

Funding:



Topological properties of aftershock clusters in a viscoelastic model of quasi-brittle failure

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https://meetingorganizer.copernicus.org/EGU2020/EGU2020-4948.html

The presenting author will be also available from **10:45-12:30 CET** on the same day **4 May 2020**, at chatroom: *https://meetingorganizer.copernicus.org/EGU2020/EGU2020-6334.html*

Please, feel free to leave comments at any other time before 30 May 2020, at the same links.

Note: blue texts are hyperlinks redirecting to supplementary material in this document and external links.

Material failure at different scales and processes can be modeled as an emergent feature of **micromechanical** systems in terms of **avalanche dynamics**. Among experimental observations, event-event triggering —aftershocks— is a common feature in seismological catalogs, acoustic emission experiments [1] and even other phenomena. In parallel, the statistical properties of triggering in such catalogs are often modeled as stochastic **epidemic branching** or **linear Hawkes** processes [4,5]. In the **micromechanical** approach, **viscoelastic** stress transfer and after-slip are among the proposed mechanism behind triggering and aftershocks.

Here we address a simple question: *Do aftershock sequences obtained in micromechanical models agree with the predictions and ideas behind the epidemic branching framework?*



We introduce two **fibrous models** as prototypes of **viscoelastic fracture** [2] which (i) provide an analytical explanation to the acceleration of activity in absence of critical failure observed in acoustic emission experiments [3]; (ii) reproduce the typical spatio-temporal properties of triggering found in field catalogs, acoustic emission experiments; and (iii) agree with the one-to-one causality established in epidemic models, but display discrepancies with the branching topological properties predicted by stochastic models. These are probably caused by physical constrains and nonstationary parameters.

[1] J. Baró et al., *Phys. Rev. Lett.* 110 (8), 088702 (2013);

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[5] S. Saichev, et al., Pure and App. Geoph., 162 (6), 1113-1134 (2005).







2. Epidemic Aftershock Sequence Models (ETAS) \leftrightarrow Galton-Watson Branchin \bigcirc R M

The Epidemic Aftershock Paradigm [4]:

• Catalogs are modeled as a linear Hawkes process (ETAS):

$$\mu(t, \mathbf{r}, m) = \rho(m)\mu_0(t, \mathbf{r}) + \sum_{i|t_i < t} \rho(m)n(m_i)\Psi_i(t, \mathbf{r}|t_i, \mathbf{r_i})$$

considering: - Gutenber-Richter: $\rho(m) \sim 10^{-b(m-m_c)}$ - productivity law: $n(m_i) := k_c 10^{\alpha(m_i - m_c)}$

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• ...or specifically as a Galton Watson **branching** process exhibiting a transition from Poisson (swarm-like) clusters to scale-free (burst-like) offspring depending on α/b . (details)

 $X_i(m_i) \sim \text{Pois.}(n(m_i)); \text{ as GW}:$

$$P(X_i = x) = \frac{b}{\alpha} \frac{k_c^{\frac{b}{\alpha}}}{x!} \Gamma(x - b(\alpha, k_c))$$
only depends on $0 < \alpha/b \le 1$ and $n_b \equiv k_0 / \left(1 - \frac{\alpha}{b}\right)$.

*Notice that the branching interpretation explicitly considers **one-to-one causal links**. The Hawkes interpretation does not.





Consider a bundle of a number *M* of equal parallel fibers $\{l\}$: $\varepsilon_l = \int J d\sigma_l$; each with a random strength S_l ; A **global load** σ is shared in individual **local loads**: $\sigma_l(t) = w_l(t)\sigma(t)$; (i) At time *t* a fiber is broken if $\exists t' | S_l < \sigma_l(t' < t)$; if so: $w_l(t) \to 0$; (ii) Conservation imposes: $\sum_l w_l = 1 \to \text{load must be redistributed}$; (iii) Sharing Rule: **democratic (DFBM)** (mean field)[2]: $w_l(t) = N_{S < \sigma(t)}^{-1}$ **local (LFBM)** (*k* = 4 n.n. in a 2d-lattice): $\delta\sigma_{i \in \text{nn}(l)} = \sigma_l/k$;





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(iv) Creep compliance ($\Delta \epsilon(t) = J(t)\Delta \sigma_l$): elastic kernel : $J_{\text{EL}}(t) = 1/E$;



• Avalanches are caused by simultaneous failure of several fibers (with similar strength in the example of DFBM).





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• Avalanches are split in causally connected clusters.

• The magnitude of **transient hardening** (*h*) controls avalanche statistics.

 $S_i S_{i+\Delta^I}$

 $S_{i+\Delta^I}$

S.





DEMOCRATIC FIBER BUNDLE MODEL

- Acceleration to failure $(d\Delta/df_{\sigma}(f_{\sigma}))$ is invariant [2], but
- viscoelasticity trades **critical avals.** for **foreshocks** [2]. ↓
- Observed in acoustic emission experiments [3]. →













Democratic Fiber Bundle Model

• All avalanche sizes are i.i.d. as Borel depending on f_{σ} : $\rho(\Delta; f_c) = (f_c \Delta)^{\Delta - 1} e^{-f_c \Delta} / \Delta!$ (details).







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- Considering $m = \log_{10} \Delta$ this implies b-value = 0.5; $\alpha \approx 0.8$ ($\alpha/b = 1.6 > 1$).
- Triggering is sorted by parent (see model) rendering unrealistically (non-ETAS) 'combed' trees;







2-D Local Fiber Bundle Model

• No analytic solution. Critical failure for $S_i \sim \text{Weibull}(k(h))$, being k(0) = 1.36.

 $P(\Delta) \sim \Delta^{-1-b} \exp(-(\Delta/\Delta_c)^b)$ with $b \sim 0.7$, a cutoff $\Delta_c(h)$ & productivity exponent $\alpha(h)$.









The exponent values in the DFBM imply: $\alpha/b = 1.6 > 1!!$ (unphysical) BUT, failure is sub-critical (no divergence of (number of offsprings²))











 10^{3}

 10^{4}







Power-law avalanches can occur with h > 0 (unlike the DFBM)

Transition from swarms to bursts is observed by tunning h.

Global exponents (table here) do not fully satisfy expectations from ETAS.

This is corrected by considering the non-stationary evolution of statistical parameters corresponding to the phase transition. (WIP not shown here)





7. Conclusions:



► Epidemic models (ETAS) interpret aftershock sequences as:

(1) **linear Hawkes' processes** with an intensity factorized in empirical terms accounting for: mainshock mag., and spatio-temporal and mag. distribution.

(2) a Galton-Watson **branching forests** with one-to-one causal links, independent offspring production and a transition between **Poisson** and **power-law** offspring distribution.



► Avalanches in **micromechanical models** of viscoelastic fracture can be triggered by external driving (mainshocks in terms of seismology) or one-to-one causal triggering (aftershocks) and reproduce *qualitatively* the expectations of the ETAS model.



- (1) Aftershocks are defined by one-to-one causal links, leading to branching.
 (2) Explain the origin of acceleration in absence of critical avals. at failure
 (3) Reproduce the expected cluster classification depending on physical parameters. We find bursts for high viscosity (*h*) and swarms for low.
- (4) To reproduce *quantitatively* all topological features we must consider physical constrains and non-stationary parameters in the ETAS model (WIP).



Supplementary Information



Epidemic Type Aftershock Sequence Model (ETAS) [Y. Ogata, JASA (1988)]:

$$\Psi(\Delta, t, \mathbf{r}|m_i, t_i, \mathbf{r_i}) = \rho(\Delta)n_b(\Delta_0) \Psi_t(t - t_0)\Psi_r(||\mathbf{r} - \mathbf{r_0}||)$$

 $\left.\begin{array}{l}\rho(\Delta)\sim\Delta^{-1-b}\\\\n_b(\Delta_0)\sim\Delta_0^\alpha\end{array}\right\}$

Results depend only on $\langle n_b \rangle$ and α/b . $0 \le \alpha/b < 0.5$ *typical* Galton-Watson $0.5 \le \alpha/b < 1$ special case [*A. Saichev, et al.* (2015)]





Epidemic Type Aftershock Sequence Model (ETAS) [Y. Ogata, JASA (1988)]:

$$\Psi(\Delta, t, \mathbf{r}|m_i, t_i, \mathbf{r_i}) = \rho(\Delta)n_b(\Delta_0) \Psi_t(t - t_0)\Psi_r(||\mathbf{r} - \mathbf{r_0}||)$$

$$\left. \begin{array}{l} \rho(\Delta) \sim \Delta^{-1-b} \\ \\ n_b(\Delta_0) \sim \Delta_0^{\alpha} \end{array} \right\}$$

Results depend only on $\langle n_b \rangle$ and α/b . $0 \le \alpha/b < 0.5$ typical Galton-Watson $0.5 \le \alpha/b < 1$ special case [A. Saichev, et al. (2015)]











Triggering in the ETAS model





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h	0.2	0.5	0.9
$b_{ m eff}$	0.8	1.2	7.0
α	0.78	0.72	0.58
$\frac{\alpha}{b_{\alpha}}$	0.975	0.600	0.082
n_b	0.171	0.413	0.675
$\gamma_x^{\mathrm{mod}} = 1 + b/\alpha$	2.03	2.67	13.1
$\hat{\gamma}_x$	4	5	13
$\gamma_s^{ m mod,h} = 1 + b/lpha$	2.03	2.67	13.1
$\gamma_s^{\mathrm{mod},\mathrm{l}} = 1 + \alpha/b$	1.96	1.60	1.08
$s_c^{\text{mod}} = (1 - n_b)^{1/(\alpha/b - 1)}$	1775	3.78	3.40
$\hat{\gamma}_s$	2.1	1.9	1.8
γ_d^{sim}	0	0	0.5
$\hat{\gamma}_d$	0.33	0.51	0.59



Adds **dissipation**, **temporal scales** and **power-law memory**. Reproduces the response of certain bulk amorphous materials



Constitutive equation for the generalized Zener Element:

$$\begin{bmatrix} 1 + \frac{X}{E_m} \frac{d^{\alpha}}{dt^{\alpha}} \end{bmatrix} \sigma_l = \begin{bmatrix} 1 + \frac{X(E_m + E)}{E_m E} \frac{d^{\alpha}}{dt^{\alpha}} \end{bmatrix} E\varepsilon.$$
$$\mathbf{H}_{\alpha}(t/\tau) := \frac{E_m}{E_m + E} \mathbf{E}_{\alpha} \left(-\left(\frac{t}{\tau}\right)^{\alpha} \right) \begin{cases} \mathbf{H}_{\alpha}(0) &= \frac{E_m}{E_m + E} := h\\ \mathbf{H}_{\alpha}(t \gg \tau) &\to 0 \end{cases}$$







[J. Baró & J. Davidsen, PRE (2018)]





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Triggering in the FBM with **democratic** load sharing (DFBM)





Triggering in the FBM with democratic load sharing (DFBM)









From constitutive equation: An avalanche start at S_i , stops when: $\sigma(\varepsilon) \ge \sigma(S_i)$



 $\xi(\Delta)$: Poisson counting process of Δ steps.



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 $\xi(\Delta)$: Poisson counting process of Δ steps.

B > 1: Prob. $\Delta \rightarrow \infty$.

B < 1: Borel distribution!

$$D(\Delta; B) = \frac{(|1 - B|\Delta)^{\Delta - 1} \exp(-|1 - B|\Delta)}{\Delta!} \sim \Delta^{-3/2} \mathcal{D}(\Delta|1 - B|)$$

B = 1: Critical $D(\Delta; B) \sim \Delta^{-1.5}$.

[Baró & Davidsen, PRE (2018)]



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1) VISCOELASTICITY & AFTERSHOCKS

Material failure at different scales and processes can be modeled as an emergent feature in terms of avalanche dynamics in micromechanical systems. Event-event triggering -aftershocksis common in seismological catalogs and acoustic emission experiments [1] among other phenomena. Stochastic branching and linear Hawkes processes are used to model the statistical properties of catalogs. In the micromechanical approach, viscoelastic stress transfer and after-slip are among the proposed mechanism of aftershocks.

Here we ask this simple question:

Do aftershock sequences in micromechanical models agree with such epidemic branching paradigm?

We introduce two fibrous models as prototypes of viscoelastic fracture [2] which (i) provides an analytical explanation to the acceleration of activity in absence of critical failure observed in acoustic emission experiments [3]; (ii) reproduce the typical spatio-temporal properties of triggering found in field catalogs, acoustic emission experiments: but (iii) display discrepancies with the branching topological properties predicted by stochastic models, probably due to physical constrains.

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4) ACTIVITY AND AFTERSHOCKS

 Viscoelasticity trades critical avals, for foreshocks [2]. as observed in acoustic emission experiments [3].





2) Epidemic Aftershock Sequence Models (ETAS) \leftrightarrow Galton-Watson Branching (GW) [4]





3) GENERALIZED VISCOELASTIC DEMOCRACTIC AND LOCAL FIBER BUNDLE MODEL (GVE-DFBM & GVE-LFBM) [2]



5) BRANCHING PARAMETERS $(\alpha/b, n_b)$

 'combed' trees; Borel distr.: P(Δ; f_c) = (f_cΔ)^{Δ−1}e^{-f_cΔ}/Δ!. considering $m = \log_{10} \Delta \rightarrow b = 0.5$; $\alpha \approx 0.8$ ($\alpha/b = 1.6 > 1$).

depth



 no analytic solution: crit. fail. at S_i ~ Weibull(α = 1.36). Size distribution: $\Delta \sim \Delta^{-1-b} \exp(-(\Delta/\Delta_c)^b)$ w. $b \sim 0.7$; cutoff Δ_c & productivity (α) depend on h



6) TOPOLOGICAL PROPERTIES OF TRIGGERING TREES

Comparison of trees in DFBM with ETAS model:

- Offspring (X) and tree-size (S) distributions: power law w. $\gamma_s = \gamma_x = 2.5$ ($\alpha/b = 2/3$ in ETAS) From aval. size (Δ) ?: $\int P(\Delta; f_c) df_c \Rightarrow S \sim \Delta(h = 0)$. $(\gamma = 1.5 \text{ at crit. point})$
- Leaf-depths (d_l) scale ~ S^{0.5} like swarms (low α/b). Not as bursts (d indep. of S) expected for high α/b .
- ETAS needs to account for cutoff (correcting α/b > 1) and temporal variations of parameters.







· Distributions (and exponent values) disagree with an ETAS model with the fitted parameters.



2D-Local