

# Self-organized criticality and avalanches in spin glasses

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# Outline

- Crackling, avalanches, and “shocks” in disordered, non-linear systems;  
Self-organized criticality
- Avalanches in the magnetizing process (“Barkhausen noise”)
- The criticality of spin glasses at equilibrium – why to expect scale free avalanches
- Magnetization avalanches in the Sherrington-Kirkpatrick spin glass – an analytical study.
- Outlook: electron glasses, finite dimensions...

# Crackling

*Review: Sethna,  
Dahmen, Myers,  
Nature 410, 242 (2001).*

**Crackling** = Response to a slow driving which occurs in a discrete set of **avalanches**, spanning a wide range of sizes.

Occurs **often** but not necessarily only **out-of equilibrium**.

Examples:

- Earthquakes
- Crumpling paper
- Vortices and vortex lattices in disordered media etc.
- **Disordered magnet in a changing external field magnetizes in a series of jumps**

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It is intermediate **between snapping** (e.g., twigs, chalk, weakly disordered ferromagnets, nucleation in clean systems) and **popping** (e.g., popcorn, strongly disordered ferromagnets)

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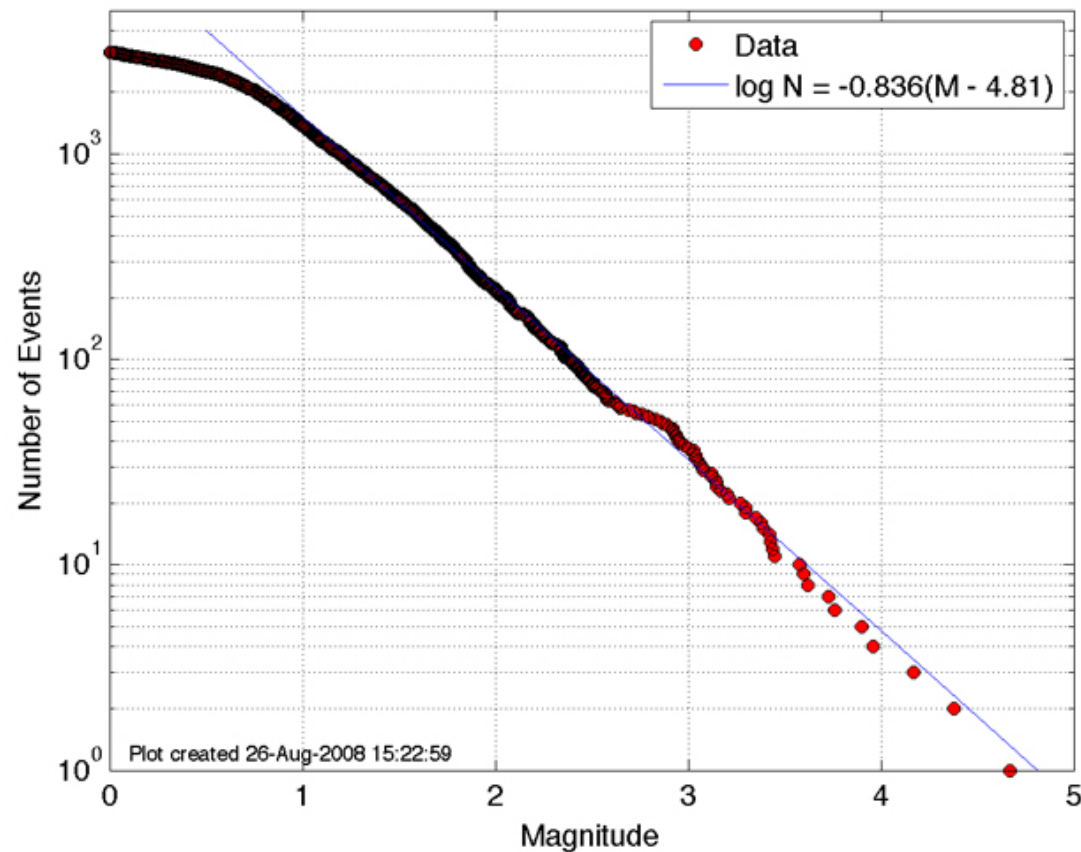
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**Crackling on all scales is generally a signature of a critical state in driven, non-linear systems. It can thus be an interesting *diagnostic*.**

# Examples of crackling I

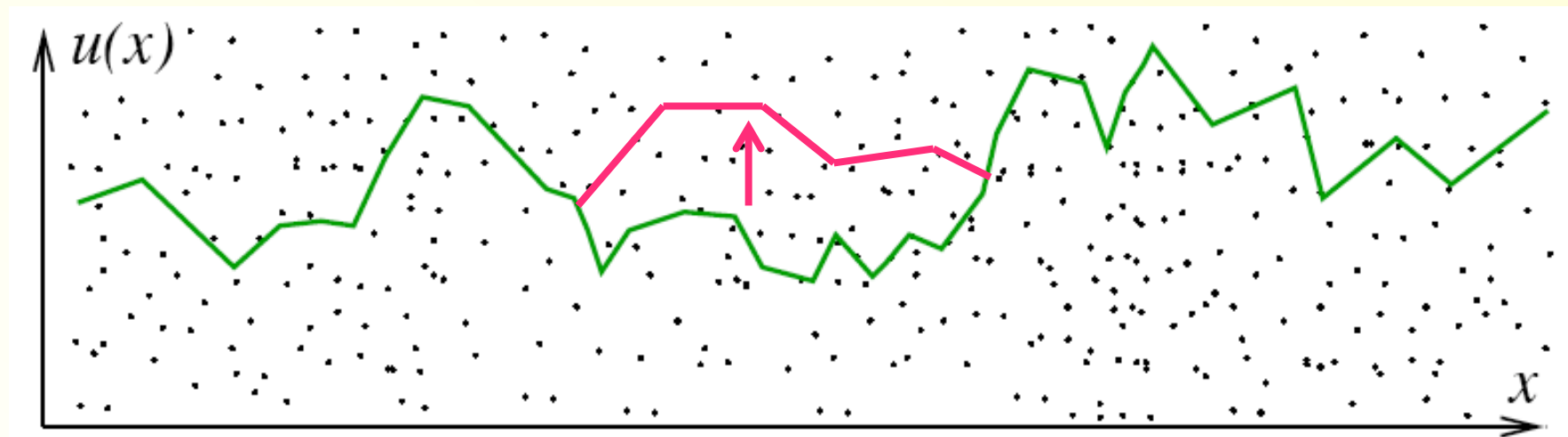
- Gutenberg-Richter law for strength of earthquakes (jumps of driven tectonic plates)



# Examples of crackling II

- Depinning of elastic interfaces

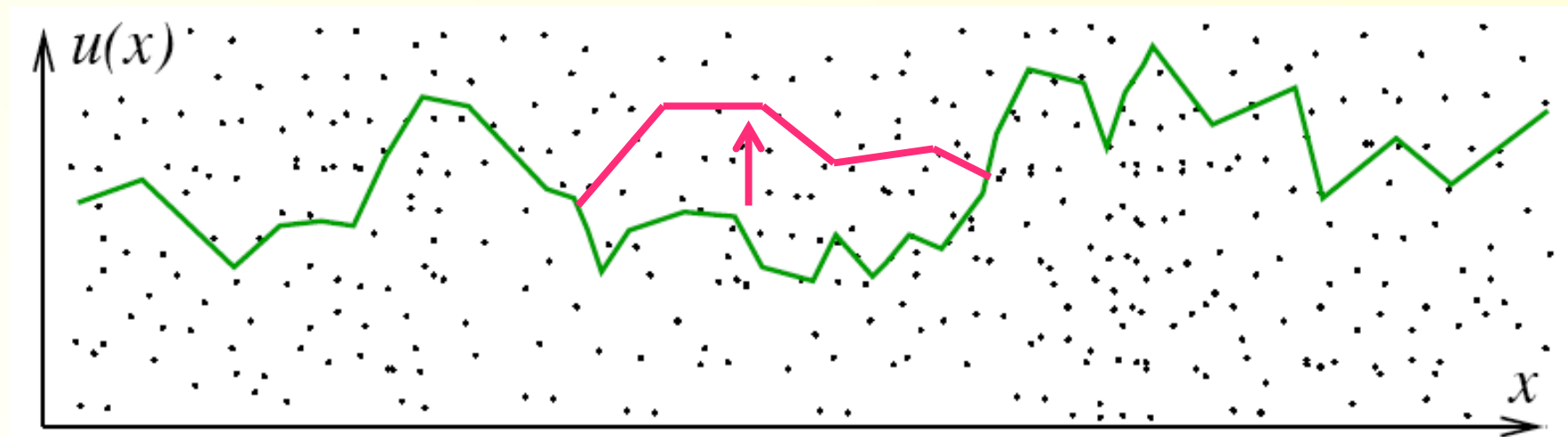
Liquid fronts, domain walls, charge density waves, vortex lattices:



# Examples of crackling II

- Depinning of elastic interfaces

Liquid fronts, domain walls, charge density waves, vortex lattices:



Depinning as a **dynamical critical phenomenon** in disordered **glassy** systems  
Sophisticated theory approach: functional RG “FRG” [D. Fisher, LeDoussal, ...]

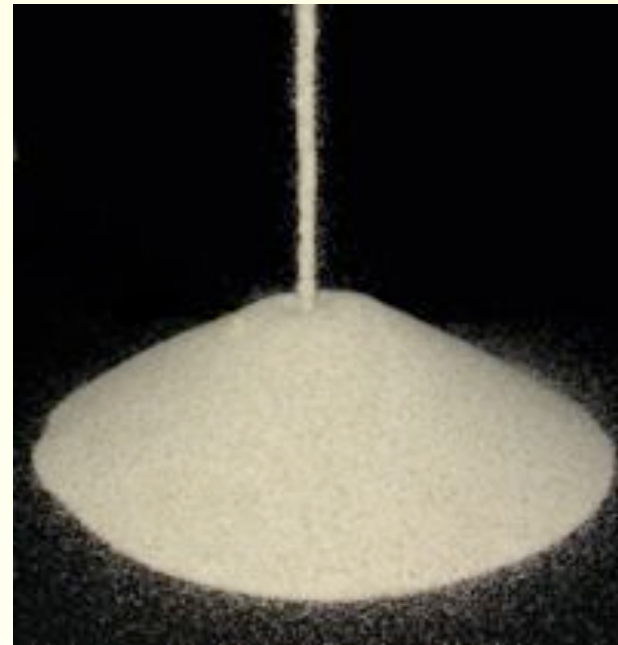
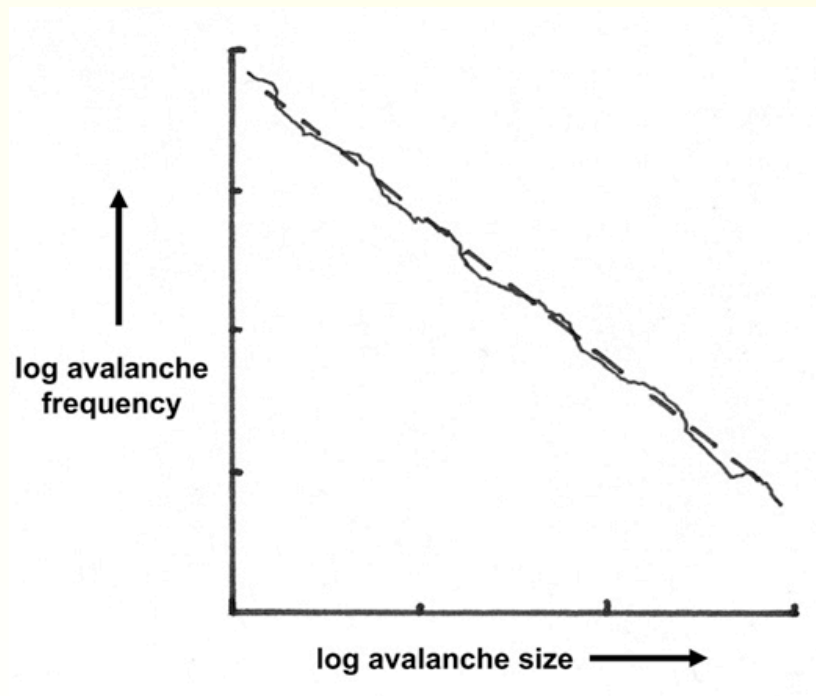
Statistics of avalanches: - mean field theory  
- recent first steps and successes with FRG  
→ find non-trivial critical power laws (without scale)



# Examples of crackling III

- Power laws due to **self-organized criticality**:  
Dynamics is **attracted to a critical state**, without fine-tuning of parameters

Example: sandpile model by Bak, Tang, and Wiesenfeld



# Magnetic systems

- Crackling noise in the hysteresis loop: “Barkhausen noise”
- When does crackling occur in random magnets, and why?
- What happens in frustrated spin glasses (as opposed to just dirty ferromagnets)?



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- Crackling noise in the hysteresis loop: “Barkhausen noise”
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Equilibrium avalanches in the hysteresis reflect criticality of the glass phase! Noise as a diagnostic of a critical glass state!

# Avalanches in ferromagnetic films

Direct Observation of Barkhausen Avalanche in (ferro) Co Thin Films

*Kim, Choe, and Shin (PRL 2003)*

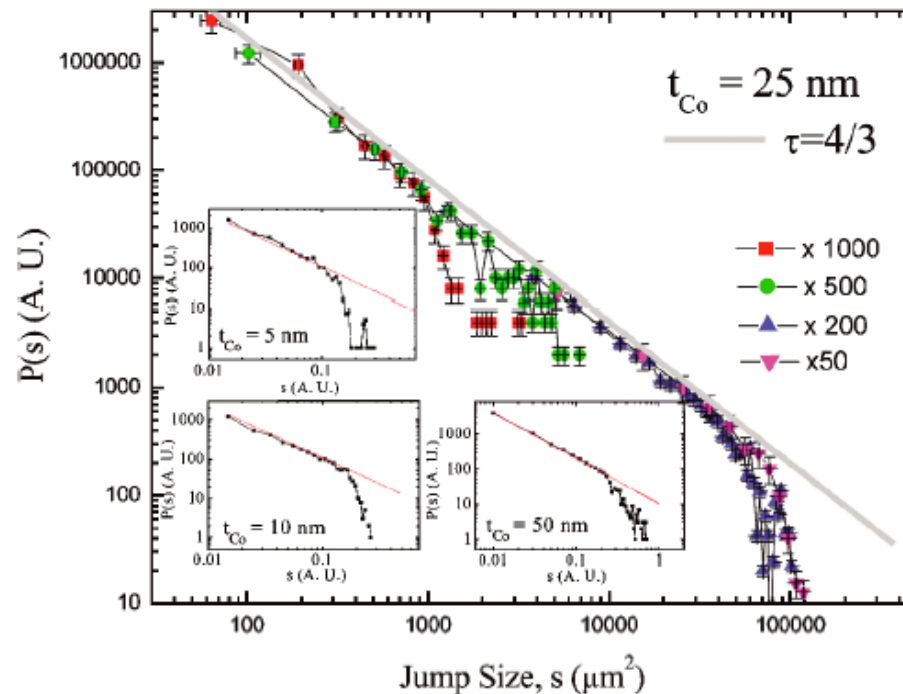


FIG. 3 (color). Distributions of the Barkhausen jump size in 25 and 50-nm Co samples. Distributions in 5, 10, and 50-nm Co samples are shown in the insets. Fitting curve with  $\tau = 1.33$  is denoted at each graph.

Distribution of magnetization jumps

$$P(s) = \frac{A}{s^\tau}$$
$$\tau = \frac{4}{3}$$

*Cizeau et al.:*

Theoretical model with

**dipolar long range interactions**

(believed to be crucial to get criticality)

# Model ferromagnets

*Dahmen, Sethna  
Vives, Planes*

Random field Ising model (short range):

$$H = -J \sum_{\langle ij \rangle} s_i s_j - \sum_i h_i s_i - h_{ext} \sum_i s_i$$

- **Generically non-critical**
- Scale free avalanches **require fine tuning** of disorder  $\Delta = \langle h_i^2 \rangle$   
and field  $h_{ext,crit}$

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Experiment:

( $T$  tunes effective disorder)

*Experiment (disordered ferro)  
Berger et al. (2000)*

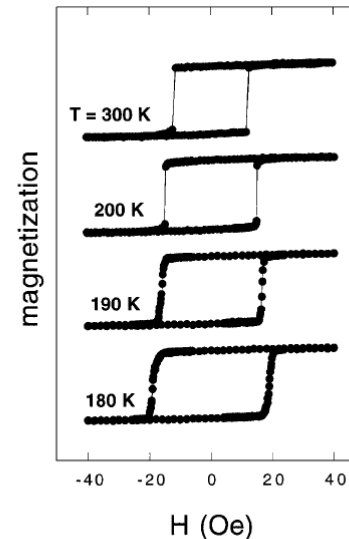


FIG. 1.  $M(H)$  loops measured on a Co/CoO-bilayer structure for the temperatures indicated. The thin lines are guides to the eye.

# Why is the random Ising model generally non-critical?

*Pazmandi, Zarand, Zimanyi (PRL 1999):*

Elastic manifolds and  
ferros with dipolar interactions:

**They have strong frustration:**

- long range interactions with varying signs and/or
- strong configurational constraints

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Look at spin glasses! (Frustration +  
disorder = glass and criticality? yes!)

# SK criticality

VOLUME 83, NUMBER 5

PHYSICAL REVIEW LETTERS

2 AUGUST 1999

## Self-Organized Criticality in the Hysteresis of the Sherrington-Kirkpatrick Model

Ferenc Pázmándi,<sup>1,2,3</sup> Gergely Zaránd,<sup>1,3</sup> and Gergely T. Zimányi<sup>1</sup>

Canonical spin glass model: Sherrington-Kirkpatrick (SK) model - fully connected

$$H = \frac{1}{2} \sum_{i,j} J_{ij} s_i s_j - h_{ext} \sum_i s_i, \quad J_{ij} : \text{random Gaussian } \overline{J_{ij}^2} = J^2/N$$

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- Known facts:
  - There is a **thermodynamic** transition at  $T_c$  to a **glass phase**:
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  - Multitude of **metastable states**, separated by barriers
  - Correct equilibrium solution by G. Parisi : **Replica symmetry breaking**

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  - Multitude of **metastable states**, separated by barriers
  - Correct equilibrium solution by G. Parisi : **Replica symmetry breaking**
  - **Glass phase is always critical!** (*Kondor, DeDominicis*)

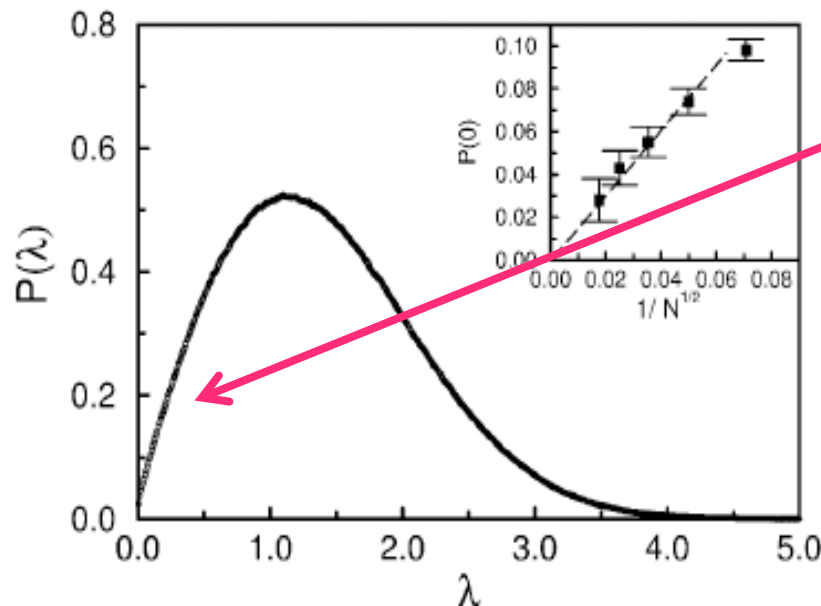
# SK criticality – local fields

$$H = \frac{1}{2} \sum_{i,j} J_{ij} s_i s_j - h_{ext} \sum_i s_i$$

Local field on spin  $i$ :

$$\lambda_i \equiv -\frac{\partial H}{\partial s_i} = -\sum_{j \neq i} J_{ij} s_j + h_{ext}$$

*Thouless, Anderson and Palmer, (1977); Palmer and Pond (1979)  
Parisi (1979), Bray, Moore (1980)  
Sommers and Dupont (1984)  
Dobrosavljevic, Pastor (1999)  
Pazmandi, Zarand, Zimanyi (1999)  
MM, Pankov (2007)*



Linear “Coulomb” gap in the distribution of local fields

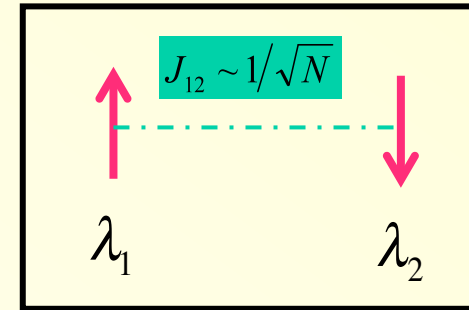
A first indication of criticality!

# The linear pseudogap in SK

*Thouless (1977)*

Stability of ground state with respect to flipping of a pair:

The distribution of local fields must vanish at  $\lambda=0$  at  $T=0$ !



• Suppose pseudogap  $P(\lambda) \propto \lambda^\gamma$

→ Smallest local fields  $\lambda_{\min} \propto N^{-1/1+\gamma}$

• 2-spin flip cost  $E_{\text{cost}} \propto |\lambda_1| + |\lambda_2| - N^{-1/2} \sim N^{-1/1+\gamma} - N^{-1/2} \stackrel{!}{>} 0$

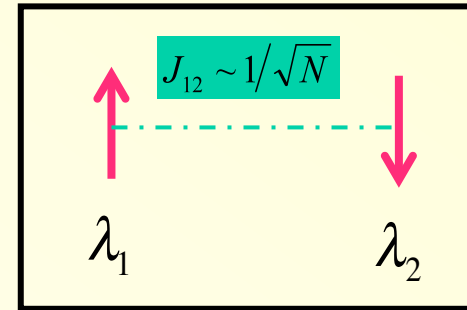
$\gamma \geq 1 \rightarrow$  At least linear pseudogap!

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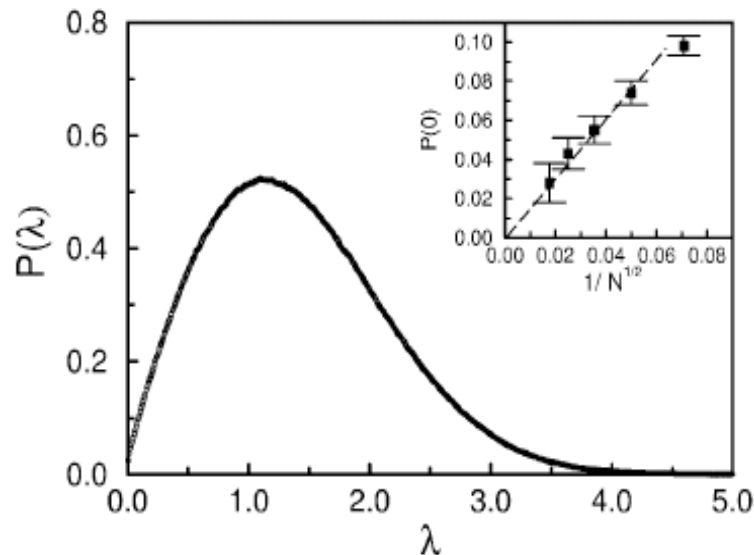
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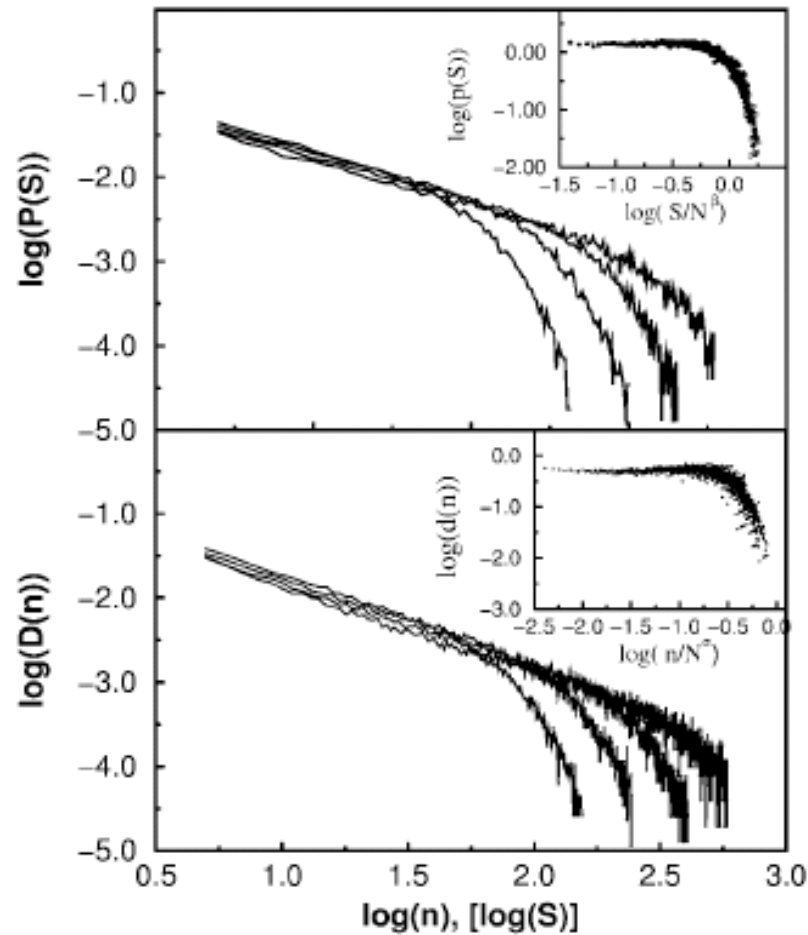
$\gamma \geq 1 \rightarrow$  At least linear pseudogap!

• But:  $\gamma = 1$ !  
 Largest possible density of soft spins!  
 Distribution is so critical that flipping the first spin by an increase of  $\Delta h_{\text{ext}} = \lambda_{\min}$  can trigger a large avalanche!



# “Living on the edge”

*Pazmandi, Zarand, Zimanyi (1999)*



## Size distribution of avalanches:

- Avalanches are large
- Only cutoff: system size ( $N^{1/2}$ )
- Power law:  
Sign of Self-Organized Criticality

# Review: Criticality and RSB

SK-model

$$H = \sum_{i < j} J_{ij} s_i s_j$$

Replica trick

$$-\beta F = \overline{\ln Z} = \lim_{n \rightarrow 0} \frac{\overline{Z^n} - 1}{n}$$

*Edwards, Anderson (1974)*

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$$\begin{aligned} \overline{Z^n} &= \overline{\exp\left(-\beta \sum_{a=1}^n H[s^a]\right)} = \exp\left[\frac{\beta^2 N n}{4} + \frac{\beta^2 N}{2} \sum_{1 \leq a < b \leq n} \left(\sum_i s_i^a s_i^b / N\right)^2\right] \\ &= \int \prod_{a < b} \frac{dQ_{ab}}{\sqrt{2\pi / \beta^2 N}} \exp(-NA[Q]) \end{aligned}$$

Free energy functional  $A[Q] = -n\beta^2/4 + \beta^2/2 \sum_{1 \leq a < b \leq n} Q_{ab}^2 - \log \left[ \sum_{\{s^a\}} \exp(\beta^2 Q_{ab} s^a s^b) \right]$

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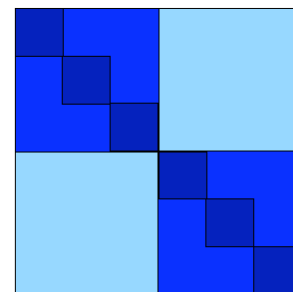
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Parisi ansatz for the saddle point:  
Hierarchical replica symmetry breaking

*Parisi (1979)*

$Q_{ab} =$



# SK criticality

Important features of the solution in the glass phase:

- The free energy functional is only **marginally stable!**  
→ Collection of zero modes of the Hessian  $\frac{\partial^2 A}{\partial Q_{ab} \partial Q_{cd}}$
- $\leftrightarrow$  **Critical spin-spin correlations in the whole glass phase!** Found numerically also in finite dimensions!

$$\overline{\langle s_i s_j \rangle^2} \sim \frac{1}{r_{ij}^\alpha}$$

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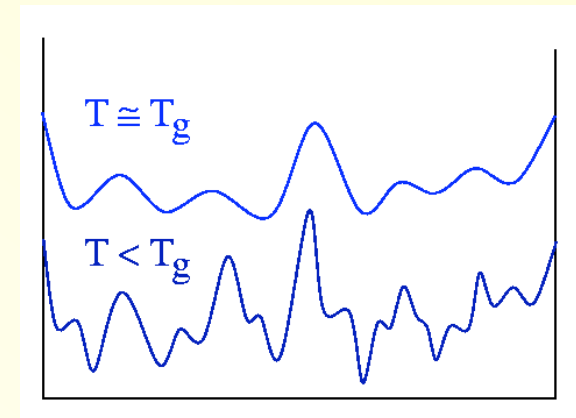
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Free energy landscape



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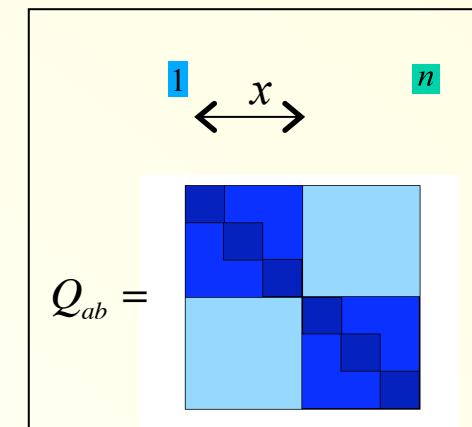
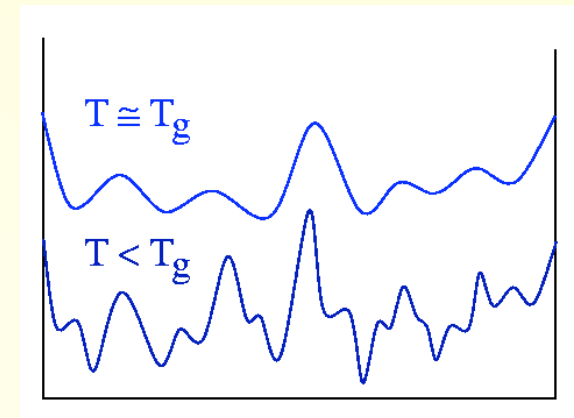
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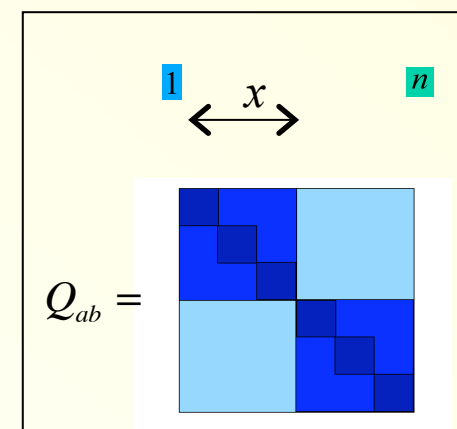
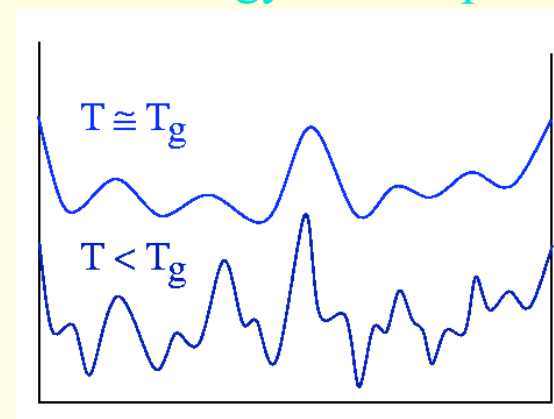
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 A continuous function  $Q(x)$ ,  $n < x < 1$ , parametrizes  $Q_{ab}$
- Marginality is directly related to the linear pseudogap  
 The pseudogap can be calculated analytically at low T  
*(Pankov)*

Free energy landscape





# After so much critical preparation:

- Understand shocks in spin glasses
- Calculate avalanche distribution analytically!
- Confirm the direct connection of scale free avalanches and thermodynamic criticality!

→ Barkhausen noise as a diagnostic tool for a glass phase?

# Stepwise response and shocks in spin glass models

*Yoshino, Rizzo (2008)*

**p-spin models** [akin to supercooled liquids]

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→ Glassy, but much simpler and non-critical

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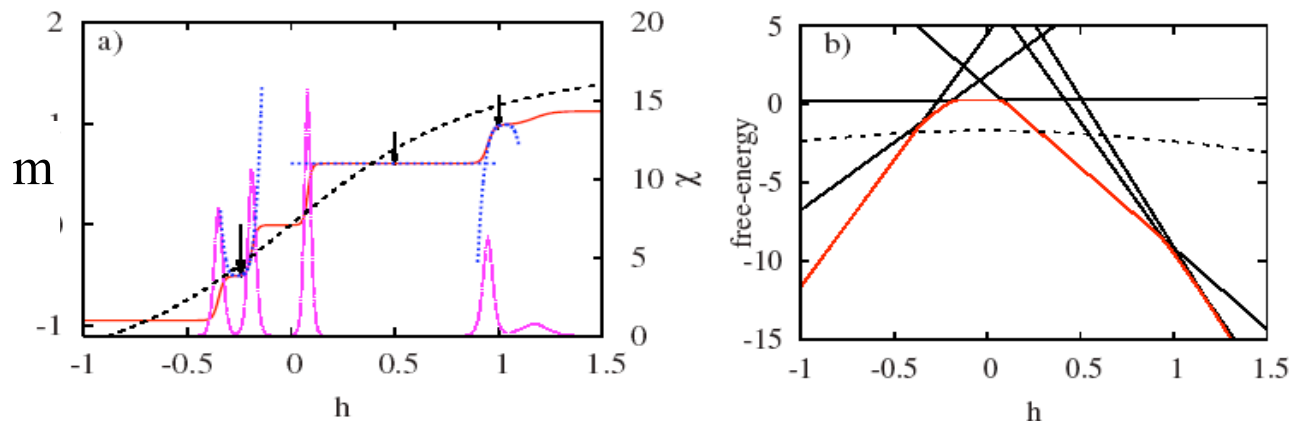
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Free energy of metastable state  $\alpha$ :  $F_\alpha(h) = F_\alpha(h=0) - hM_\alpha$

Equilibrium jump/shock when two states cross:  $F_\alpha(h_{shock}) = F_\beta(h_{shock})$



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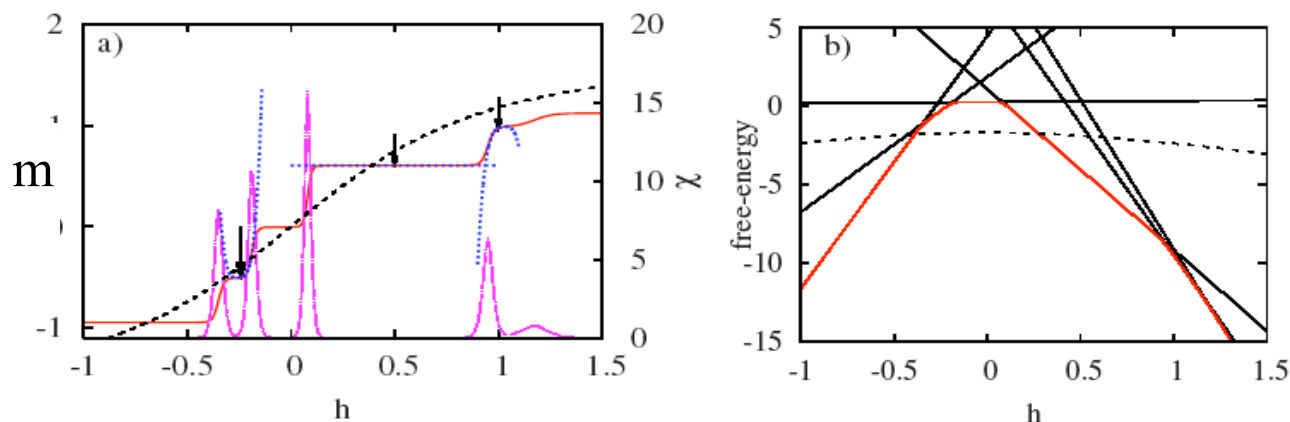
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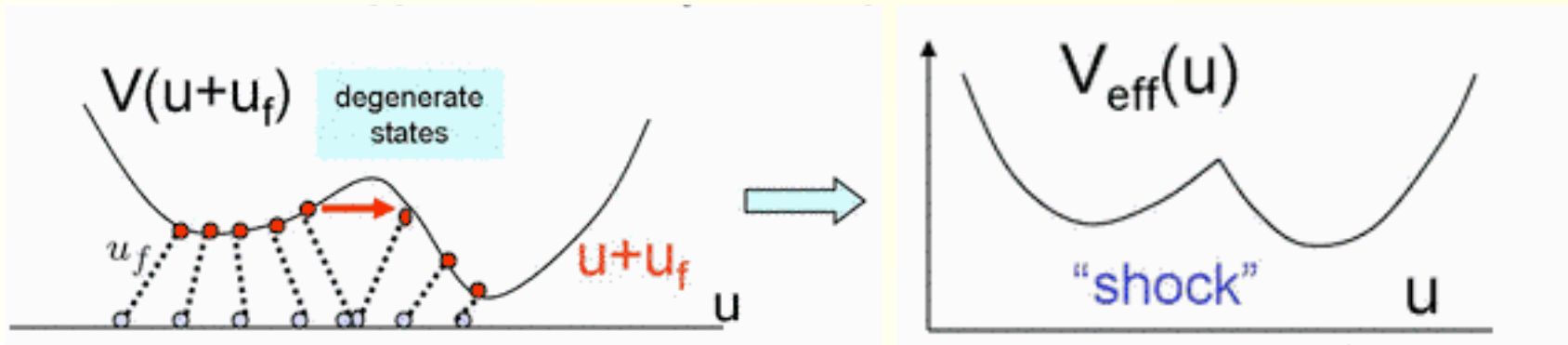
Mesoscopic effect: Susceptibility has spikes and does **not** self-average!

# A simple picture of shocks

*Balents, Bouchaud, Mezard*

$$H = \frac{q^2}{2}u^2 + \frac{\Lambda^2}{2}|u_f|^2 + V(u + u_f)$$

$$H_{eff}[u] = \text{Min}_{u_f} H[u, u_f] \quad T = 0$$



Elastic system

Displacement

Effective potential

Force

$$u \leftrightarrow h$$

$$V(u) \leftrightarrow F(h)$$

$$f(u) = -V'(u) \leftrightarrow m(h) = -F'(h)$$

Magnetic system

Magnetic field

Free energy

magnetization

# Detecting shocks

2<sup>nd</sup> cumulant of the magnetization ( $T = 0$ )

*Yoshino, Rizzo (2008)*

$$\overline{M(h + \delta h)M(h - \delta h) - M(h)^2} \propto |\delta h|$$

Non-analytic cusp!

- Reflects the probability of shocks.
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Closely related effects:

- Functional renormalization group for **collectively pinned elastic manifolds (e.g. vortex lattices)**:  
Cusp in cumulants of effective potential  $V_{\text{eff}}(\mathbf{u}_{\text{cm}})$   
at  $T = 0$  and beyond collective pinning scale  $L > L_{\text{larkin}}$

*D. Fisher (1986)*  
*LeDoussal, Wiese*  
*Balents, Bouchaud,*  
*Mézard*  
*LeDoussal, MM, Wiese*

# Detecting shocks

2<sup>nd</sup> cumulant of the magnetization ( $T = 0$ )

*Yoshino, Rizzo (2008)*

$$\overline{M(h + \delta h)M(h - \delta h) - M(h)^2} \propto |\delta h|$$

Non-analytic cusp!

- Reflects the probability of **shocks**.
- The cusp is rounded at finite  $T$ .

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- **Turbulence:**

Shocks in the velocity field  $\mathbf{v}(\mathbf{x})$ , rounded only by finite viscosity  $\eta$  (akin to  $T$  above)

*D. Fisher (1986)*

*LeDoussal, Wiese*

*Balents, Bouchaud,*

*Mézard*

*LeDoussal, MM, Wiese*

*Bouchaud, Mézard,*

*Parisi*



# Strategy of calculation

$k^{\text{th}}$  cumulant of magnetization difference

$$\overline{[M(h) - M(h + \delta h)]^k} = \text{Prob}(\text{shock} \in [h, h + \delta h]) \overline{\Delta M_{\text{shock}}^k}^h + O(\delta h^2)$$

Shock density

$$\text{Prob}(\text{shock} \in [h, h + \delta h]) = \rho_0 |\delta h|$$

Avalanche size cumulants

$$\overline{\Delta M_{\text{shock}}^k}^h = \int_0^\infty d\Delta M P(\Delta M; h) \Delta M^k$$

→ Calculate  $\overline{[M(h) - M(h + \delta h)]^k} \rightarrow \rho_0, P(\Delta M; h)$

Natural scales:

$$\delta h \sim \lambda_{\min} \sim N^{-1/2}$$

$$\Delta M \sim \chi N \Delta h \sim N^{1/2}$$

# Strategy of calculation

→ Calculate  $\overline{[M(h) - M(h + \delta h)]^k}$  →  $\rho_0, P(\Delta M; h)$

$$\overline{M(h_1) \dots M(h_k)} = (-1)^k \partial_{h_1} \dots \partial_{h_k} \overline{F(h_1) \dots F(h_k)}$$

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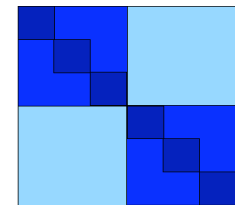
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→ Calculate effective potential of n replicas:

Easy to extract in the replica limit  $n \rightarrow 0$

$$\begin{aligned} \exp [W[\{h_a\}]] &:= \overline{\exp \left[ -\beta \sum_{a=1}^n F(h_a) \right]}^J \\ &= \exp \left[ -\beta \sum_{a=1}^n \overline{F(h_a)}^J + \frac{\beta^2}{2} \sum_{a,b=1}^n \overline{F(h_a)F(h_b)}^{J,c} - \frac{\beta^3}{3!} \sum_{a,b,c=1}^n \overline{F(h_a)F(h_b)F(h_c)}^{J,c} + \dots \right] \\ &= \sum_{\{S_a^i\}} \overline{\exp \left[ \beta \sum_{ij} S_a^i J^{ij} S_a^j + \beta \sum_i h_a S_a^i \right]}^J = \\ &= \sum_{\{S_a^i\}} \int \prod_{a \neq b} dQ_{ab} \prod_i \exp \left[ nN \frac{\beta^2 J^2}{2} + \beta^2 J^2 \sum_{a \neq b} \left( -\frac{N}{2} Q_{ab}^2 + Q_{ab} S_a^i S_b^i \right) + \sum_a \beta h_a S_a^i \right]. \end{aligned}$$

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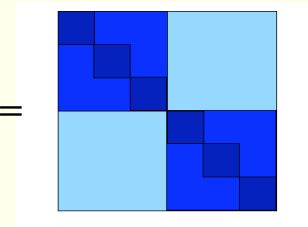
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$N \rightarrow \infty$  limit:  $h_a = \tilde{h}_a / \sqrt{N}$

Saddle point  $Q_{ab}$ , sum over replica permutations!

$Q_{ab} =$



$$\exp[W[h] - W[0]] = \sum_{\pi} \exp\left[\frac{\beta^2}{2} \sum_{ab} Q_{ab} \tilde{h}_{\pi(a)} \tilde{h}_{\pi(b)} + \frac{\beta^2}{2} \sum_a \tilde{h}_a^2 (1 - Q_{aa})\right] / \sum_{\pi} 1$$

# Calculation

Sum over replica permutations  $\pi$  in  $S(n)$  [quite a challenge!]

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Final result:

- picture of **mesoscopic avalanches**  $\sim N^{1/2}$  fully confirmed
- obtain **critical** probability distribution of avalanche sizes

$$P(\delta m \equiv \frac{\Delta M}{\sqrt{N}}) d(\delta m) \frac{dh}{\sqrt{N}} = \sqrt{\frac{c^*}{\pi}} \frac{e^{-\delta m^2}}{\delta m} d(\delta m) \frac{dh}{\sqrt{N}}$$

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$c^* = 0.410802$  Obtained from low T solution of the SK model

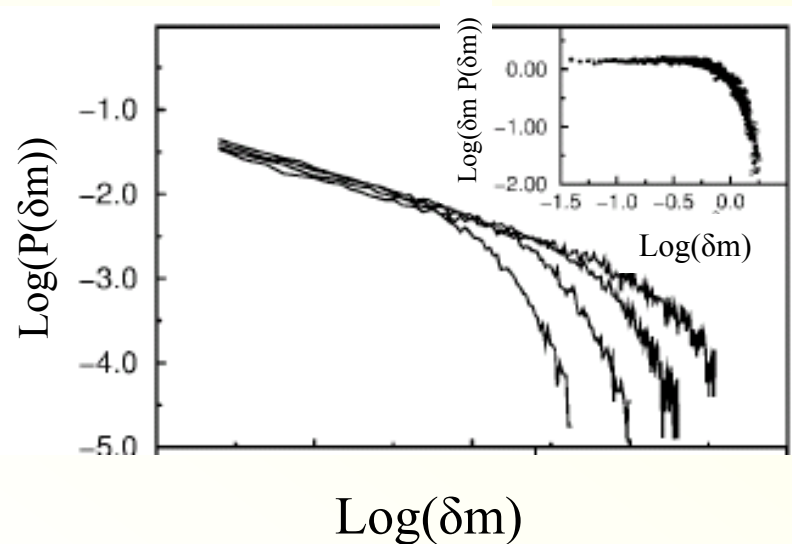


# Comparison with numerics

Analytical result (shocks in equilibrium)

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Avalanches in the hysteresis loop (slowly driven, out-of-equilibrium)



Many qualitative features agree between  
analytics (equilibrium) and  
numerics (out-of equilibrium)

*Pazmandi, Zarand, Zimanyi (1999)*

# Remarks

Analytical result (shocks in equilibrium)

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Important remarks

- The power law arises **because** of the criticality of the glass
- It receives contributions from **all scales** and distances within the hierarchical organization of states
- Nearly no dependence on the external field, except in the cutoff scale:

**The spin glass is critical even in finite field.**

# Conclusion

Spin glass criticality (in the SK model) is prominently reflected in scale free response to a slow magnetic field change.

There is a deep connection between various manifestations of this criticality:

Soft gap – avalanches – spin-spin correlations – abundant collective low energy excitations

# Outlook

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  - Is criticality revealed in avalanches?
  - Experimental probe for criticality via Barkhausen noise?
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- Avalanches in other complex systems (computer science, optimization, economy, etc)