

# A dynamical scaling approach to earthquake occurrence

**Lucilla de Arcangelis**

*Second University of Naples*

*IfB, ETH, Zurich*

# Outline

- Phenomenological laws for seismic occurrence
- Critical behaviour and scale invariance
- Scaling hypothesis
- Correlations in seismicity
- Dynamical scaling branching model
- Risk maps
- Generalized Omori law
- Outlook

# How big can an earthquake be?

$$P(>M) \sim 10^{-b M} \quad (b \sim 1)$$

Gutenberg-Richter Law (1954)

→ Seismic moment  $M_0 = m A \Delta u$

$$M = (2/3) \log(M_0) - 6$$

(Kanamori, Anderson 1975)

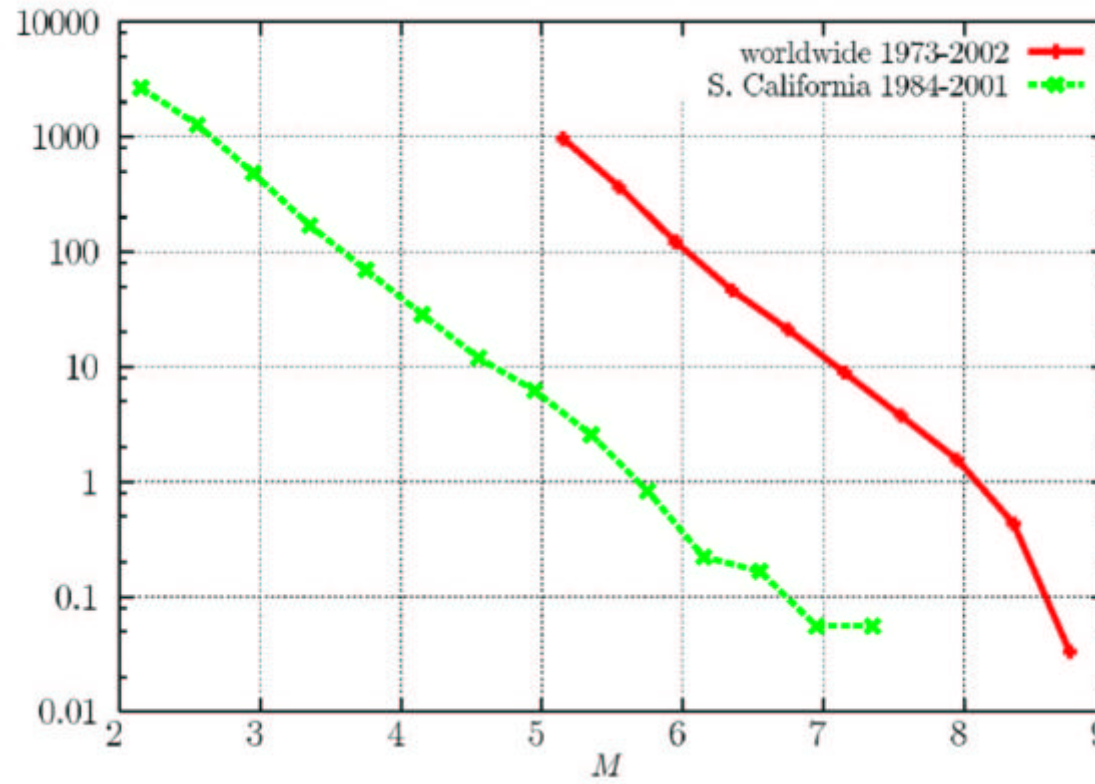
$$P(>M_0) \sim M_0^{-\alpha}$$

→ Energy

$$M = (2/3) \log(E) + \text{const}$$

$$P(>E) \sim E^{-\alpha}$$

Universality of  $\alpha \sim 0.7$



# Sequences of aftershocks

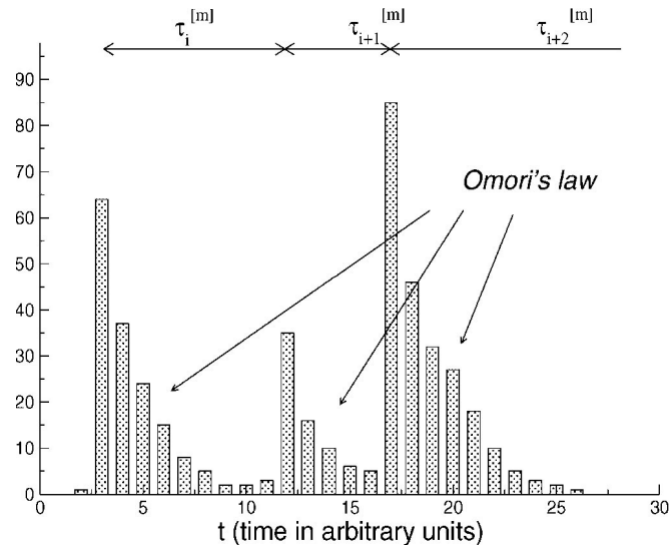
**Omori law** (JCSIUT, 1894)

$$n_{AS}(t) \sim (c + t)^{-p} \quad p \sim 1$$

$c$  depends on  $M$  main shock and  $M$  lower cutoff

(Kagan 2004, Shcherbakov et al 2004, Lise et al 2004)

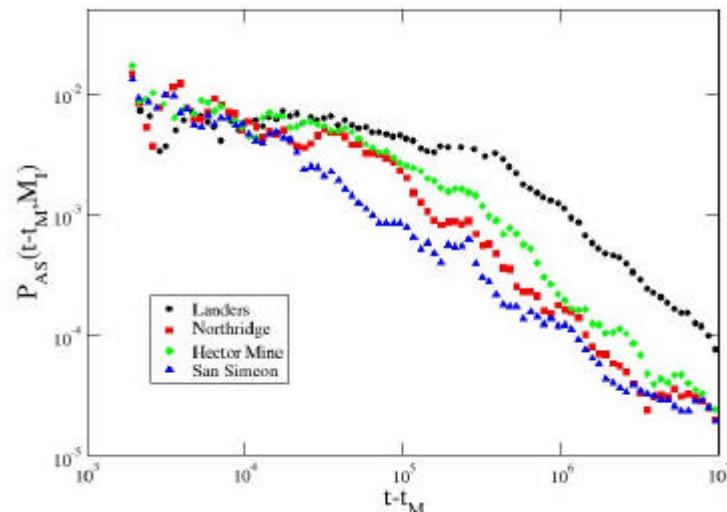
At time  $t$  after a main shock at  $t=0$



**Productivity law**

$$N_{AS}(M) \sim 10^{\alpha M} \quad \alpha \sim b$$

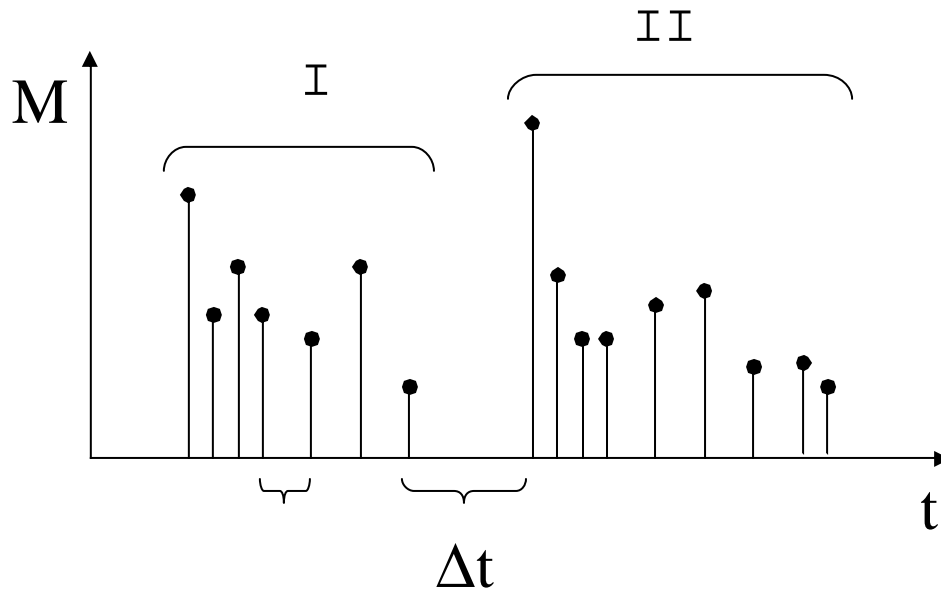
(Helmstetter 2003, Felzer et al 2004, Helmstetter et al 2005, 2006)



# Waiting time distribution

$\Delta t$  time interval between successive events  $M > M_c$  lower cutoff magnitude

All events (foreshocks, mainshocks, aftershocks) are considered on the same footing



→ Bak et al (PRL 2002) divided California in sub-regions of size  $l$  and computed the distribution  $N(\Delta t, M_c)$  in each sub-region. They find the unified scaling law

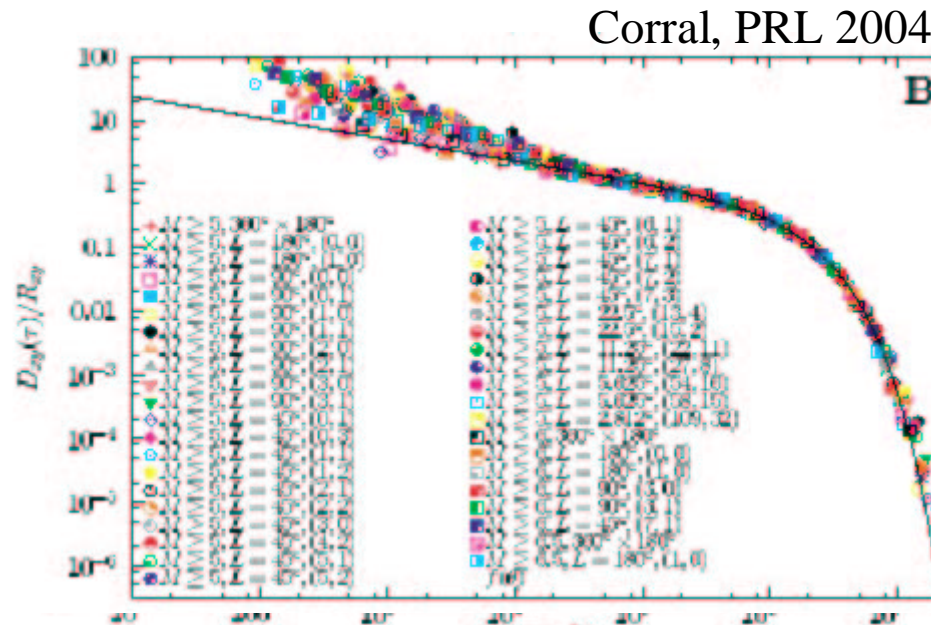
$$\Delta t^a N_{l, M_c}(\Delta t) = f(10^{-bM_c} l^{d_f} \Delta t)$$

Average number of events with  $M > M_c$  occurring in a region of size  $l$  in the time range  $\Delta t$

→ Corral (PRL, 2004) rescaling  $\Delta t$  by the average rate in the area → universal scaling law for the probability density

$$D(\Delta t, M_c) = R(M_c) f(R(M_c) \Delta t)$$

holds also for Japan, Spain, New Zeland...  
scaling function not universal (different areas are characterized by different rates)



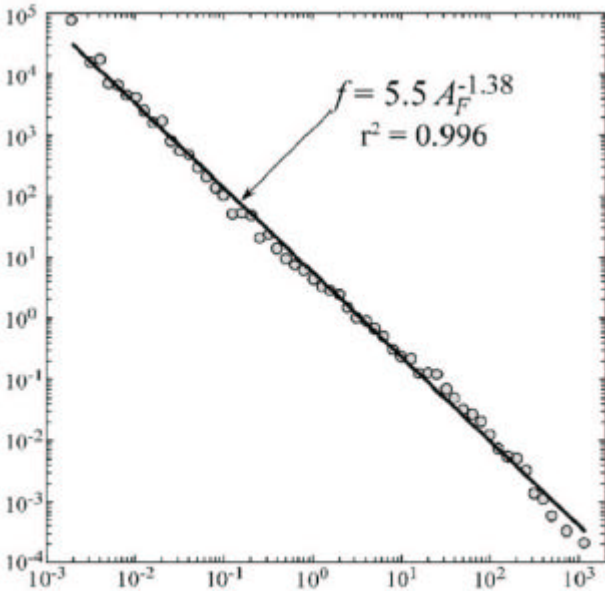
# Clustering

Omori law  temporal clustering

Spatial clustering 

- Earthquakes are clustered along hierarchical fault structures
- Ipocenter distribution has fractal dimension  $d_f \approx 2.2$   
(Kagan and Knopoff, GJRAS 1980)
- Correlation dimension for epicenters  $D_2 \approx 1.5$   
(Helmstetter and Sornette, PRE 2002)
- Generalized dimensions for the epicenter distribution of California and Southern Italy (Davidsen and Goltz, GRL 2004; Godano et al, GJI 1996)
- Scale free networks of aftershocks, degree distribution has exponent  $? \approx 2$ .  
(Baiesi and Paczuski, PRE 2004)

# Power laws in natural hazards

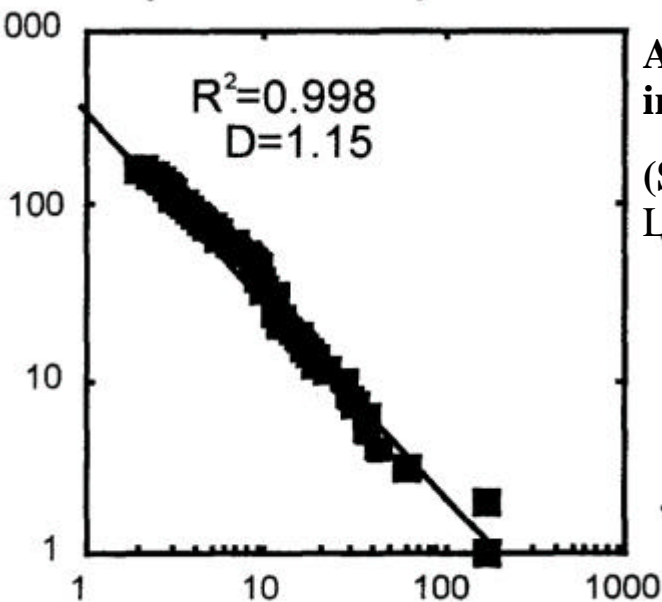


**Forest fires in Ontario (Canada) 1976-1996**

Turcotte & Malamud 2004

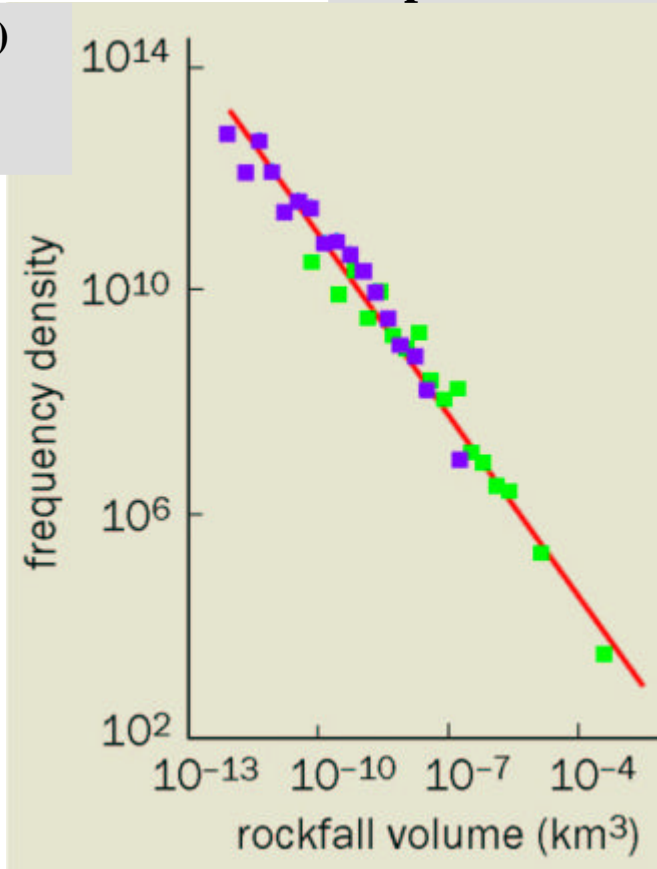
**Rockfall in Umbria (1997)  
& Yosemite (1980-2002)**  
Malamud 2004

**Exponent 1.1**



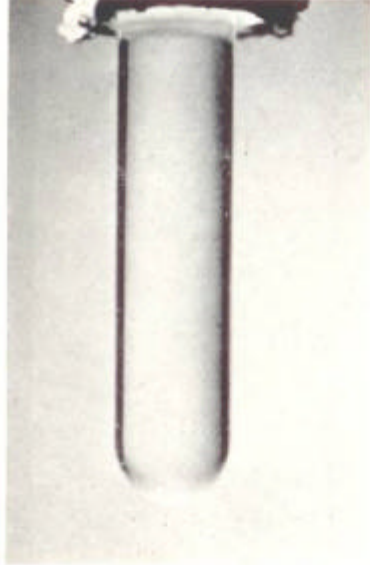
**Areas covered by lava  
in volcanic eruptions**

(Springerville, Arizona)  
Lahaie & Grasso 1998





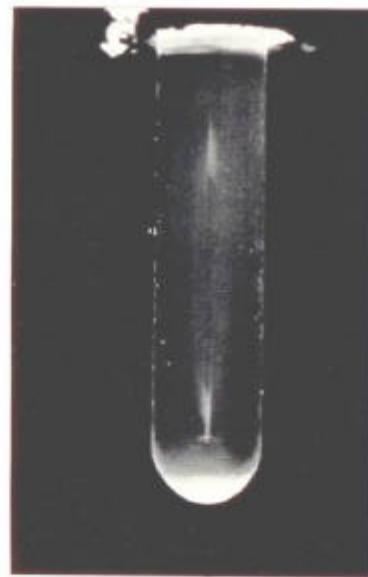
$$T \gg T_c$$



*a*



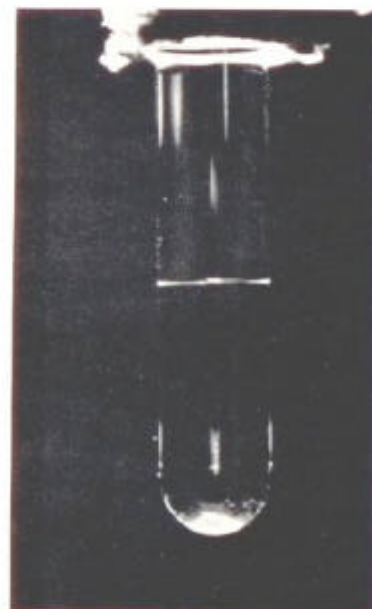
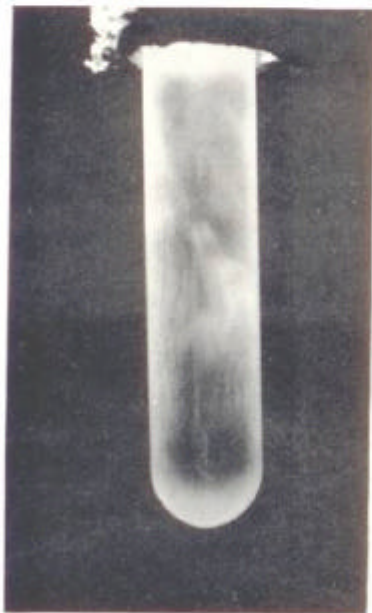
*b*



*c*

**critical opalescence**

$$T \approx T_c$$



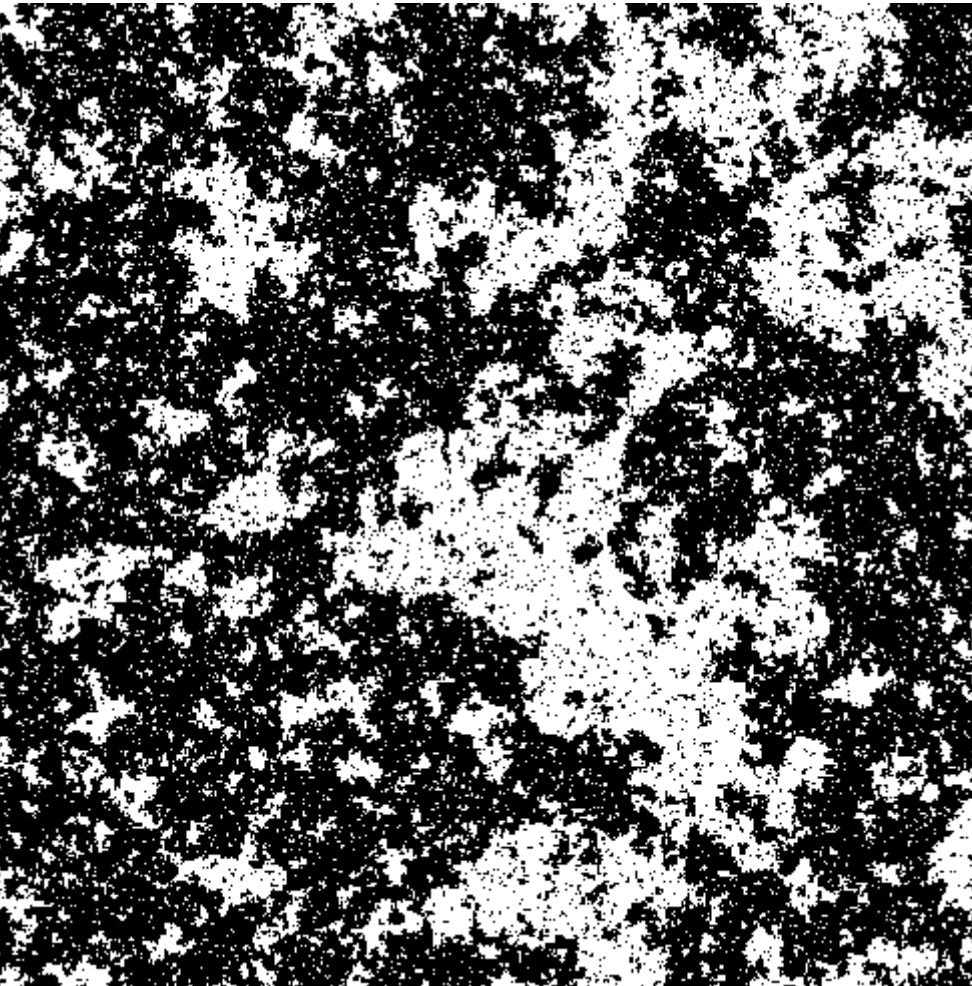
$$T \ll T_c$$

• clusters of all possible sizes are present

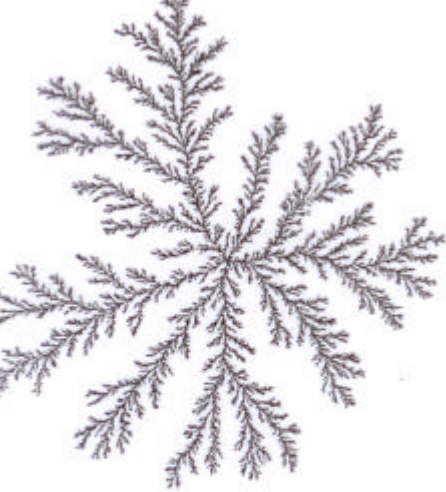
• divergence of correlation range

• divergence of fluctuations

• **Self-similarity**  $\longrightarrow$  the largest cluster is **fractal**



**At the critical point**  
**physical properties behave as**  
**power laws**



a



b

Self-similarity



c

**Diffusion Limited Aggregation**

# Power laws and scaling

Near the critical point the main physical properties exhibit **power law behaviour**

Nice properties of power laws  $\longrightarrow$  **invariant under rescaling!**

Suppose  $y = f(x) = x^a$

Take the scale transformation  $x \rightarrow x' = bx$   $y \rightarrow y' = cy$

Under rescaling  $f(x) \rightarrow f(x') = cf(x'/b)$

If  $c = b^a$  the function is invariant

$\longrightarrow$  **Scale invariance**  $f(Lx) = g(L)f(x)$   
homogeneous functions

For functions of more than one variable

$$f(\mathbf{l}^a x, \mathbf{l}^b y) = \mathbf{l} f(x, y) \quad \forall \mathbf{l}$$

Choose  $\mathbf{l} = y^{-1/b}$

Obtain

$$f(x, y) = y^{1/b} f(y^{-a/b} x, 1) = y^{1/b} g(y^{-a/b} x)$$

# Are there correlations in seismicity?


The conditional probability  $D_M(\Delta t \mid \Delta t_0)$  of a waiting time  $\Delta t$  following a waiting time  $\Delta t_0$  does depend on  $\Delta t_0$  (Livina et al, PRL 2000)

Systematic analysis of stationary seismicity for world wide and California catalogs in terms of conditional probability distribution indicates: Corral, Tectonophys. 2000

**Positive correlations** between waiting times: short  $\Delta t$  close to each other  
the shorter the time to get an earthquake, the shorter till the next

**Anticorrelation** between waiting times and magnitudes:  
large  $M$  tend to increase number of short  $\Delta t$  and decrease large  $\Delta t$   
the bigger the size of an earthquake, the shorter the time till the next

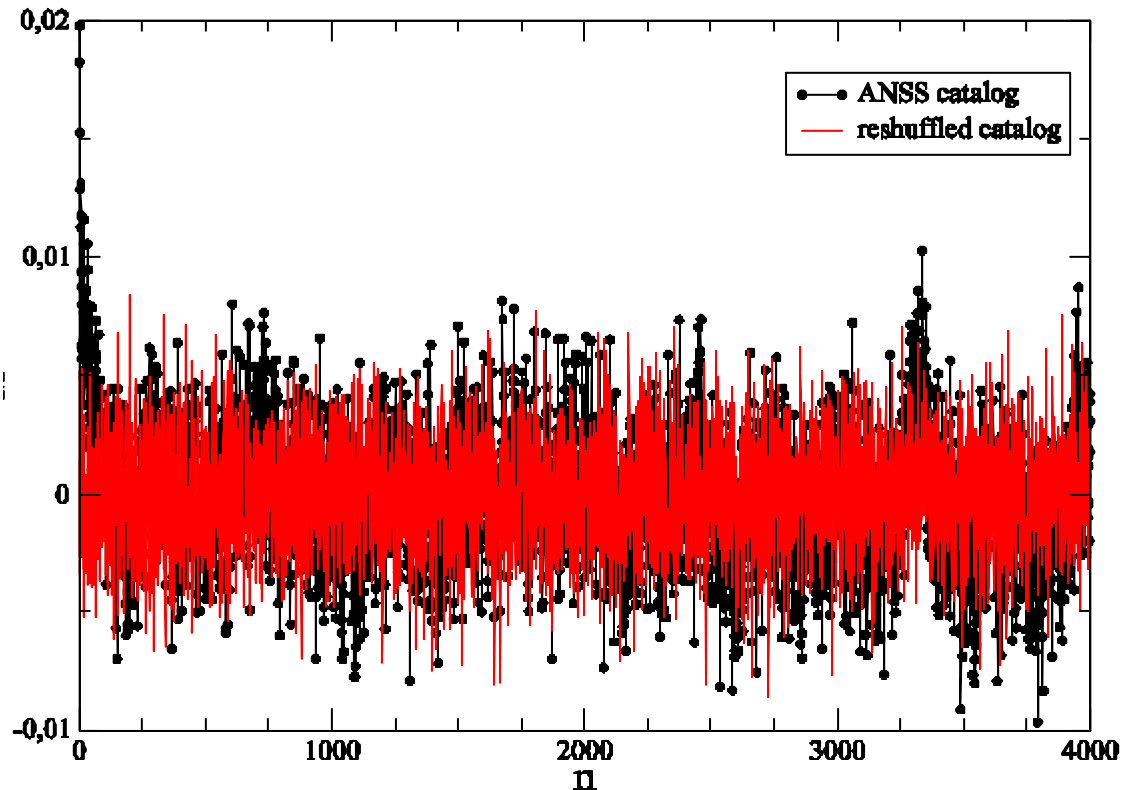
No significant correlations between earthquake magnitudes:  
values comparable with statistical fluctuations  
an earthquake does not know how big it will become

Davidson & Paczuski (PRL 2005)  waiting times and distances between epicenter of successive earthquakes are independent

# Magnitude correlations

Evaluating the  $\langle M_i M_j \rangle - \langle M_i \rangle^2$  gives values comparable with statistical noise

**red data** represent the correlations evaluated in a catalog where magnitudes are reshuffled with respect to occurrence time  $\longrightarrow$  **uncorrelated magnitudes**



# Spatio-temporal correlations

Lippiello, LdA, Godano, PRL 2008

We define for any couple of successive events of the NCEDC catalog:

$$\Delta r_i = |\vec{r}_{i+1} - \vec{r}_i| \quad \text{epicenter distance,} \quad \Delta t_i = t_{i+1} - t_i \quad \text{time distance.}$$

For the magnitude  $\Delta m_i = m_{i+1} - m_i$  and  $\Delta m_i^* = m_{i+1} - m_{i^*}$

where we reshuffle the previous magnitude, with  $i^* \neq i$  a random index

We neglect events in a temporal window  $\propto 10^{m-m_c}$

after each earthquake of magnitude  $m$  (Helmstetter, Kagan, Jackson JGR 2005)

We evaluate the conditional probability

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

# couples of subsequent events with both  
 $\Delta m_i < m_0, \Delta t_i < t_0$

# couples of subsequent events with  
 $\Delta t_i < t_0$



→ We calculate the conditional probabilities  $P(\Delta m_i < m_0 \mid \Delta r_i < r_0)$  and

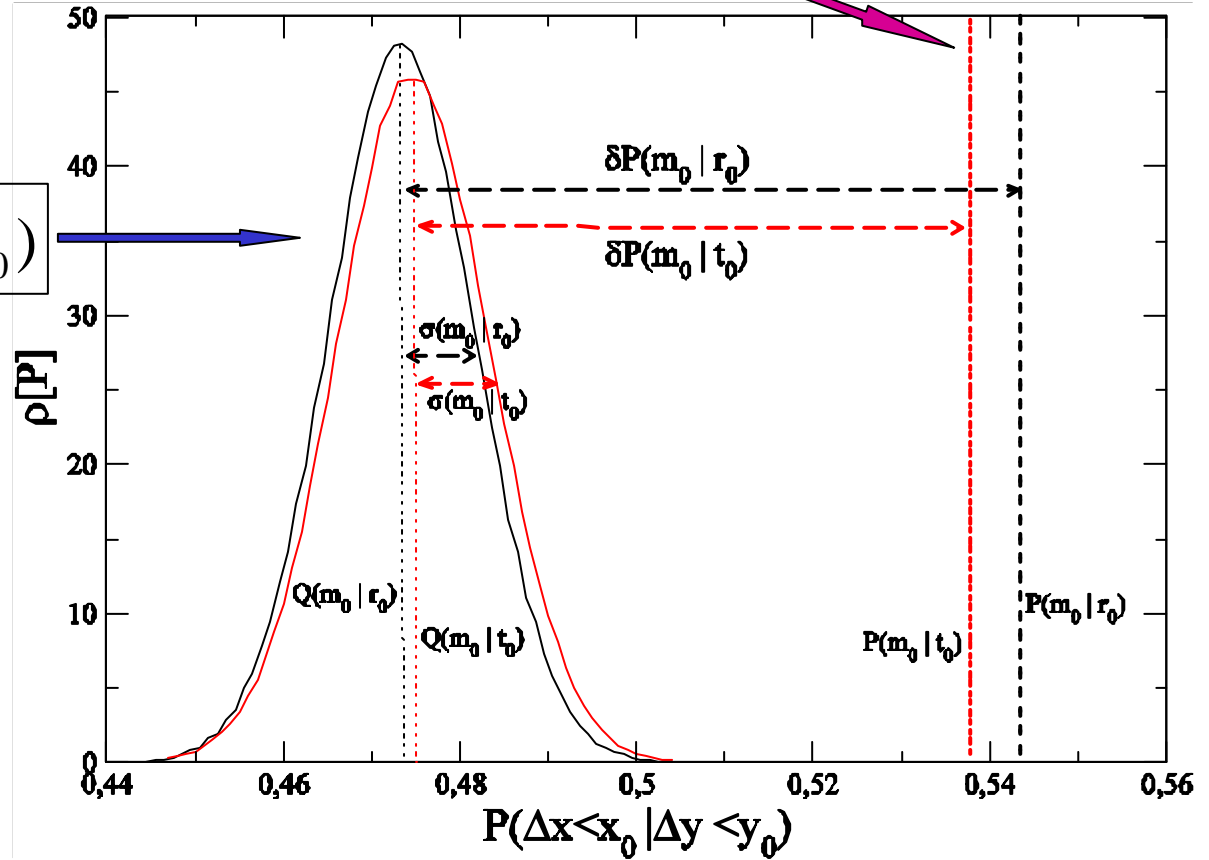
$P(\Delta m_i < m_0 \mid \Delta t_i < t_0)$  in the California catalog

and for  $10^4$  realizations of the reshuffled catalog (Gaussian distributed)

$P(\Delta m_i^* < m_0 \mid \Delta r_i < r_0)$

$P(\Delta m_i^* < m_0 \mid \Delta t_i < t_0)$

$r_0=10\text{km}$   
 $t_0=1\text{h}$   
 $m_0=0$

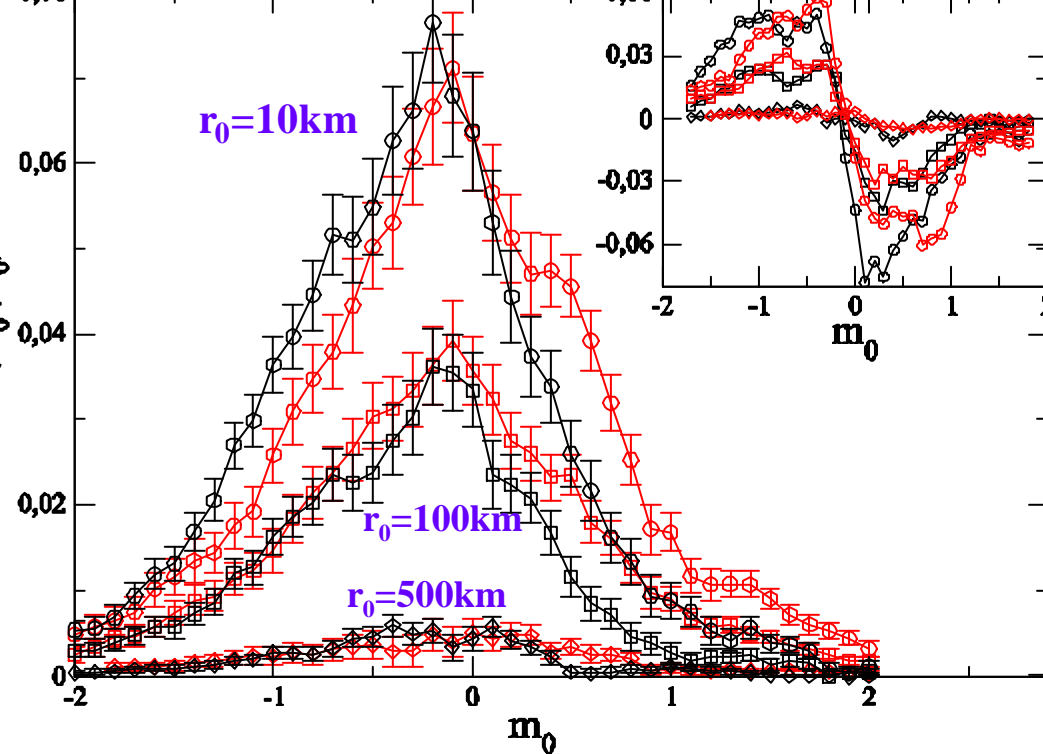


If

$$dP(m_0 \mid t_0) = P(\Delta m_i < m_0 \mid \Delta t_i < t_0) - Q(m_0 \mid t_0) > S(m_0 \mid t_0)$$



Evidence for magnitude correlations



$$\frac{dP(m_0 | r_0)}{dm_0} \rightarrow \text{probability difference}$$

For  $m_0 < 0$  the probability is larger in the real than in the reshuffled catalog where magnitudes are uncorrelated

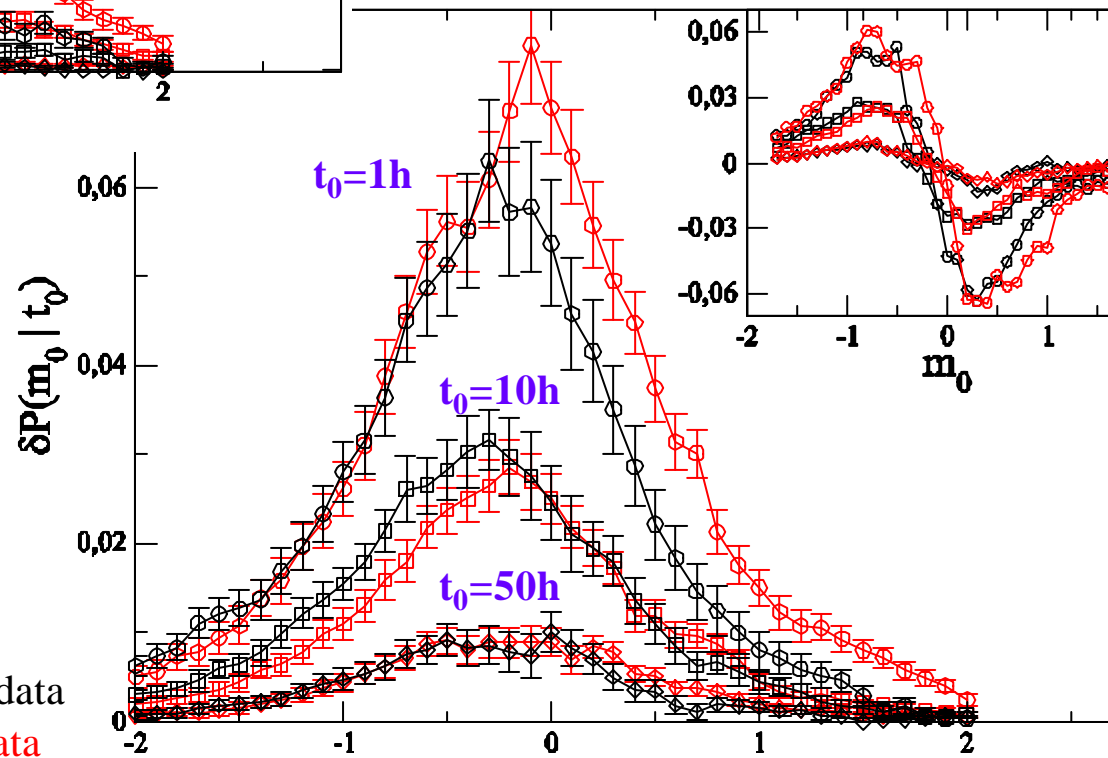
Maximum for  $m_0$  in  $[-1, -0.5]$

Analogously for  $dP(m_0 | t_0)$

The next earthquake tends to have magnitude close but smaller than the previous one

Experimental data

Numerical data

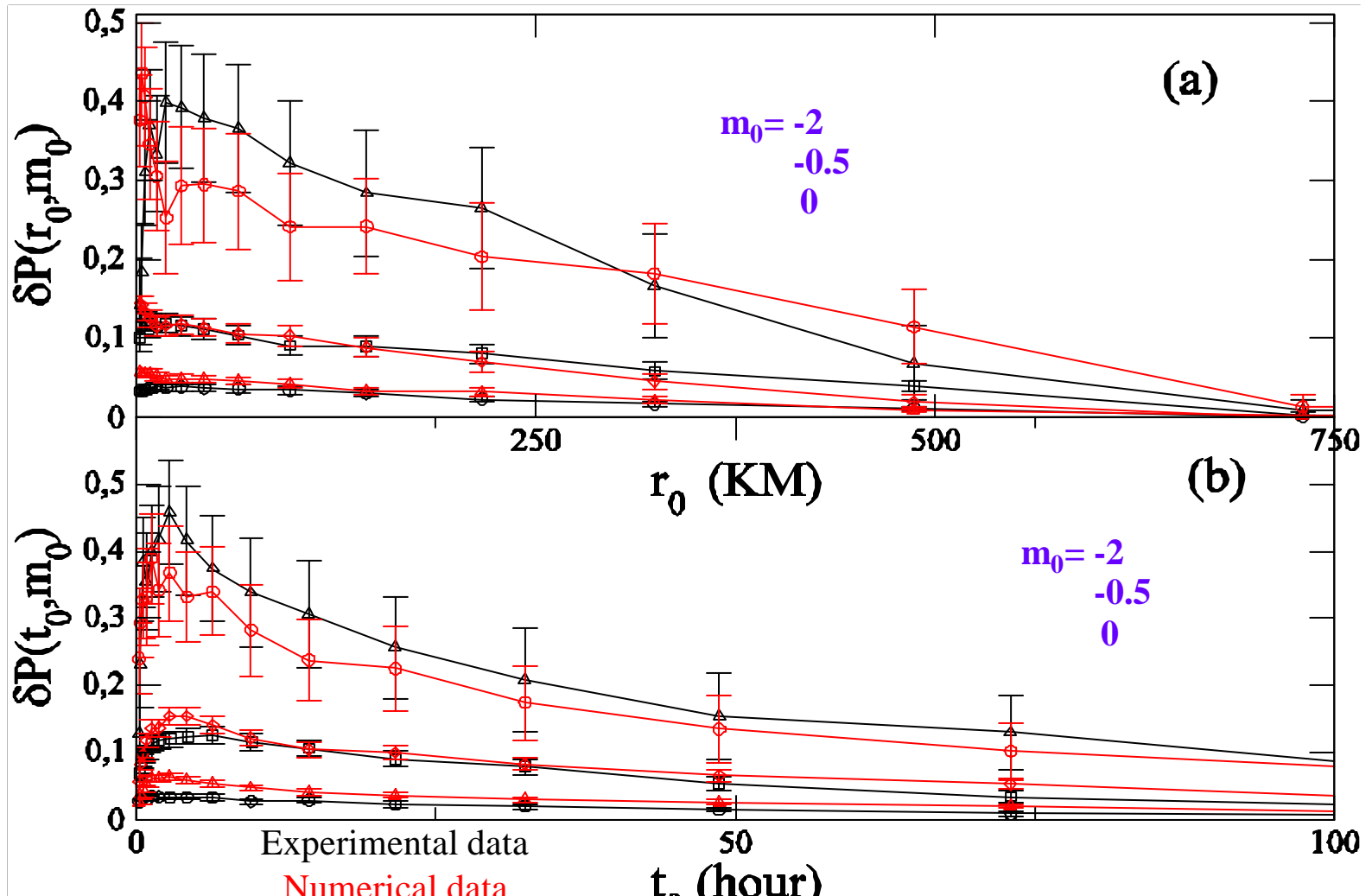


calculating  $P(\Delta r_i < r_0 \mid \Delta m_i < m_0)$  and  $P(\Delta t_i < t_0 \mid \Delta m_i < m_0)$

➡ Influence of temporal / spatial clustering on magnitude correlations

➡ Better description of seismicity if *space - time - magnitude*

correlations are taken into account



# Branching model for seismicity

We treat seismicity as a point process in time, where  $\{m_i(t_i)\}$  the history of past events

Given the history, one assumes that each event can trigger future ones according to a two point conditional rate and therefore the rate of events of magnitude  $m$  at time  $t$  is

$$r(m(t) | \{m_i(t_i)\}) = \sum_{i:t_i < t} r(m(t) | m_i(t_i)) + mP(m)$$

where  $m$  is a constant rate of independent sources and  $P(m)$  their magnitude distribution

In the ETAS model (Ogata, JASA 1988) the magnitude  $m$  is independent of previous events

$$r(M_i(t) | M_i(t_i)) = P(m_i) g(t_i - t_j; m_j) \propto 10^{-bm_i} 10^{am_j} (t_i - t_j + c)^{-b}$$

Magnitude correlations must be introduced via a multiplicative term

$$S(m_i - m_j) = 10^{-d|m_i - m_j|} \quad (\text{Vere-Jones, AAP 2005})$$

# Dynamical scaling

Lippiello, Godano, LdA, PRL 2007, 200

We assume that the magnitude difference fixes a characteristic time

$$t_{ij} = t_0 10^{b(m_j - m_i)}$$

where  $t_0$  is a constant measured in seconds

and that  $\mathbf{r}(m_i(t_i) | m_j(t_j))$  is invariant for  $\Delta t \rightarrow \mathbf{l} \Delta t = \frac{\Delta t}{t}$

*This time represents the temporal scale for correlations:*

*A  $m=2$  earthquake is correlated to a previous  $m=6$  event over a time scale of about 2 years*

*A  $m=5$  earthquake is correlated to a previous  $m=6$  event over a time scale of few days*

Therefore the conditional rate becomes with time rescaled by  $t_{ij}$

$$\mathbf{r}(m_i(t_i) | m_j(t_j)) = F\left(\frac{t_i - t_j}{t_{ij}}\right)$$

where  $F(x)$  is a normalizable function



On the basis of this scaling hypothesis we recover the GR law:

Total number of daughter earthquakes

$$\int_{t_0}^{\infty} \mathbf{r}(m(t) | m_0(t_0)) dt = t_0 10^{-b(m-m_0)} \int_0^{\infty} F(x) dx$$

and the Omori law:

$$\mathbf{r}(m, t - t_0) = \int_{-\infty}^{\infty} \mathbf{r}(m(t) | (m_0(t_0))) P(m_0) dm_0$$

Rate of  $m$  events at time  $t$

$$\propto \frac{10^{-bm}}{t - t_0} \int_{-\infty}^{\infty} F(z) dz$$

# Numerical catalog

By choosing explicitly the function  $F$  we can generate a catalog of events

$$F(z) = A/(z^l + g) \quad \text{or} \quad F(z) = A/(e^z - 1 + g)$$

- At  $t=0$  choose a random event with  $m$  in  $[m_{inf}, m_{sup}]$
- $t \rightarrow t+1$  choose a random  $m$
- Evaluate the probability of the event  $m(t)$  by contribution of all rates due to previous events  $m_j(t_j)$  and constant rate of independent sources  $m$   
$$r(m(t) | m_j(t_j)) = F\left(\frac{t_i - t_j}{t_0 10^{b(m-m_j)}}\right)$$
- Compare probability with random number to select event
- Construct a catalog of 245000 events (30 year California catalog)

 Gutenberg Richter law

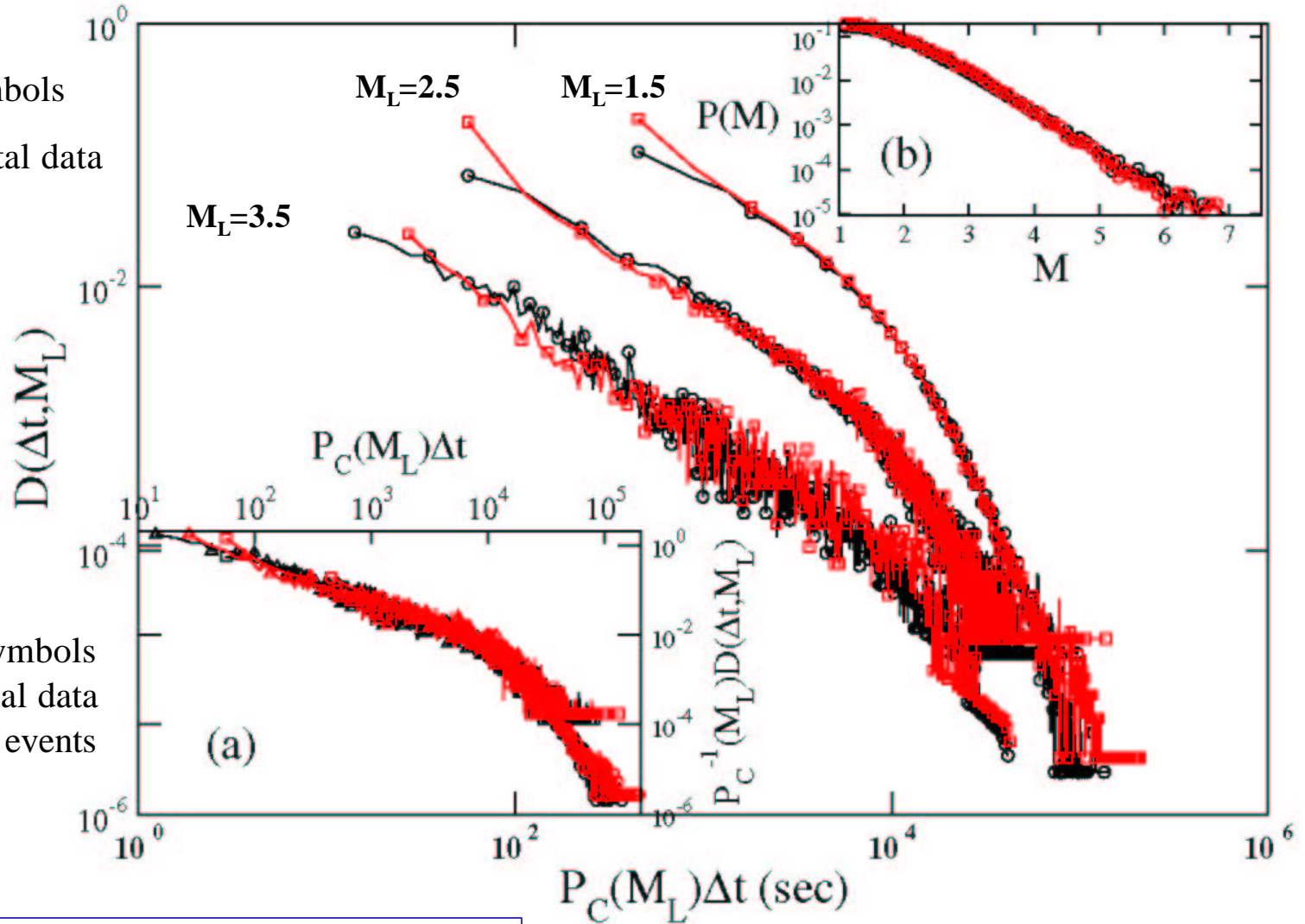
Waiting time distribution

$$F(z) = A / (e^z - 1 + g)$$

Gutenberg Richter law

Red symbols  
experimental data

Black symbols  
numerical data  
245000 events



Waiting time distribution  
rescaled by average rate

$$A = 6.1 \cdot 10^{-5} \text{ sec}^{-1}$$

$$g = 0.1$$



# Spatio-temporal formulation

The probability to have  
the next earthquake in

$$[m, m + \mathbf{d}m] \quad [t, t + \mathbf{d}t] \quad [\vec{r}, \vec{r} + \mathbf{d}\vec{r}]$$

$$P(t, \vec{r}, m) = \sum_j P(t - t_j, |\vec{r} - \vec{r}_j|, m, m_j)$$

f  $\Delta t \rightarrow I \Delta t$

statistical properties are invariant provided that

$$\Delta r \rightarrow I^H \Delta r$$

$$\Delta m \rightarrow \Delta m + (1/b) \log I$$

We introduce **two characteristic time scales**

$$\mathbf{t}_{ij} = k_t 10^{b(m_j - m_i)}$$

$$\mathbf{r}_{ij}^{1/H} = k_r |\vec{r}_i - \vec{r}_j|^{1/H}$$

leading to the scaling behavior with

$$\Delta t_{ij} = t_i - t_j$$

$$\begin{aligned} P(\Delta t_{ij}, \Delta r_{ij}, m_i, m_j) &= \Delta t_{ij}^{-H} G\left(\frac{\mathbf{t}_{ij}}{\Delta t_{ij}}, \frac{\Delta r_{ij}}{\Delta t_{ij}^H}\right) \\ &\approx \Delta t_{ij}^{-H} G_1\left(\frac{\mathbf{t}_{ij}}{\Delta t_{ij}}\right) G_2\left(\frac{\Delta r_{ij}}{\Delta t_{ij}^H}\right) \end{aligned}$$

where

$$G_1(x) = \frac{A}{e^{1/x} - 1 + \mathbf{g}_1} \quad G_2(y) = \frac{B}{y^m + \mathbf{g}_2}$$

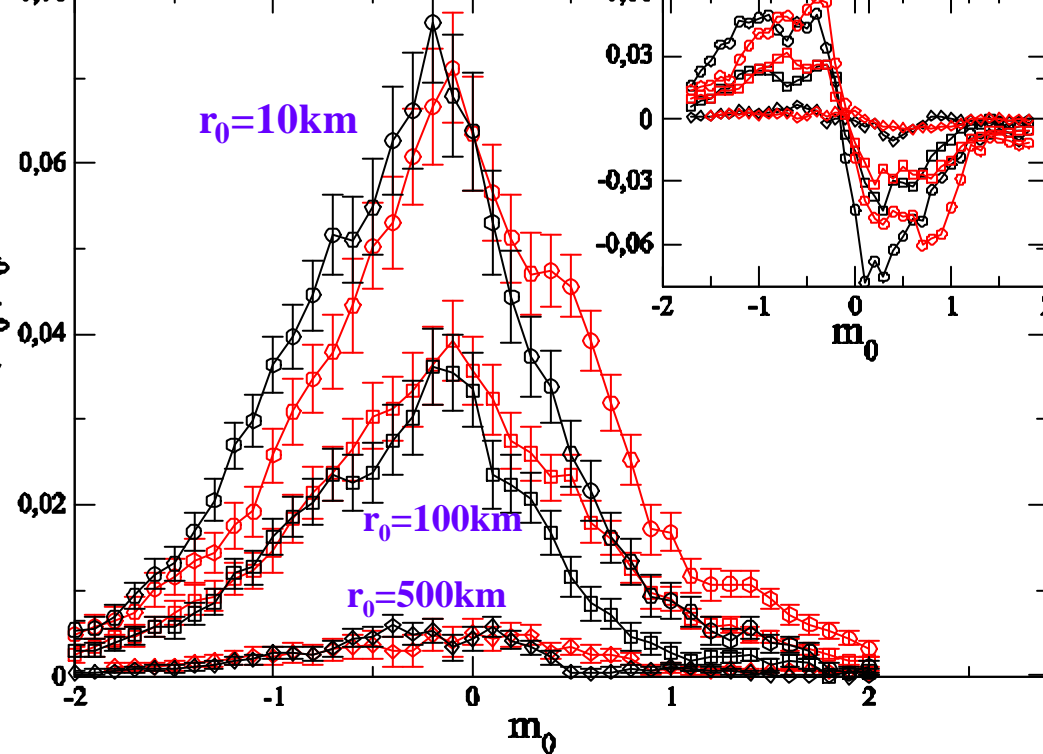
- At  $t=0$  choose a random event with  $m$  in  $[m_{inf}, m_{sup}]$  at random epicenter  $\vec{r}_{j=0}$  on a square lattice
- $t \longrightarrow t+1$  choose a random  $m$
- Evaluate the probability of the event  $m(t)$  by summing contributions of all rates due to previous events  $m_j(t_j)$  and constant rate of independent sources  $m$
- Compare probability with random number to select event
- Choose a mother among all previous events according to the probability  $G_1 \left( \frac{t_{ij}}{\Delta t_{ij}} \right)$
- Given the mother  $m^*(t^*)$  at  $\vec{r}^*$ , determine the epicenter  $\vec{r}_j$  from

$$(t_j - t^*)^{-H} G_2 \left( \frac{|\vec{r}_j - \vec{r}^*|}{(t_j - t^*)^H} \right)$$



$$H \approx 0.5$$

diffusion process



$$\frac{dP(m_0 | r_0)}{dm_0} \rightarrow \text{probability difference}$$

For  $m_0 < 0$  the probability is larger in the real than in the reshuffled catalog where magnitudes are uncorrelated

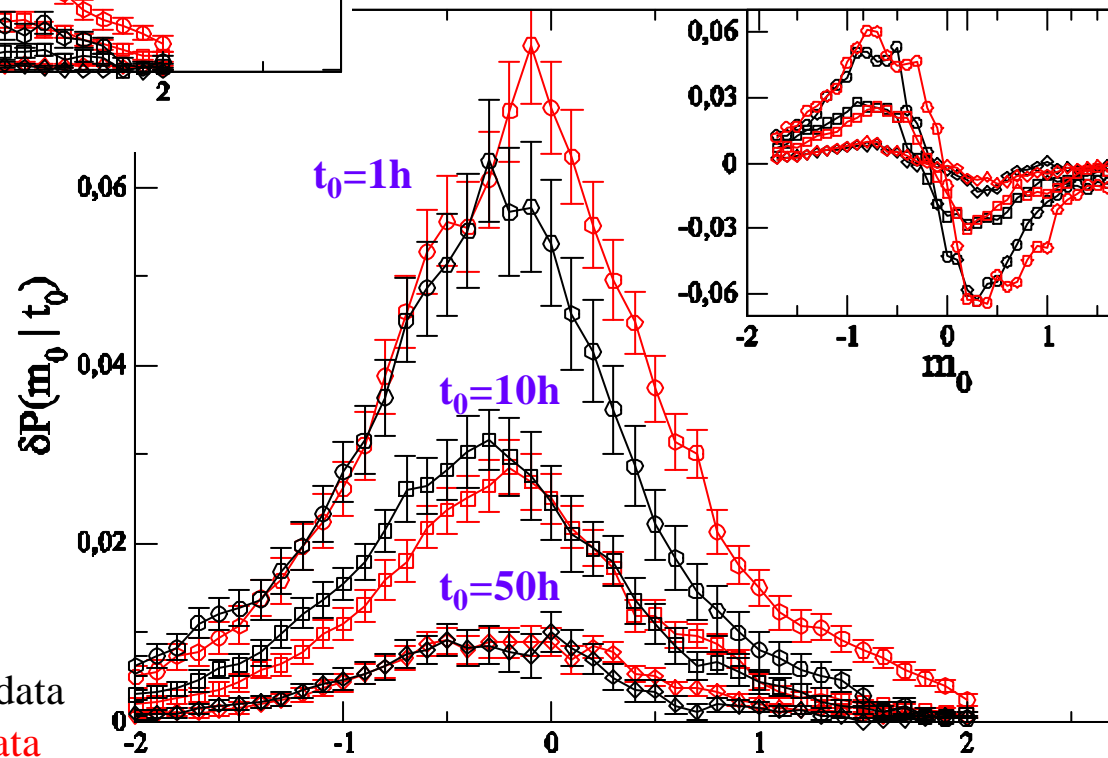
Maximum for  $m_0$  in  $[-1, -0.5]$

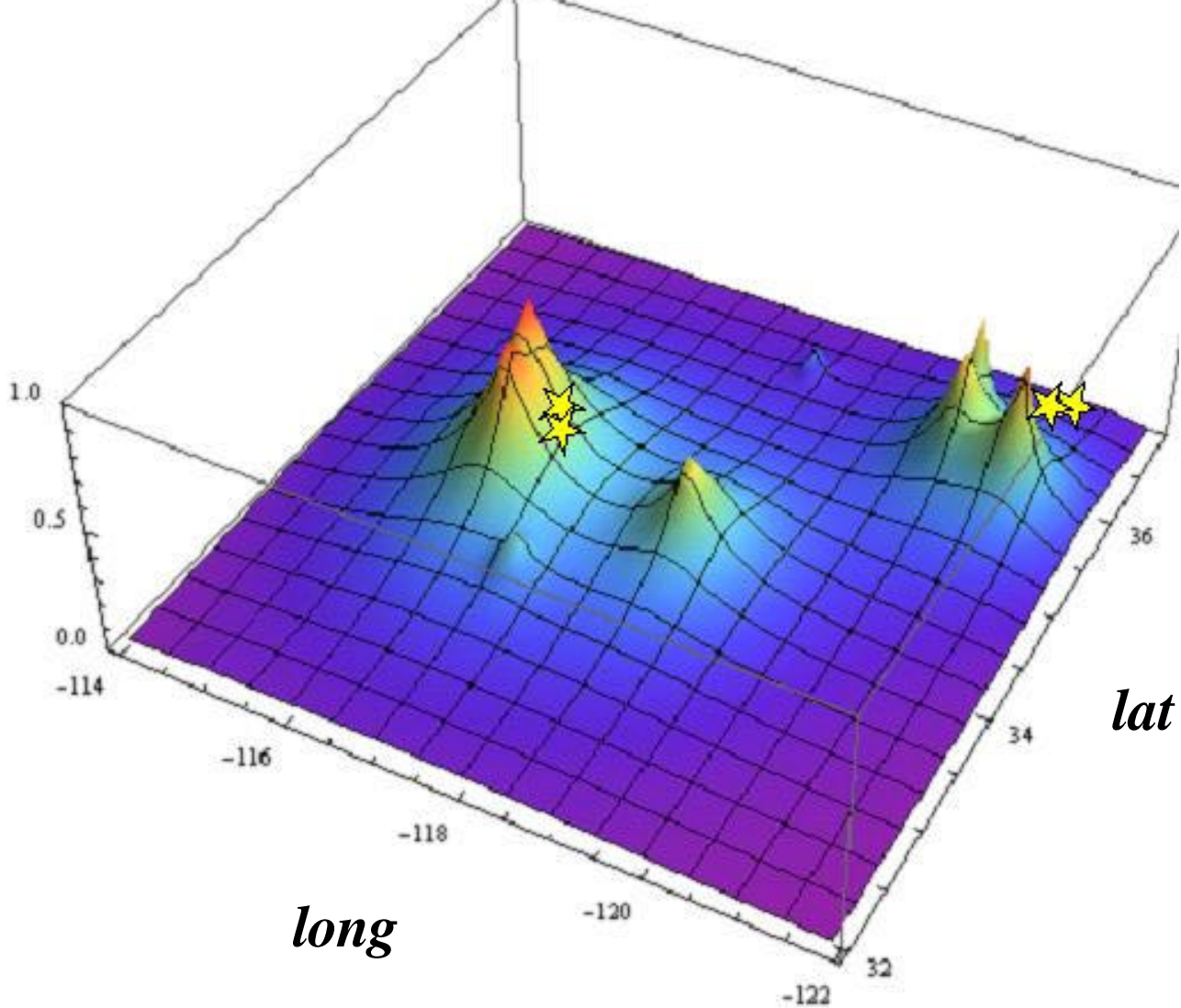
Analogously for  $dP(m_0 | t_0)$

The next earthquake tends to have magnitude close but smaller than the previous one

Experimental data

Numerical data





The probability  $P$  to have  $m \geq 3$  earthquakes during January 2007 due to past seismicity. Recorded events (yellow stars) are closely located near the maximum of  $P$ .

# Generalized Omori Law

Given a main shock  $M_M$  at  $t=t_M$ , the rate of aftershocks with  $M > M_I$

$$n(t) \propto (t + c)^{-p}$$

Shcherbakov et al 2004

$$c(M_I) = c^* 10^{\frac{b-b(M_M - \Delta M - M_I)}{p-1}}$$

• Kagan 2004 STAI  $c = 10^{(M_M - M_I - M_1)/d}$  many small events close to  $t_M$  are lost

➤ We calculate the aftershock probability with the DS approach choosing  $F(z) = \frac{A}{z^p + 1}$

$$P_{AS}(t - t_M, M_I | M_M) = \int_{M_I}^{\infty} dM p(M, t | M_M, t_M) = \frac{A}{b} \log \left[ 1 + \left( \frac{t - t_M}{t_0 K} \right)^{-p} \right] \quad \forall M \geq M_I$$

For  $t - t_M \gg t_0 K$  recover  $(t - t_M)^{-p}$  behaviour

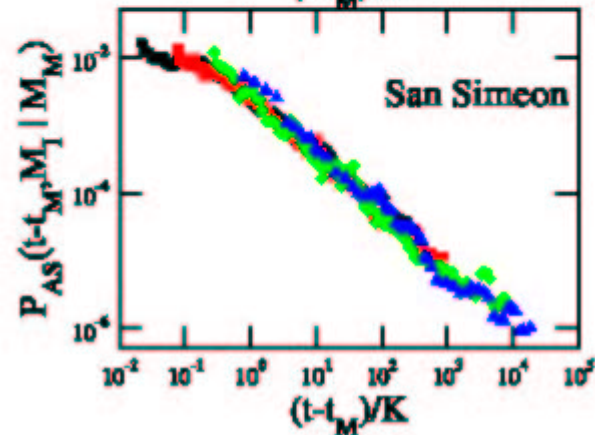
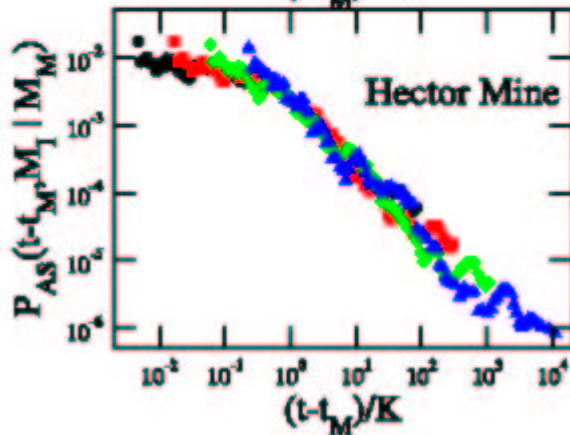
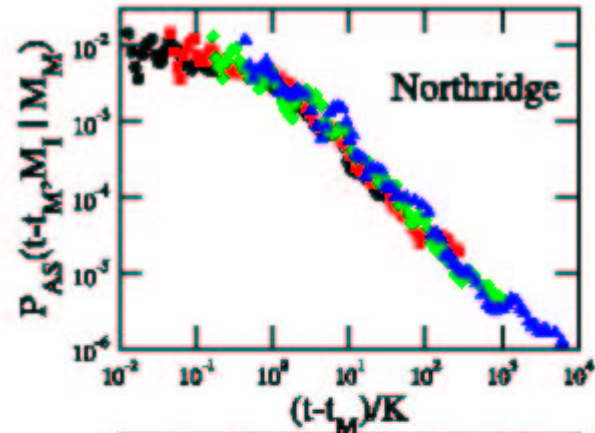
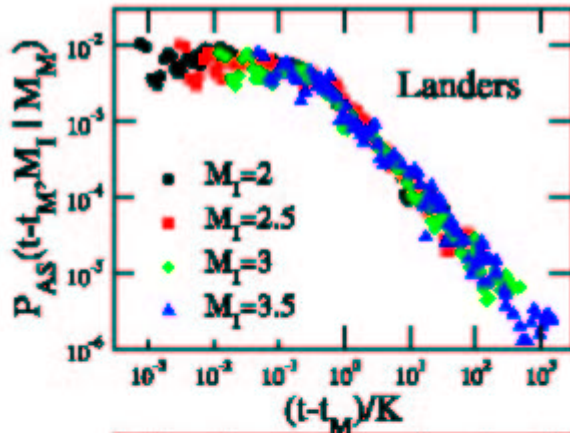
$$c(M_I) = t_0 K = t_0 10^{(b/p)(M_M - M_I)}$$

fixes the onset of the Omori behaviour

$$K = 10^{(b/p)(M_M - M_I)}$$

$M_M=7.3$

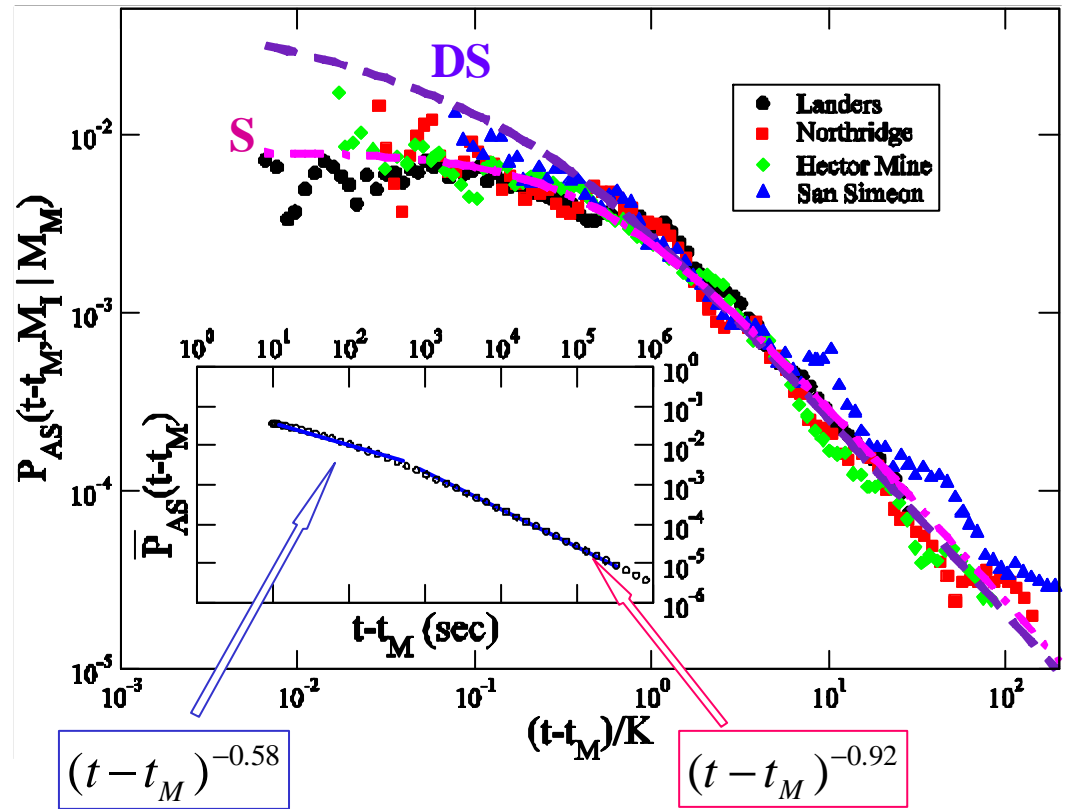
$M_M=6.7$



$M_M=7.1$

$M_M=6.5$

Peng et al made a careful analysis for shallow earthquakes in Japan and found 5 times more events in the first 200 sec after the main event.




$$\overline{P}_{AS}(t-t_M) = \int_3^5 dM_M P_{AS}(t-t_M, M_I | M_M) P(M_M)$$

Peng et al,  
JGR 2007



## Recent results

- Log-Likelihood for the DS model with a PSRS approach (sub. JGR)
- New method for aftershock detection based on variability coefficient (JGR 2009)
- Analysis of inter-time and inter-distance distributions for sequences (characteristic spatial length scale)
- Spatial distribution of aftershocks  static stress triggering scenario (PRL 2009)
- 3d molecular dynamics simulations of granular media within rough faults

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