

An analytic expression for the volcanic seismic swarms occurrence rate

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Abstract

Seismic swarms are defined as a group of earthquakes occurring very close in time and space but without any larger event triggering their occurrence. Up to now no simple law has been found to describe the swarm occurrence rate. Here we find an expression able to fit the average occurrence rate on some volcanic areas. Such an expression exhibits some differences in respect of the usual Omori law. Namely the c parameter of the Omori law is equal to zero and the power law decay of the average occurrence rate of the earthquakes is followed by an exponential decaying regime. Both the results can be interpreted in term of fluid injection and/or movements. Indeed this is a more impulsive phenomenon, in respect to the occurrence of a large earthquake, with a duration compatible with a $c=0$. The exponential decay following the power law one could explained by a viscoelastic relaxation of the stress induced by the injection and/or movements of fluids in the earth crust.

1 **An analytic expression for the volcanic seismic swarms**
2 **occurrence rate**

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9 **Abstract**

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 21 earth crust.

22 **1 Introduction**

23 When an earthquake occurs the stress released by its occurrence is redistributed
 24 to the surrounding rocks causing the occurrence of a number of aftershocks which de-
 25 pends on the magnitude of the triggering event (Helmstetter, 2003). The rate of occur-
 26 rence is governed by the Omori law (Omori, 1894)

$$n = \frac{k}{(t + c)^p} \tag{1}$$

27 where n is the number of aftershock, t is the time elapsed from the mainshock oc-
 28 currence and k , c and p are experimental constant. k depends exponentially on the main-
 29 shock magnitude (Helmstetter, 2003), c makes the Omori law normalizable, whereas p
 30 controls the velocity of aftershocks rate decay.

31 The Omori law is one of the principal ingredients for the ETAS model (Ogata, 1985,
 32 1998) which views the earthquake occurrence as the superposition of a constant rate of
 33 occurrence μ and the aftershocks occurrence rate. They occur in a cascade process: a
 34 parent earthquake can generate some offspring who can, in turn, generate other offspring.
 35 This is a very general characteristic of aftershocks occurrence.

36 Differently from mainshock - aftershock sequences, earthquake swarms are defined
37 as earthquakes clustered in space and time without a triggering events of higher mag-
38 nitude (Hainzl, Fischer, & Dahm, 2012). Swarm activity has been associated to stress
39 changes induced by aseismic processes such as pore pressure changes (Miller et al., 2004)
40 or fluid intrusion (Toda, Stein, & Sagiya, 2002). Mogi (1963) firstly suggested that swarms
41 occur in regions characterised by high heterogeneity in terms of material properties and
42 stress concentration. Swarms are indeed recorded in volcanic, geothermal or tectonic en-
43 vironments (Hainzl & Fischer, 2002; Tramelli et al., 2021; White & McCausland, 2015)
44 and their triggering mechanism is interpreted as due to volcanic processes or fluid in-
45 jection and/or movements (Chouet, 1996; Glazner & McNutt, 2021; Hainzl, 2003; Tramelli
46 et al., 2021). Volcanic swarms are usually the main reported seismic precursor for vol-
47 canic eruptions especially for volcanoes that have been silent for decades or more (White
48 & McCausland, 2015).

49 A mechanical model to simulate the swarm occurrence was obtained modifying the
50 Burridge and Knopoff (1967) original one introduced by Hill (1977) and Hainzl (2003).
51 They were able to explain some of the characteristics of earthquake swarms occurring
52 in seismogenic structures driven by fluid injection and/or movements.

53 Some statistical models for swarm occurrence modified the original ETAS one (Ogata,
54 1985, 1998) introducing a non stationary background seismic occurrence. The simplest
55 approach was introduced by Lombardi, Marzocchi, and Selva (2006) who use the station-
56 ary ETAS model in moving time windows explaining the fluctuations of the ETAS model
57 parameters. Marsan, Prono, and Helmstetter (2013) and Reverso, Marsan, and Helm-
58 stetter (2015) took into account of seismic transients like fault interactions, fluid and dike
59 injections being able to recover, both in duration and in intensity, the changes in fault
60 loading rates. Kumazawa and Ogata (2014) expressed $\mu(t)$ as a piece wise linear func-
61 tion, whereas Kattamanchi, Tiwari, and Ramesh (2017) made use of a spline function
62 which allowed them to identify slow slip earthquakes occurring on subduction zones The
63 authors enlighten as their approach could model earthquake sequences triggered by fluid/magma
64 injections.

65 Even if many of these models can reproduce some statistical feature of the seismic
66 swarms, it was not possible the fitting of the occurrence rate and neither the Omori law
67 nor a simple relationship can well describe the temporal evolution of the volcanic earth-

68 quake swarms. The reason for such a difficulty must be sought in the duration of the swarms
 69 which are often very short and not provide a sufficient number of events for a reliable
 70 statistical analysis.

71 In the following we will show that, stacking many swarms in an average rate of oc-
 72 currence, an analytic expression for the earthquake swarms time evolution can fit the ex-
 73 perimental observations.

74 **2 The data**

75 Here we analyse five earthquake catalogues of corresponding volcanic areas: Campi
 76 Flegrei (CF) (1982-1984), Campi Flegrei (2000-2019), Etna (S. et al., 2015), Hawaii, Costa
 77 Rica. The web sites where the catalogues can be downloaded are reported in Table 1,
 78 whereas Table 2 reports the time periods of the catalogues, the earthquake number in
 79 each one of them and the completeness magnitude here adopted. This quantity has been
 80 estimated by using the goodness of fit method (Wiemer & Wyss, 2000) and the method
 81 introduced by Godano (2017). In most of cases the two methods estimate the same value
 82 and, when there are differences, we adopted the larger value between the two estimations.

Table 1. The areas and the web sites from where the earthquake catalogues can be down-
 loaded.

Catalogue	web site
Costa Rica	https://doi.org/10.5281/zenodo.6383911
CF 1982-1984	https://doi.org/10.5281/zenodo.6376561
CF 2000-2019	sismolab.ov.ingv.it/sismo/CATALOGO_STATICO/FLEGREI/fle_2000_2019.html
Etna	ct.ingv.it/index.php/monitoraggio-e-sorveglianza/banche-dati-terremoti/terremoti
Hawaii	https://earthquake.usgs.gov/fdsnws/event/1/

83 **3 Individuating the seismic swarms and defining the rate of occurrence**

84 The first step of our investigation is to separate the earthquake swarm from the
 85 background seismic activity. This result can be obtained using the clustering properties
 86 of earthquake occurrence. In order to characterise these properties we use the distribu-

Table 2. The temporal periods, the number of events in the catalogues and the completeness magnitude of the catalogues here analysed.

Catalogue	initial date	final date	N	m_c
Costa Rica	2005/01/03	2021/12/31	19372	2.4
CF 1982-1984	1982/02/04	1984/12/31	5775	1.0
CF 2000-2019	2000/08/22	2019/12/31	1489	0.4
Etna	2000/01/01	2016/12/31	8983	2.6
Hawaii	2000/01/01	2018/05/31	64076	1.8

87 tion of the time interval between two successive events. In the following we refer to this
88 quantity as the inter-event time Δt . Let us, firstly, to recall the fundamental results ob-
89 tained on this distribution.

90 3.1 The inter-event time distribution

91 The main result obtained on the inter-event time distribution during the last twenty
92 years, is that the Δt distribution $p(\Delta t)$ can be considered universal when the inter-event
93 times Δt are rescaled by the mean occurrence rate, R (A. Corral, 2003, 2004, 2006). Namely,
94 $p(\Delta t)$ is independent of the geographic zone and the magnitude threshold. This implies
95 that R defines a ‘local’ time scale that characterises the earthquake occurrence whereas
96 their clustering properties can be considered universal. This result was firstly obtained
97 for pseudo-stationary periods revealing that earthquakes tend to cluster even if their oc-
98 currence is apparently Poissonian (A. Corral, 2004). The universality of $p(\Delta t)$ has been
99 also observed for non-stationary periods (A. Corral, 2009) and for aftershock sequences
100 (Bottiglieri, Lippiello, Godano, & De Arcangelis, 2011; Shcherbakov, Yakovlev, Turcotte,
101 & Rundle, 2005). However the universal behaviour of $p(\Delta t)$ has been questioned (Hainzl,
102 Scherbaum, & Beauval, 2006; Lindman, Jonsdottir, Roberts, Lund, & Bödvarsson, 2005;
103 Molchan, 2005; Saichev & Sornette, 2006, 2007; Sornette, Utkin, & Saichev, 2008; Touati,
104 Naylor, & Main, 2009). In particular, deviations from universality at small Δt have been
105 related to interplay between correlated earthquakes, which follow a Gamma distribution
106 (see appendix for more details), and uncorrelated events, which follow pure exponential
107 decay. The departure from universality has been solved by Bottiglieri, de Arcangelis, Go-

108 dano, and Lippiello (2010) who showed that four typical time scales are relevant for the
 109 interevent time distribution scaling: the inverse rate of independent events, λ , the mean
 110 inverse rate of correlated events, the time parameter c defined in the Omori law, and the
 111 catalogue duration T (the last one is irrelevant for the analysis here presented).

112 **3.2 The role of the space**

113 Earthquake swarms can be characterised also by their spatial clustering. In order
 114 to take into account the role of the space we evaluate the conditioned probability den-
 115 sity of Δt given a $\Delta r < \delta$, where Δr is the epicentral distance between the same suc-
 116 cessive events with an inter-event time Δt and δ is a fixed value. More precisely, if Δt
 117 is the inter-event time between the i th earthquake and the $1+i$ th one, it is counted in
 118 the distribution only if Δr (the inter-distance between the i th earthquake and the $1+$
 119 i th one) assumes a value $\leq \delta$. δ has been fixed in different ranges depending on the size
 120 of the investigated areas. The δ values can be found in the legends of figure 1 showing
 121 the conditioned probability density $p(\Delta t|\Delta r \leq \delta)$.

122 As can be seen $p(\Delta t|\Delta r \leq \delta)$ does not depend on δ with the exception of Etna
 123 and Hawaii for the smallest values of δ . This implies that, for Etna and Hawaii, no back-
 124 ground activity is included in the analysis when δ assumes very small values. Neverthe-
 125 less, here we need to include some background activity in order to individuate the swarms
 126 as an increase of the seismic activity as compared to the background occurrence rate.

127 The $p(\Delta t|\Delta r \leq \delta)$ follows a Gamma distribution characterised by two param-
 128 eters: α controlling the power law decay of the distribution and Θ representing the Δt
 129 value after which the exponential decay becomes dominant. The two parameters have
 130 been estimated using a maximum likelihood method (see Appendix). In table 3 we re-
 131 port only the values of Θ because it will be useful in the swarm individuation (see next
 132 section).

133 **3.3 The earthquakes swarms and the Omori law**

134 As stated before we use the value of Θ for discriminating between the background
 135 activity and the swarms occurrence. More precisely the swarm starts when $\Delta t \leq \Theta|\Delta r \leq$
 136 δ and ends when $\Delta t > \Theta|\Delta r \leq \delta$. Indeed Θ^{-1} can be viewed as the largest observ-
 137 able occurrence rate of the background earthquakes (where observable means not hid-

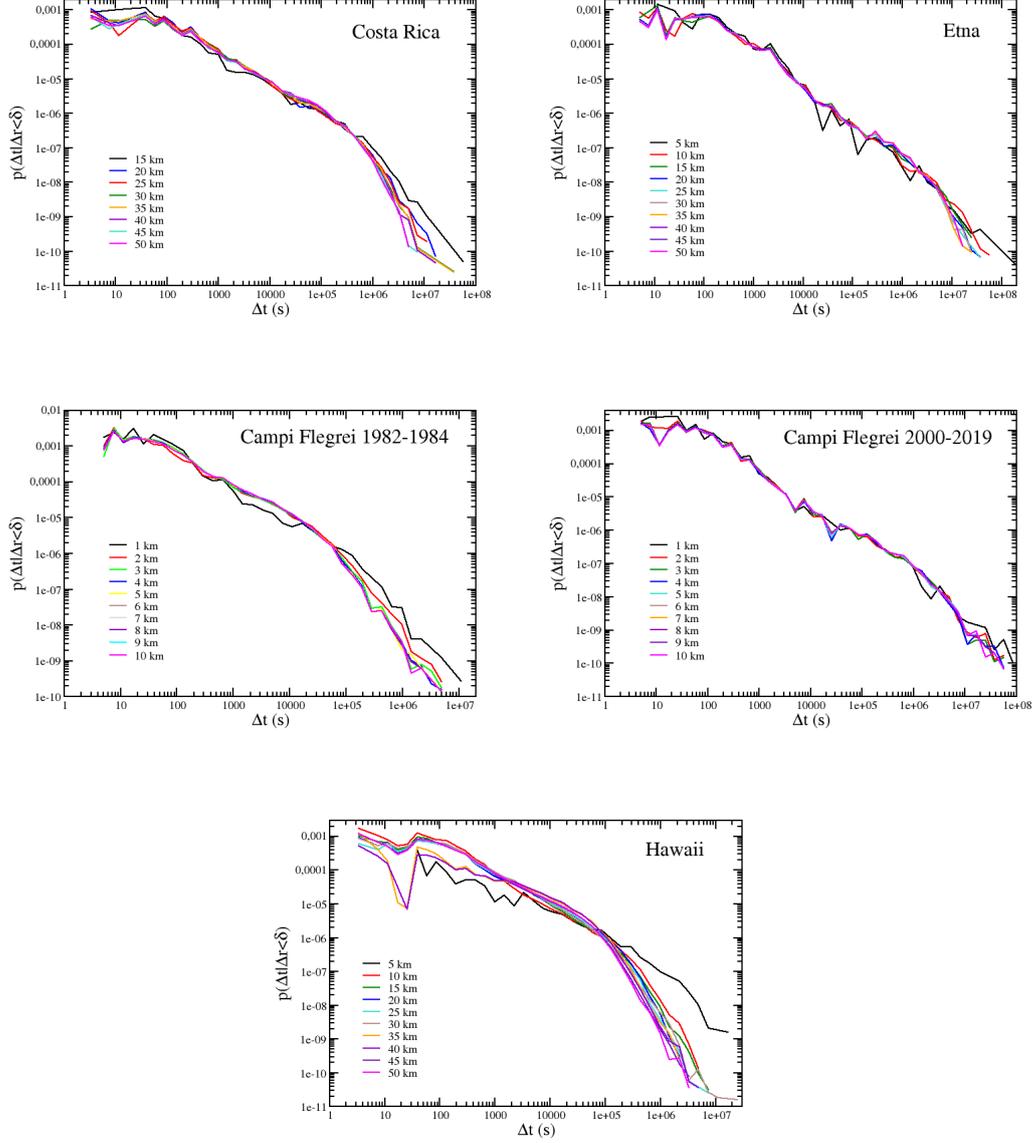


Figure 1. The conditioned probability density $p(\Delta t | \Delta r \leq \delta)$ for the five volcanic catalogues here analysed. The minimum δ value has been obtained under the request of at least 150 events satisfying the condition $\Delta t | \Delta r \leq \delta$.

Table 3. The values of θ for the earthquake catalogues here analysed.

Catalogue	Θ
Costa Rica	450000 (s)
CF 1982-1984	55000 (s)
CF 2000-2019	500000 (s)
Etna	200000 (s)
Hawaii	80000 (s)

den by the swarm events occurrence rate). Conversely the $\Delta t \leq \Theta$ intertime values characterise the occurrence of clustered events in the earthquake swarms. In order to have a qualitative feedback of our choice, figure 2 shows the cumulative number of events for the whole catalogue (black squares) and for the events selected as swarms (red circles). As can be seen the rate of occurrence increases significantly in correspondence of the individuated swarms revealing that the method recognise the seismic swarms efficiently. In figure 2 we use the largest δ value reported in the figure 1 labels. However the δ value do not influence the selection of the swarms simply because Θ is δ independent.

As a counter proof of the goodness of our choice for the earthquake swarms, we show (figure 3) the intertime distribution during the periods outside the swarms. As expected the distribution appear to be exponential for all the catalogues here analysed revealing their Poissonian occurrence and confirming the goodness of our choice.

The great part of the individuated swarms are very short and do not allow the investigation of their time behaviour. As a consequence we have stacked all of them in a unique average Omori law for each catalogue. Namely we count the number of events occurred at the time t elapsed from the beginning of the swarm and for each class t the different $n(t)$ are summed and divided by the number of classes with $n(t) \neq 0$ building an average rate of occurrence $\nu(t|\Delta r \leq \delta)$ for each catalogue here analysed. Figure 4 shows $\nu(t|\Delta r \leq \delta)$ opportunely rescaled in order to have a collapse on a unique master curve and to better evidence their independence of the δ value.

For all the catalogues we obtain a $\nu(t|\Delta r \leq \delta)$ that can be described as a power law tapered by an exponential decrease after a given value of t . However the Campi Fle-

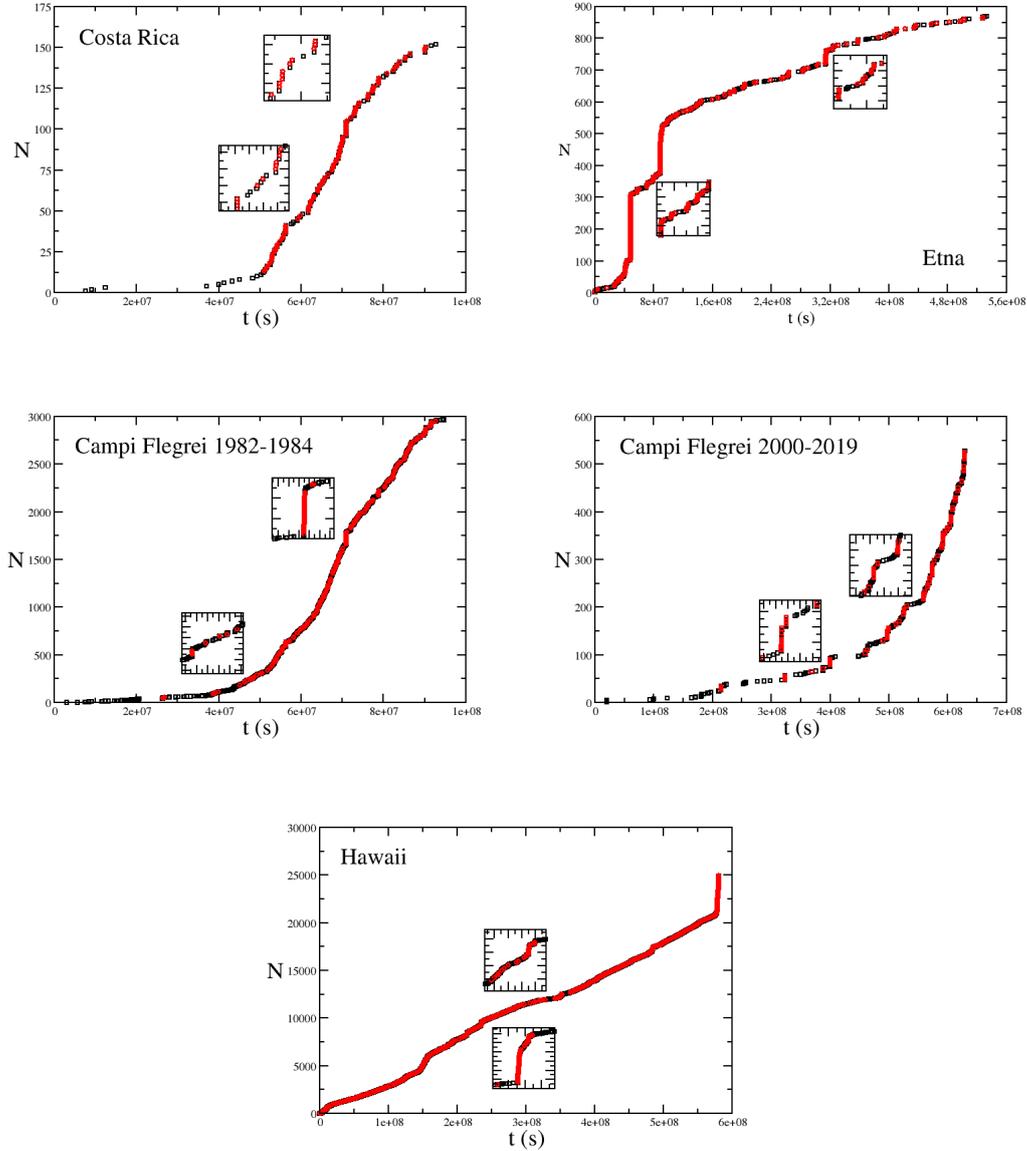


Figure 2. The cumulative number of earthquakes as a function of time for the whole catalogues (black squares) and for the individualized swarms (red circles). The insets represent a zoom of the curve in proximity of the square corner closest to the curve.

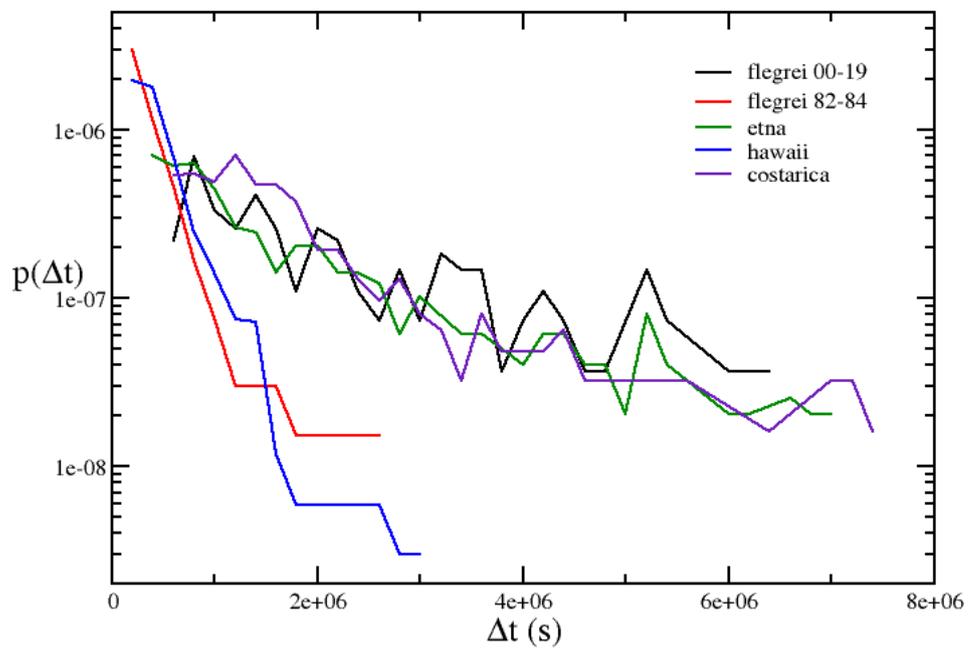


Figure 3. The intertime between two successive events occurring during periods outside the swarms.

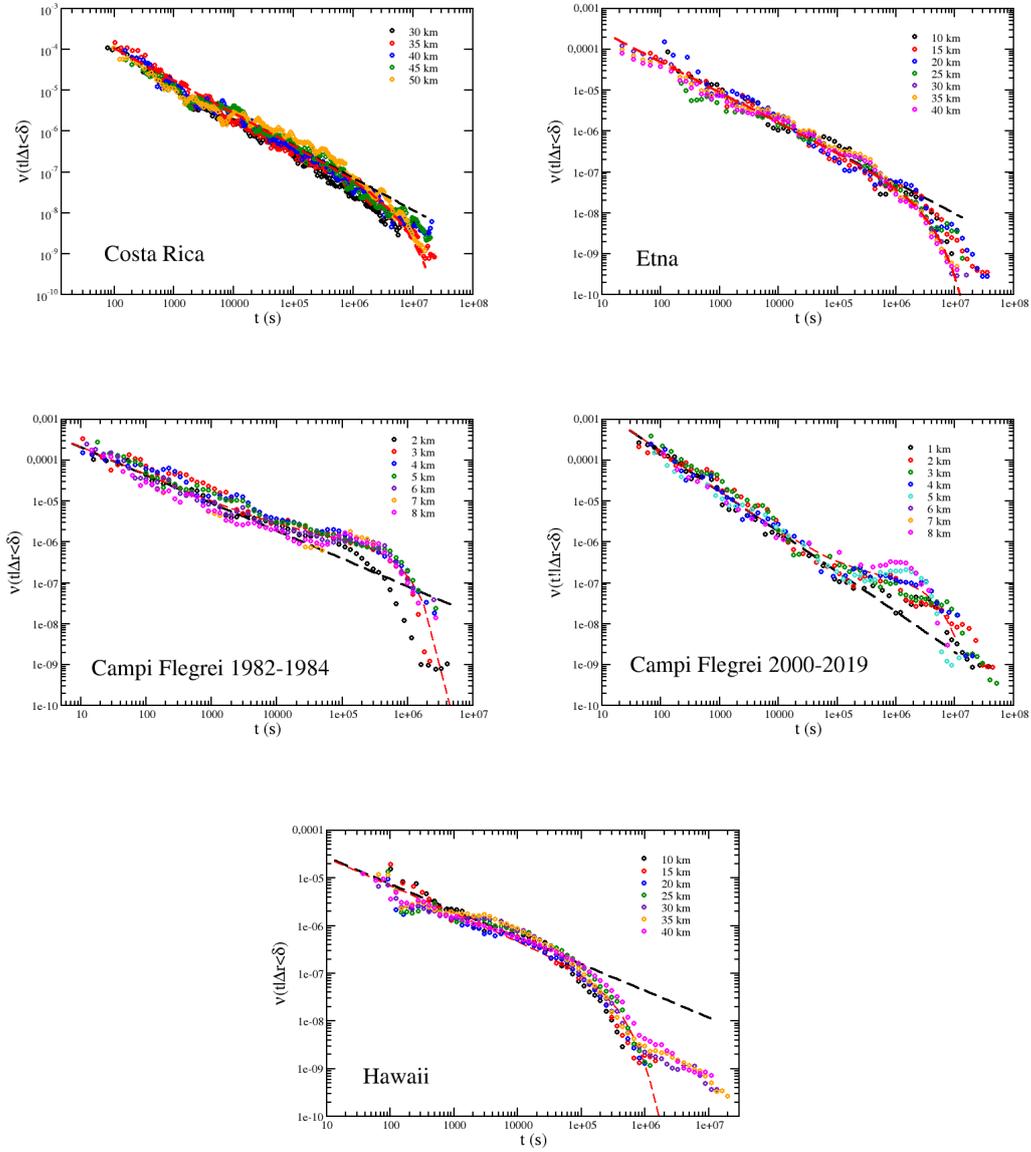


Figure 4. The conditioned rate of occurrence $\nu(t|\Delta r \leq \delta)$ for the five volcanic catalogues here analysed. The standard deviation is of the same order of magnitude of the symbol size.

160 grei catalogues after the power law decay presents a bump in the average occurrence rate
 161 eventually followed by an exponential decay whereas the Hawaii catalogue exhibits a more
 162 flat regime at $t > 10^6$ (s) for $\delta=30, 35$ and 40 km.

163 An interpretation and the fit of these behaviour will be provided in the next sec-
 164 tion.

165 **3.4 The productivity law**

166 We have verified that the volcanic swarms occurrence rate can be assimilated to
 167 an Omori law. Let us to verify if the productivity law holds also for volcanic earthquakes.
 168 As suggested by Helmstetter (2003) the number of events in a seismic sequence, grows
 169 exponentially with the magnitude of the mainshock. However, for the earthquake swarms,
 170 it is not possible to speak of a mainshock. As a consequence, we evaluate the number
 171 of events in a swarm as a function of the largest event magnitude, m_L , in the swarm. Fig-
 172 ure 5 shows that the productivity laws are independent of the δ values with the excep-
 173 tion of the Hawaii catalogue.

174 Following Shebalin, Narteau, and Baranov (2020) we also investigated the produc-
 175 tivity through the distribution $p(n)$ of the number of earthquakes per swarm. Figure 6
 176 confirms the results of Shebalin et al. (2020): $p(n)$ follows a power law distribution. How-
 177 ever the smallest value of n is, in our case, 2 simply because it is impossible to have swarms
 178 with $n < 2$.

179 As expected the distribution of occurrence time t_L of the largest earthquake in the
 180 swarm in respect to the beginning time t_b of the swarm reveals that in all the cases $t_L >$
 181 t_b (figure 6) confirming that the mechanism of triggering the earthquake swarms is dif-
 182 ferent by the one of the tectonic sequences which are triggered by the mainshock.

183 This result confirms the idea that earthquake swarms are not triggered by the oc-
 184 currence of a large events.

185 **4 Discussion**

186 In the previous section we have shown that many of the results obtained for the
 187 earthquake sequences can be extended to the volcanic earthquakes with some substan-
 188 tial difference.

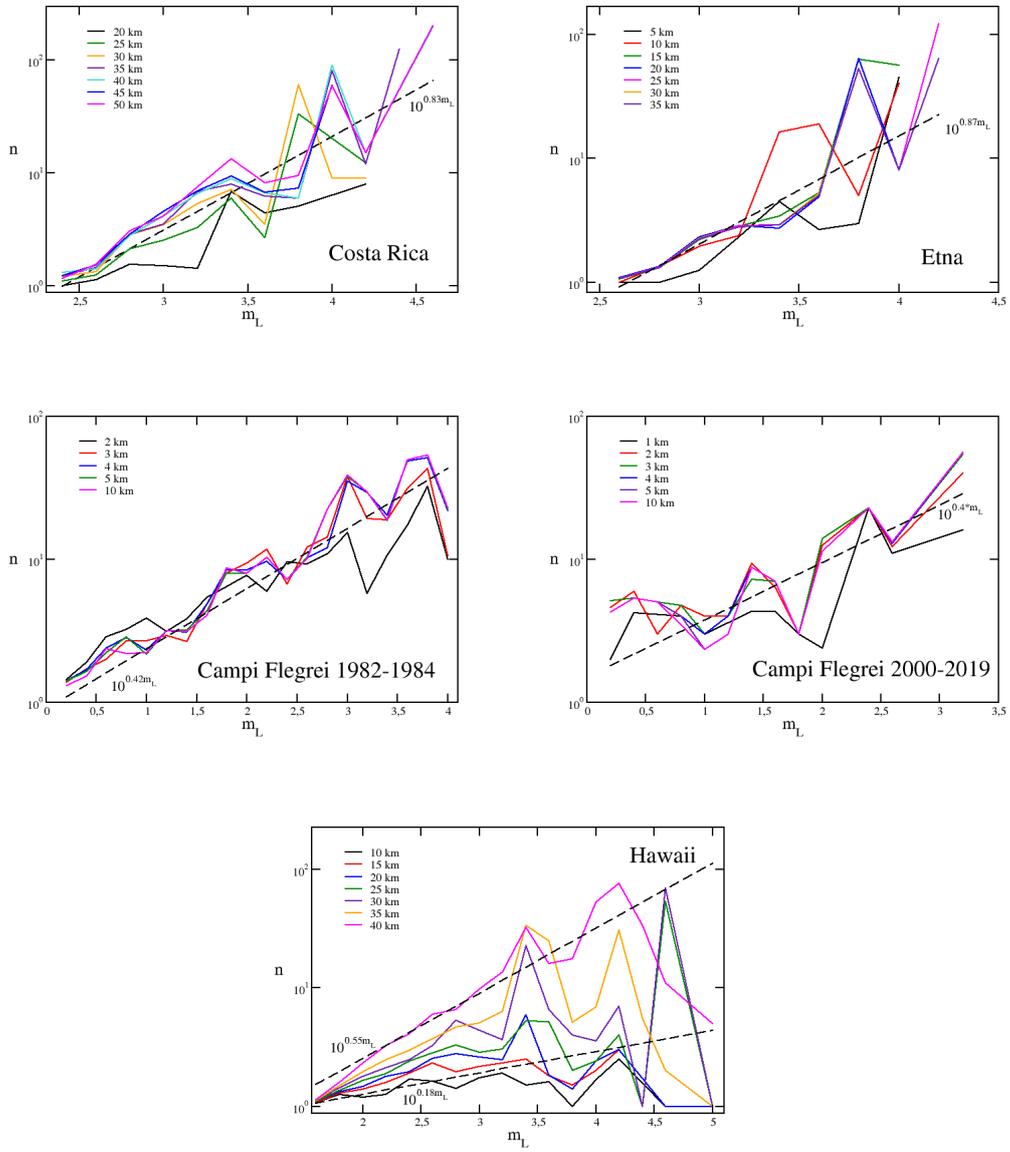


Figure 5. The conditioned productivity laws for the five volcanic catalogues here analysed.

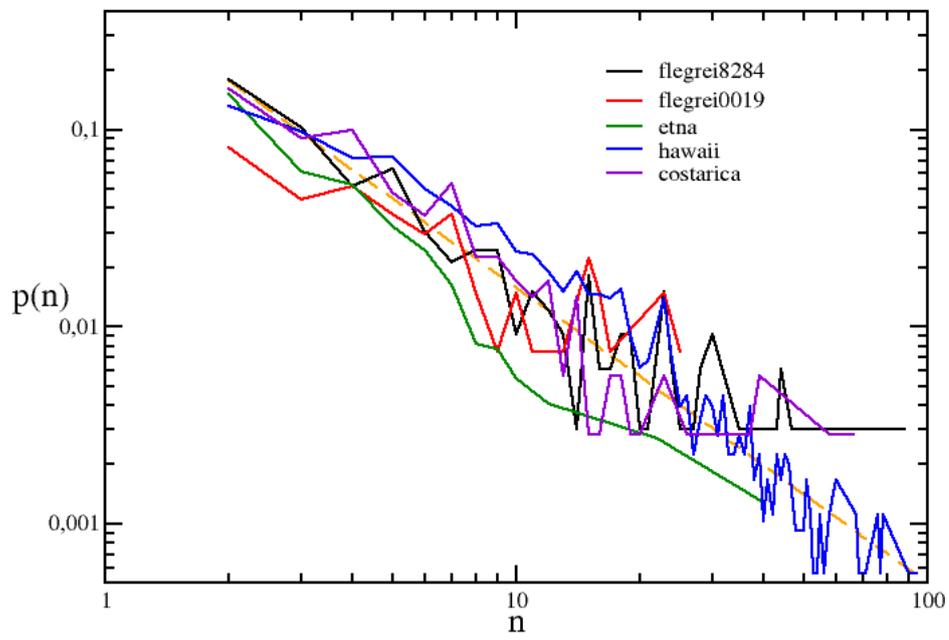


Figure 6. The distribution of the number of events per swarm n for the five volcanic catalogues here analysed.

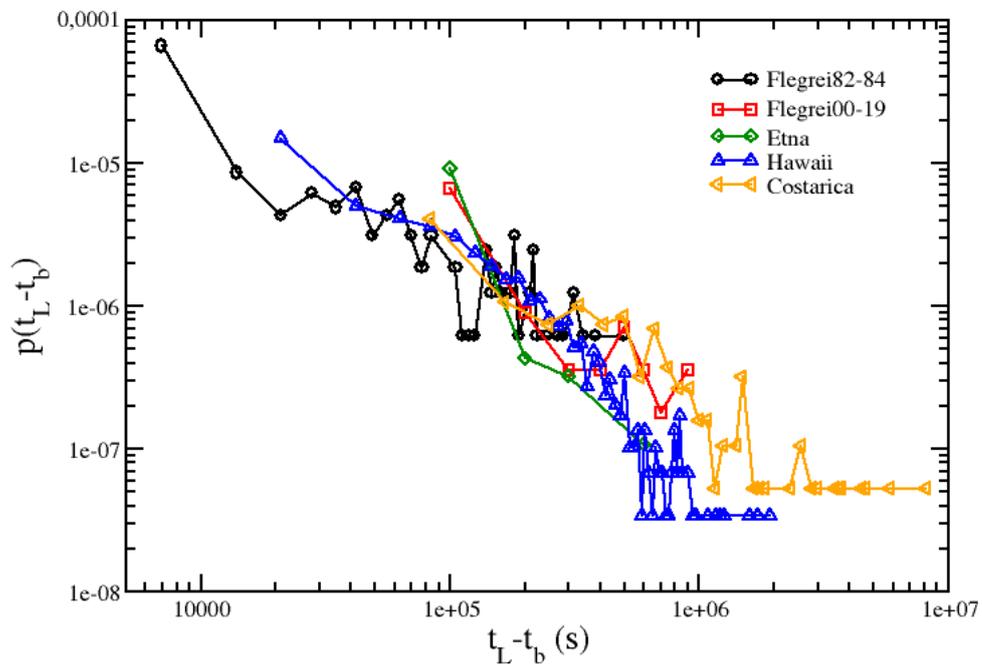


Figure 7. The distribution of $t_L - t_b$ for the five volcanic catalogues here analysed.

189 The intertime distribution follows, as for the earthquake sequences, a Gamma one.
 190 As well known this is characterised by a power law decreases with Δt followed by an ex-
 191 ponential one. The first regime is characteristic of earthquakes clusters, whereas the ex-
 192 ponential regime characterises the occurrence of the background seismic activity (Bot-
 193 tiglieri et al., 2010; A. Corral, 2003, 2004, 2006; Godano, 2015; Molchan, 2005). The pa-
 194 rameter Θ separate the two regimes and has been here used for successfully individu-
 195 ate the seismic swarms. The Δt distribution appears to be independent of the δ value
 196 revealing that it is not influenced by the spatial occurrence properties. This result was
 197 unexpected because the spatial proximity is part of the definition of earthquake swarms.
 198 However it simply reveals that the occurrence probability of simultaneous swarms at dif-
 199 ferent zone of the same volcanic area is very small, even if the area is characterised by
 200 the presence of many volcanoes as in Costa Rica or Hawaii.

201 The analysis of the Δt distribution allows us to individuate the seismic swarms and
 202 to build for each catalogue an average swarm rate of occurrence. Figure 4 shows as this
 203 occurrence rate exhibits some differences in respect to the Omori law. The first one is
 204 that the parameter c appears to be equal to zero. However the presence of an exponen-
 205 tial tapering at high values of t allows the normalisation of the occurrence rate expres-
 206 sion:

$$\nu(t) \propto (t^{-p} + \mu)e^{-\frac{t}{\tau}} \quad (2)$$

207 where p assumes the same meaning of the usual Omori law p value and τ is the elapsed
 208 time from the beginning of the swarm at which the exponential decay becomes domi-
 209 nant. The parameter μ is the constant rate of background occurrence seismicity here in-
 210 troduced to explain the bump in the rate of occurrence just before the exponential regime
 211 (Figure 4) observed for the Campi Flegrei catalogues.

212 We have fitted the parameters of Eq.s (2) through the minimisation of the χ^2 . More
 213 precisely we explore the parameter space looking for the minimum value of the χ^2 . The
 214 estimated parameters are reported in table 4.

215 Let us to provide an interpretation of the three main differences with the standard
 216 Omori law. Namely the c is equal to zero and the power law rate regime is followed by
 217 an exponential one.

Table 4. The estimated values of the parameters p , τ and μ for the five catalogues here analysed.

Catalogue	p	τ	μ
Costa Rica	0.79	$5.8 \cdot 10^6$ (s)	0 (s^{-1})
CF 1982-1984	0.68	$5 \cdot 10^5$ (s)	10^{-3} (s^{-1})
CF 2000-2019	0.98	$2.8 \cdot 10^6$ (s)	10^{-5} (s^{-1})
Etna	0.74	$[2.8 \cdot 10^6, 82 \cdot 10^6]$ (s)	0 (s^{-1})
Hawaii	0.58	$3.1 \cdot 10^5$ (s)	0 (s^{-1})

- 218 1. The c value represents a physical time during which aftershocks do not yet occur
219 or are not recorded. It can be explained in terms of many physical processes, namely
220 the faulting duration, a not perfectly elastic behaviour of the rock introducing a
221 delay in the mechanism of stress release, higher resistance of the unbroken patches
222 of the fault delays the occurrence of the aftershocks, etc. In the case of the seis-
223 mic swarms the triggering phenomenon is not the occurrence of a large earthquake,
224 but the intrusion and/or movements of fluids (see, among the others, Chouet (1996);
225 Glazner and McNutt (2021); Hainzl (2003); Hill (1977); Tramelli et al. (2021)).
226 This can be considered a more impulsive phenomenon, moreover the presence of
227 fluids lubricates the existing faults making more rapid the response to the stress
228 impulse. As a consequence the c value becomes negligible.
- 229 2. We interpret the exponential decay after the power law regime as due to a viscoelas-
230 tic effect in the hypothesis that the occurrence rate is proportional to the stress
231 rate. Indeed the higher temperature of the volcanic rocks makes their rheologi-
232 cal behaviour more viscous than the rocks of the tectonic areas. As a consequence,
233 when the fluid is not injected or moved anymore, the induced stress on the sur-
234 rounding rocks is released following a viscous relaxation causing the exponential
235 decay of the occurrence rate.
- 236 3. The presence of the μ constant term here introduced for explaining the bump in
237 the occurrence rate for the Campi Flegrei catalogues deserves a short discussion.
238 Indeed it should not be confused with the background activity which is a constant
239 rate of occurrence to be added to the swarms activity and represent a Poissonian

240 process independent of the swarm triggering mechanism. Conversely μ should be
 241 considered as an integral part of the swarm that ceases when the fluid intrusion
 242 and/or movements stops. In this sense the triggering mechanism causes an increase
 243 of the stress generating the swarm activity and, moreover, causes a Poissonian oc-
 244 currence of other earthquakes that could be generated by a mechanism of fault
 245 lubrication due to the presence of fluids. The observation of μ only at Campi Fle-
 246 grei is easy to explain noting that the m_c values are significantly higher for the
 247 other volcanoes. Indeed the background seismicity is dominated by smaller events
 248 and, as a consequence, the background activity, occurring during the swarms, can-
 249 not be observed for the catalogues with a large value of m_c (see table 2).

250 Finally the Hawaiian greater productivity for $\delta=30, 35$ and 40 km can be explained
 251 observing that for those δ values the rate of occurrence exhibits an approximately flat
 252 regime (for $t > 10^6$ s) evidencing that, in these cases, some background activity has been
 253 included in the analysis.

254 5 Conclusions

255 The general interpretation of earthquake occurrence is that the stress induced by
 256 the plate tectonics drives the crustal rocks at a critical state which allows the occurrence
 257 of random earthquakes whose magnitude follows the Gutenberg-Richter distribution. More-
 258 over, when an earthquake occurs, it diffuses, in the crust, the accumulated strain gen-
 259 erating new stress able to give rise to the occurrence of other earthquakes. Generally the
 260 two classes of earthquakes are called mainshocks and aftershocks. The number of after-
 261 shocks depends on the magnitude of their mainshock (Helmstetter, 2003) and decreases
 262 in time as t^{-p} (Omori, 1894). However such a behaviour is not observed for seismic swarms
 263 occurring on volcanic, geothermal or tectonic environments where fluids injections and/or
 264 movements generate an instant increase of the stress.

265 Up till now neither the Omori law nor any other simple law has been found to fit
 266 the swarm occurrence rate. However the earthquake distribution within swarm has been
 267 found to be fractal and the intertime distribution and their spatio-temporal spreading
 268 was fitted by power laws at least for the swarm recorded in the Vogtland region (Hainzl,
 269 2003; Hainzl & Fischer, 2002).

270 We have shown that, stacking the occurrence rate of many swarms it is possible
 271 to express the earthquake swarms occurrence rate as a power law decay tapered by an
 272 exponential decay allowing its normalisation. The definition of such an expression could
 273 also aim at boosting some debate on the swarms definition and could be useful in the
 274 definition of the seismic risk where the triggering mechanism is represented by fluids in-
 275 jections and/or movements.

276 **6 Appendix**

277 The Gamma distribution can be defined as:

$$p(\Delta t) = \frac{1}{\Gamma(\alpha)} \Delta t^{\alpha-1} e^{-\Delta t/\Theta} \quad (3)$$

278 The two parameters of this distribution can be easily estimated by the maximum
 279 likelihood method. The log-likelihood for the 3 distribution is:

$$LL = (\alpha - 1) \sum_i \Delta t_i - N \frac{\langle \Delta t \rangle}{\theta} - NK \log \Theta - N \log \Gamma(\alpha) \quad (4)$$

280 A correct estimation of the parameters involves the derivative of $\Gamma(\alpha)$, however an
 281 approximated estimation is provided by $\alpha = \frac{3-s+\sqrt{(s-3)^2+24s}}{12s}$ with $s = \log \langle \Delta t \rangle -$
 282 $\langle \log \Delta t \rangle$ and $\Theta = \frac{\langle \Delta t \rangle}{\alpha}$.

283 **7 Declarations**

284 The authors declare that there is no conflict of interest.

285 **8 Ethical statements**

286 All materials and results here presented have not been previously published else-
 287 where. The paper properly credits the meaningful contributions of co-authors.

288 **9 Data availability**

289 Data here used can be found and downloaded at the web-sites: [https://doi.org/](https://doi.org/10.5281/zenodo.6383911)
 290 [10.5281/zenodo.6383911](https://doi.org/10.5281/zenodo.6376561), <https://doi.org/10.5281/zenodo.6376561>, [sismolab.ov](https://www.sismolab.ov)
 291 [.ingv.it/sismo/CATALOGO_STATICO/FLEGREI/fle_2000_2019.html](https://www.ct.ingv.it/sismo/CATALOGO_STATICO/FLEGREI/fle_2000_2019.html), [ct.ingv.it/index](https://www.ct.ingv.it/index)

292 .php/monitoraggio-e-sorveglianza/banche-dati-terremoti/terremoti, [https://](https://earthquake.usgs.gov/fdsnws/event/1/)
 293 earthquake.usgs.gov/fdsnws/event/1/

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 296 grei 2000-2019 catalogues and the USGS for providing the Hawaii catalogue.

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 298 nancial support.

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