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#### Title:

Linking earthquake magnitude-frequency statistics and stress in visco-frictional fault zone models

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# Linking earthquake magnitude-frequency statistics and stress in viscofrictional fault zone models

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- 10 Key Points:
- Combining viscous creep and rate-and-state friction in fault slip models limits the peak
   loading stress over the earthquake cycle.
- Numerical and analytical models reproduce Gutenberg-Richter earthquake size recurrence statistics, with a b-value linked to fault stress.
- The interplay between loading stress and probabilistic fault locking provides an
   explanation for regional contrasts in b-value.

# 18 Abstract

- 19 The ability to estimate the likelihood of given earthquake magnitudes is critical for seismic
- 20 hazard assessment. Earthquake magnitude-recurrence statistics are empirically linked to stress,
- 21 yet which fault-zone processes explain this link remains debated. We use numerical models to
- 22 reproduce the interplay between viscous creep and frictional sliding of a fault-zone, for which
- 23 inter-seismic locking becomes linked to stress. The models reproduce the empirical stress-
- 24 dependent earthquake magnitude distribution observed in nature. Stress is related to the
- 25 likelihood a fault section is near frictional failure, influencing likely rupture lengths. An
- 26 analytical model is derived of a fault consisting of identical patches, each with a probability of
- 27 inter-seismic locking. It reproduces a similar magnitude-recurrence relationship, which may
- therefore be caused by probabilistic clustering of locked fault patches. Contrasts in earthquake
- statistics between regions could therefore be explained by stress variation, which has future
- 30 potential to further constrain statistical models of regional seismicity.

# 31 Plain Language Summary

- 32 The frequency of earthquakes with a given magnitude is empirically described by the Gutenberg-
- 33 Richter law, where large earthquakes occur less frequently than small ones. Variations in
- 34 magnitude distribution between regions have been correlated with the tectonic force acting on a
- 35 fault. However, it is unclear which mechanism is responsible for this relationship, restricting its
- <sup>36</sup> predictive capability. Here, we create computational models in which some portions of a fault
- 37 can generate earthquakes and others can move slowly (not generating earthquakes). This slow
- movement acts to relax and limit the elastic forces that build up around the fault. This approach
- is used to reproduce realistic earthquake statistics, indicating that processes that limit the stress
- 40 build-up between earthquakes may be responsible for the varying likelihoods of earthquake
- 41 magnitudes observed in nature.

# 42 **1 Introduction**

- 43 One of the cornerstones of modern seismic hazard assessment is the ability to model statistical
- 44 distributions of how often earthquakes of a given size occur in a region (Gerstenberger et al.,
- 45 2020). This is typically modelled following the Gutenberg-Richter (G-R) law, where the number
- 46 N of earthquakes of moment magnitude  $M_w$  or greater that occur in a specific region and time
- 47 period is given by  $log(N) = a bM_w$ . *a* and *b* are empirical parameters, which vary between
- regions. For example, for thrust fault earthquakes, b is 0.75 at the Honshu subduction margin,
- 49 Japan, and 1.07 at the Marianas margin (Bilek & Lay, 2018). Higher b-values indicate that the
- ratio of small to large earthquake rates is larger (large earthquakes are relatively less frequent).
- 52 A high b-value has been linked to low differential stress in laboratory experiments (Scholz,
- <sup>53</sup> 1968). In nature, it has been correlated with extensional tectonic regimes (Schorlemmer et al.,
- 54 2005), shallow earthquake hypocenters (Spada et al., 2013), regions hosting inter-seismic creep
- 55 (Tormann et al., 2014) and periods following large earthquakes (Nuannin et al., 2005). These
- 56 contexts are generally associated with relatively low differential stress. The G-R distribution of
- 57 earthquake sizes is thought to reflect a power-law (fractal) distribution of material properties,
- 58 fault lengths or stress in the Earth, based on physical models
- 59 (Ampuero et al., 2006; Dublanchet, 2020; Huang & Turcotte, 1988; Kanamori & Anderson,
- 60 1975; King, 1983; Mogi, 1967; Scholz, 1968). An increase in the stress loading a material with a

61 power-law strength distribution results in a larger critically stressed fault area (Huang &

- Turcotte, 1988; Scholz, 1968), while still reproducing the G-R law, leading to a predicted
   decrease in b-value. However, this process is complicated by rupture dynamics over earthquake
- decrease in b-value. However, this process is complicated by rupture dynamics over earthquake
   cycles. Shear-stress evolves heterogeneously as fault segments slip, while also depending on
- bit cycles. Shear-stress evolves heterogeneously as rault segments ship, while also depending on
   loading conditions. Earthquakes may also propagate through regions that are unfavorable for
- 66 earthquake nucleation, depending probabilistically on the magnitude and heterogeneity of fault
- 67 stress and strength (Ampuero et al., 2006; Fang & Dunham, 2013; Galis et al., 2015; Ripperger
- et al., 2007). Earthquake cycle models can address these ambiguities by reproducing fault stress
- 69 states that evolve self-consistently and can be used to study the controls on rupture for various
- 70 fault structures, properties and conditions. Such models have been used to reproduce the G-R law
- 71 (Cattania, 2019; Dublanchet, 2020; Dublanchet et al., 2013; van den Ende et al., 2020), though
- an outstanding question is how they can reproduce the observed b-value dependence on stress.
- 73

Faults commonly include 'creeping' regions where elastic strain does not accumulate (inter-

- rs seismic coupling is low) and seismic slip is less likely (Avouac, 2015), influencing the
- 76 distribution of possible earthquake magnitudes. Creep may occur by stable frictional sliding or
- viscous mechanisms. We use the term creep to refer exclusively to viscous deformation, which is
- <sup>78</sup> inferred from evidence of pressure solution creep (Gratier et al., 2013; Rutter, 1976) that
- 79 operates within fault-zones at depths typically including, but not limited to, 5-20 km (Bos &
- 80 Spiers, 2002). Fault segments with low inter-seismic coupling are inferred from b-values to
- deform at low deviatoric stress (Tormann et al., 2014), which could be explained by viscous stress relaxation. Building on these inferences, we hypothesize that the proportion of fault area
- that is creeping is related to both fault stress and b-value, explaining why these are linked in
- nature. We test this hypothesis by developing earthquake cycle models in which fault
- 85 deformation occurs by a combination of frictional sliding and viscous creep. Visco-frictional
- 86 fault-zones observed in nature are represented as a coupled fault and shear-zone, allowing us to
- 87 explore how stress relaxation due to shear-zone deformation (or off-fault creep) influences
- earthquake size. Our modelled earthquake cycles involve a range of rupture dynamics that
- depend on this visco-frictional interplay. The resulting catalogue of models reproduce the
- <sup>90</sup> relationship between stress and b-value. We also interpret these results through comparison to an
- analytical model and demonstrate that it is the probability that a given fault segment is critically
   stressed that controls the modelled earthquake statistics.
- 92 93
- 94

# 95 **2 Methodology**

# 96 2.1 Numerical model

97 We use the boundary element code QDYN (Luo et al., 2017) to model quasi-dynamic earthquake

98 cycles. QDYN solves the time- and position-dependent slip and slip-rate of a planar fault

- 99 embedded in two elastic half-spaces undergoing constant tectonic loading. Slip and slip-rate
- 100 depend on the elastic stress-state, while also relieving accumulated stress, providing a non-linear
- 101 relationship between stress and fault slip that may generate the spectrum of creep to seismic slip.
- 102 The coupled fault and shear-zone system is modelled on a 2-D vertical plane as a 1-D thrust
- fault, neglecting along-strike variation, with a seismogenic zone of width  $L_f = 30$  km. Along
- unbounded extensions of the fault beyond its seismogenic zone, a steady slip velocity of  $v_p = 10^{-10}$

 $^{9}$  m s<sup>-1</sup> is prescribed, representing plate motion of ~ 30 mm/yr. On the seismogenic zone, a visco-

106 frictional rheology is assumed in which total fault slip rate is the sum of viscous  $(v_v)$  and

107 frictional  $(v_f)$  slip rates, such that the weakest mechanism dominates: at any given point on the

fault we have (for bulk shear stress  $\tau$  and frictional and viscous stresses  $\tau_f$  and  $\tau_v$ , respectively,

109 and state variable  $\theta$ ):

$$\tau = \tau_f(v_f, \theta) = \tau_v(v_v) \tag{1}$$

110

$$v = v_f + v_v \tag{2}$$

111

Frictional strength is assumed to follows the rate-and-state law (equation S1), with frictional rate 112 113 parameter (a - b) = -0.011, such that the fault would be velocity-weakening and potentially seismic in the absence of creep. The steady-state static and dynamic strengths  $S_f$  and  $S_d$  are 114 defined as the frictional strengths prior to and during seismic sliding. They are  $S_f = 60$  MPa and 115  $S_d = 37$  MPa, for the reference friction coefficient  $\mu_0 = 0.6$ , effective normal stress 100 MPa and 116 calculated at steady slip rates of  $v_p$  and 1 m/s, respectively. We take  $S_f$  and  $S_d$  as constants for 117 analysis, though they are an approximation as the models are not steady-state and ruptures may 118 have partial stress drops. The earthquake nucleation length  $L_{\infty}$  (following Rubin & Ampuero, 119 2005, Text S1), the size a slip zone must reach to become unstable, is 316 m for the chosen 120 121 frictional parameters.  $L_{h}$  is the length-scale near a rupture front over which frictional weakening occurs and is approximately 150 m. A model resolution of 29.3 m is chosen to resolve both 122 123 processes.

124

125 Viscous deformation is assumed to be Newtonian, following  $\tau_v = v_v \eta / W$ , for viscosity  $\eta$  and

shear-zone width W. Fault-zones typically consist of mixtures of blocks of varying strengths and  $\frac{127}{12}$ 

sizes that follow fractal distributions (Fagereng & Sibson, 2010; Kirkpatrick et al., 2021).
Accordingly, the shear-zone consists of patches with random lengths from a truncated power-law

distribution with exponent D = 1, ranging from 10 to 100 m. Each patch has a uniform  $\eta$  which

is chosen by assuming that  $\log(\eta)$  follows a uniform random distribution between  $\eta_{min} = 10^{18}$ 

Pa s and  $\eta_{max} = 10^{20}$  Pa s. This reflects heterogeneity within the seismogenic zone inferred in nature (Fagereng & Sibson, 2010; Gratier et al., 2013) and microphysical models (Bos & Spiers,

133 2002). *W* is uniform along the fault and constant for a given simulation. This setup could

equivalently represent uniform  $\eta$  and down-dip W heterogeneity.

135

136 The model reproduces seismic and aseismic slip (Figure 1), with a range of rupture sizes,

depending on visco-frictional interaction. For each simulation, an earthquake catalogue is

138 compiled with moment magnitudes  $M_w$  computed by assuming that earthquake areas are

- 139 circular.
- 140
- 141 As a consequence of the adopted rheology, there exists a critical viscosity  $\eta_c$ , where if a fault
- 142 patch has  $\eta > \eta_c$  it will be primarily inter-seismically locked and capable of accumulating elastic
- energy and possibly of nucleating earthquakes. The steady-state strength of the viscous material
- 144  $S_v$  is the stress at which it accommodates plate motion:  $S_v = v_p \eta / W$ . Inter-seismic elastic strain
- 145 accumulation plateaus at a peak stress below the frictional steady-state strength  $S_f$  (i.e. tectonic
- 146 deformation is fully accommodated by creep) if  $S_v/S_f < 1$ . The threshold  $S_v/S_f = 1$
- 147 corresponds to  $\eta = \eta_c$ , giving:

$$\eta_c = \frac{S_f W}{v_p} \tag{3}$$

148  $\phi$  is the probability that a given patch will be inter-seismically locked ( $\eta > \eta_c$ ). A collection of

adjacent locked patches is termed an 'effective asperity' (Figure 1a).  $\phi$  is also approximately

equivalent to the proportion of the fault consisting of effective asperities, converging to an exact agreement as the number of patches is increased. For the viscosity distribution of the reference

agreement as the number of patches is increased. For the viscosity distribution of

152 model-set, the probability 
$$\phi$$
 is:

$$\phi \equiv P(\eta \ge \eta_c) = \frac{\ln(\eta_{max}) - \ln(\eta_c)}{\ln(\eta_{max}) - \ln(\eta_{min})}$$
(4)

153

154  $\phi$  is controlled by varying W (equation 3) and therefore  $\eta_c$  (equation 4). Variation of  $\phi$  could be

equivalently achieved by varying the normal stress or friction coefficient along the fault and

therefore  $S_f$ , however this would also modify the earthquake nucleation length and stress drop,

so we only vary W for simplicity. We could equally have changed  $v_p$ , but that would also affect

the earthquake recurrence intervals. Note that the definitions of  $\phi$  and  $\eta_c$  assume steady-state

simulations. Our simulations are not steady-state and small proportions of viscous deformation can occur during inter-seismic periods, even for  $\eta > \eta_c$ . Inter-seismically creeping patches can

experience some co- or post-seismic frictional sliding due to the elevated stresses of a

162 propagating earthquake.

163

164 We simulate regional scale variations in loading conditions by changing the key parameter  $\phi$ , as 165 average fault shear stress is shown to vary proportionally with  $\phi$  up to a critical stress threshold

(Figure 2a).  $\phi$  is varied from 0.1 to 1 by varying W from 1000 m to 10 m. We run three models

167 with different randomized realizations of the viscosity distribution for each  $\phi$ , generating

168 statistically significant earthquake catalogues for b-value analysis and testing the sensitivity to

- 169 the randomized distribution.
- 170

As fault shear stress varies spatially and temporally, we calculate the representative fault shear stress  $\tau_{av}$  by calculating the spatially averaged shear stress for each time-step and then taking the

173 temporal maximum (Figure S2).  $\tau_{av}$  is typically the average stress prior to the largest

earthquake. Model dynamics depend on the stress relative to fault strength, not on the absolute

175 stress. Stress is non-dimensionalised as the ratio  $\bar{\tau}_{av}$  between the average available static stress

176 drop prior to the largest event (following the  $\tau_{av}$  definition) and the strength drop (which is also

177 the maximum possible stress drop):

$$\bar{\tau}_{av} = \frac{\tau_{av} - S_d}{S_f - S_d} \tag{4}$$

178 Further modelling methodology details are included in Text S1.

179

# 180 2.2 Analytical asperity model

181 We construct a simplified analytical model for comparison. In this model the fault consists of

182 many permanent patches of identical length w, each with a constant probability  $\phi$  of steady-state

inter-seismic locking and therefore of forming an effective asperity. The probability that a given 183 effective asperity will consist of *n* patches is: 184

185

$$P(n) = (1 - \phi)\phi^{n-1}$$
 (5)

186

To predict the statistics of ruptures, we assume that each effective asperity repeatedly hosts 187 events rupturing that individual asperity only. We assume that a single patch can nucleate an 188 earthquake, which is justified by the fact that  $L_{\infty}$  is only 1.2x the length of the smallest patch. 189 We take the patch length w = 550 m, which is the average patch length in the QDYN models. 190 From this simple probabilistic model, we calculate estimates of the b-value (derivation fully 191 described in Text S3). 192

193

#### **3 Results** 194

Models are run for 2,000 years, including a 500-year run-in period that is excluded from 195

analysis. Earthquake stress drops are defined as the change in shear stress throughout an 196

earthquake over the region it ruptured. Stress drops are relatively constant (standard deviation of 197 198 4 MPa) with an average  $\Delta \tau_{av} = 17$  MPa (74% of the maximum possible strength drop  $S_f - S_d$ ), within the range of seismological observations (Abercrombie, 1995). Events with  $M_w > 5.5$ 199 tend to have lower stress drops (~7 MPa), because large ruptures can pass through low stress 200 regions, as discussed by Lambert et al. (2021). 201

202

The average stress  $\tau_{av}$  increases linearly with increasing locking probability  $\phi$  (Figure 2a), 203

before plateauing at a peak value of approximately  $S_f - \Delta \tau_{av}$ . We define the value of  $\phi$  where 204  $\tau_{av} = S_f - \Delta \tau_{av}$  as  $\phi_v$ . While  $\tau_{av} < S_f$ , fault segments locally reach  $S_f$  to nucleate earthquakes, 205 which can propagate through regions with  $\tau < S_f$ . We also derive  $\tau_{av}$  from the expected value of 206 average viscosity (Text S3.1), giving equation 6, which depends on the choice of viscosity 207 contrast  $\Delta \eta = \eta_{max} - \eta_{min}$  and agrees with the numerical results. 208

209

$$\tau_{av} \approx \begin{cases} \phi S_f + \frac{(1-\phi)S_f}{\Delta \eta^{0.5(1-\phi)}} & \phi < \phi_y \\ S_f - \Delta \tau_{av} & \phi > \phi_y \end{cases}$$
(6)

210

The relationship between  $\phi$  and  $\tau_{av}$  is therefore clear, where high fault-scale shear stress reflects 211 an increased likelihood of patch locking. 212

213

At low  $\phi$  and  $\tau_{av}$ , earthquakes are generally limited to small isolated effective asperities (black 214 stripes in Figure 1b). Earthquakes rarely propagate into adjacent creeping regions, and are 215 restricted to low magnitudes ( $M_w < 5.7$  and on average  $M_w \sim 4$ ). 216

217

With increasing  $\phi$  and consequently higher  $\tau_{av}$ , effective asperities of increasing sizes can host 218

larger earthquakes (Figure 1c-d), that also occasionally span multiple asperities. Small 219

- 220 earthquakes also persist, both hosted on small effective asperities and occurring as partial
- ruptures of larger effective asperities. When  $\phi = 0.61$ ,  $\tau_{av} = 47$  MPa ( $\bar{\tau}_{av} = 0.43$ ) and 221

- earthquakes with  $M_w < 6.9$  occur, propagating through regions undergoing inter-seismic creep (interpreted as barriers)  $\leq 1$  km wide (Figure 1d). Large events occur less frequently than small
- events, and with greater displacement, as occurs in natural scaling relationships. The largest
- events in the reference model-set occur when  $\phi = 1$  (W=10 m) and have  $M_w < 7.4$ , reaching the
- limit at which ruptures are restricted by fault length.





236distributions of viscosity (identical between models) and effective asperities are237shown.



Figure 2. Variation of average shear stress (a) and magnitude statistics (b) between models with different patch locking probability  $\phi$ . a) Equation 6 is shown for the reference model-set (black

line), with (solid) and without (dashed) capping at a stress  $S_f - \Delta \tau$ . Lower and higher viscosity

contrasts are also shown by light and dark blue lines respectively. b) The G-R fit (solid lines) and

- analytical solution (equation 8) are shown (dashed lines).
- 245 246

# 247 **3.1 Magnitude recurrence distribution and b-value**

The recurrence times of seismic events are generally approximated by the G-R law (Figure 2b). This power-law is fit to the numerical data using a linear regression. Uncertainty is estimated by measuring the b-value for random subsets (1/3) of the data and taking the standard deviation. The minimum cut-off magnitude  $M_c$  for the G-R fit appears to be ~4.5, corresponding to a lengthscale of 904 m, larger than the average patch length.

253

The b-value increases with decreasing  $\phi$  and  $\tau_{max}$ , reflecting the decreased likelihood of large

events with decreasing stress. The exact b-value is ambiguous for  $\phi \sim 0.1$ , due to a small  $M_w$ 

range. Many b-values are within the range of b-values compiled by Nishikawa and Ide (2014) for

subduction zones and all are within the wide range reported in the literature for all settings (El-Isa & Eaton, 2014). The maximum  $M_w$  increases approximately linearly with increasing  $\phi$ , up to

the occurrence of fault-spanning ruptures at  $M_w \sim 7.5$  (see also Figure S3).

260

261 To understand the cause of this G-R law, we derive the magnitude recurrence distribution for the

262 analytical asperity model (Text S3.1-3.4). The expected number of asperities having length L(assumed to be an integer multiple of w) or larger is:

263 (assumed to be an integer multiple of w) or larger is:

264

$$E(W \ge L) = \frac{L_f(1-\phi)\phi^{\frac{L}{w}}}{w}$$
(7)

265

 $L_f$  is the total fault length and this prediction agrees with the numerical data (Figure S7). If each effective asperity ruptures repeatedly with stress drop  $\Delta \tau$ , the expected number of events with length larger than *L* is:

269

$$E(N \ge N_L) = \frac{(1-\phi)^2 \gamma \chi_a(\phi) L_f}{w^2} \sum_{n=L/w}^{\infty} \frac{\phi^n}{n}$$
(8)

270

for  $\gamma = tv_p G/(c_s \Delta \tau)$ , geometric constant  $c_s$ , sampling duration t, shear modulus G and asperity seismic coupling  $\chi_a$ . The infinite sum converges because  $\phi < 1$ , so large ruptures are increasingly improbable. Event length is converted to  $M_w$ , as  $L \propto 10^{0.5M_w}$  for constant  $\Delta \tau$ , giving the magnitude-recurrence relationship (dashed lines, Figure 2b). Equation 8 is not a power-law, instead tapering off at high  $M_w$ . It has a similar slope to the data and is a good approximation, but underestimates the number of large magnitude events when  $\phi \ge 0.5$ , likely because ruptures propagate between the effective asperities at high  $\phi$  in the numerical models. 279 We find an equivalent b-value, by calculating the tangent of equation 8, evaluated at a length-

scale *L* (ideally slightly higher than the length-scale for  $M_c$ ), giving:

$$b \equiv -\frac{d \log_{10} E}{dM_w} = \frac{L}{2w} \left( \frac{\sum_{k=0}^{\infty} \frac{\phi^k}{(k+L/w)^2}}{\sum_{k=0}^{\infty} \frac{\phi^k}{k+L/w}} - \ln \phi \right)$$
(9)

281

282 This expression is well approximated for  $\phi < 0.95$  and  $L/w \sim 1$  by:

283

$$b = \frac{1}{2} - 0.27\phi^2 - \frac{L}{2w}\ln(\phi)$$
 (10)

284

285 This b-value only depends on  $\phi$  and L/w. Equation 8 is tangent to the G-R law at  $M_w = 5$  for

the numerical models (Figure 2b), corresponding to L = 1.6 km, (compared to w = 550m),

giving L/w = 3. In this case, the b-value range of 2.5 to 0.3 in nature (El-Isa & Eaton, 2014) corresponds to  $\phi = 0.26$  to 0.97.

289

Equation 10 reproduces the decrease of b-value with increasing  $\phi$ , and agrees well with the

numerical models (Figure 3a). The exact and approximate solutions are mostly indistinguishable.

292 The b-value estimate is converted to a function of  $\tau_{av}$  using equation 6. The stress cut-off at  $S_f$  –

293  $\Delta \tau_{av}$  explains the sharp decrease of b-value at  $\tau_{av} = 43$  MPa ( $\overline{\tau}_0 = 0.26$ ).

294





Patch Locking Probability ( $\phi$ ) Figure 3. a-b) b-value of the numerical models as a function of  $\phi$  (a) and  $\tau_{av}$  (b). Marker styles 297 depict the reference model-set (outlined) and alternative viscosity distributions (see legend). The 298 uncertainty in b-value fit and variation in  $\tau_{av}$  within each set of random models are shown by 299 vertical and horizontal bars. The bi-modal distribution model-set does not follow the G-R 300 301 distribution and is omitted. a) The exact (red dashed line) and approximate (solid line) analytical predictions, equations 9 and 10 are shown. b) Equation 10 is shown as a function of stress (solid 302 line), with light and dark blue dashed lines for smaller and larger viscosity contrasts. c) Natural 303 304 b-value estimates (modified from Scholz, 2015) are compared to equation 10 (black line), assuming L/w = 1 and  $\tau = m\phi$ , where various values of m are labelled in MPa. A case L/w =305 3 is also shown (dashed line). d) Seismic coupling for all models (marker styles following a). 306 307

308

#### 3.2 Viscosity distribution sensitivity 309

310

311 We tested the sensitivity of our results to the imposed viscosity probability distribution, using

additional model-sets (symbols in Figure 3a,b,d) with smaller or larger viscosity contrasts, or 312

following power-law or bi-modal (either high or low viscosity) distributions (Text S2; Figure

S4). The characteristics of these various models collapse onto similar curves when framed in

terms of  $\phi$ , as predicted by the analytical model. All model-sets approximately reproduce the G-

R law, except the bi-modal distribution, which is also bi-modal in  $M_w$ . Variation of statistics

- between model-sets arises when instead plotted in terms of shear stress, as also predicted by equation 6.
- sis equation o.

# 319 4 Discussion

Our models analyze the underlying mechanism responsible for the variation of b-value with

321 stress, observed experimentally and in nature. A fault with significant strength variation must be

322 loaded to a relatively high stress for an earthquake to grow to a large magnitude, which has been 323 interpreted to imply that relatively permanent fault properties, such as roughness, control both

rupture characteristics and fault stress (Fang & Dunham, 2013). Loading stress depends on

tectonic setting and can therefore contrast between faults. Dublanchet (2020) explored the

influence of stress, varied by changing effective normal stress, on b-value in a rate-and-state

earthquake cycle model, but found that this simultaneously affects the nucleation length and

leads instead to an increase in b-value with increasing shear stress. We have modelled

earthquake cycles on a fault-zone that can be loaded at arbitrary regional shear stresses, by

incorporating viscous creep that limits the peak loading stress. Using this method, we can

331 successfully reproduce the relationship between b-value and shear stress, without invoking

- 332 variations in frictional properties.
- 333

The distribution of asperities and creeping regions on subduction megathrusts has been

associated with geometrical and rheological heterogeneity at length scales of 100 m to 1 km

336 (Kirkpatrick et al., 2020), which correspond to our modelled patches. Large earthquakes span

distances of 10-100 km and variation in seismogenic behavior has been linked to geometric

heterogeneity at such large wavelengths (van Rijsingen et al., 2018). Alternatively, large

earthquakes may be hosted on many small asperities which rupture collectively at high stress

(Tormann et al., 2014), corresponding to our modelled effective asperities. In this case, the
 distribution of earthquake sizes and nucleation sites depends on a combination of inherited

properties at small scales and tectonic stress at larger scales. There is subsequently uncertainty in

using asperity geometry to constrain the maximum  $M_w$ , as they may change effective size or link

together with changing stress. The approximate reproduction of the G-R law with our analytical

345 model with uniform patch lengths also indicates that the G-R law does not necessarily reflect 346 power-law distributions of fault properties, but could be a statistical effect dependent on stress.

346 347

We propose that regional shear stress is linked locally to the probability  $\phi$  that a fault segment is

locked, which controls variations in earthquake statistics. Similar probabilistic dependence on

stress has been proposed to explain b-value variation (Huang & Turcotte, 1988; Scholz, 1968), which we expand on by demonstrating its validity for an earthquake cycle model and with the

derivation of a statistical model. In our numerical models  $\phi$  is related to viscous creep, but the

ability of our simplified viscosity-independent analytic model to reproduce similar statistics

demonstrates that the link between earthquake statistics,  $\phi$  and stress may be more general,

explaining its occurrence in experimental data (Scholz, 1968) and nature (discussed next).

In Figure 3c we compare the derived b-value relationship to the natural data of Scholz (2015),

who combined estimated tectonic stresses with b-value data from Spada et al. (2013). We apply a factor of 0.5 to their differential stress to convert it to invariant shear stress. The ~100 MPa

 $_{360}$  stresses shown are higher than the ~10 MPa stress scale used in our models, maybe reflecting

intra-plate stress compared to the lower stress on plate interfaces (Duarte et al., 2015). Our

362 models only depend on the stress relative to frictional strength and can be rescaled. We assume

that  $\tau = m\phi$  (where *m* is an arbitrary constant), motivated by the linear relationship in our models (Figure 2a), though neglect the stress cut-off because there is no sharp b-value decrease

at high stress in the data. We also assume L = w. Despite the simplifications of our asperity

model, the natural decrease in b-value with increasing stress approximately follows the predicted

logarithmic trend. An alternative case with L > W overestimates the b-value variability with stress. Most of the data points are in the range 0.8 < b < 1.2, for which the asperity model

369 predicts that the probability of fault segments being inter-seismically locked or close to failure

ranges from 25% to 55%, depending on stress. This is in contrast to the view that the crust is

uniformly critically stressed (Townend & Zoback, 2000). Spatial variability in criticality,

potentially corresponding to  $\phi$ , was mapped by Langenbruch et al. (2018), who found that

induced seismicity was more easily triggered in particular regions in the intra-plate USA.

374

 $\phi$  may be inferred from estimates of seismic coupling  $\chi$  (Figure 3d). We calculate  $\chi$  as the ratio of the total accumulated seismic slip to the total loading displacement in the numerical models, which is equivalent to both seismic and inter-seismic coupling.  $\chi$  is relatively insensitive to the

choice of viscosity distribution and increases monotonically with  $\phi$ , though following a slightly non-linear relationship (detailed in Text S2 3)

380

non-linear relationship (detailed in Text S3.3).

381 Our models relate b-value and stress, providing future opportunities to integrate tectonic stress

data into probabilistic seismic models. While the maximum  $M_w$  depends on stress in our models, it is underestimated by the asperity model, likely depending on more complex rupture dynamics.

Intra-plate stress has plausible variation sufficient to cover a wider range of seismogenic

behavior (Figure 3c). In subduction megathrusts, under-stressing may occur through the

occurrence of pressure solution creep, which is ubiquitous in exhumed megathrusts (e.g.

Fagereng & Sibson, 2010; Kirkpatrick et al., 2021). Geodynamic estimates indicate a  $\sim 20\%$ 

variation in plate interface shear stress between subduction regimes (Beall et al., 2021;

Dielforder et al., 2020), which is sufficient to drive significant contrasts in seismicity in our

numerical models. The inferred change in  $\phi$  may then provide a mechanism to explain proposed

variations of b-value with subduction stresses (Nishikawa & Ide, 2014; Scholz & Campos,

392 2012). As inter-seismic coupling is often well constrained in subduction zones from geodetic

data, the link between  $\phi$  and  $\chi$  could also be used to constrain  $\phi$  and test our model predictions

394 as more geophysical observations become available.

# **5 Conclusions**

We use numerical models to demonstrate that a visco-frictional fault with a heterogeneous

397 distribution of viscously creeping and frictionally locked patches can host earthquakes that

follow the Gutenberg-Richter law. The modelling shows that the decreasing relative contribution

of creep at higher driving stresses can explain the empirical link between *b*-value and stress.

400 Analytical models indicate that this relationship can be interpreted more generally in terms of the

401 probability that fault areas of various sizes are critically stressed. These first model applications

- 402 highlight the potential to apply earthquake cycle models that incorporate stress-dependent inter-
- 403 seismic locking in understanding regional contrasts in seismogenic behavior and earthquake
- 404 statistics.

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# 414 **Open Research**

- 415 The models described are available in an online repository at
- 416 https://doi.org/10.5281/zenodo.6153898.
- 417
- 418

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