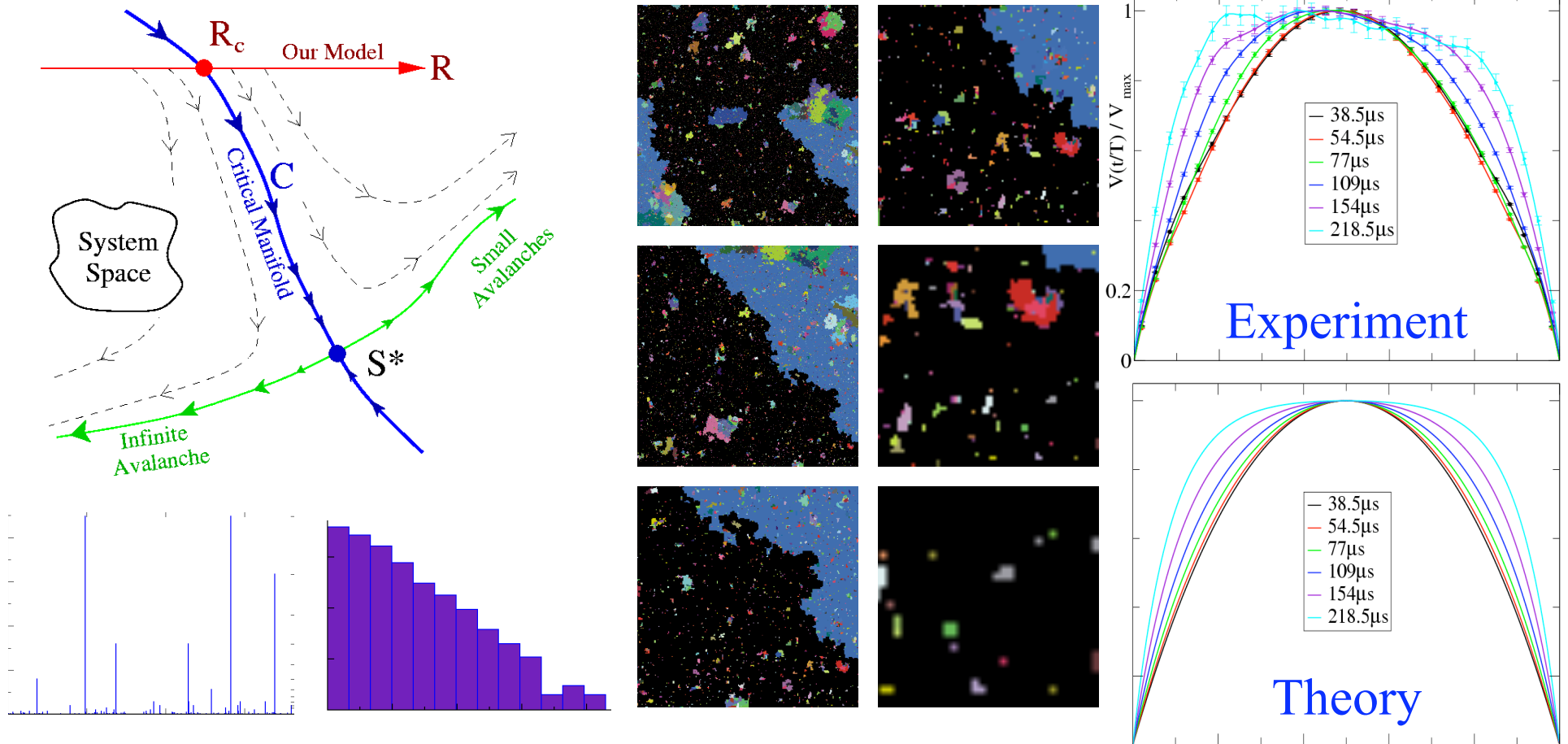


# Continuous Phase Transitions

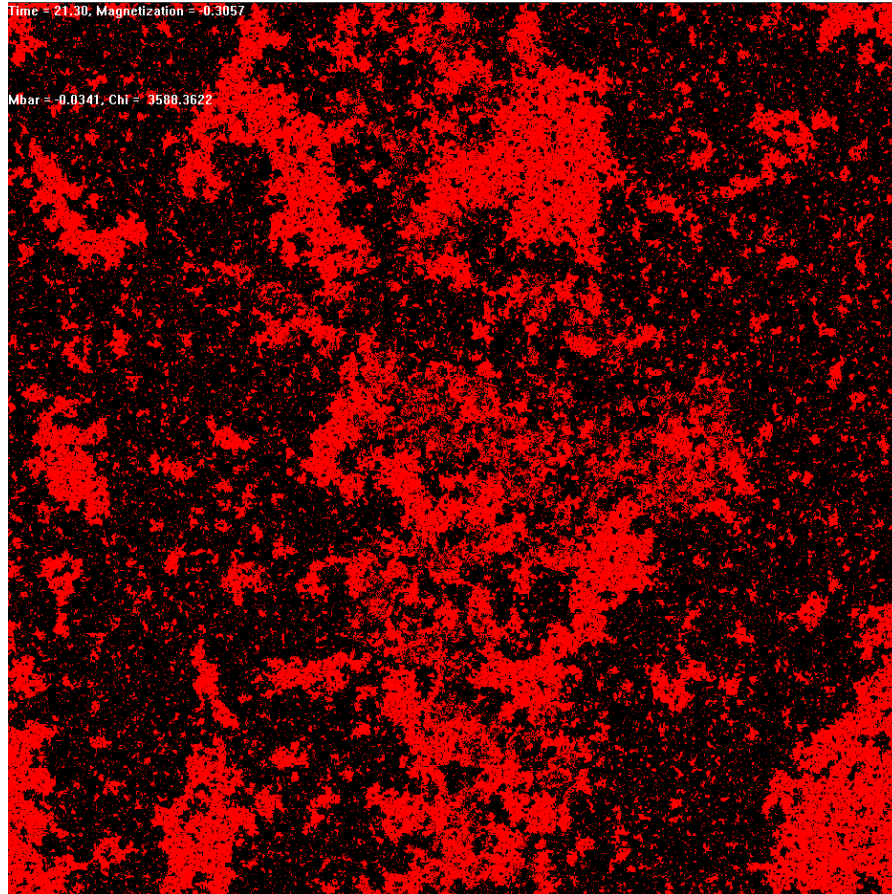
Jim Sethna, Physics 653, Fall 2010



Yanjiun Chen, Stefanos Papanikolaou, Karin Dahmen, Olga Perković, Chris Myers, Matt Kuntz, Gianfranco Durin, Stefano Zapperi, ...

# The Ising Model at $T_c$

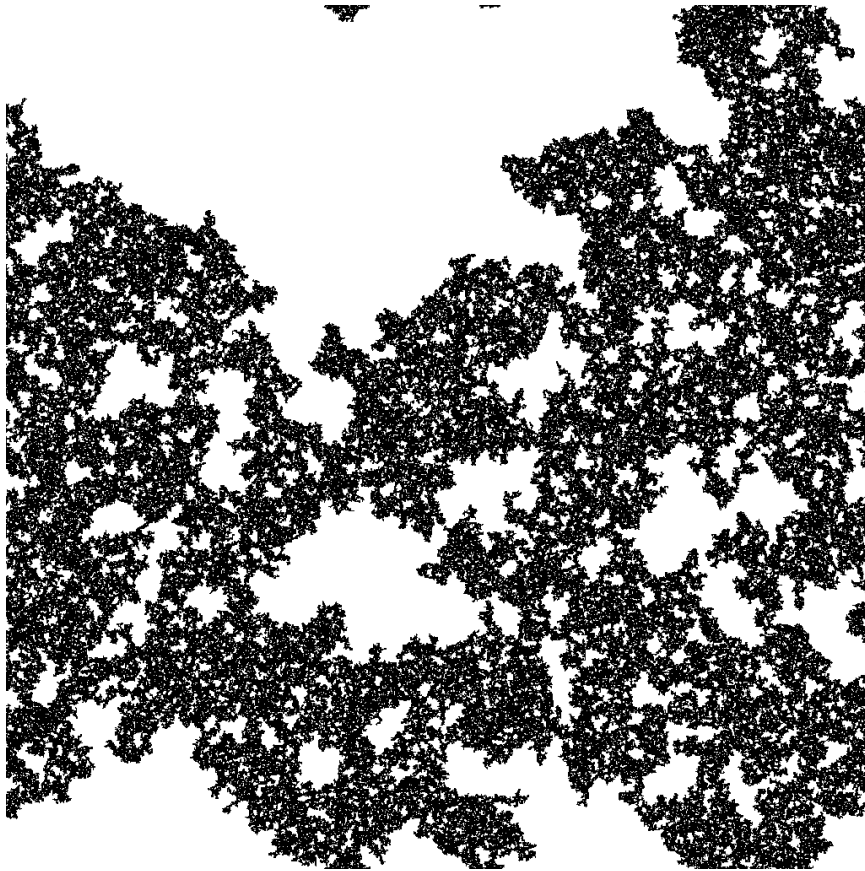
## Structure on All Scales



- Continuous Phase Transition
- Competition Entropy vs. Energy
- Thermal Disorder
- High Temperature:  
Random
- Low Temperature  
Long-Range Order
- Critical Point
  - $T_c = 2/\log(1+\sqrt{2}) \sim 2.27$
  - Fluctuations on All Scales

# Percolation

## Structure on All Scales



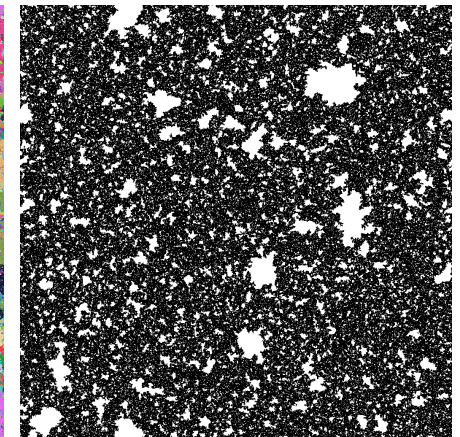
Largest Connected Cluster

$$P=P_c$$

- Connectivity Transition
- Punch Holes at Random, Probability  $1-P$   
 $P_c = 1/2$  Falls Apart  
(2D, Square Lattice, Bond)
- Static (Quenched) Disorder



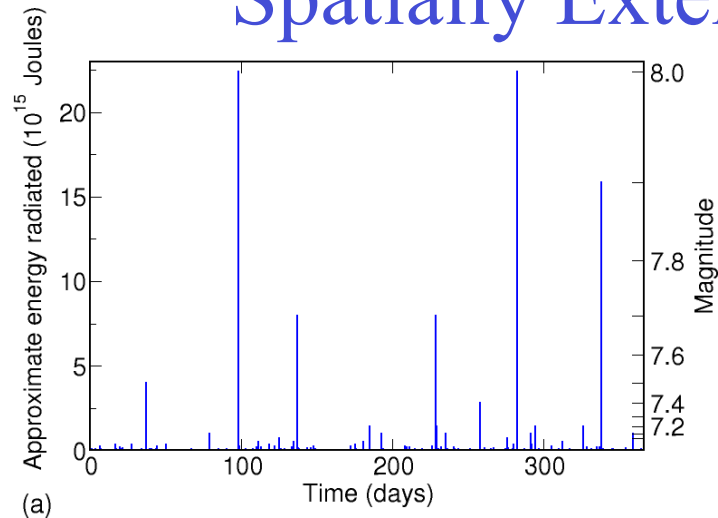
$P=0.49$



$P=0.51$

# Earthquakes

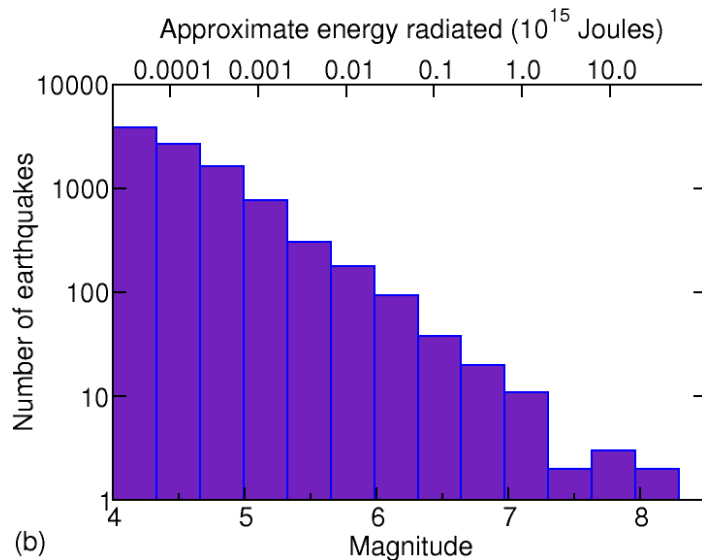
## Spatially Extended Events of All Sizes



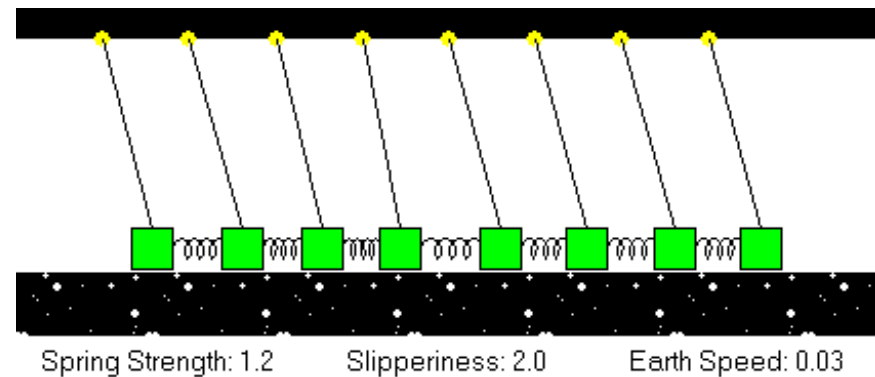
(a)

- Earthquakes of All Sizes
- Gutenberg-Richter Law:  
Probability  $\sim$  Size<sup>-Power</sup>
- Simple Block-Spring Model
  - No disorder
  - Slow driving rate (cm/year)

## Earthquakes of Many Sizes: 1995



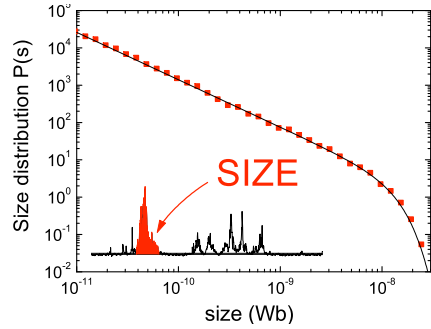
(b)



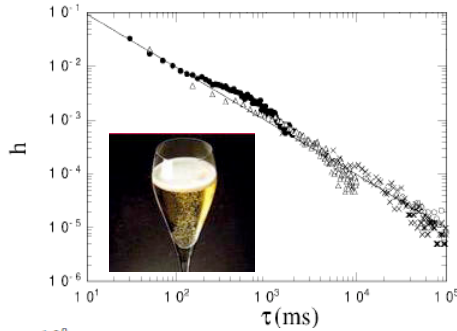
Burridge-Knopoff (Carlson & Langer)

<http://simscience.org/crackling/Advanced/Earthquakes/EarthquakeSimulation.html>

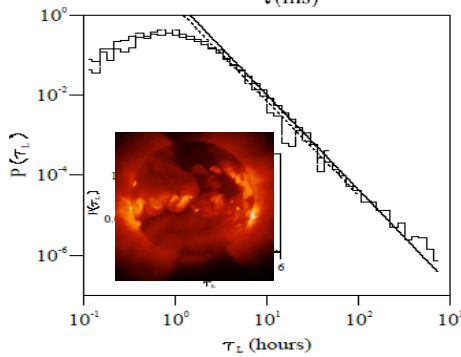
Magnets



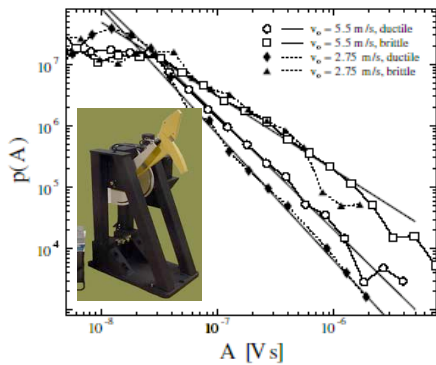
Foams



Solar Flares



Fracture



# Crackling noise

Discrete crackles span enormous range of sizes. Should be comprehensible; *scaling theory*.

Analogy with

hydrodynamics:

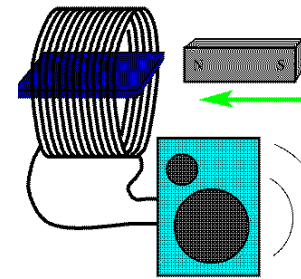
Molecules don't matter for Navier-Stokes fluid flow  
 Microscopics won't matter for crackling



Paper Crumpling



Rice Krispies



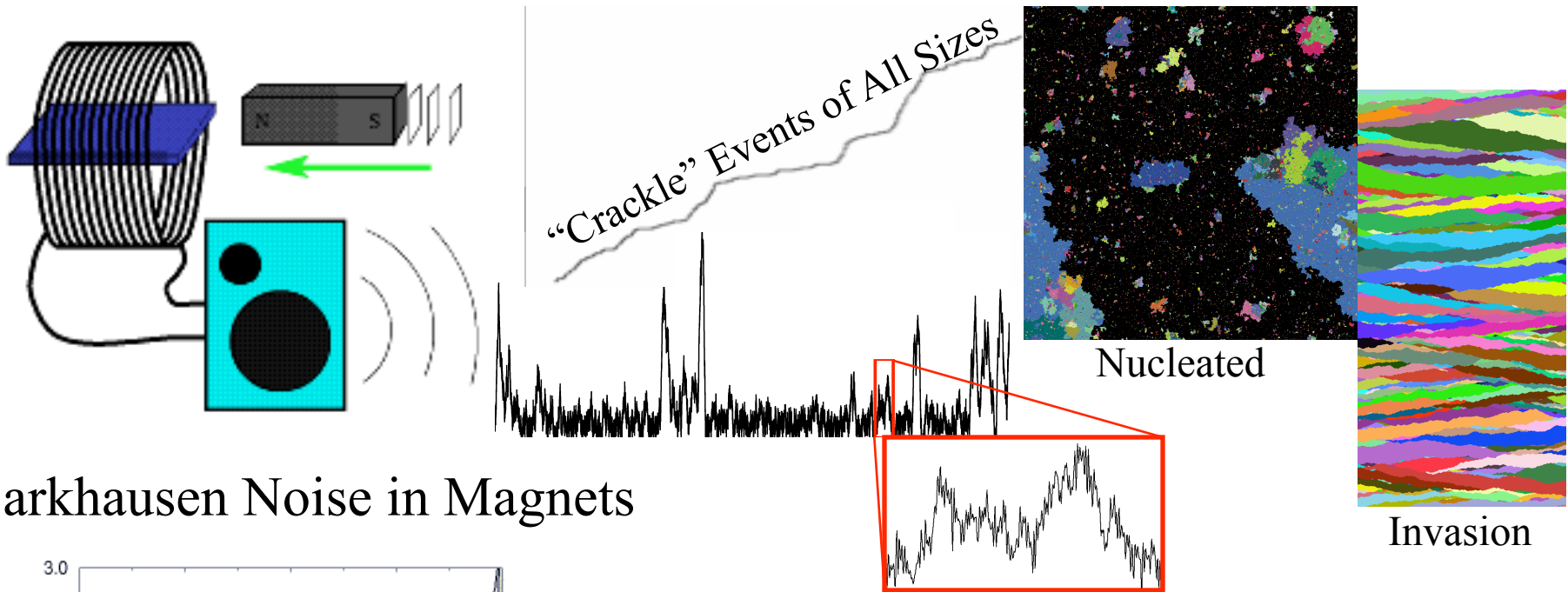
Magnets



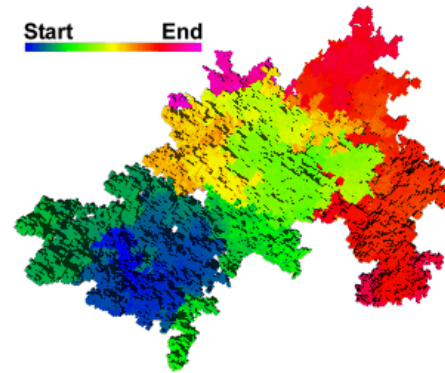
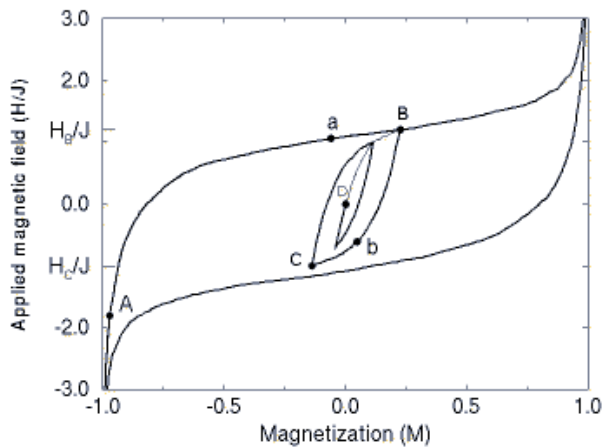
Paper Tearing

# Magnetic Barkhausen Noise

## Events of All Sizes, Structure on All Scales



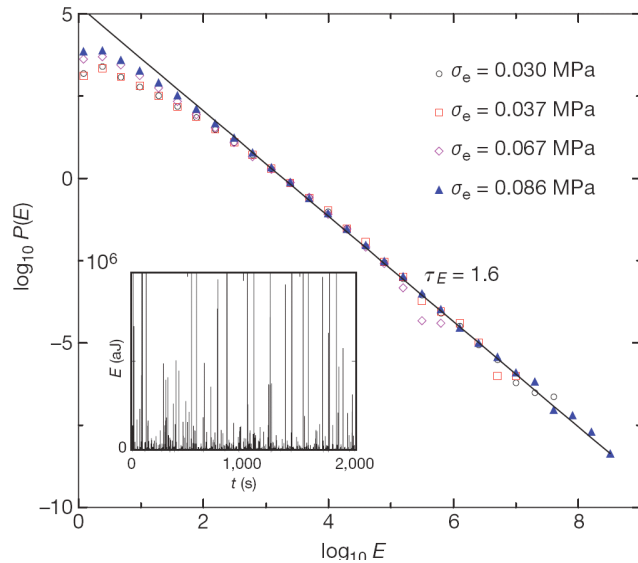
### Barkhausen Noise in Magnets



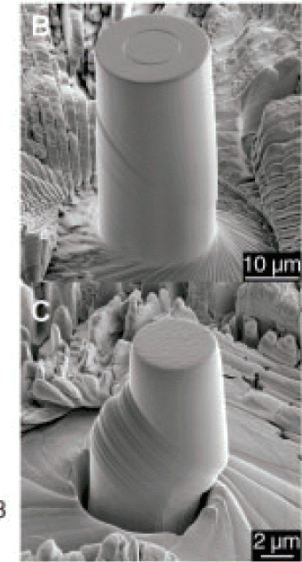
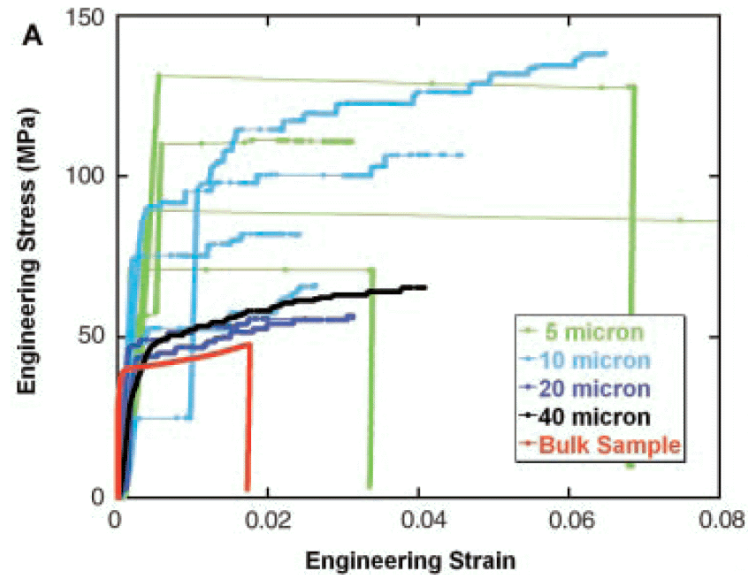
Magnetic  
Avalanches  
Fractal  
in Time and  
Space

# Plasticity

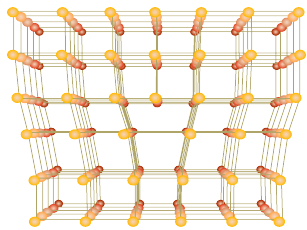
## Dislocation avalanches when bending forks



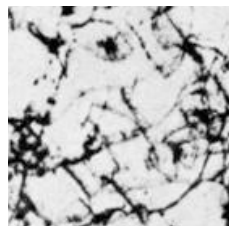
Avalanches in Ice  
(Miguel et al.)



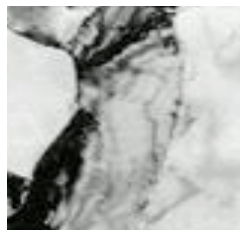
Avalanches in Nickel Micropillars  
(Uchic et al.)



Dislocation



Tangle

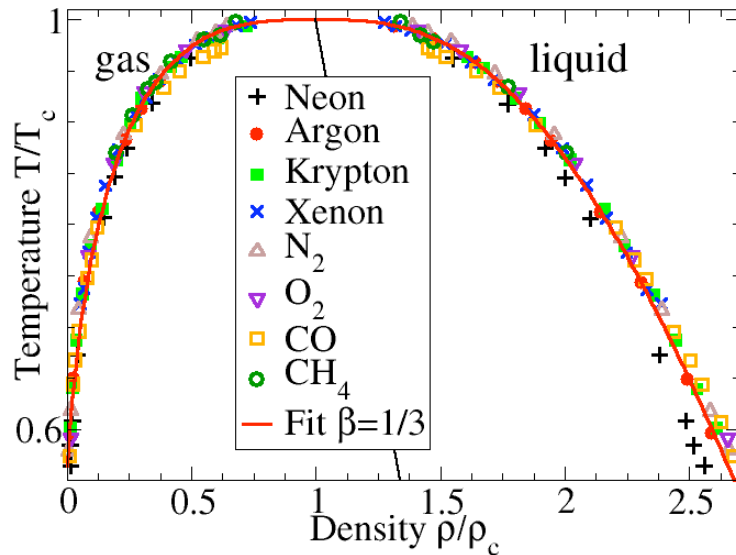


Structure

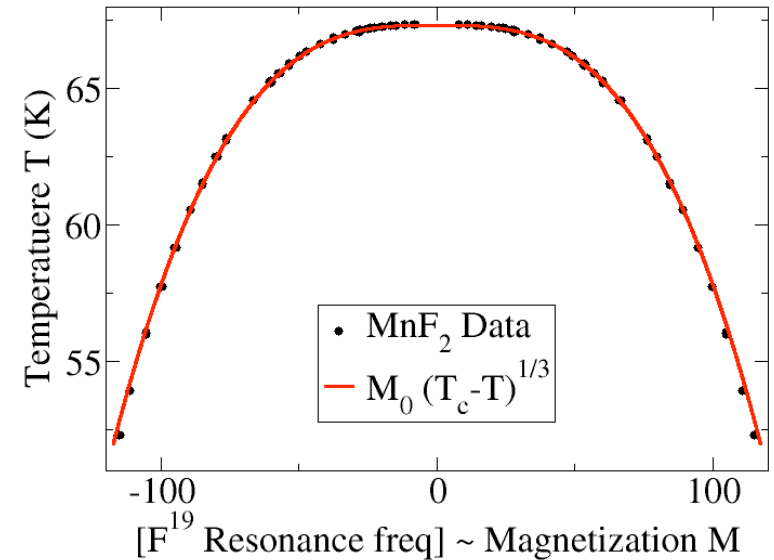
Ice crackles when it is squeezed  
So, surprisingly, do metals

# Universality: Shared Critical Behavior

## Ising Model and Liquid-Gas Critical Point



Same critical  
exponent  
 $\beta=0.332!$



Liquid-Gas Critical Point

$$\rho - \rho_c \sim (T_c - T)^\beta$$

$$\rho^{Ar}(T) = A \rho^{CO}(BT)$$

Ising Critical Point

$$M(T) \sim (T_c - T)^\beta$$

$$\rho^{Ar}(T) = A(M(BT), T)$$

Universality: Same Behavior up to Change in Coordinates

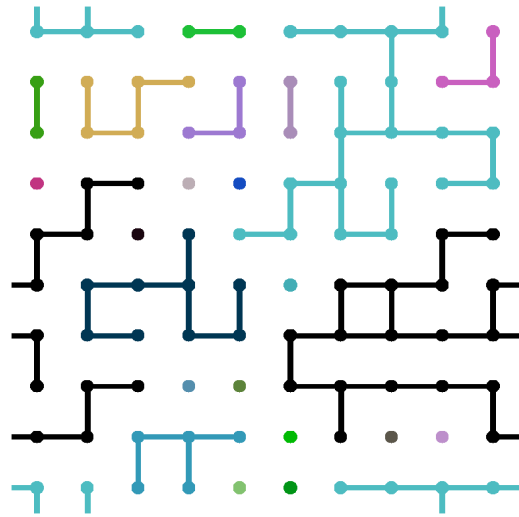
$$A(M, T) = a_1 M + a_2 + a_3 T + \text{(other singular terms)}$$

Nonanalytic behavior at critical point (not parabolic top)

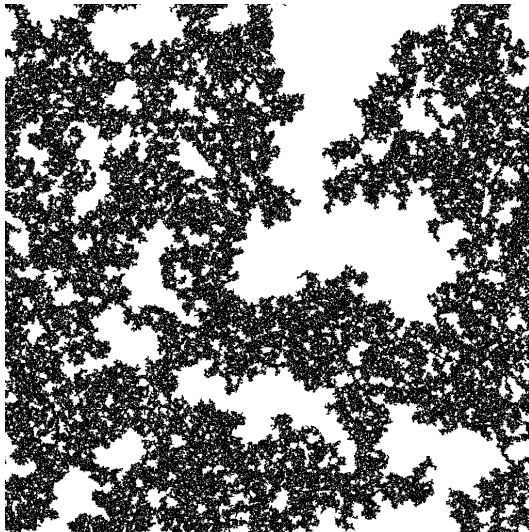
All power-law singularities ( $\chi, c_v, \xi$ ) are shared by magnets, liquid/gas

# Microscopic Details Irrelevant

## Universality in Percolation

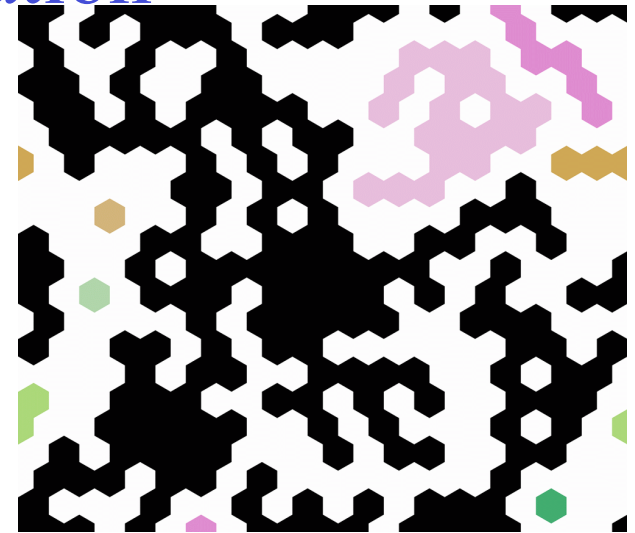


Bond Percolation

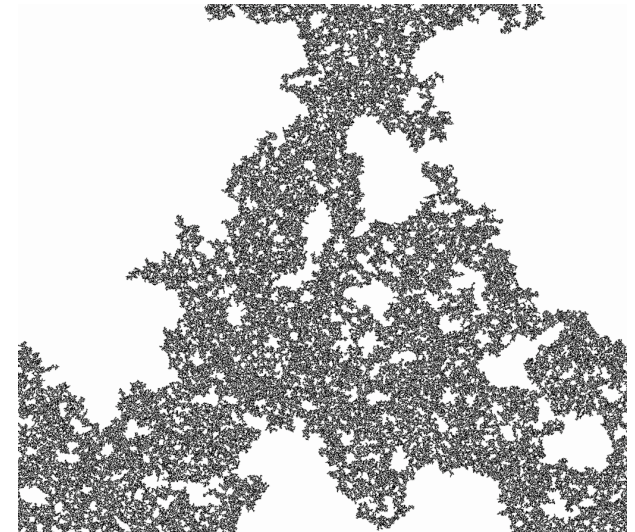


Site, bond percolation  
look the same for big  
clusters!

Statistical morphology  
of critical point  
independent of  
microscopic details:  
depends only on  
dimension of space,  
type of transition  
(*universality class*).  
(Note site percolation  
lighter: overall scale of  
order parameter non-  
universal)



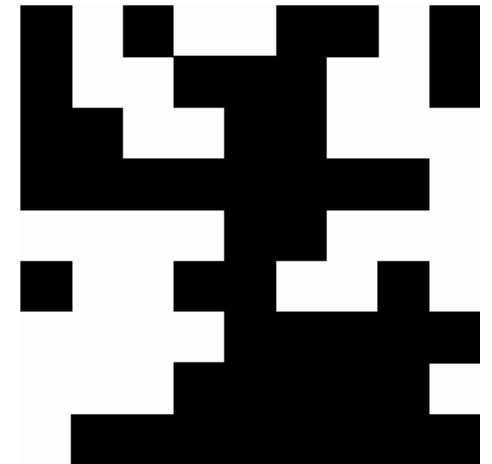
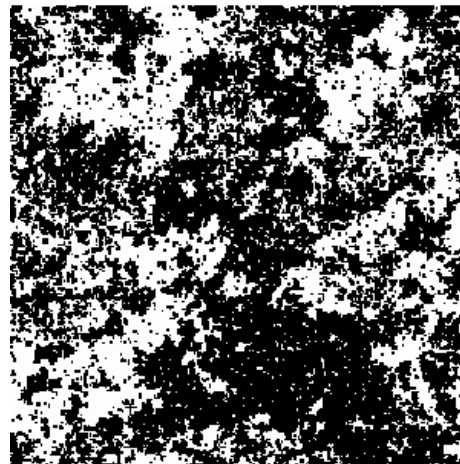
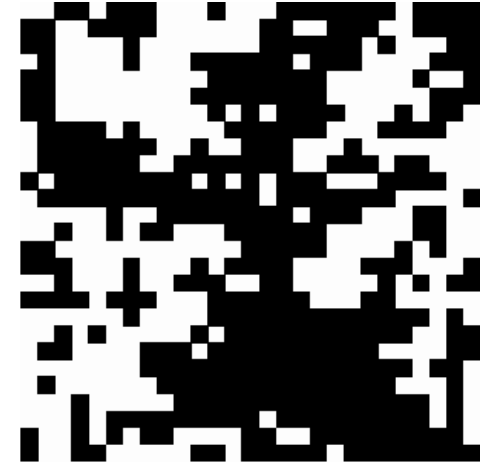
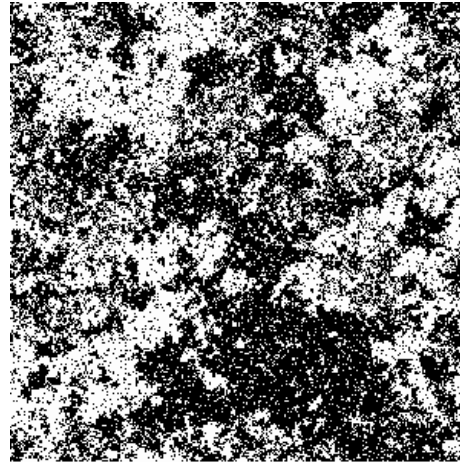
Site Percolation



# Coarse Graining

## Remove microscopic details

- ‘Continuum limit’ – average over details in small regions, get effective laws for coarser system
- Example: majority-rule block-spin transformation (3x3 blocks)
- Renormalization group: find effective block-spin free energy: new interactions from old by tracing over microscopic variables

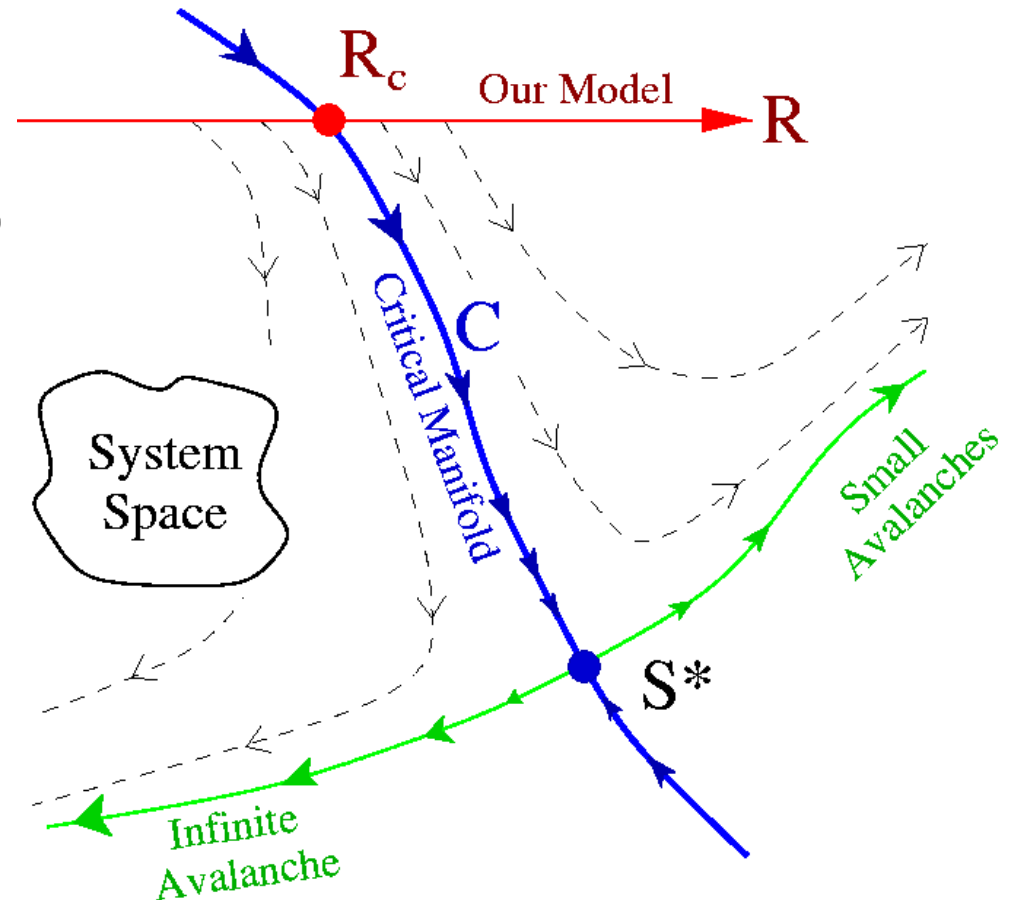


# The Renormalization Group

## Why Universal? Fixed Point under Coarse Graining

### Renormalization Group

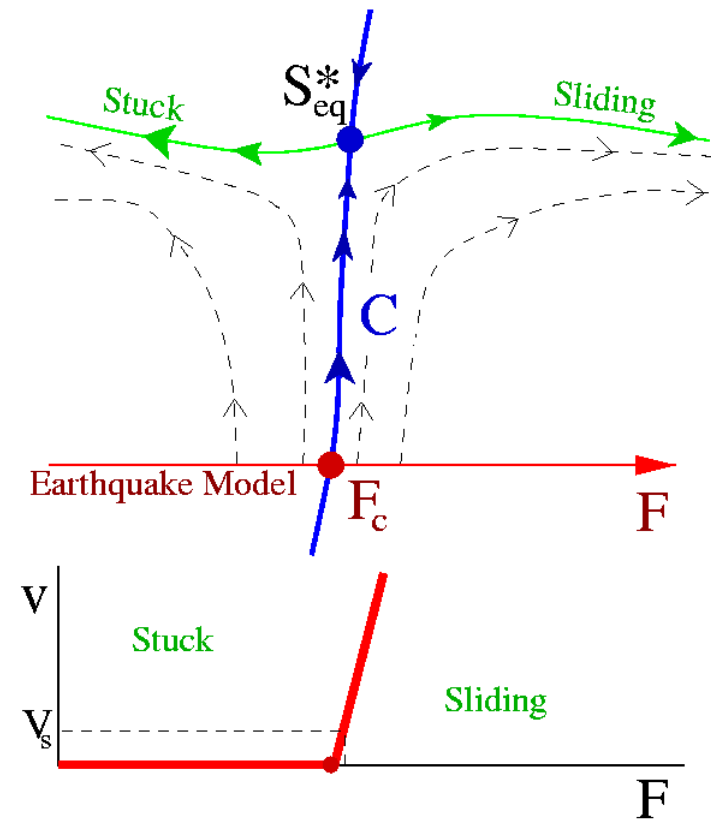
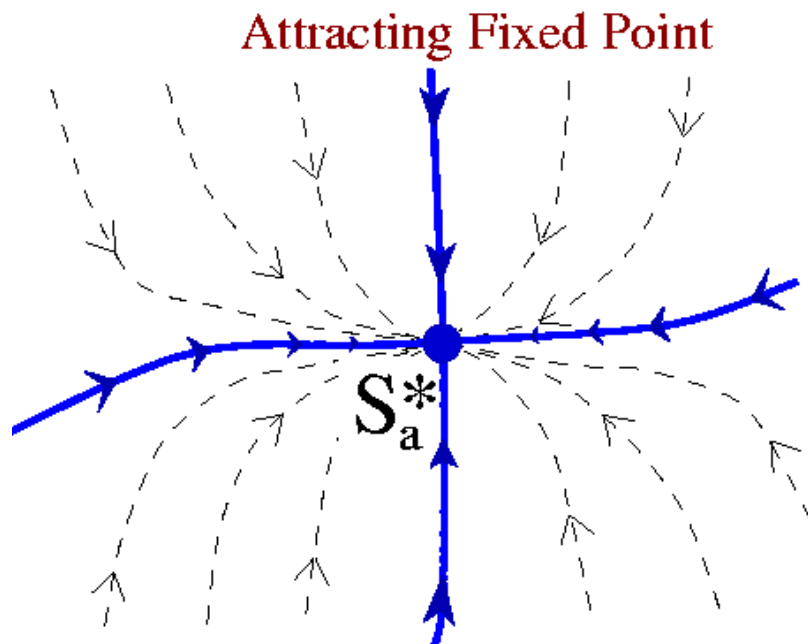
- Not a group
- *Renormalized* parameters (electron charge from QED)
- Effect of coarse-graining (shrink system, remove short length DOF)
- Fixed point  $S^*$  *self-similar* (coarse-grains to self)
- Critical points flow to  $S^*$
- **Universality**
- Many methods (technical) real-space,  $\epsilon$ -expansion, Monte Carlo, ...
- Critical exponents from linearization near fixed point



*System Space* Flows  
Under Coarse-Graining

# Spontaneous Criticality

## Generic Scale Invariance; Self-Organized Criticality

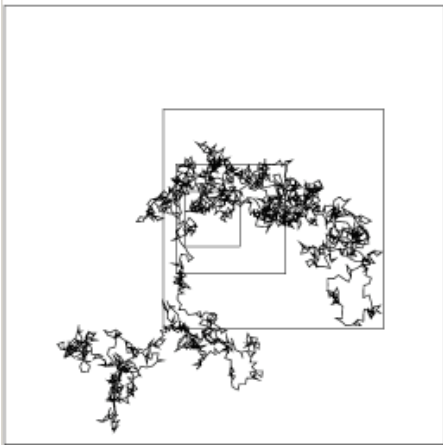
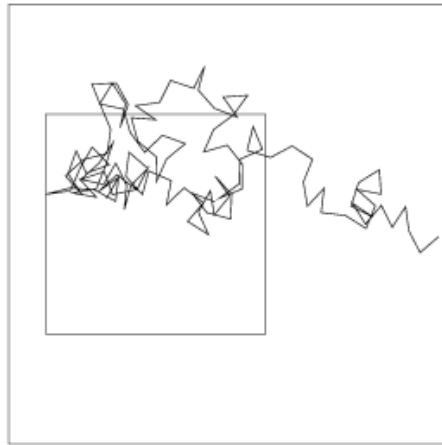
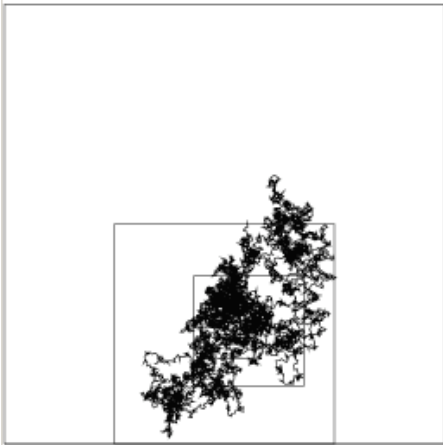
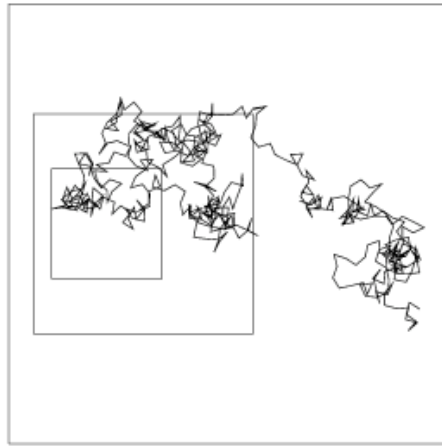
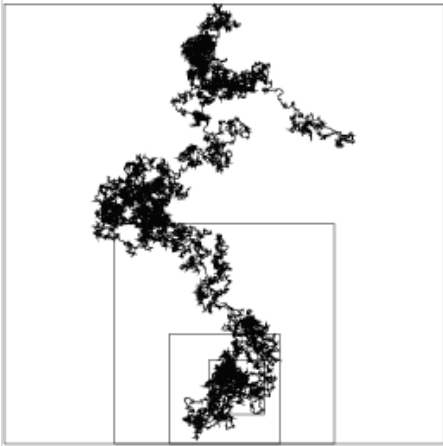


Attracting Fixed Point: Phases!  
Sometimes still fluctuations  
(Polymers, random walks,  
surface growth)

Slow Driving / Inhomogeneous /  
Long-range Forces  
Drives to Critical Point  
(Earthquakes, Sandpiles, Front  
Propagation, Forest Fires...)

# Random Walks: Self Similarity

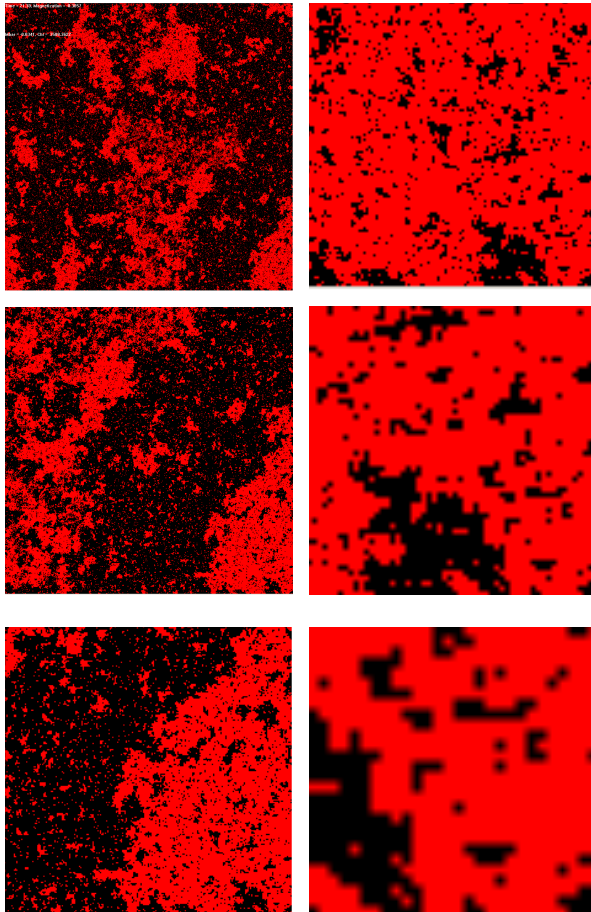
$\frac{1}{4}$  of an N-step walk is  
(statistically) like  
shrinking by  $\frac{1}{2}$



- Endpoint  $\sim (\sqrt{N} a)$  half as far
- Fractal: self similar
- Mass  $\sim \text{radius}^{\text{fractal dimension}}$
- Random walk dimension = 2

# Self-Similarity

## Self-Universality on Different Scales



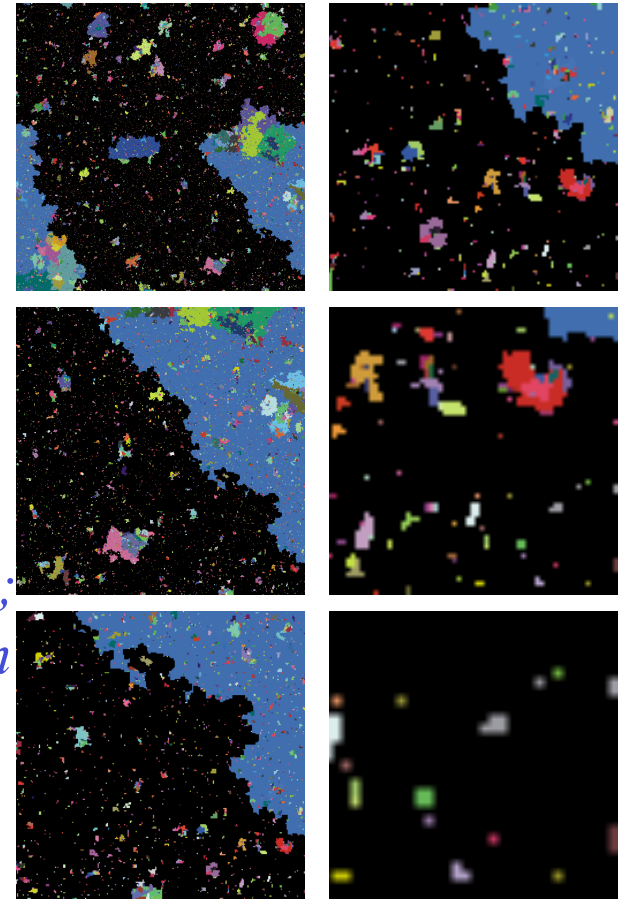
Ising Model at  $T_c$

Fixed point  $S^*$  maps onto *itself*, at a longer scale: *self-similar*. Models cross  $C$  at critical point  $T_c$ , flow to  $S^*$ : also self-similar.

*Self-similarity*  $\rightarrow$  *Power Laws*

*Expand rulers by  $B=(1+\epsilon)$ ; Avalanche size distribution*

$$D'[S'] = A D[C S'] \\ = (1+a\epsilon) D[(1+c\epsilon) S'] \\ a D = -c S dD/dS \\ D[S] = D_0 S^{-a/c}$$



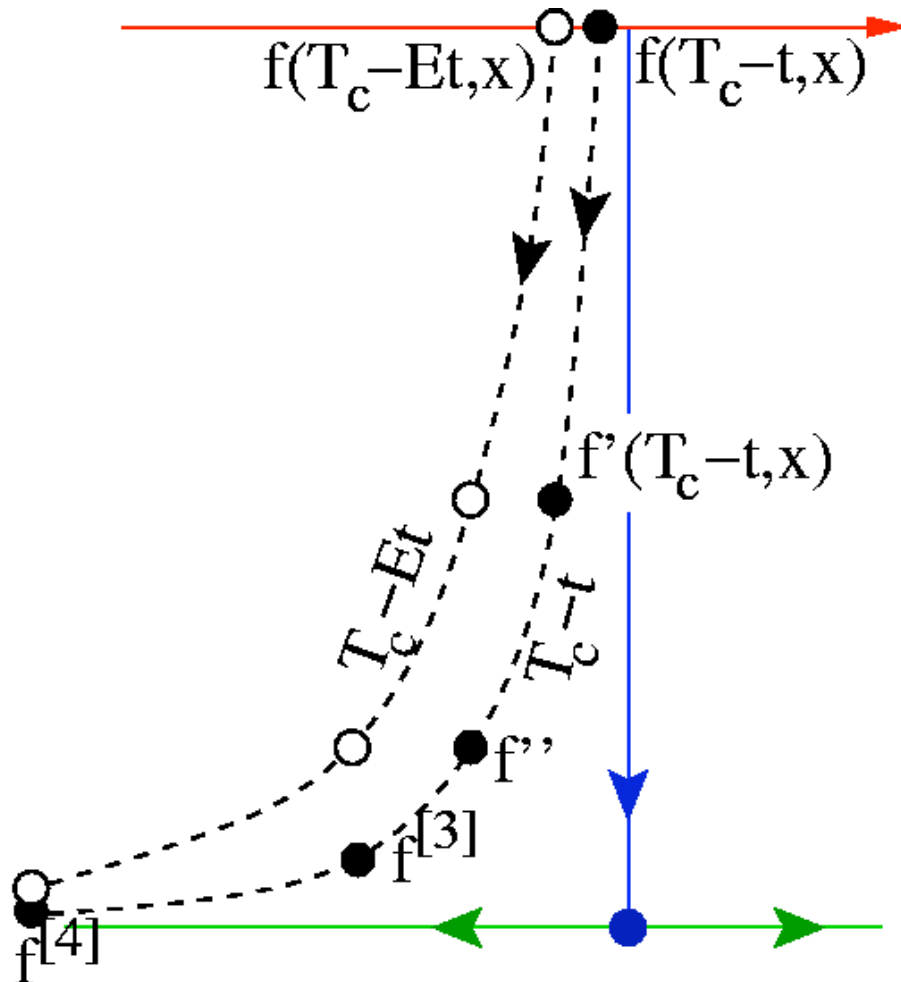
Hysteresis Model at  $R_c$

*Universal critical exponents  $c=d_f=1/\sigma\nu$ ,  $a/c=\tau$  :  $D_0$  system dependent*

Ising Correlation  $C(x) \sim x^{-(d-2+\eta)}$  at  $T_c$ , random walk  $x \sim t^{1/2}$

# Scaling Near Criticality

## Self-Universality on Different Scales



### RG Flow near Critical Point.

Two points that flow toward one another must be similar on long length scales.

$$f^{[4]}(T_c-t, x) = f^{[3]}(T_c-Et, x)$$

SO

$f'(T_c-t, y) = Af(T_c-t, By) \sim f(T_c-Et, y)$   
 at large  $y$ : the system is similar to itself at a different set of parameters.

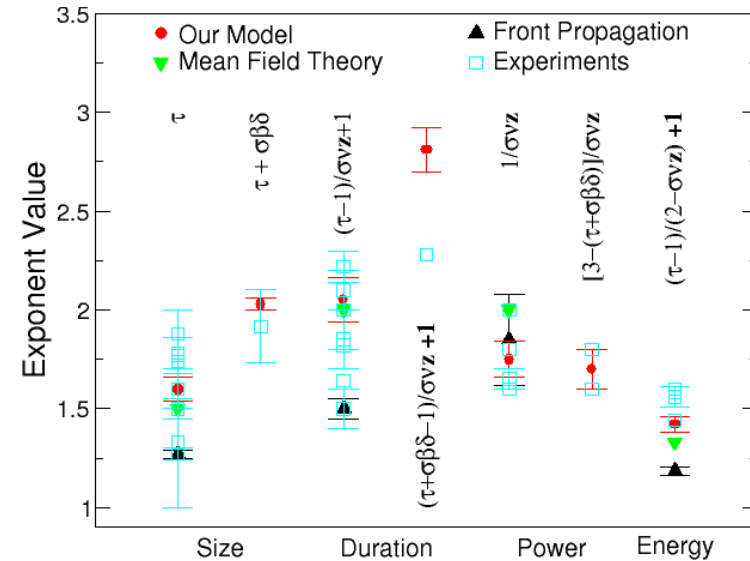
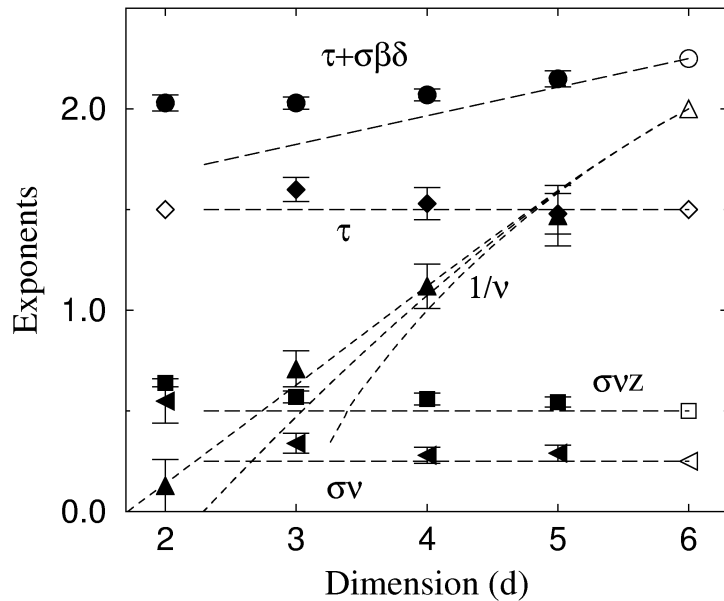
$$M'(T_c-t) = AM(T_c-t) = M(T_c-Et)$$

$$(1 + \beta\varepsilon/\nu) M(T_c-t) = M(T_c-t(1 + \varepsilon/\nu))$$

$$\dots M \sim (T_c-t)^\beta \sim t^\beta$$

# Critical Exponents

## Combinations of Greek Letters



$\sigma$ : Maximum avalanche size  $S_{max} \sim (R - R_c)^{-\sigma}$

$\nu$ : Correlation Length  $\xi \sim (R - R_c)^{-\nu}$

$\tau$ : Probability of Avalanche  $P(S, R_c, H_c) \sim S^{-\tau}$

$\bar{\tau} = \tau + \sigma\beta\delta$ : Integrated Probability  $P_{int}(S, R) \sim S^{-(\tau + \sigma\beta\delta)}$

$\sigma\nu$ : Fractal Dimension  $1/\sigma\nu$

$z$ : Duration  $T \sim \xi^z \sim (R - R_c)^{-\nu z}$

# Hysteresis Model for Magnets

## T=0 Driven Random-Field Ising Model

$$H = -\sum_{ij \text{ nn}} J S_i S_j - \sum_i H S_i - h_i S_i$$

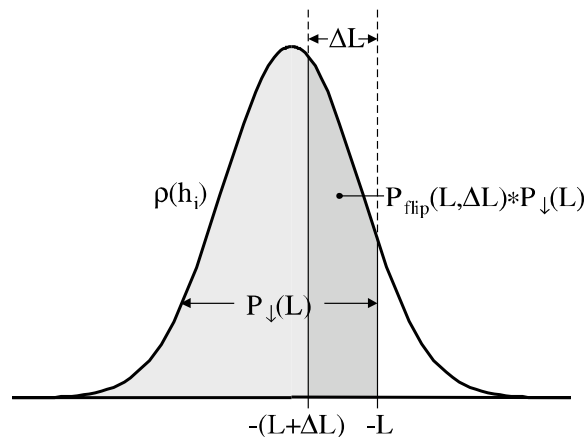
$S_i = \pm 1$ , magnetic domain

$J$  coupling between neighboring spins

$H$  external applied field

$h_i$  random field at site, dirt,

chosen from Gaussian width  $R$



$P(h)$  = Gaussian RMS width  $R$

**Lattice**

1	2	3	4	5
6	7	8	9	10
11	12	13	14	15
16	17	18	19	20
21	22	23	24	25

### Dynamics

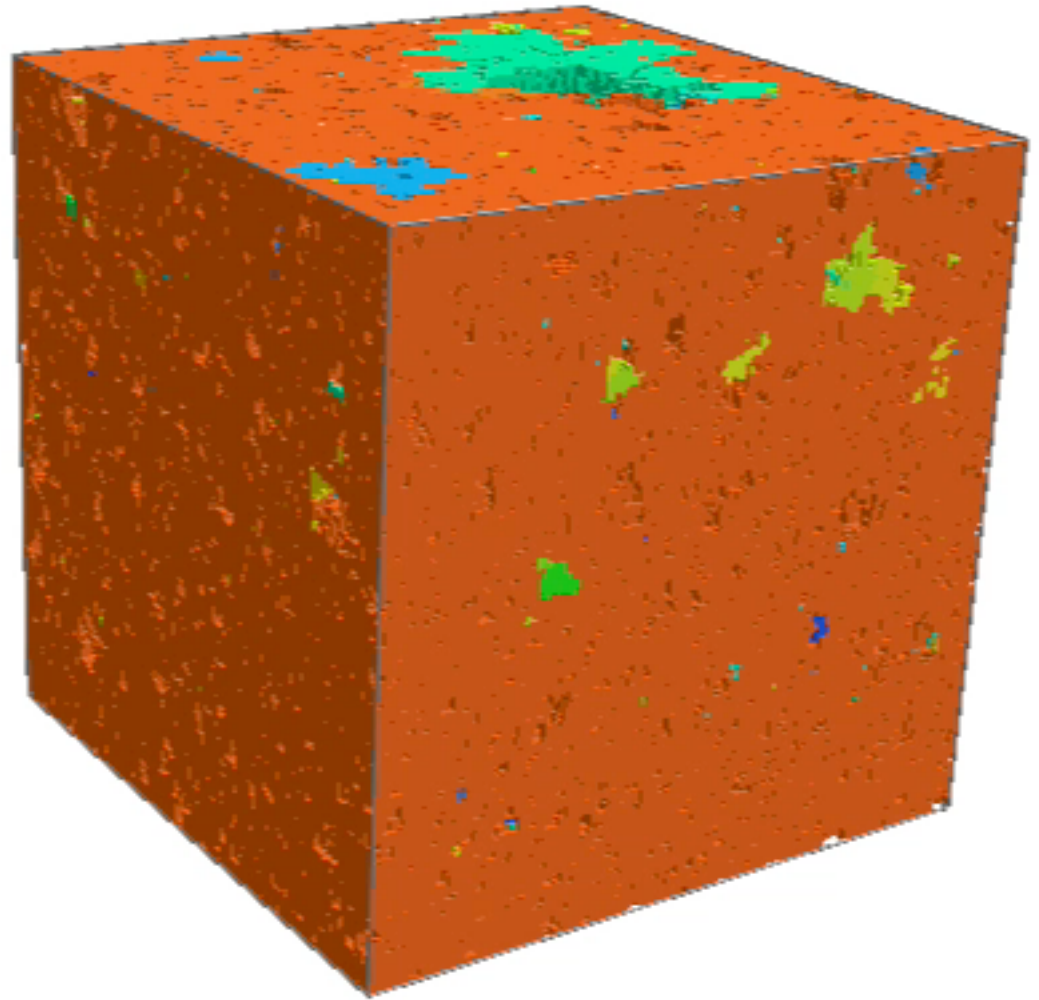
- Start all spins down,  $H = -\infty$
  - Increase field slowly
  - Spin flips when pushed over
  - Initial spin 13 pushed by  $H$
  - Pushes neighbors: avalanche!
- $V(t)$  = number of spins in shell  $t$

# Simulation at the critical disorder

(Chris Pelkie)

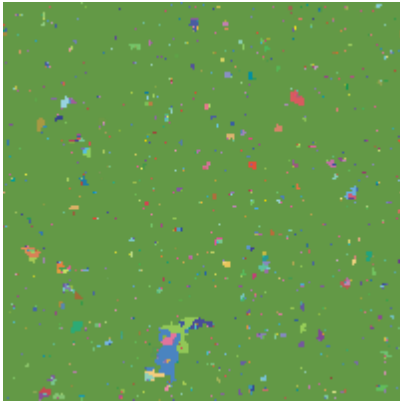
System tuned to special  
“critical” disorder  $R$

- Avalanches of all scales
- Early small avalanches, growing in size
- “Infinite” (red) avalanche, large jump in magnetization
- Small final avalanches fill in gaps

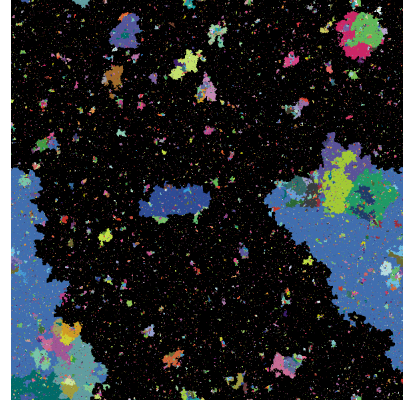


# Phase Transition in Nucleated Hysteresis

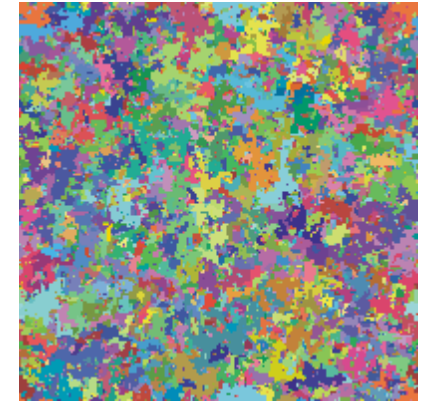
## Critical Disorder: First Infinite Avalanche



R=2



R=R<sub>c</sub>=2.16



R=2.5

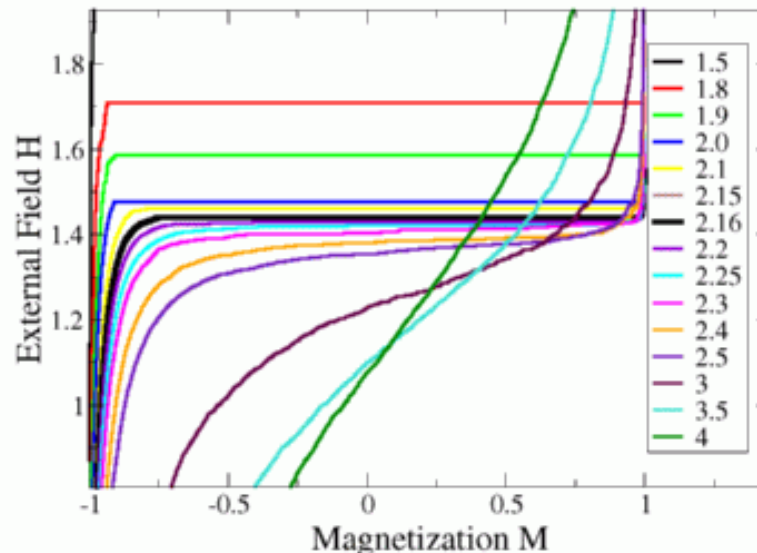
### *Small Disorder*

Neighbors Dominate  
One Big Avalanche  
(First Spin Triggers All)

At R<sub>c</sub>,

$$M - M_c \sim (H - H_c)^{1/\delta}$$

Transition in Shape of Hysteresis Loop



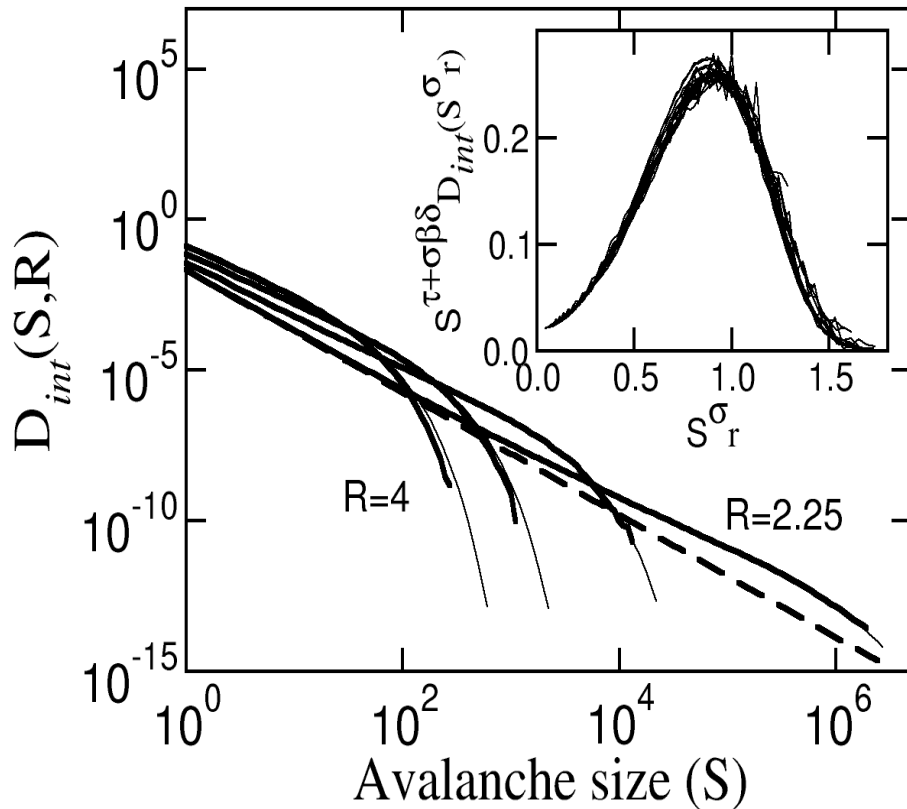
### *Large Disorder*

Dirt Dominates  
Many Small  
Avalanches  
(Each Spin to  
Itself)

What happens  
away from R<sub>c</sub>?

# Scaling Functions

## Self-Universality away from Criticality



- Avalanche Size Distribution  $D(S)$
- At  $R_c$  get Power Law  

$$D(S) \sim S^{-\bar{\tau}} \sim S^{-(\tau+\sigma\beta\delta)}$$
- Big ones cut off at  $(R-R_c)^{-\sigma}$
- Scale invariance: write as power law times function of one fewer variable ...

$$D[S,R] = S^{-(\tau+\sigma\beta\delta)} \mathcal{D}[S/(R-R_c)^{-\sigma}]$$

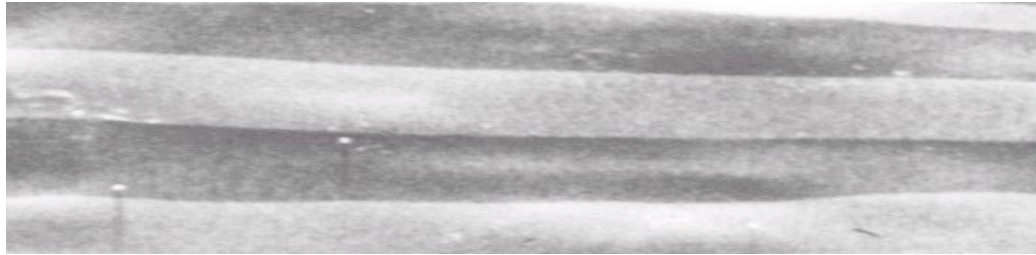
### Universal Scaling Function $\mathcal{D}$

Scaling Collapse: Plot  $S^{(\tau+\sigma\beta\delta)} D[S,R]$  vs.  $S/(R-R_c)^{-\sigma}$ , measure  $\mathcal{D}$  (inset)

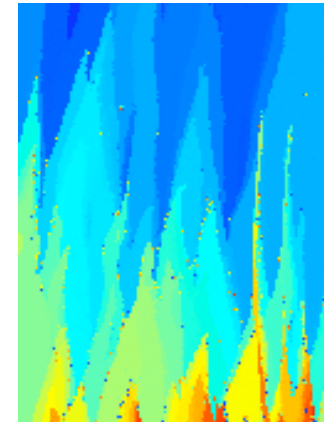
$$M(H,T) = (T_c - T)^\beta \mathcal{M}(H/(T_c - T)^{\beta\delta}); \quad C(x,t,T) = x^{-(2-d+\eta)} \mathcal{C}(x/|T-T_c|^{-\nu}, t/|T-T_c|^{-\xi\nu})$$

# Real Barkhausen Noise

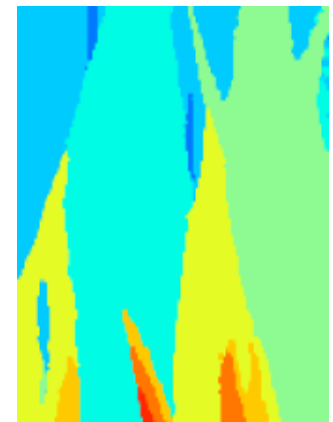
Motion of single fronts (Robbins, Fisher, Bouchaud)



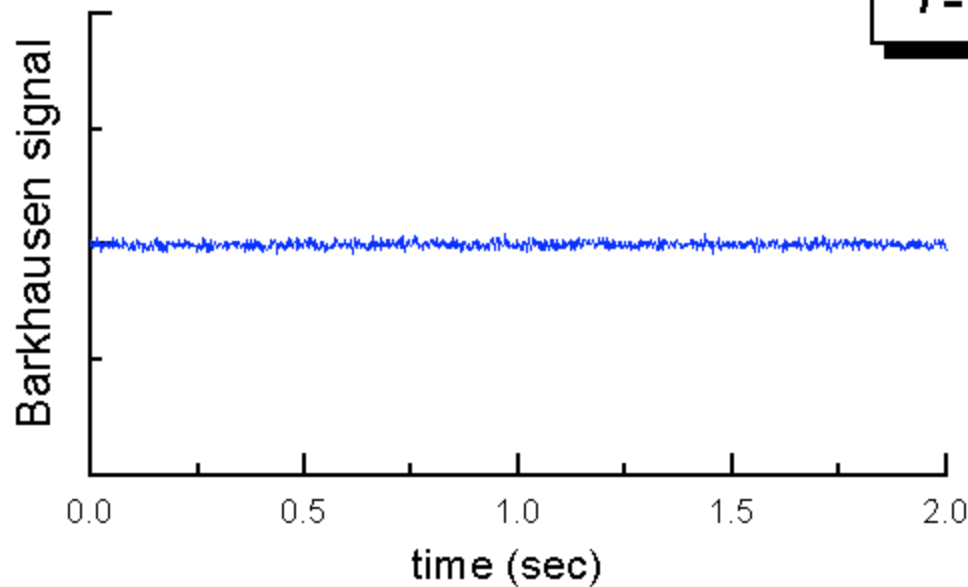
Gianfranco Durin



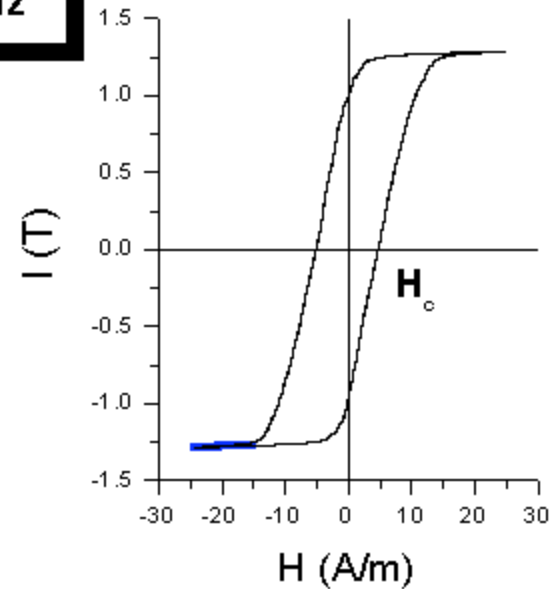
$880 \times 660 \mu\text{m}$



$440 \times 330 \mu\text{m}$



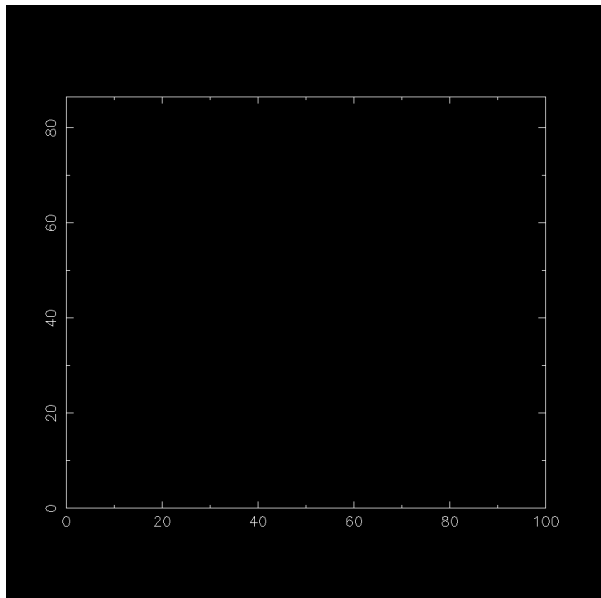
$f = 50 \text{ mHz}$



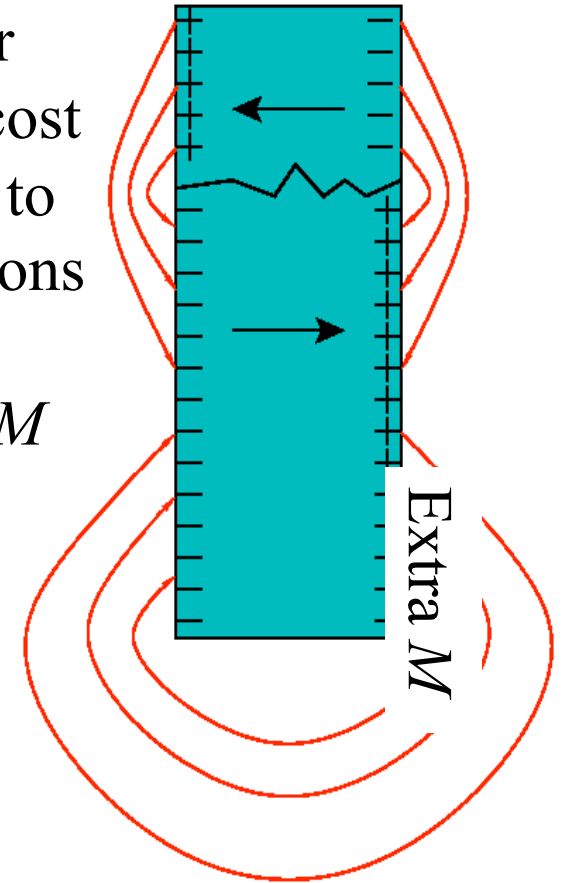
# Demagnetizing Field

## How magnets self-organize to front depinning point

Once the external field depins a front, why does it ever stop moving?

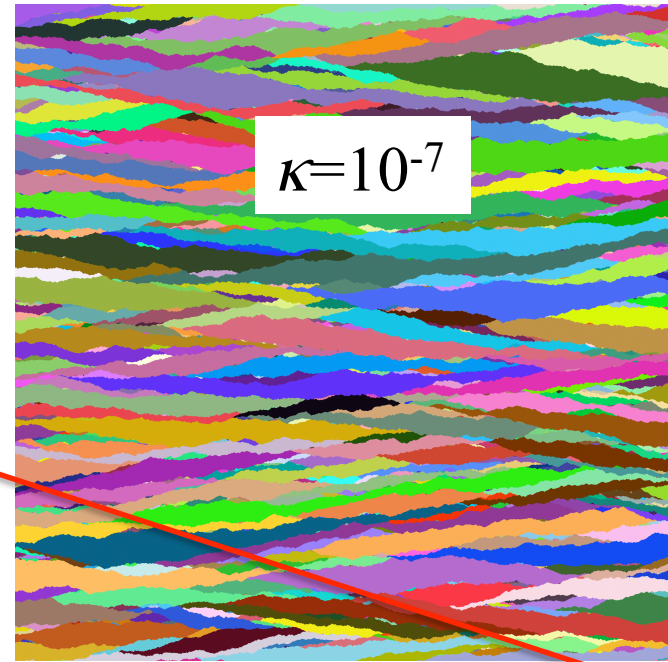
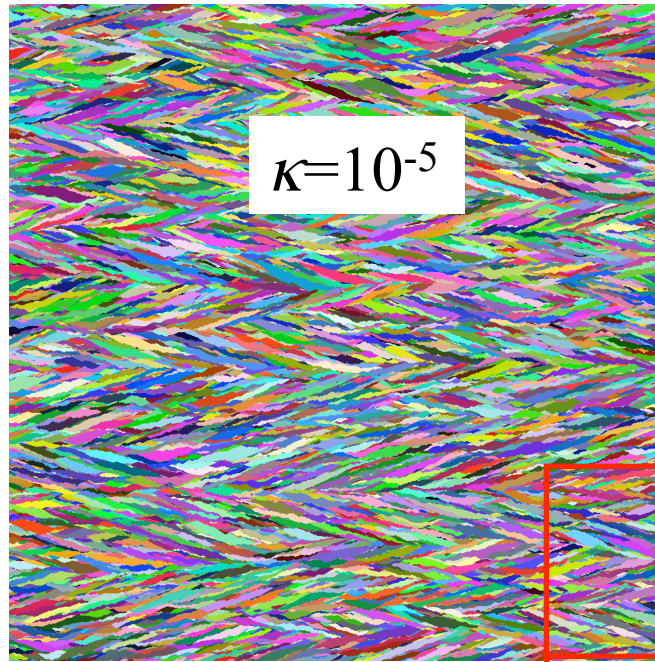


Long-range dipolar fields (+/- = N/S) cost energy mostly due to non-canceling regions (hence  $\sim \kappa M$ , net magnetization  $M$   $\times$  demagnetization factor  $\kappa$ ).



**$\kappa$  acts as much like  $T-T_c$ , a *relevant* perturbation that cuts off the largest avalanches**

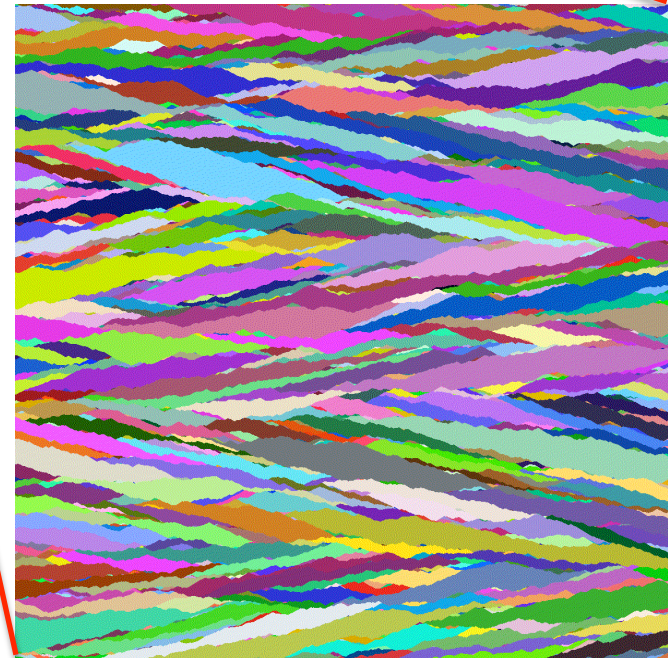
YJ Chen,  
Others



# Demagnetizing Field $\kappa$

Front propagation: limits  
sizes of avalanches

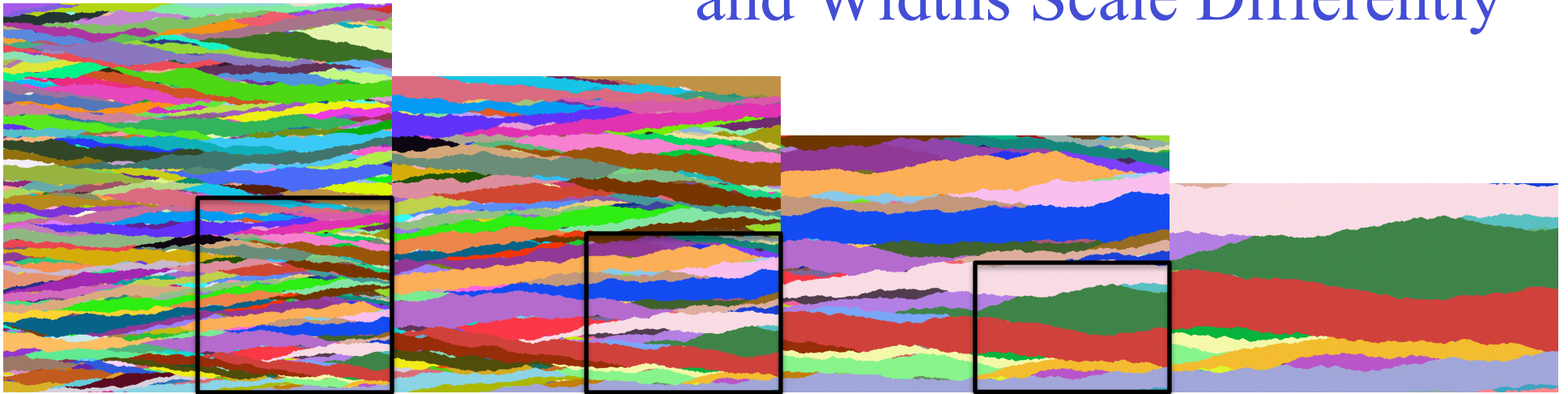
Self-similar at different  $\kappa$   
Rescaling  $w'=b w$  and  $h'=b^\zeta h$   
makes  $\kappa'$  look like  $b^{-x} \kappa$



YJ Chen,  
Others

# Self-Affine

Front propagation: Heights  
and Widths Scale Differently



Cut bottom left-hand quarter

Rescale widths by 2, heights by  $2^\xi$

Effective lower demagnetizing field:

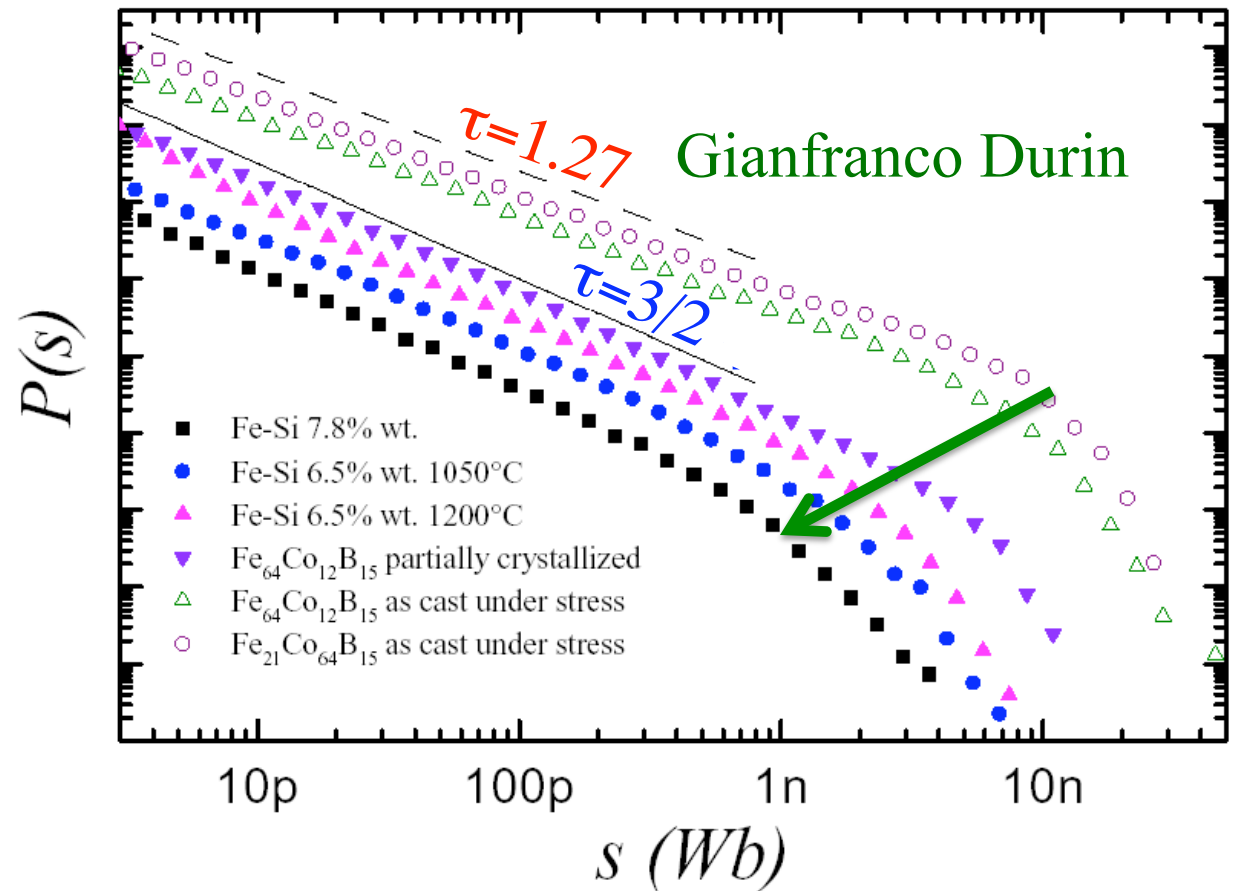
larger avalanches

Fronts appear statistically similar: self-affine

# Barkhausen Noise Size Distributions

## 3D Universality classes

Avalanche size distributions (and other critical exponents) cluster into two families. One is the *front propagation model*, the other is a *mean-field theory* due to long-range forces. (Our model doesn't describe any of the experiments.)



- Different systems, same exponents
- Experiment and theory, same exponents

$$\text{Cutoff } S_{max} \sim K^{-\sigma_K}$$

***Universality!***

# Beyond Power Laws

## *Universal Scaling Functions*

Functions of one variable become power laws at critical points

$$P(S) = b^x P(S/b^{df}) = b^{nx} P(S/b^{ndf}) = \dots = S^{-\tau}$$

Functions of  $N$  variables become power laws times *universal* functions of  $N-1$  scaling variables

$$P(S, H, W | \kappa) = b^y P(S/b^{df}, H/b^\xi, W/b | \kappa/b^{x_k})$$

$$= \dots = S^{-\omega} \mathcal{P}(H^{1+\xi}/S, W^{1+1/\xi}/S, \kappa^{\sigma_\kappa}/S)$$

Universal scaling functions forms:

- avalanche shape,  $T^{1/\sigma_v z-1} \mathcal{V}(t/T)$
- avalanche energy,  $S^2 \mathcal{E}(\omega^{1/\sigma_v z} S)$
- avalanche size/duration,

$$S^{-\tau} \mathcal{P}_\pm (S/\kappa^{\sigma_\kappa})$$

Ising model, other critical points

- magnetization  $r^\beta \mathcal{M}_\pm(h/r^{\beta\delta})$
- correlation length

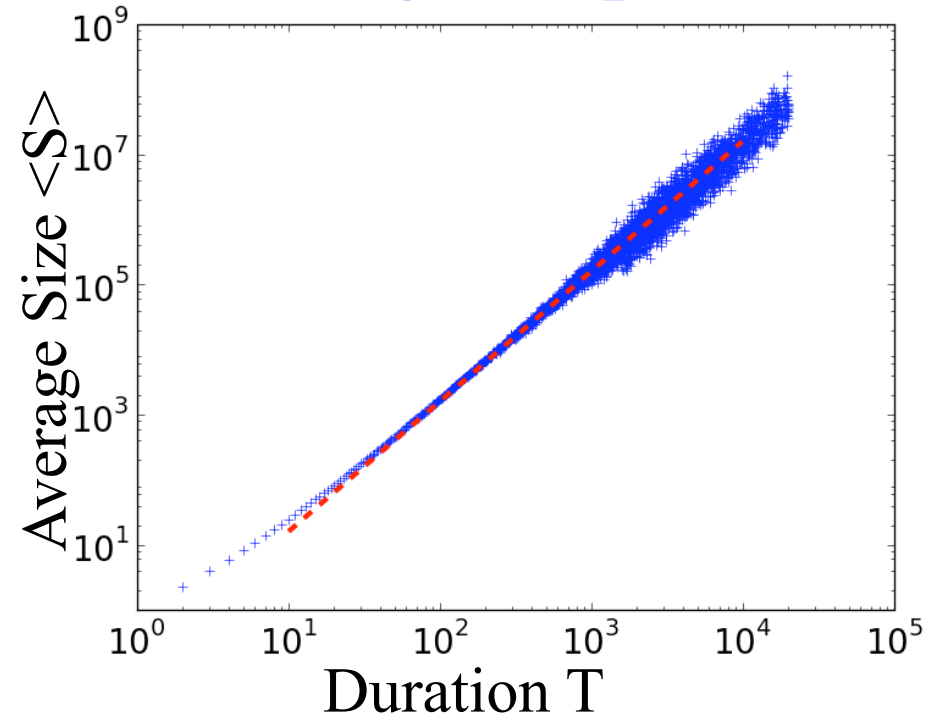
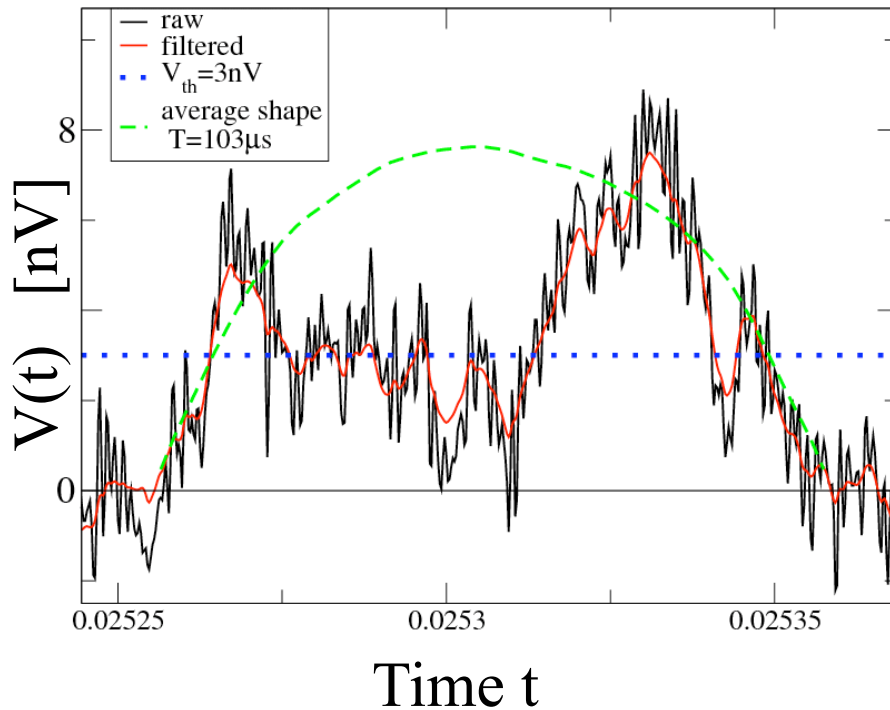
$$\xi(T, H) = t^\nu \mathcal{Y}_\pm (h/t^{\beta\delta})$$

- finite size scaling ...

# Avalanche Temporal Structure

Stefanos  
Papanikolaou,  
Others

## Duration scaling, fractals, average shapes



Hierarchical structure in time  
avalanche almost stops  
many times

Average shape for given  
duration: dashed green line

Average size  $S$  grows with  
duration

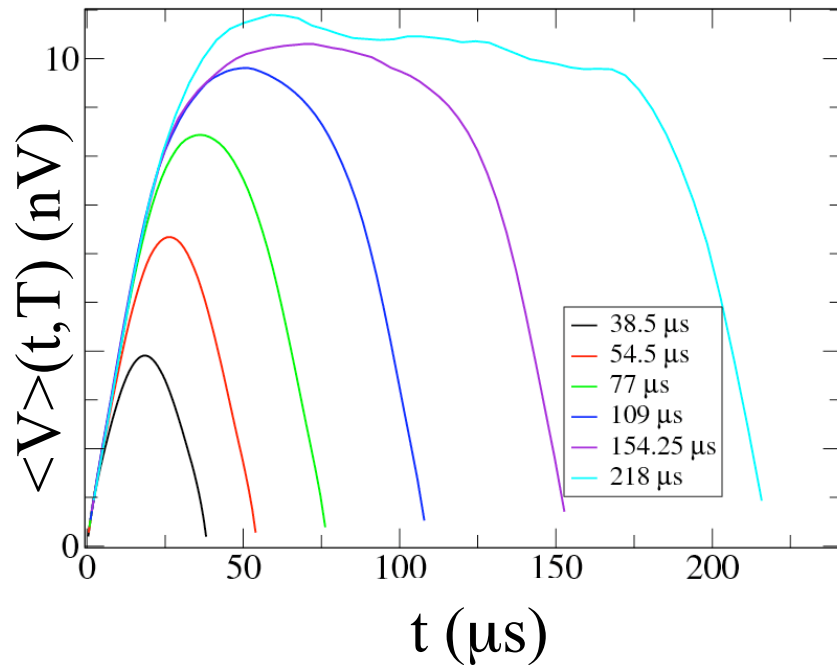
$$S \sim \xi^{\sigma_V} \sim T^{\sigma_V}$$

Another power law...

# Scaling Collapses

Universal *functions*

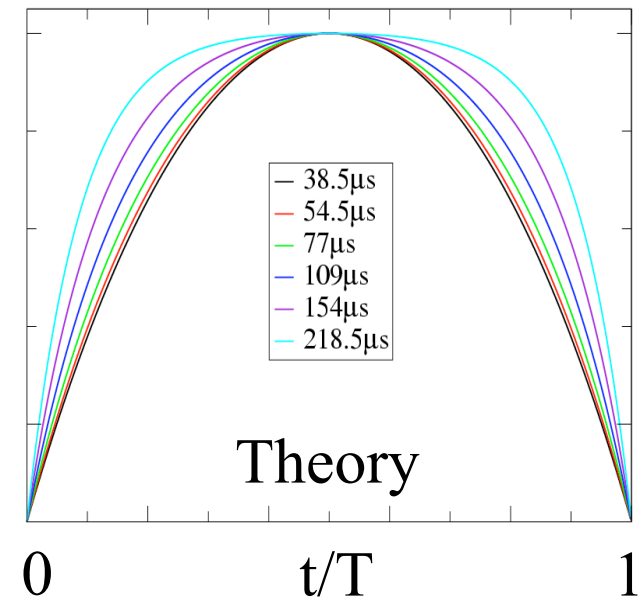
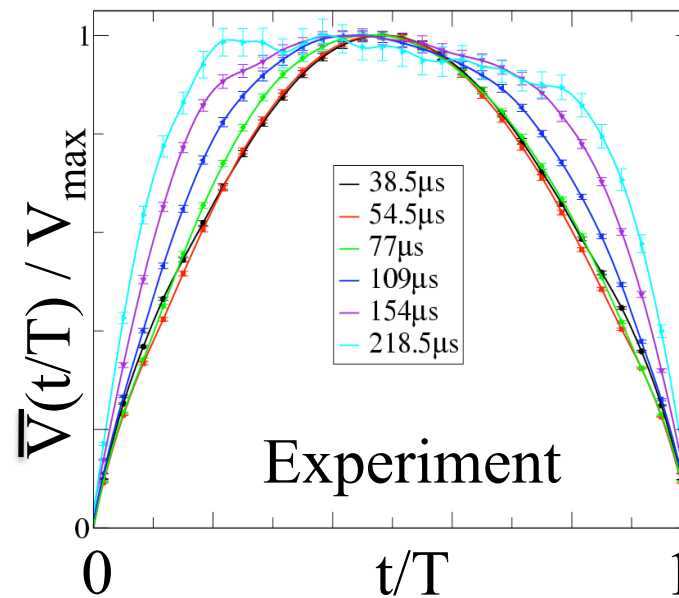
Average  $\langle V \rangle(t, T)$  over avalanches of duration  $T$



## Scaling Collapse

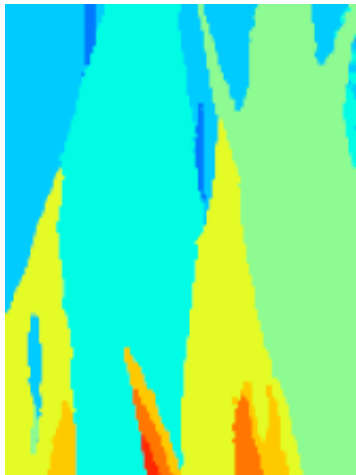
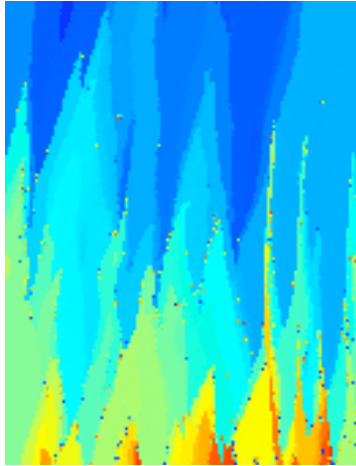
- Divide variables by scale (time  $T$ , voltage  $V_{\text{max}}$ )
- Universal scaling form (parabola MF)
- Demagnetizing field crossover flattening

Scaling away from criticality?



# Avalanche Spatial Structure

## Beyond Critical Exponents

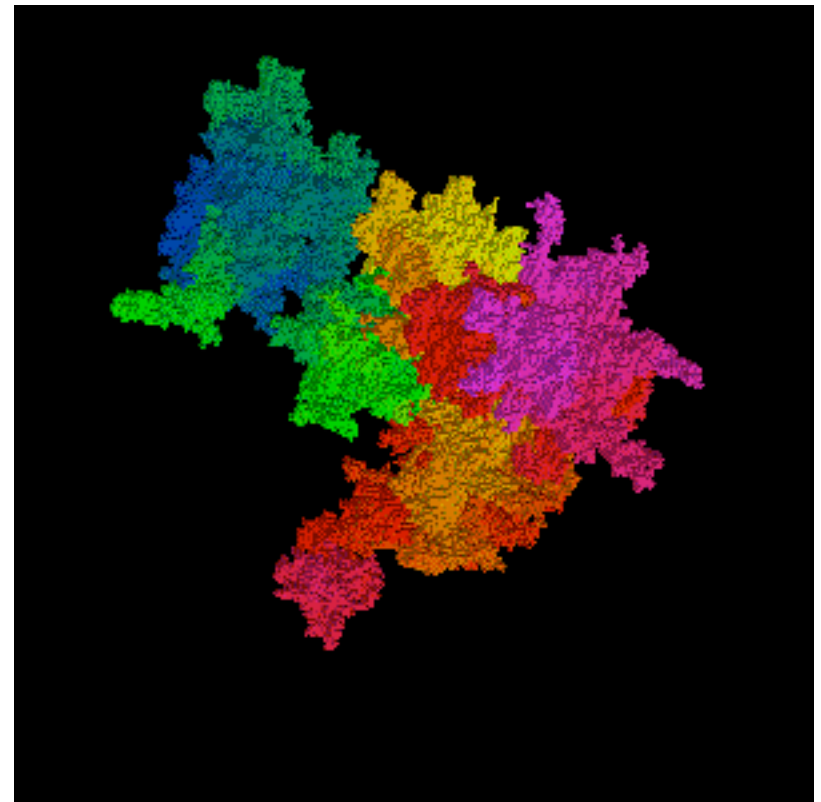


880 X 660  $\mu\text{m}$

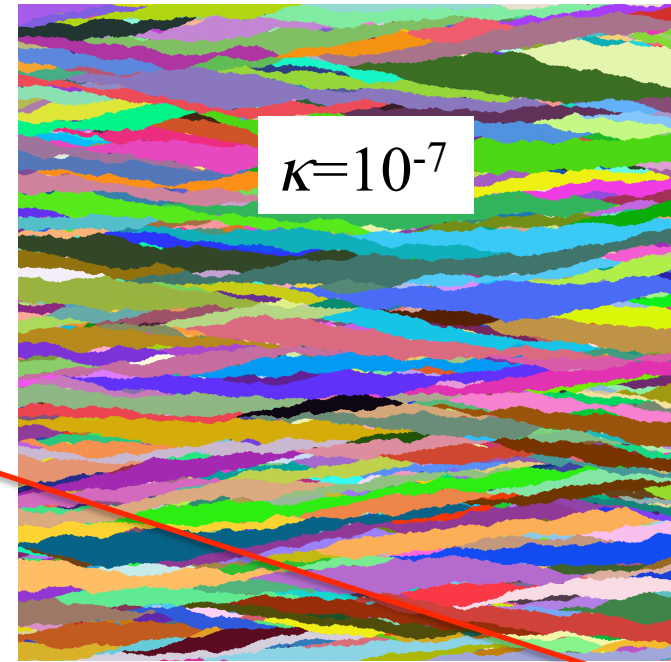
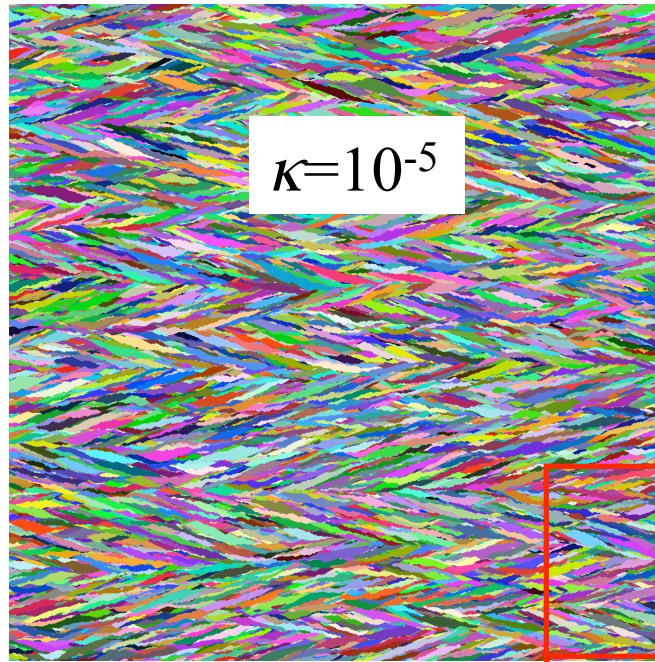
440 X 330  $\mu\text{m}$

All geometrical features of large avalanches should be universal.

- Correlation functions, fractal dimensions
- Aspect ratios
- Topology (holes, interconnectedness) (string theory)
- Front shapes
- Height, width distributions



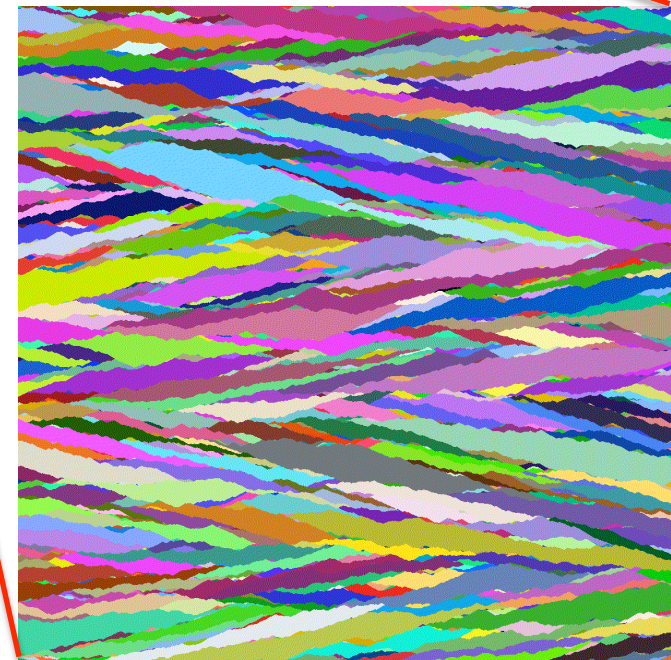
YJ Chen,  
Others



# Demagnetizing Field $\kappa$

Front propagation: limits  
sizes of avalanches

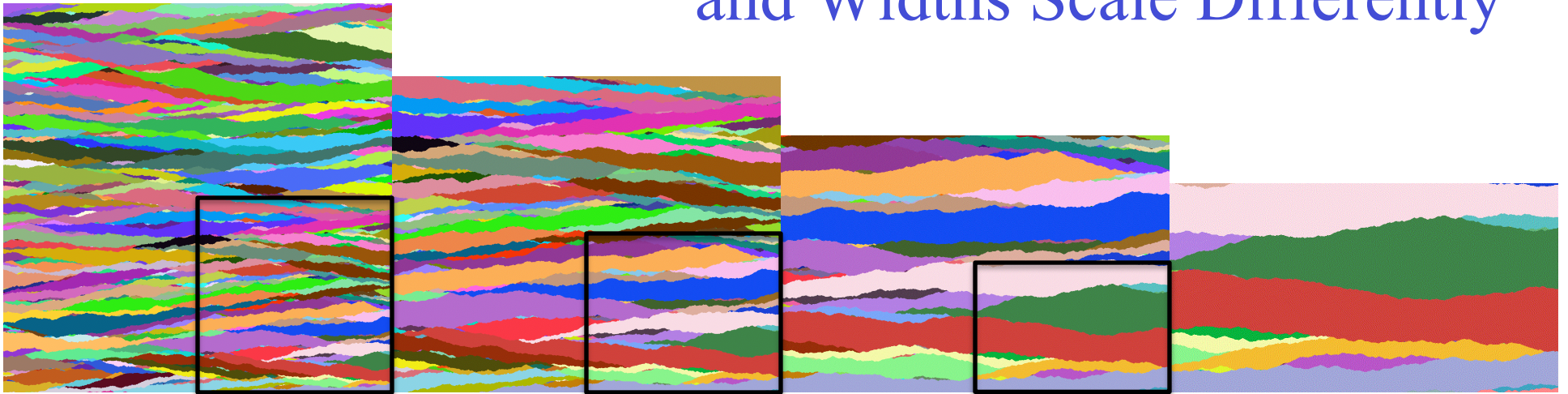
Self-similar at different  $\kappa$   
Rescaling  $w'=b w$  and  $h'=b^\zeta h$   
makes  $\kappa'$  look like  $b^{-x} \kappa$



YJ Chen,  
Others

# Self-Affine

Front propagation: Heights  
and Widths Scale Differently



Cut bottom left-hand quarter

Rescale widths by 2, heights by  $2^\zeta$

Effective lower demagnetizing field:

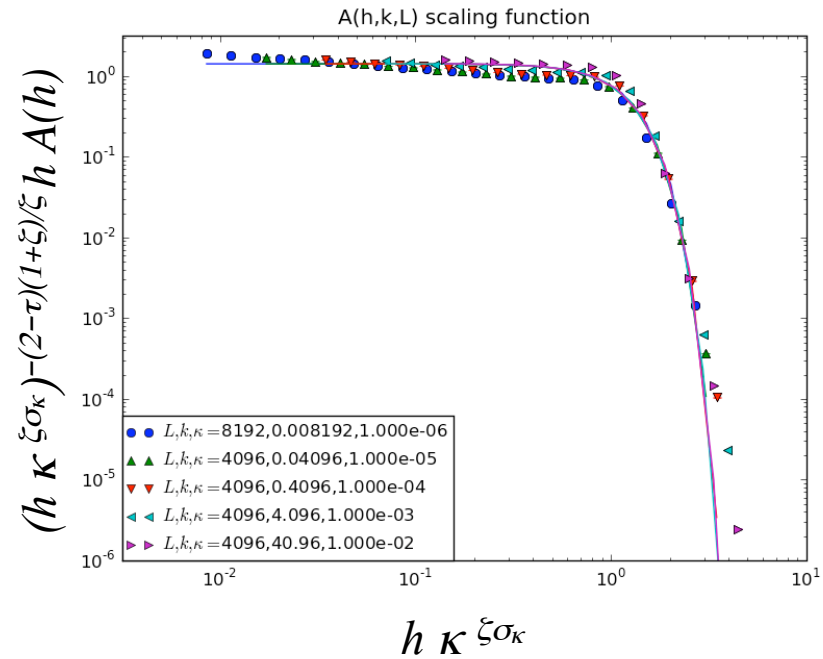
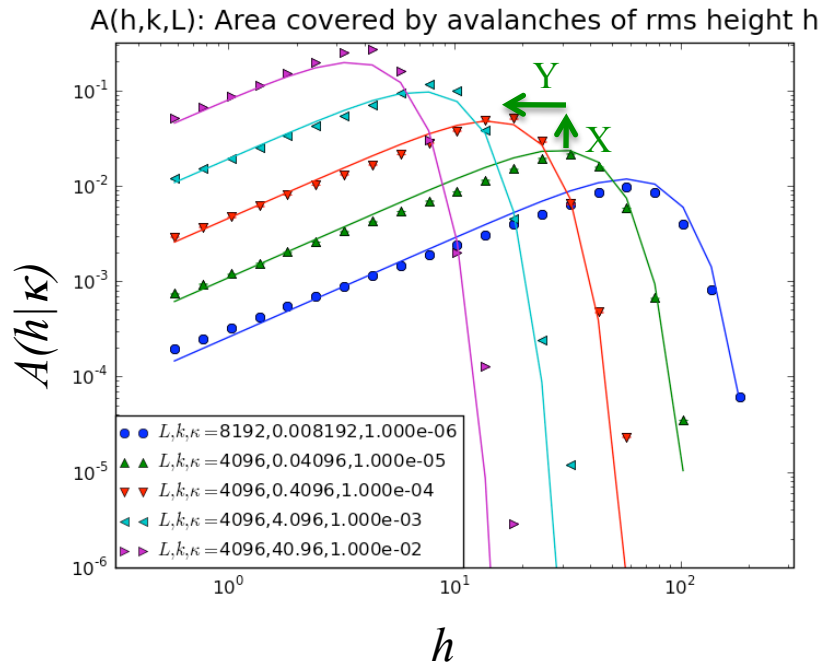
larger avalanches

Fronts appear statistically similar: self-affine

YJ Chen,  
Others

# Avalanche heights

## Scaling away from criticality



$A(h|\kappa)$  similar to  $X^n A(h / Y_n | 10^n \kappa)$

$$A(h|\kappa) = X^{-\log_{10} \kappa} \mathbf{A}(h / Y^{-\log_{10} \kappa})$$

$$= \kappa^{-\log_{10} X} \mathbf{A}(h \kappa^{\log_{10} Y})$$

$$= \kappa^{(\dots)} \mathbf{A}(h \kappa^{\xi \sigma_{\kappa}})$$

$\mathbf{A}(h \kappa^{\xi \sigma_{\kappa}})$  is a *universal scaling function* of the *scaling variable*  $h \kappa^{\xi \sigma_{\kappa}}$ .

# Traditional Equilibrium Criticality

## Energy versus Entropy

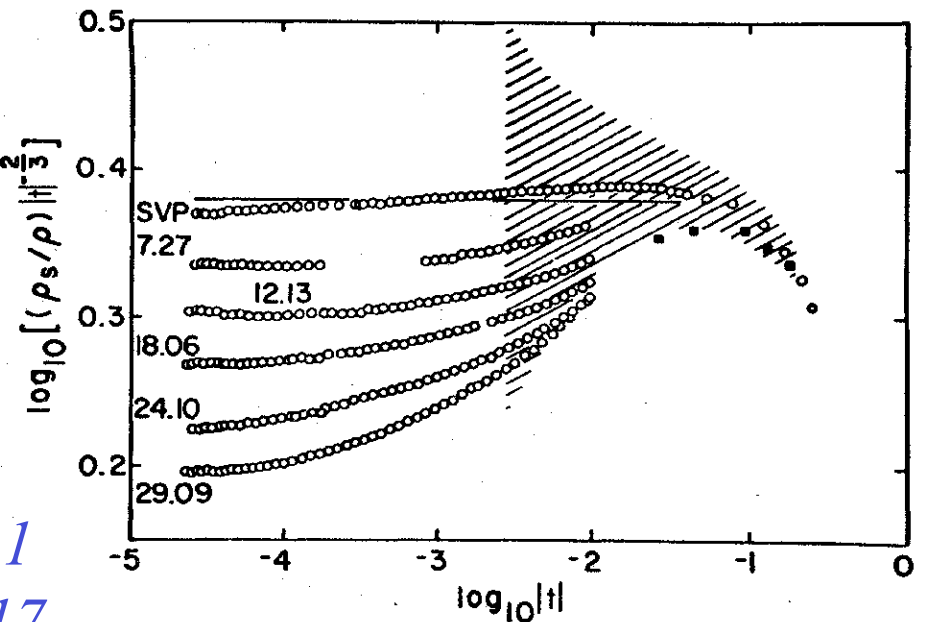
### Traditional Equilibrium Critical Points

- Ising, Potts (N-state), Heisenberg (3D vector)
- Helium: 3D XY model
- 2D XY Kosterlitz-Thouless Transition, 2D Melting, Hexatic Phases
- Liquid Crystals (Nematic to Smectic A)
- Wetting Transitions

### Ahlers: Superfluid Density versus $T$

- Five decades of  $t = |T_c - T|/T_c$
- Power law  $\zeta$
- Singular correction to scaling  $x$ 

$$\rho_s/\rho = k |T_c - T|^\zeta (1 + d |T_c - T|^x)$$
- $\zeta_{exp} = 0.6749 \pm 0.0007$ ,  $x_{exp} = 0.5 \pm 0.1$
- $\zeta_{th} = 0.669 \pm 0.002$ ,  $x_{th} = 0.522 \pm 0.017$



Ahlers Rev Mod Phys 52, 489 (1980).  
Theory: LeGuillou & Zinn-Justin

# Quantum Phase Transitions

$\hbar$  vs. Disorder, Field, ...

## Quantum Phase Transitions

- Metal-Insulator Transitions (Localization)
- Superconductor-Insulator Transitions
- Transitions between Quantum Hall Plateaus
- Macroscopic Quantum Tunneling  
(Quantum Coherence and Schrödinger's Cat)
- Kondo Effect

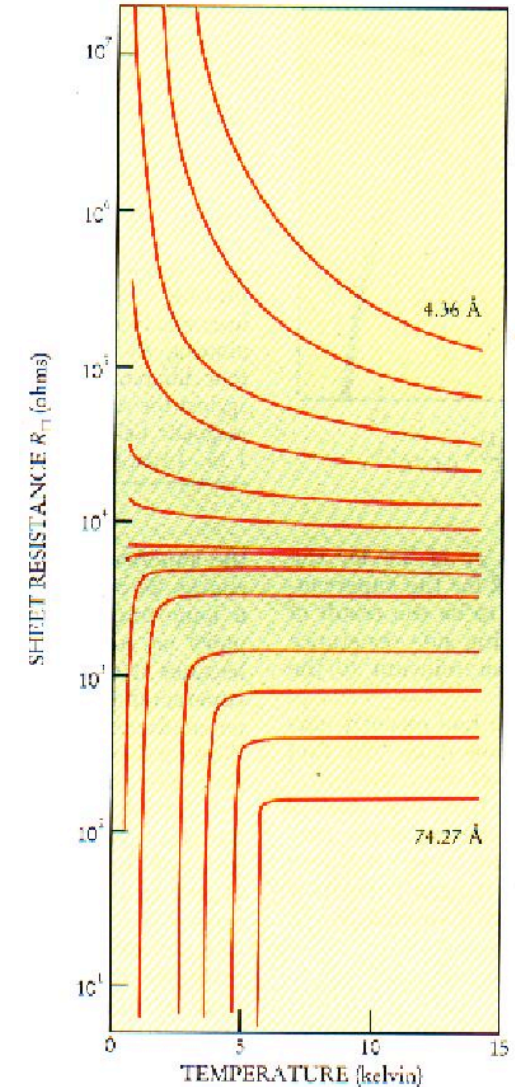
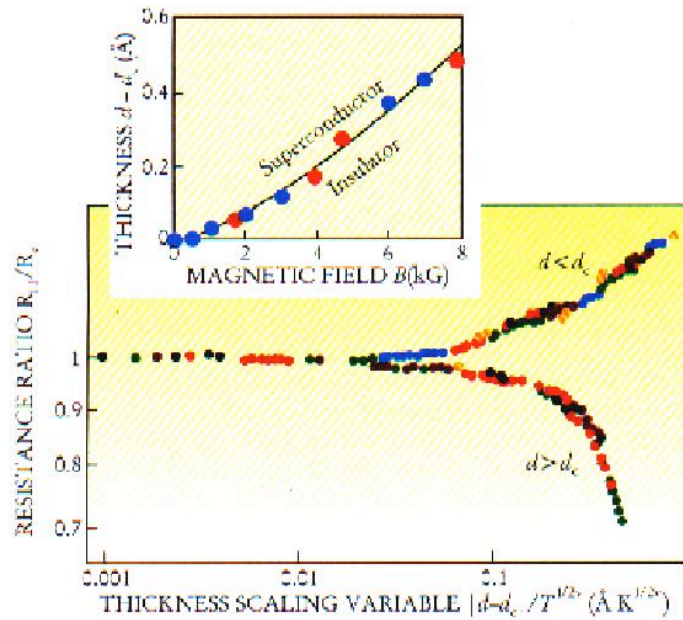
SC to Insulator with  
Film *Thickness*

Right: Resistance vs.  $T$

Left: Scaling Plot

$R/R_c$  vs.  $|d-d_c|/T^{1/z\nu}$

Left Inset: Phase  
Boundary ( $B, d$ )



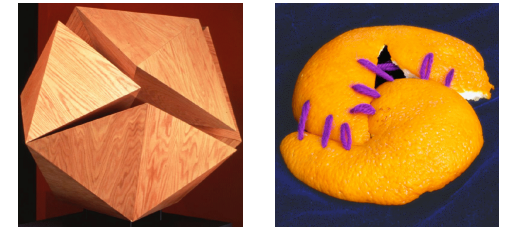
Goldman & Markovic, Phys. Today, p. 39, Nov. 1998

# Disordered Systems

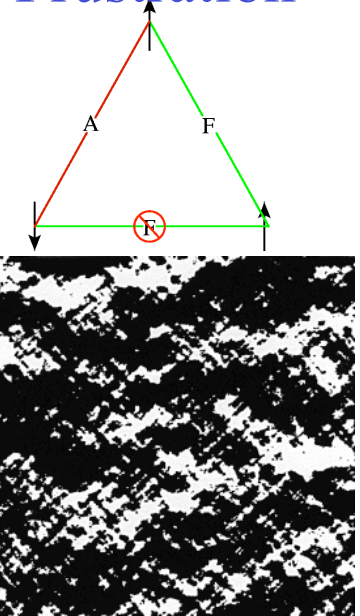
## Fancy Tools, Still Controversial

### Disordered Systems (Disorder vs. Temperature)

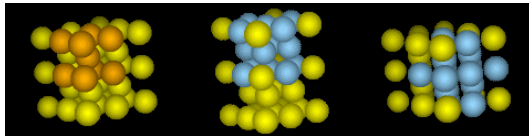
- Spin Glasses: Dilute Magnetic Alloys
  - Frustration, Competing Ferro/Antiferro, RKKY
  - Long-range order in Time  $\lim(t \Rightarrow \infty) \langle S_i(t) S_i(0) \rangle$
  - Replica Theory vs. Clusters
  - Neural Networks, Tweed in Martensites
- Random Field Ising Models
  - Dimensional Reduction, Supersymmetry *Wrong*
  - Diverging Barriers, Analogies to Glasses?
- Vortex Glass Transition, ...



Frustration

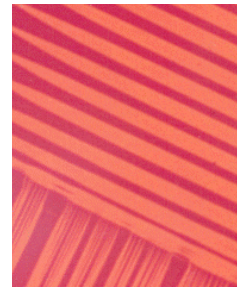
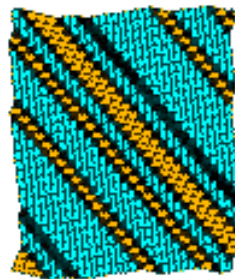


Tweed Precursors



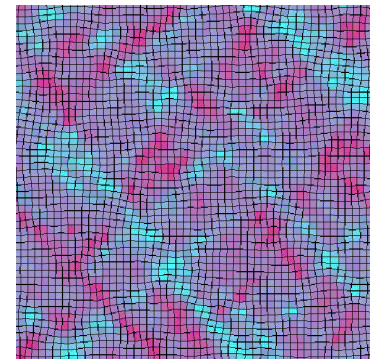
Martensites Change Shape

[http://www.lassp.cornell.edu/sethna/Tweed/What\\_Are\\_Martensites.html](http://www.lassp.cornell.edu/sethna/Tweed/What_Are_Martensites.html)



Form Stripes

But  
First  
...



# Dynamical Systems and Chaos

## Coarse-Graining in Time

### Low Dimensional Dynamical Systems

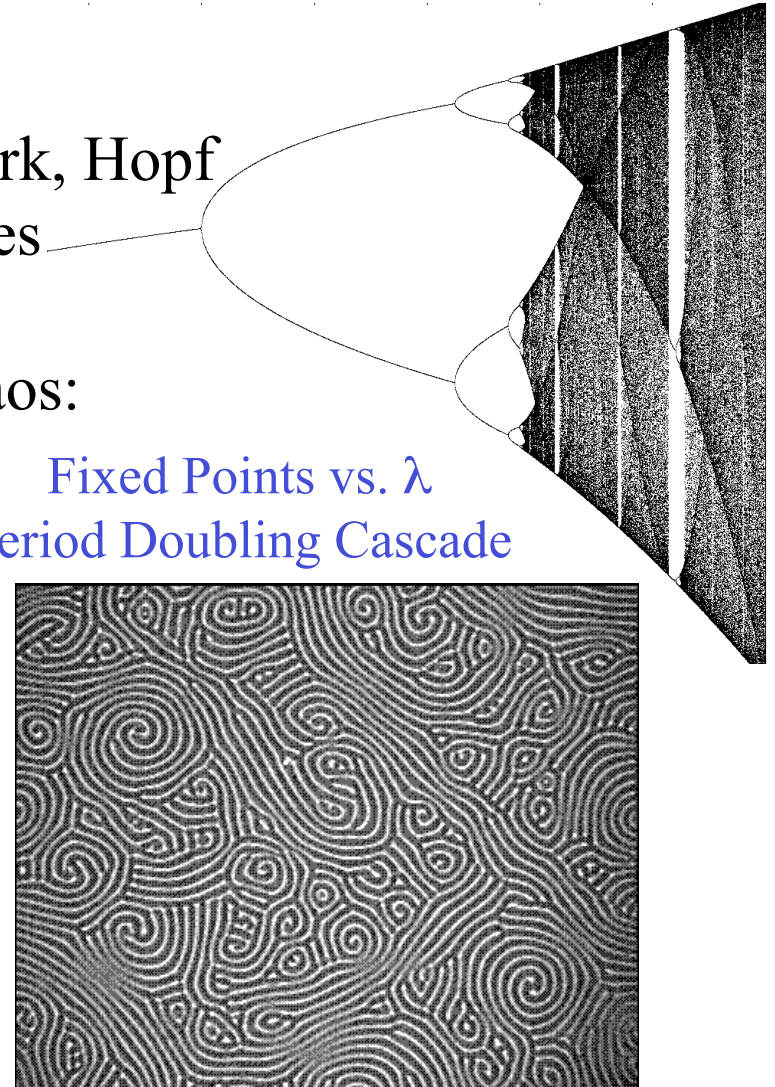
- Bifurcation Theory
  - Saddle-Node, Intermittency, Pitchfork, Hopf
  - Normal Forms = Universality Classes
- Feigenbaum Period Doubling
- Transition from Quasiperiodicity to Chaos:
  - Circle Maps
- Breakdown of the Last KAM Torus:
  - Synchrotrons and the Solar System

Fixed Points vs.  $\lambda$   
Period Doubling Cascade

### High-Dimensional Systems

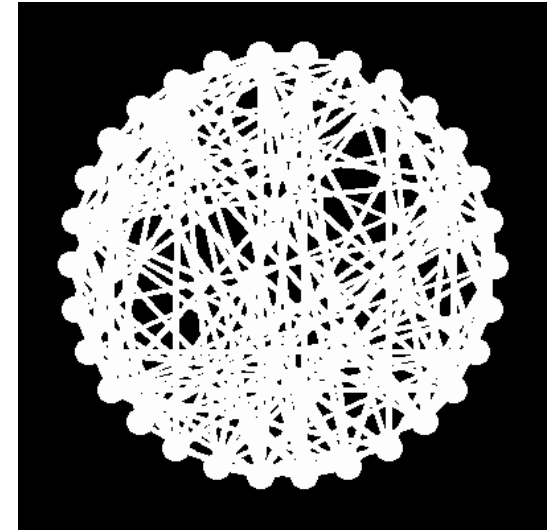
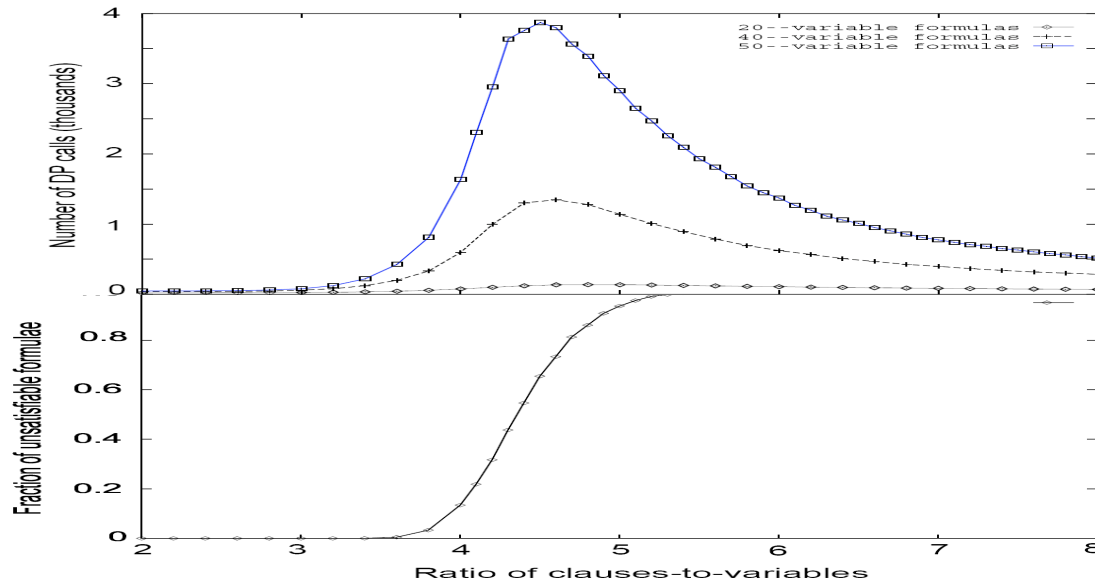
- Turbulence?
- Spatiotemporal Defect Chaos?
- Avalanches...

Bodenschatz

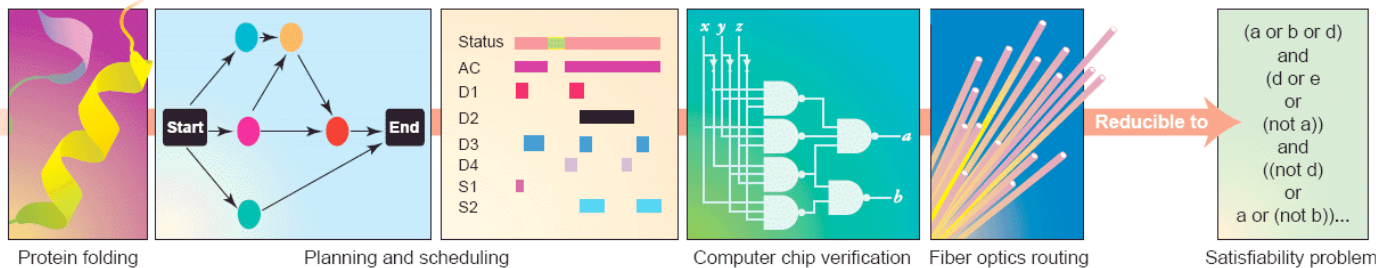


# Logical Satisfiability and NP-Completeness

Selman, Kirkpatrick, Gomes, Mézard, Montanari, Monasson, ...



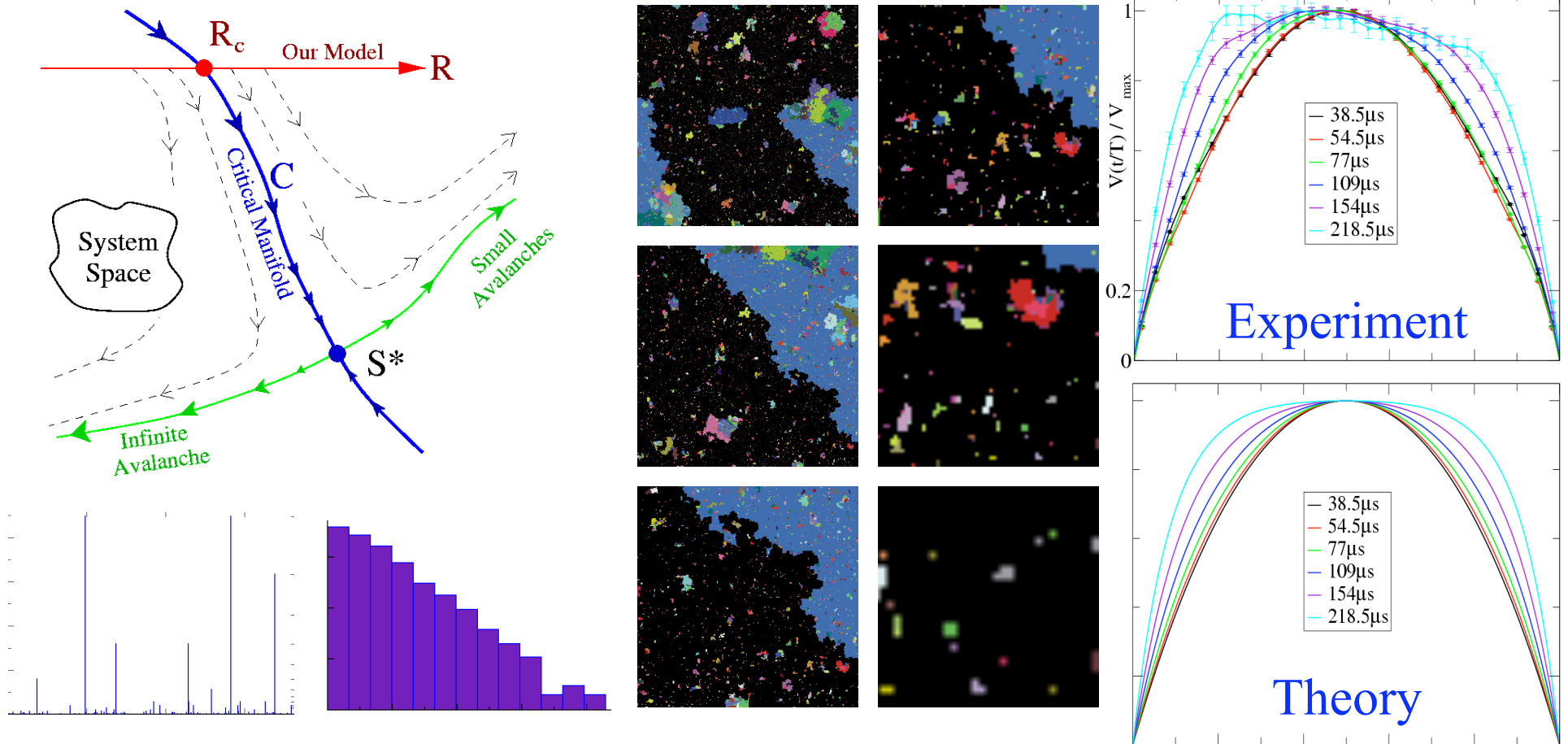
Worst-case problems exponentially hard  
 Typical problem hard only near phase transition



Two phase transitions!  
 RG: Coppersmith  
 Universality?

# Continuous Phase Transitions

Jim Sethna, Physics 653, Fall 2010



Yanjiun Chen, Stefanos Papanikolaou, Karin Dahmen, Olga Perković, Chris Myers, Matt Kuntz, Gianfranco Durin, Stefano Zapperi, ...