

## Outline

### (1) Nonequilibrium steady states

Breaking of detailed balance  $\Rightarrow$  problems with usual thermodynamic concepts

Presence of fluxes  $\Rightarrow$  power-law correlations, anisotropy

### (2) Phase transitions far from equilibrium

Differences from equilibrium (effects from dynamics)

Generation of effective long-range interactions, dynamical anisotropies

Searching for nonequilibrium universality classes

Driven lattice gases, two-temperature models, flocking, ...

Where do the power-law correlations come from?

SOC and absorbing-state transitions, surface fluctuations

Nontrivial distribution functions - using universality

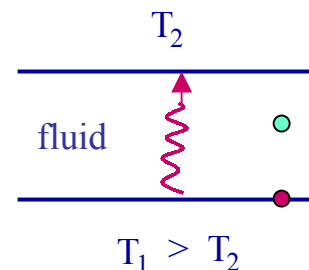
### (3) Quantum steady-states with fluxes

Spin chains with fluxes:  $T=0$  nonequilibrium transitions

### (4) Pattern formation

Classification of instabilities

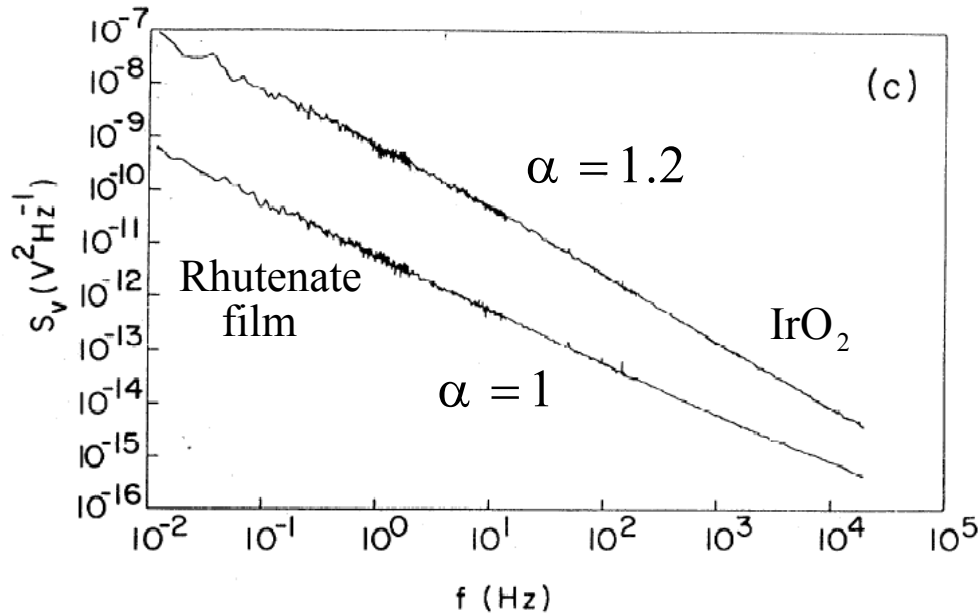
Real- and complex-coefficient Ginzburg-Landau equations



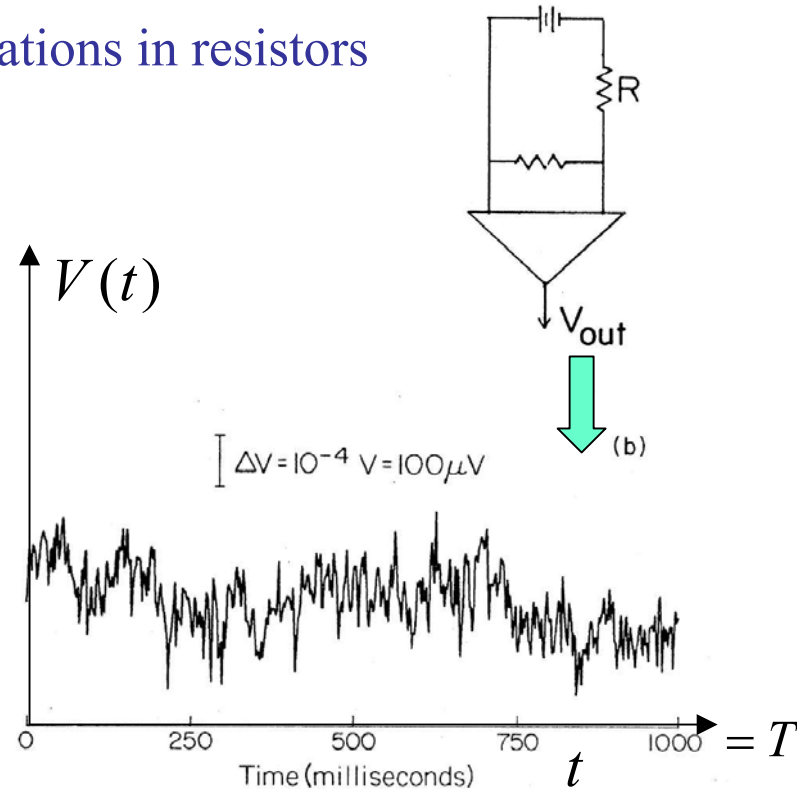
# Where do the power laws come from?

## History - examples

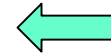
1/f noise - voltage fluctuations in resistors



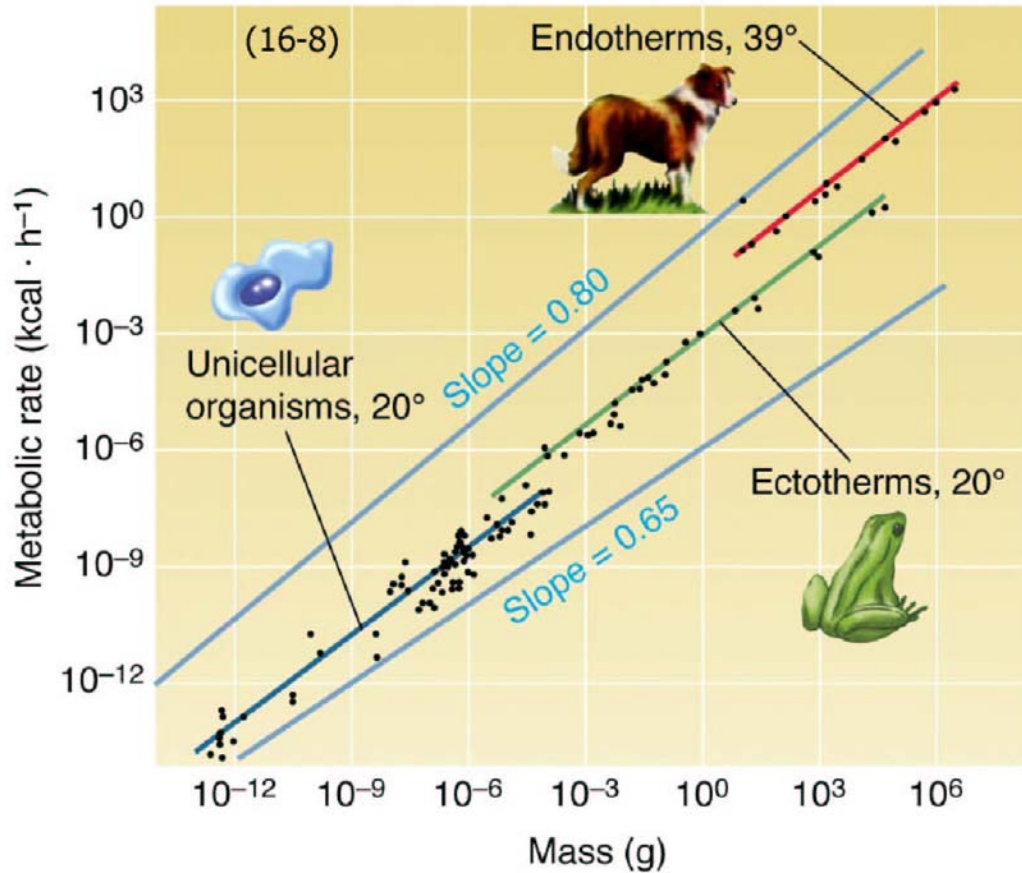
$$S(f) \sim \langle |V_f|^2 \rangle \sim 1/f^\alpha$$



$$V_f = \frac{1}{T} \sum_x e^{2\pi i f t} V(t)$$



# Metabolic rate vs. mass of animals



# Where do the power laws come from?

## Other examples:

Earthquakes,

turn-around-time fluctuations in internet

income distributions, light emission in white-dwarfs, .....

fluctuations in sand flow,

## Basic questions:

Are power laws necessarily related to a phase transition (critical behavior)?

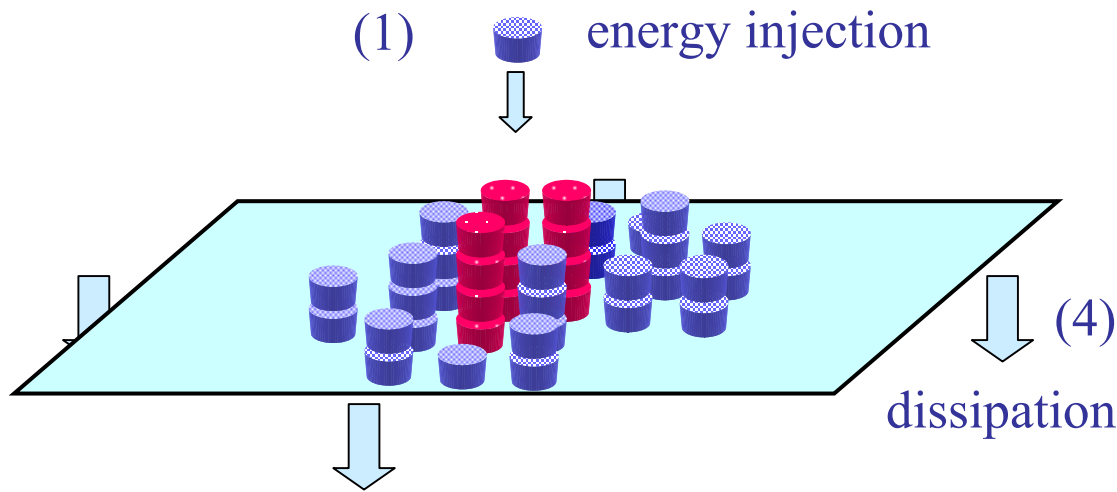
Can  $1/f$  noise (scaling) be the natural outcome of a complex dynamics?

What ingredients determine the characteristics of the power laws?

# SOC

Bak-Tang-Wiesenfeld (1987)

**Self Organized Criticality = Criticality without tuning**



(2)

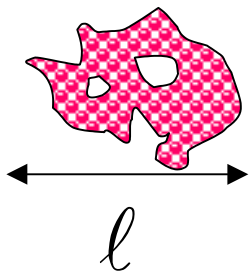
$$z_{crit} = 4$$

(3)

$$z_i > 4 \rightarrow z_i - 4$$

redistribution to neighbors

**Avalanche** (sequence of topplings between two additions)



Size-distribution of avalanches

$$P(l) \sim l^{-\tau_l}$$

Lifetime-distribution of avalanches

$$P(t) \sim t^{-\tau_t}$$

no fine tuning of parameters

# SOC

Is it criticality without tuning?

Nonlocal dynamics (external supervisor)

(1) energy injection

(2)

$$z_{crit} = 4$$

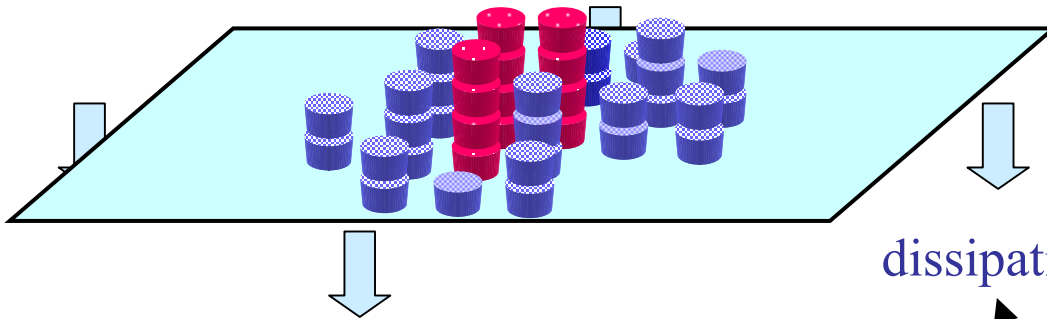
(3)

$$z_i > 4 \rightarrow z_i - 4$$

redistribution to neighbors

(4) dissipation

local dynamics



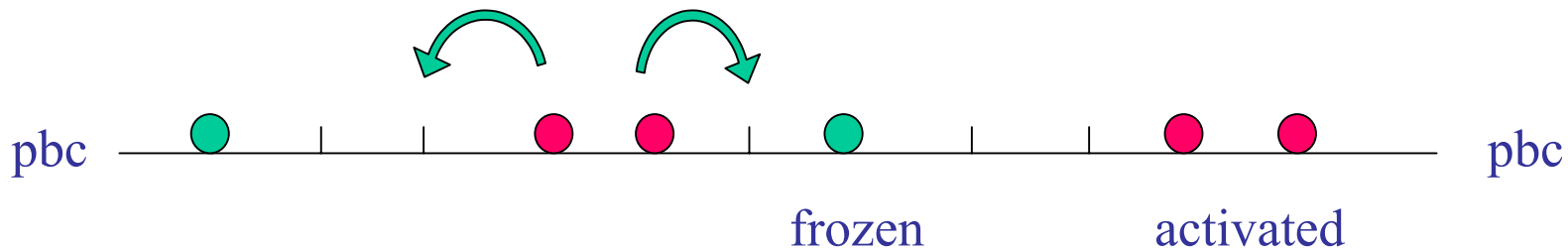
Separation of timescales

Source (energy injection) and sink (dissipation) is infinitesimal

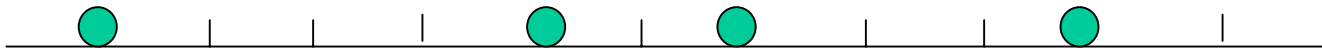
# SOC and absorbing-state transitions

Dickman, Munoz, Vespigniani, Zapperi (1998)

**Activated random walkers** (  $\longrightarrow$  fixed energy sandpiles)



Absorbing states



infinite number of them

Particle conservation  $\longrightarrow$  Control parameter :  $n=N/L \longrightarrow \boxed{n_c = 1/2}$   
 active - frozen transition

Order parameter: Number of n.n. pairs (activity)

Order parameter is coupled to a static field

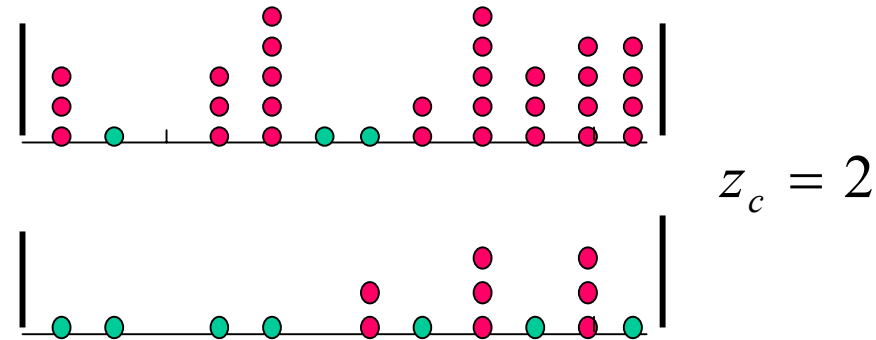
# SOC as pinching of a critical point

## Fixed energy sandpile with closed boundary

Conserved total energy  $E$  - contr. par.

Ever lasting activity for  $E > E_c$

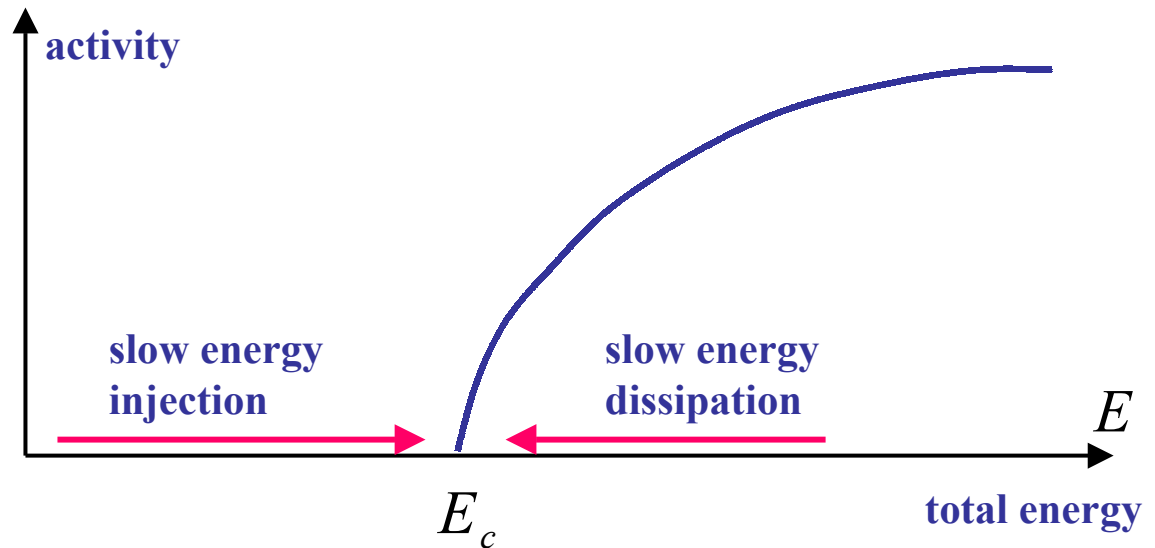
Dying out activity for  $E < E_c$



Order parameter: activity

**Switch on dissipation**  
(at boundary)

**Switch on injection**  
(if activity is ceased)



Program:

Calculate the exponents of SOC from the appropriate absorbing state transition



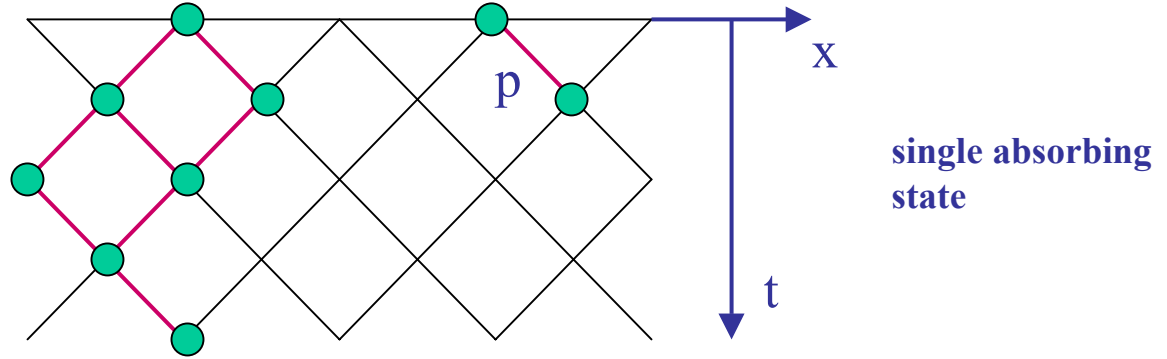
# Examples of absorbing-state transitions I

## Directed percolation (DP)

Control parameter:  $p$

Order parameter:

$$\langle \rho \rangle = \rho(t \rightarrow \infty)$$



Exponents:

$$\langle \rho \rangle \sim (p - p_c)^\beta$$

$d=1$   $\beta = 0.276$

Reaction-diffusion equivalent:

$\bullet \equiv \mathbf{A}$



Field theory:

$d_c=4$

$$\partial_t \rho = \Delta \rho + r\rho - \rho^2 + \zeta$$

New (and difficult): multiplicative noise

$$\langle \zeta(x, t) \zeta(x', t') \rangle = c(\rho) \delta_{x, x'} \delta_{t, t'}$$

Early claims: everything is DP.

Now: single absorbing state, no symmetries, no conservation laws, short-range dynamics

in Landau's spirit

$$c(\rho) \sim \rho$$

# Examples of absorbing-state transitions II

## Parity conserving (PC) process

Control parameter:  $p$

Order parameter:

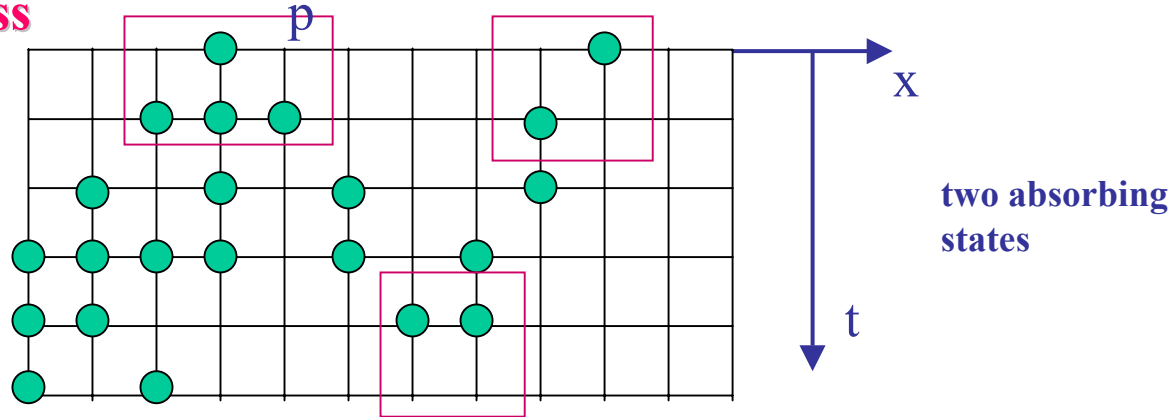
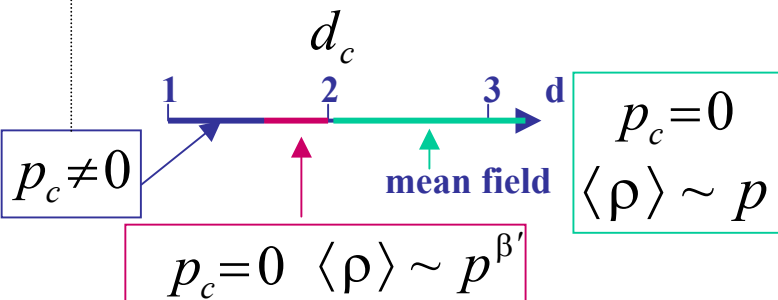
$$\langle \rho \rangle = \rho(t \rightarrow \infty)$$

Exponents:

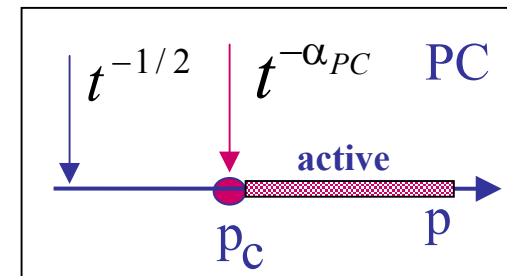
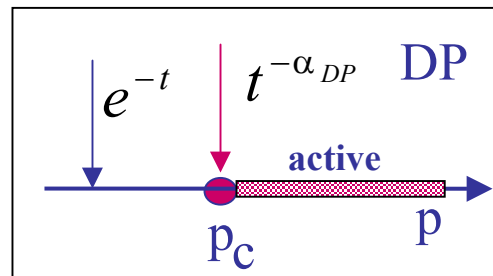
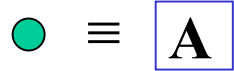
$$\langle \rho \rangle \sim (p - p_c)^\beta$$

$$d=1 \quad \beta = 0.94$$

Field theory: Complex noise



Reaction-diffusion equivalent:



# Examples of absorbing-state transitions III

## Pair Contact Process with Diffusion (PCPD)

Control parameters:  $p, D$

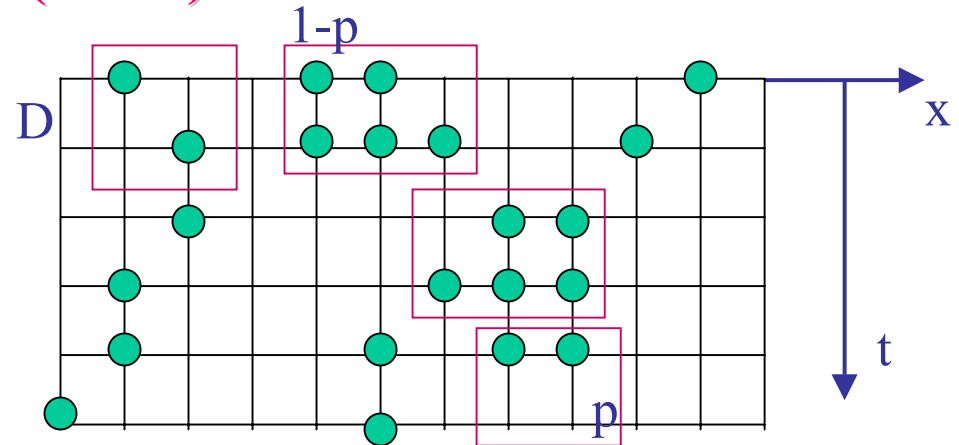
Order parameter:

$$\langle \rho \rangle = \rho(t \rightarrow \infty)$$

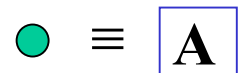
Exponents:

$$\langle \rho \rangle \sim (p - p_c)^\beta$$

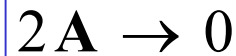
$$d=1 \quad \beta = 0.58$$



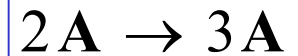
Reaction-diffusion equivalent:



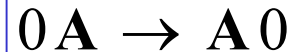
Annihilation



Birth



Diffusion



Two absorbing states (0 or 1 particle) - no conservation law

$D=0$  : infinite number of abs. states,  
PD class except spreading

Field theory:?

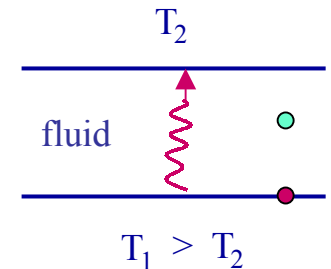
# Distribution Functions for Nonequilibrium Fluctuations

(universality, extreme statistics, etc.)

**Question:** What is the probability distribution function (PDF) of a macroscopic quantity in a far from equilibrium system?

**Idea:** Effective criticality (power-law correlations) may imply

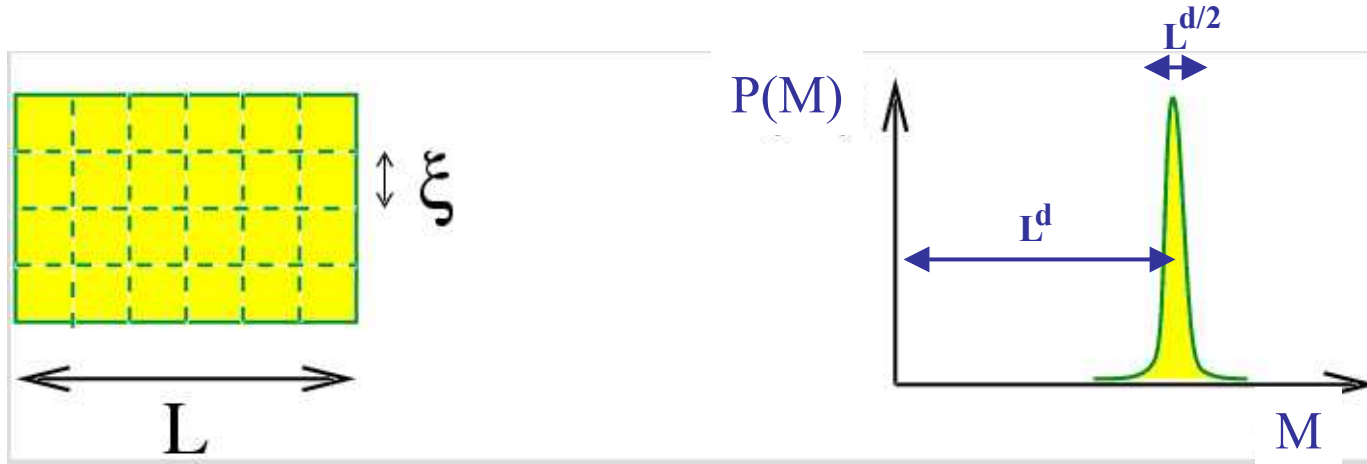
- (1) nongaussian PDF-s,
- (2) universal forms according to universality classes



**Aims:** (1) Construct a picture gallery of scaling functions (PDF-s)  
(2) Identify underlying nonequilibrium features by comparing PDF-s

**Results:** picture gallery - surface growth experiments  
scalability of parallel algorithms,  
turbulence and surface fluctuations,  
upper critical dimension of KPZ equation  
1/f noise and extreme statistics

# Gaussian and nongaussian distributions I



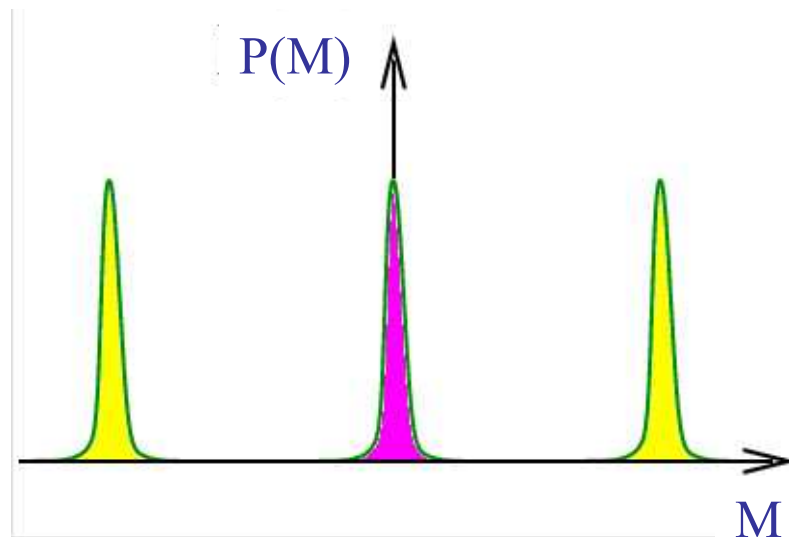
Extensive quantity in a **noncritical** system

$$(\xi \ll L)$$

central limit theorem

Small Gaussian fluctuations around the mean

Example: Ising model  
above and below  $T_c$ .



# Gaussian and nongaussian distributions II

Extensive quantity in  
a **critical** system

$$(\xi \sim L)$$

no central limit  
theorem

nongaussian fluctuations  
around the mean

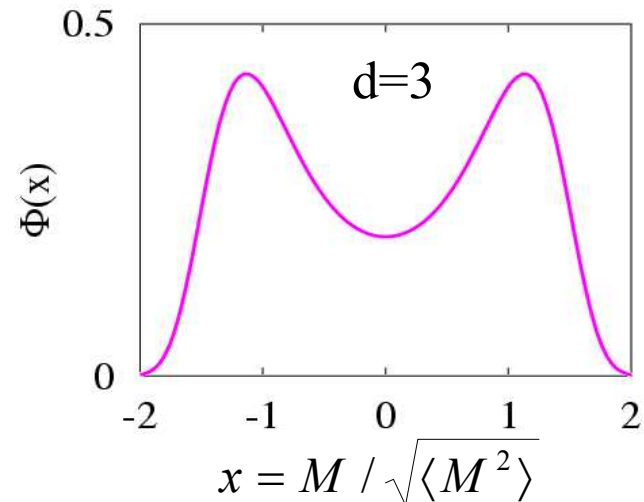
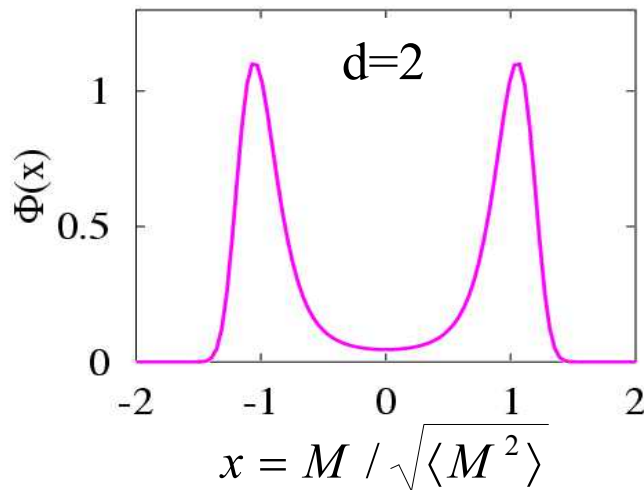
Example: Ising model at  $T_c$  - emergence of universal scaling functions

Scaling variable:

$$x = M / \sqrt{\langle M^2 \rangle}$$

Scaling func.:

$$\Phi(x) = \sqrt{\langle M^2 \rangle} P(M)$$

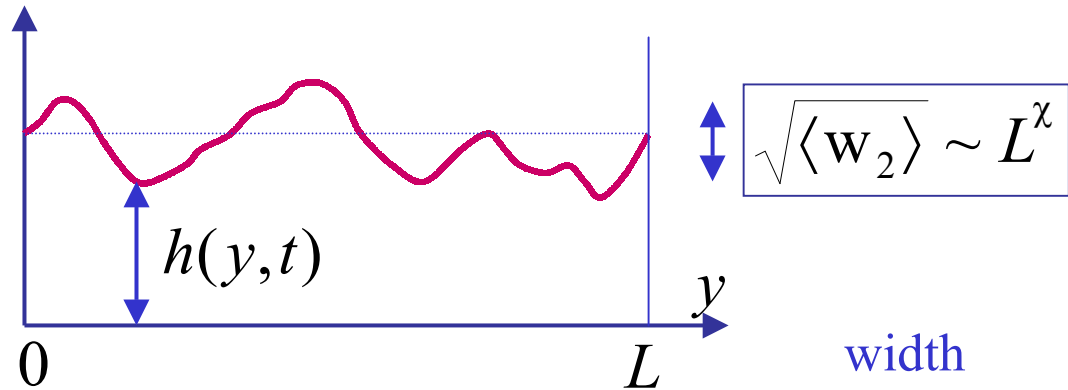


Boundary condition dependence - a characteristics of nonequilibrium systems

# Nongaussianity -- width distribution of interfaces



Ag on glass

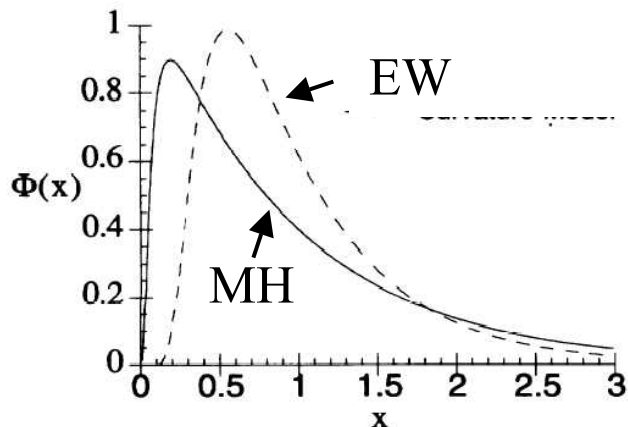


Stationary distribution:

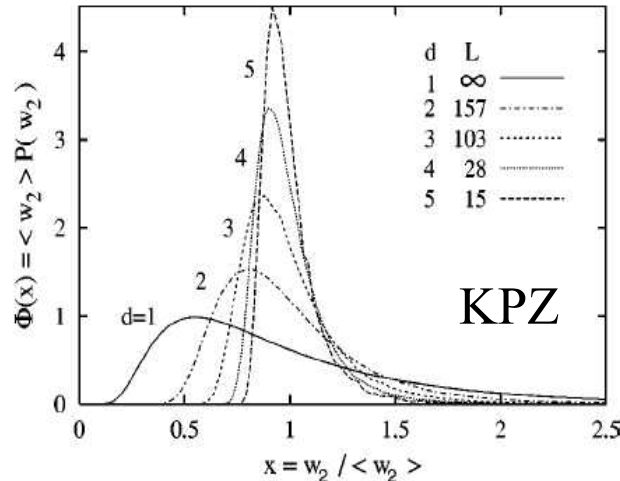
$$\sqrt{\langle w_2 \rangle_L} P(w_2) = \Phi\left(\frac{w_2}{\langle w_2 \rangle_L}\right) = \Phi(x)$$

$$w_2(L,t) = \frac{1}{L} \int_0^L dy [h(y,t) - \bar{h}]^2$$

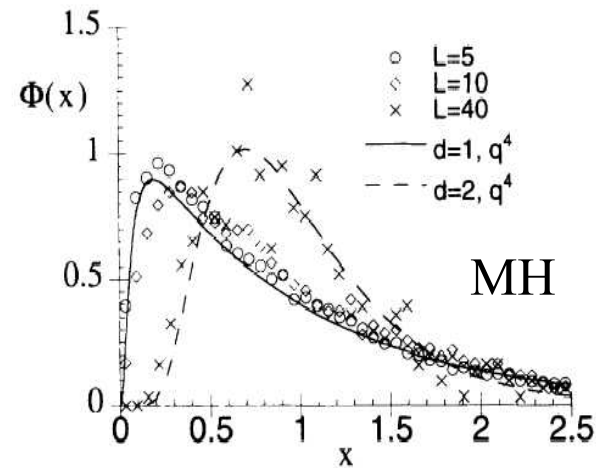
Picture gallery



PRE50, 639, 3589 (1994)



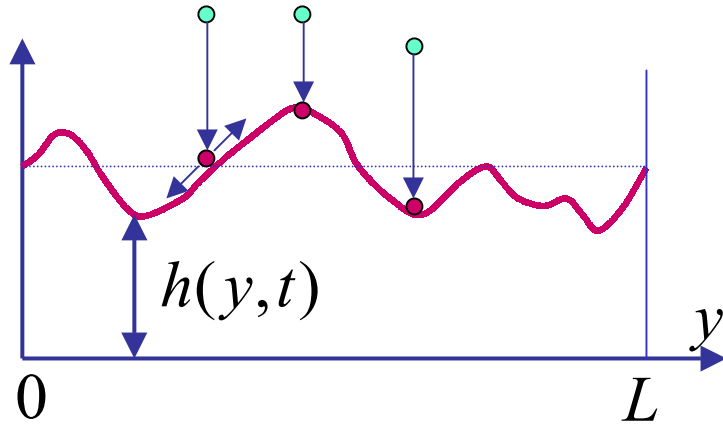
PRE65, 026136 (2002)



PRE50, 3530 (1994)

# Edwards-Wilkinson (EW) interface

Surface tension driven growth



Vertical growth velocity can depend only on the spatial derivatives of  $h$ .

$$v = \partial_t h = f(\partial_y h, \partial_y^2 h, \dots) + \eta$$

Noise in the arrival  
(Gaussian, white is assumed)

Long wavelength (gradient) expansion:

$$f(\partial_y h, \partial_y^2 h, \dots) = v_0 + \sigma \partial_y^2 h + \dots$$

average growth velocity      surface tension

In the system moving with  $v_0$ :

$$\partial_t h = \sigma \Delta h + \eta$$

Steady state distribution function:

$$\mathbf{P}[h] \sim e^{-\frac{\sigma}{2} \int_0^L (\nabla h)^2 dy}$$

Fourier modes:

$$h(y) = \sum_k e^{iky} h_k$$

$$\mathbf{P}[h_k] \sim e^{-\frac{\sigma}{2} L \sum_k k^2 |h_k|^2} = \prod_k e^{-\frac{\sigma}{2} L k^2 |h_k|^2}$$

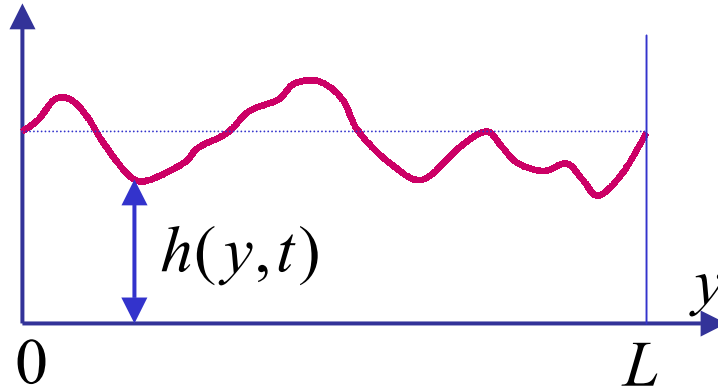
Independent modes



# Nongaussian distributions - Edwards-Wilkinson (EW) interface

Surface tension driven dynamics

$$\partial_t h = \sigma \Delta h + \eta$$

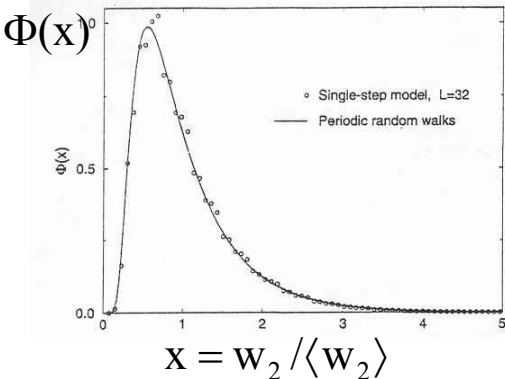


Stationary state:

$$\mathbf{P}[h] \sim e^{-\frac{\sigma}{2} \int_0^L (\nabla h)^2 dy}$$

Independent Fourier modes:

$$\mathbf{P}[h_k] \sim e^{-\frac{\sigma}{2} L \sum_k k^2 |h_k|^2} = \prod_k e^{-\frac{\sigma}{2} L k^2 |h_k|^2}$$



diverging fluctuations

$$w_2 = \frac{1}{L} \int_0^L dy [h(y, t) - \bar{h}]^2 = \sum_k |h_k|^2 \propto L$$

sum of independent variables

$$\langle |h_k|^2 \rangle \sim \frac{1}{k^2}$$

nonidentical, singular fluctuations

Reason for the failing of the central limit theorem

# Derivation of the width distribution for EW interface (1)

$\partial_t h = \sigma \Delta h + \eta$  Stationary state:  $\mathbf{P}[h] \sim e^{-\frac{\sigma}{2} \int_0^L (\nabla h)^2 dy} \Rightarrow \prod_k e^{-\frac{\sigma}{2} L k^2 |h_k|^2}$

Independent Fourier modes

Width distribution:

$$P(w_2) = \int D(h) \mathbf{P}(h) \delta \left[ w_2 - \frac{1}{L} \int_0^L dy (h - \bar{h})^2 \right]$$

Generating function:

$$G(s) = \int_0^\infty dw_2 e^{-w_2 s} P(w_2) = \int D(h) e^{-\frac{\sigma}{2} \int_0^L (\nabla h)^2 dy - \frac{s}{L} \int_0^L (h - \bar{h})^2 dy}$$

Path integral of harmonic oscillator

In terms of Fourier modes:

$$= N \prod_k \int_{-\infty}^\infty dh_k \int_{-\infty}^\infty dh_{-k} e^{-(\sigma k^2 + \frac{2s}{L}) |h_k|^2} = \tilde{N} \prod_k \left[ \sigma k^2 + \frac{2s}{L} \right]^{-1}$$

Normalization:

$$G(0) = 1 \quad G(s) = \prod_k \frac{\sigma k^2}{\sigma k^2 + \frac{2s}{L}} \quad \Rightarrow \quad G(s) = \prod_{n=1}^\infty \left[ 1 + \frac{Ls}{2\pi^2 \sigma n^2} \right]^{-1}$$

$k = \frac{2\pi}{L} n$

# Derivation of the width distribution for EW interface (2)

Generating function:  $G(s) = \int_0^\infty dw_2 e^{-w_2 s} P(w_2) = \prod_{n=1}^\infty \left[ 1 + \frac{Ls}{2\pi^2 \sigma n^2} \right]^{-1}$

Average width:

$$\langle w_2 \rangle = - \left. \frac{dG}{ds} \right|_{s=0} = \frac{L}{2\pi^2 \sigma} \sum_{n=1}^\infty \frac{1}{n^2} = \frac{L}{12\sigma}$$

$$\prod_{n=1}^\infty \left[ 1 + \frac{6s \langle w_2 \rangle}{\pi^2 n^2} \right]^{-1} = F(s \langle w_2 \rangle)$$

Width distribution in scaling form:

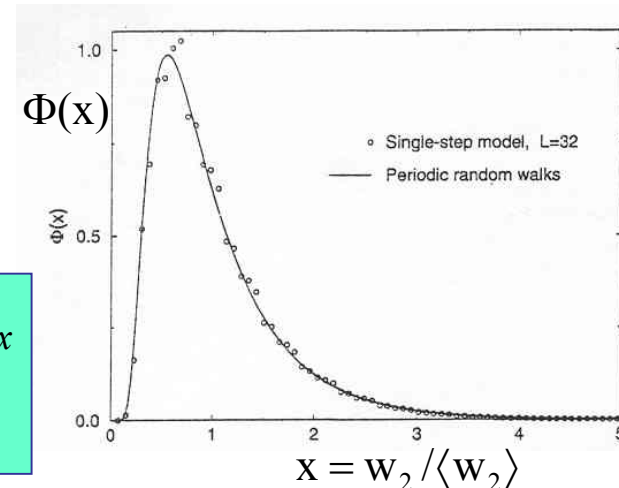
$$P(w_2) = \int_{-i\infty}^{i\infty} \frac{ds}{2\pi i} G(s) e^{w_2 s} = \frac{1}{\langle w_2 \rangle} \int_{-i\infty}^{i\infty} \frac{ds \langle w_2 \rangle}{2\pi i} F(s \langle w_2 \rangle) e^{\frac{w_2}{\langle w_2 \rangle} s \langle w_2 \rangle} = \frac{1}{\langle w_2 \rangle} \Phi\left(\frac{w_2}{\langle w_2 \rangle}\right)$$

Scaling function:

$$\Phi(x) = \int_{-i\infty}^{i\infty} \frac{dy}{2\pi i} \prod_n \left( 1 + \frac{6y}{\pi^2 n^2} \right)^{-1} e^{xy}$$

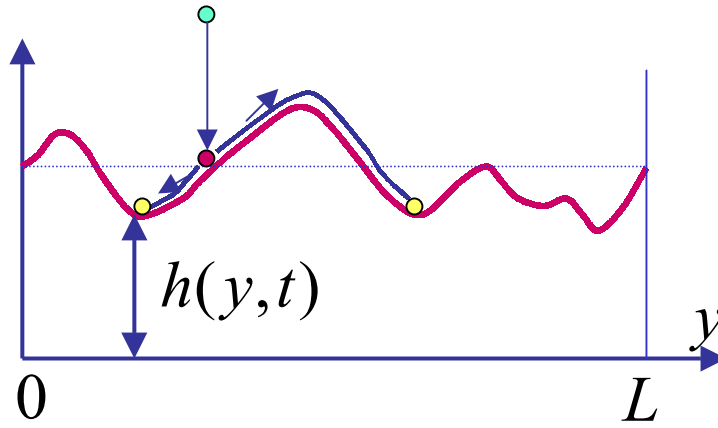
Simple poles at  $y = -n^2 \pi^2 / 6$

$$\Phi(x) = \frac{\pi^2}{3} \sum_{n=1}^\infty (-1)^{n-1} n^2 e^{-\frac{\pi^2}{6} n^2 x}$$



# Mullins-Herring (MH) interface

Surface diffusion driven growth:  
 Particles diffuse on the surface  
 before getting „snowed in”.



In the system moving with  $v_0$ :

$$\partial_t h = -D\Delta^2 h + \eta$$

Steady state  
 distribution:

$$\mathbf{P}[h_k] \sim e^{-DL \sum_k k^4 |h_k|^2} = \prod_k e^{-DLk^4 |h_k|^2}$$

Vertical growth velocity:  $v_0$  (average growth)  
 plus the flux  $j$  of particles diffusing on the surface

$$v = \partial_t h = v_0 - \partial_y j + \eta$$

average  
 growth velocity

growth due to diffusion  
 on the surface

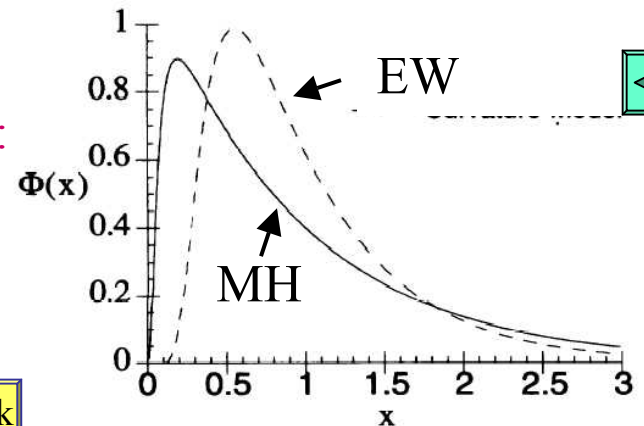
noise in the arrival  
 (Gaussian, white)

Flux: points towards larger curvatures.

$$j = \partial_y f(\partial_y h, \partial_y^2 h, \dots) \approx D \partial_y \partial_y^2 h$$

Long wavelength  
 expansion:

Comparison of  
 width distributions:

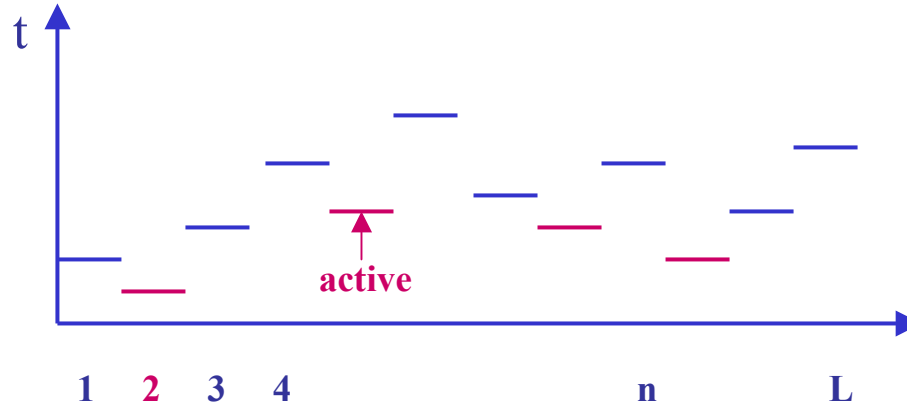


# Scalability of Parallel Algorithms (fluctuating time-horizon)

G. Korniss et al. PRL84, 1351 (2000)

Local time of the computer

Only local minima can compute

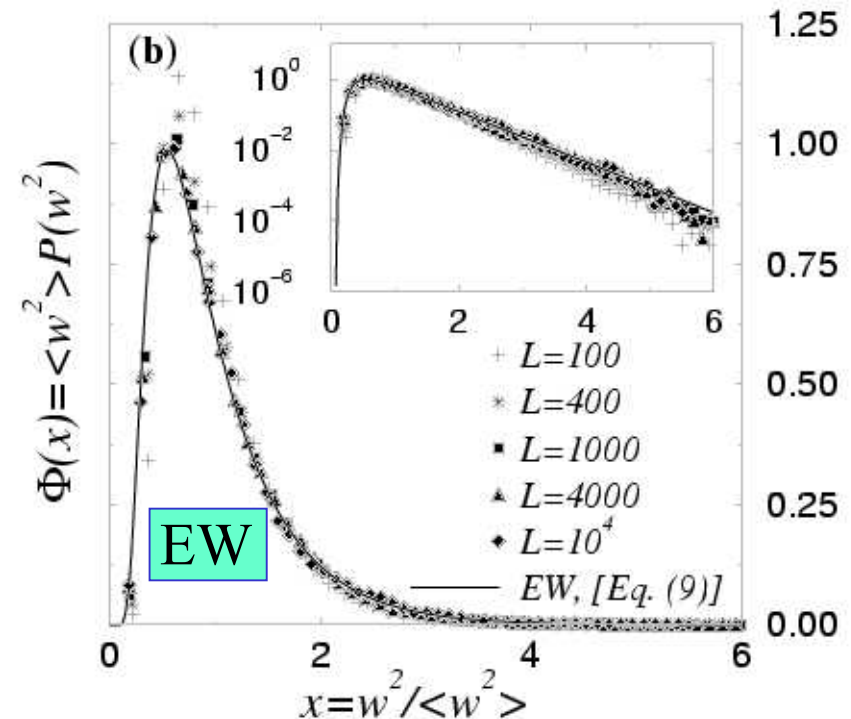


Events:  
Poisson arrivals

How does the number of active computers grow with L?

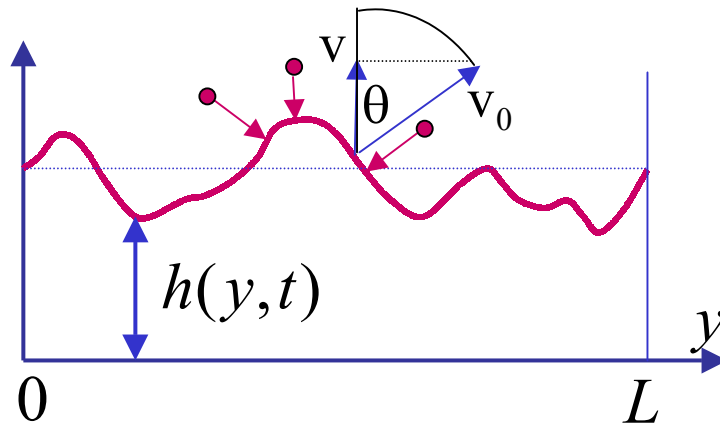
$$N_{active} \sim L^\alpha$$

$$\alpha = 1$$



# Nongaussian distributions -- Kardar-Parisi-Zhang (KPZ) interface

PRE65, 026136 (2002)



attachment: growth along the normal + surface tension effects

$$\partial_t h = \sigma \Delta h + \lambda (\nabla h)^2 + \eta$$

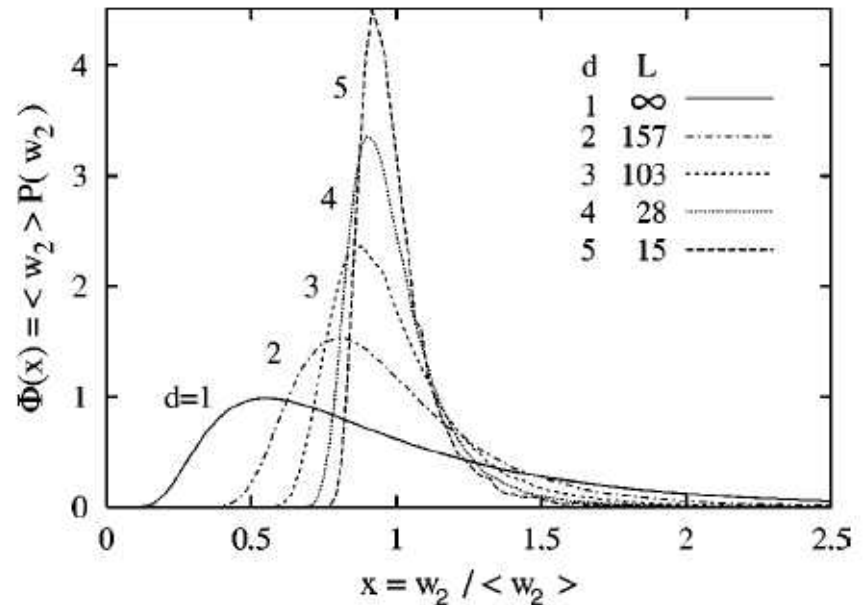
Q: Is there an upper critical dimension?

$$v = v_0 \cos(\theta) + \sigma \Delta h + \eta$$

$$\sqrt{1 - \sin^2 \theta} \approx \sqrt{1 - (\nabla h)^2} \approx 1 - (\nabla h)^2 / 2$$

$$\langle |h_k|^2 \rangle \sim \frac{1}{k^{2+\zeta}}$$

Nonidentical, singular, nongaussian fluctuations

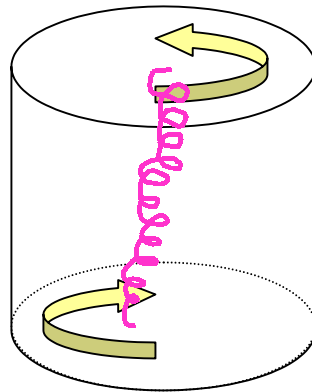


No parameters to fit

# Turbulence and the d=2 EW model

S. Bramwell et al. Nature 396, 552 (1998)

Experiment:  
French washing machine

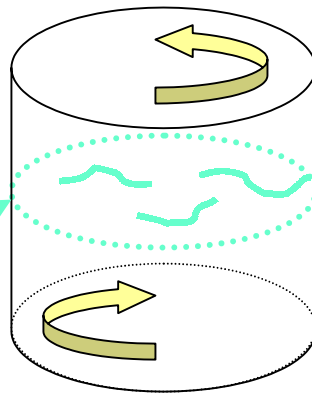


Critical

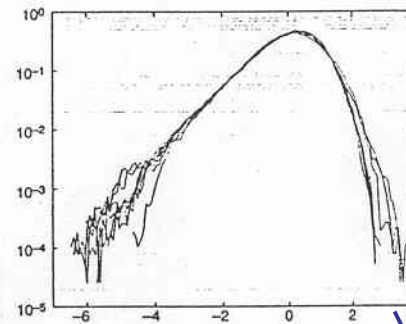
$$\omega = \omega_c$$

Aji & Goldenfeld,  
PRL86, 1007 (2001)

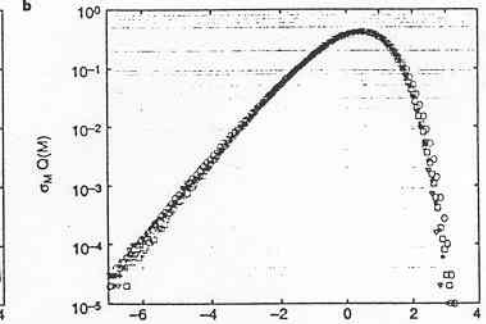
dissipation is mainly  
on the fluctuations of  
the shear pancake



Distribution of  
energy dissipation

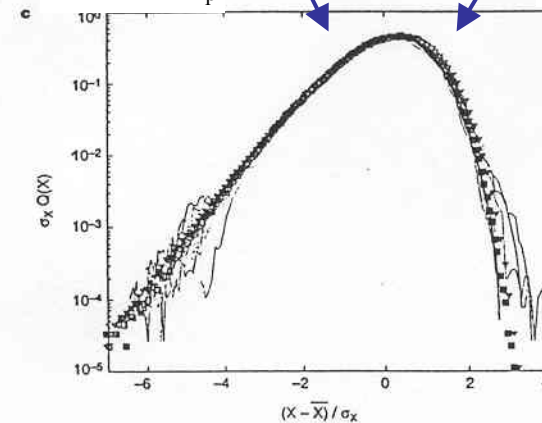


Distribution of d=2 XY  
magnetization below  $T_c$ .  
(finite-size)



$(p - \langle p \rangle) / \sigma_p$

$(M - \langle M \rangle) / \sigma_M$

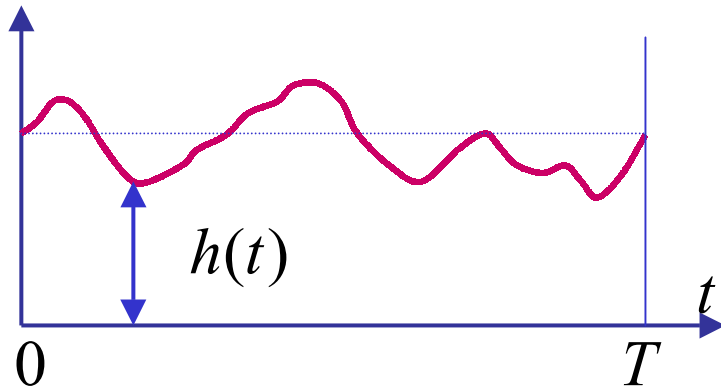


$$d = 2 \text{ EW} \equiv \text{XY } T < T_c$$

Possible connection to extreme statistics?

# Width distributions for $1/f^\alpha$ signals

PRL87,240601(2001)  
PRE65,046140(2002)



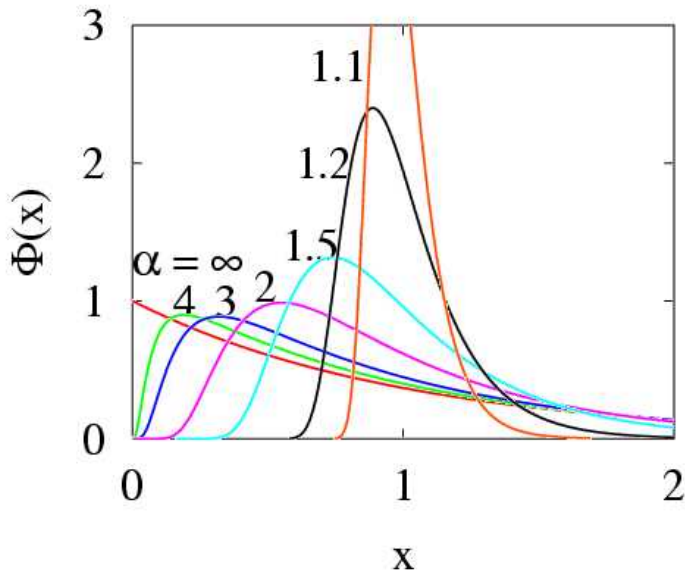
**Question:** Is there an  $\alpha$  for which extreme statistics distribution emerges?

Stationary distribution for Fourier modes

$$\mathbf{P}[h_n] \sim e^{-\sigma_L \sum_n |n|^\alpha |h_n|^2}$$

$$w_2 = \sum_n |h_n|^2$$

Integrated power spectrum



$$\sqrt{\langle w_2 \rangle_T} P(w_2) = \Phi_\alpha \left( x = \frac{w_2}{\langle w_2 \rangle_T} \right)$$

$$\alpha \rightarrow 1$$

$$\Phi_\alpha(x) \rightarrow \delta(x)$$



Does it have an internal structure?

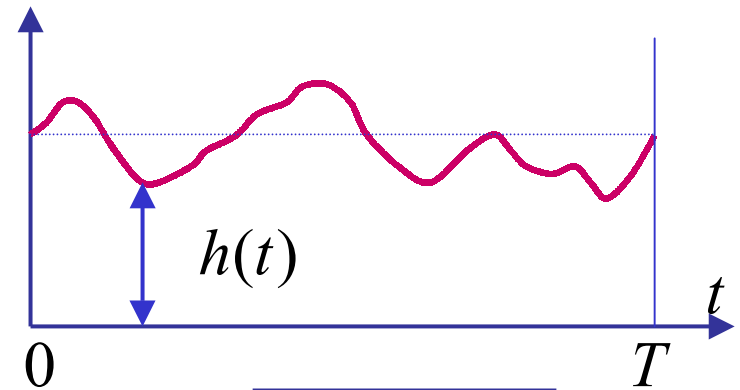


# Extreme statistics for $\alpha = 1$ .

$\alpha \rightarrow 1$  new scaling variable

$$y = \frac{w_2 - \langle w_2 \rangle_T}{\sigma_T}$$

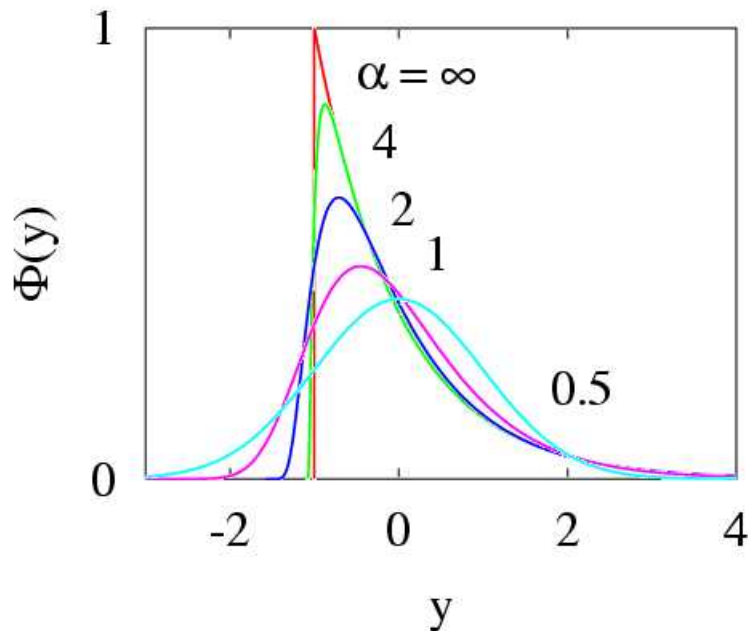
$$\sigma_T = \sqrt{\langle w_2^2 \rangle_T - \langle w_2 \rangle_T^2}$$



$$w_2 = \sum_n |h_n|^2$$

integrated power spectrum

$$\sigma_T P(w_2) = \Phi_\alpha(y)$$



$\alpha = 1$

$$\Phi_1(y) = e^{-y - e^{-y}}$$

Fisher-Tippett-Gumbel extreme value distribution

$\alpha \leq 1/2$

$$\Phi_\alpha(y) \sim e^{-y^2}$$

$$\langle |h_n|^2 \rangle \sim n^{-\alpha}$$

Central limit theorem is restored for  $\alpha \leq 1/2$

# Extreme value statistics

$N$  numbers are drawn from a distribution  $P_0(x)$

**Question:** What is the limiting ( $N \rightarrow \infty$ ) distribution of the largest number?

Three types depending on  $P_0(x \rightarrow \infty) = ?$

$$\rho(x) = \int_{-\infty}^x dy P(y)$$

I. Faster than any power law  
(Fisher -Tippet - Gumbel):

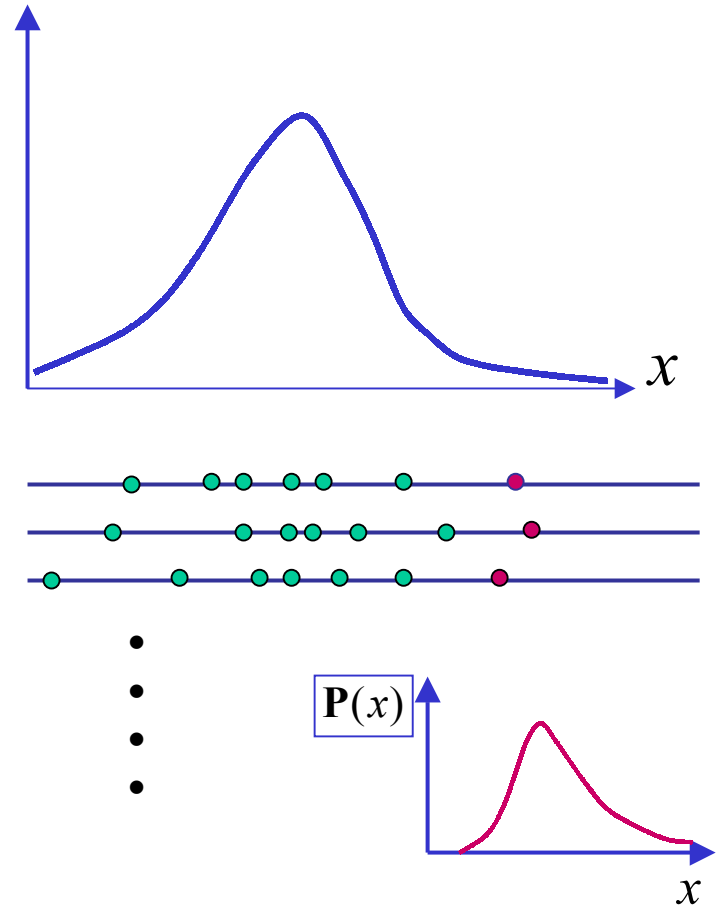
$$\rho(x) = e^{-e^{-x}}$$

II. Power law (Fisher-Tippet-Frechet)

$$\rho(x) = \begin{cases} 0 & x \leq 0 \\ e^{-x^{-\alpha}} & x > 0 \end{cases}$$

III. Finite cutoff (Weibull)

$$\rho(x) = \begin{cases} e^{-(-x)^\alpha} & x \leq 0 \\ 1 & x > 0 \end{cases}$$



# Calculation of extreme value statistics for independent events

Simple example: Parent distribution:  $P_0(x)$

Probability that all  $N$  measurements give smaller than  $y$ :

$$\rho(y) = \left[ \int_0^y dy P_0(y) \right]^N = (1 - e^{-y})^N$$

$$= \left( 1 - \frac{e^{-(y - \ln N)}}{N} \right)^N$$

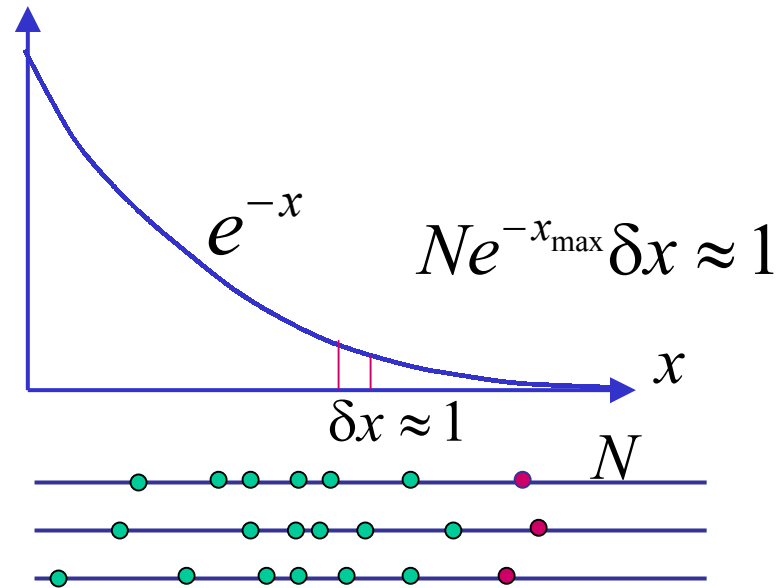
Moving frame

$$z = y - \ln N$$

$$\rho(z) = e^{-e^{-z}}$$

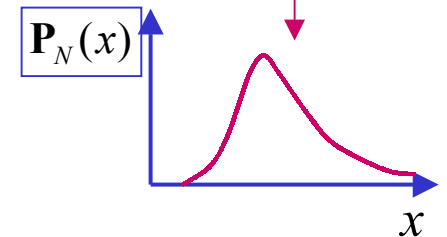
$$P(z) = e^{-z - e^{-z}}$$

Fisher - Tippet - Gumbel:



⋮

$$\langle x_{\max} \rangle_N \propto ?$$

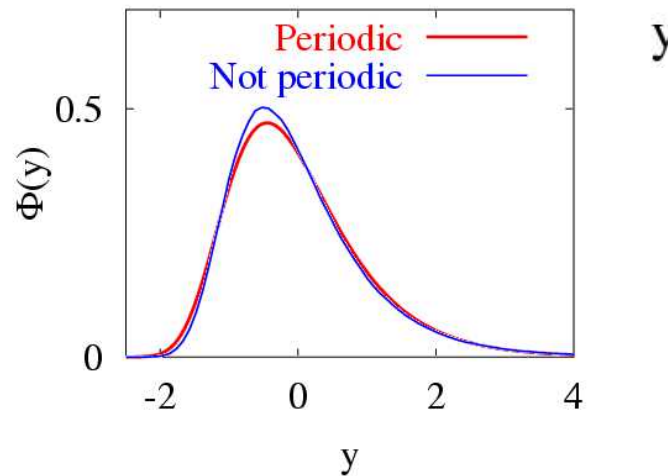
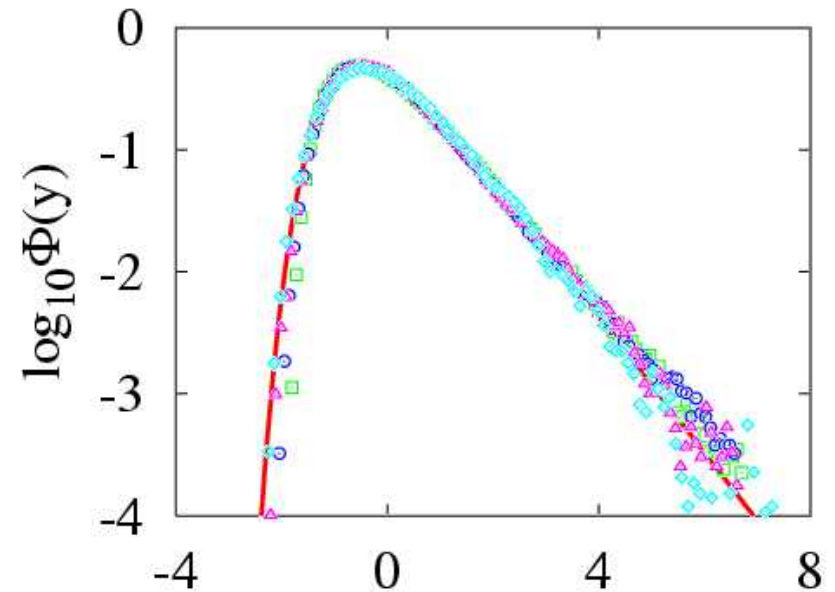
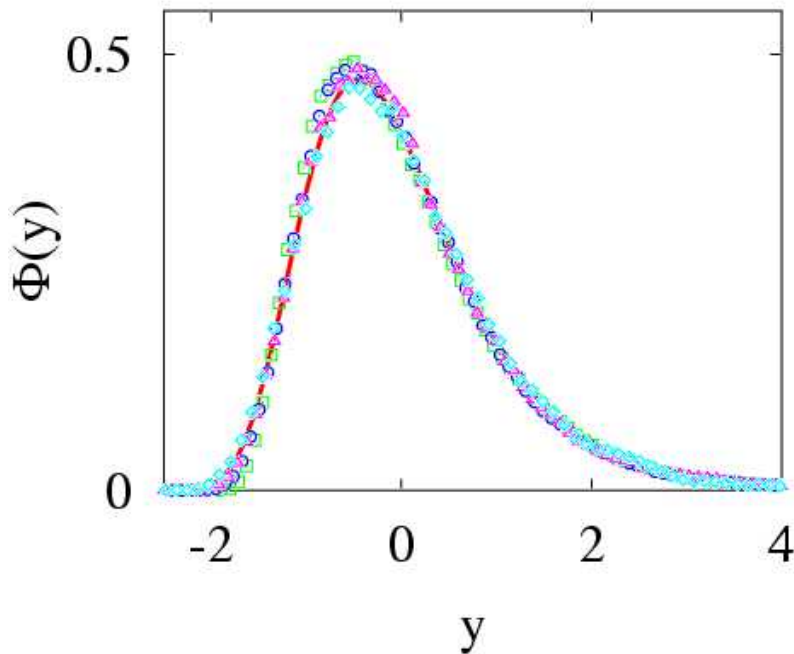


$$x_{\max} \approx \ln N$$

Homework

# Extreme value statistics - resistivity fluctuations

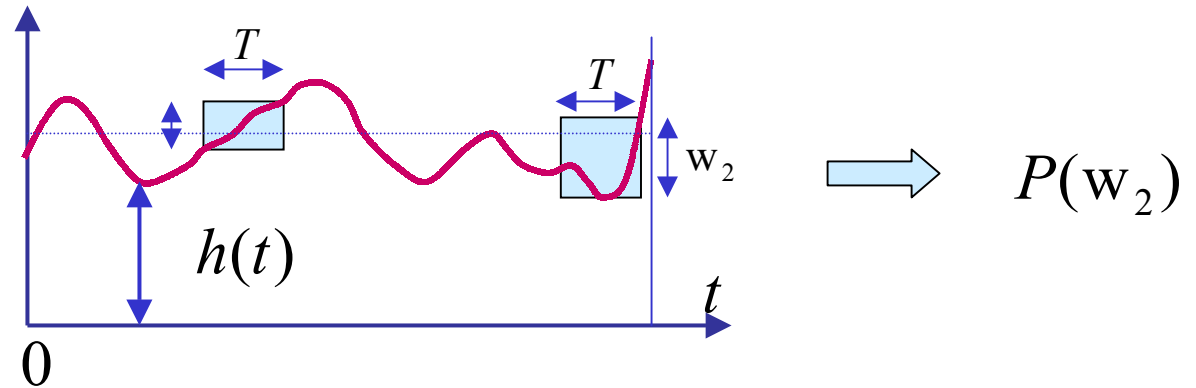
Experimental data on GaAs films (A.V. Yakimov and F.N. Hooge)



Problem: Scaling functions depend on boundary conditions

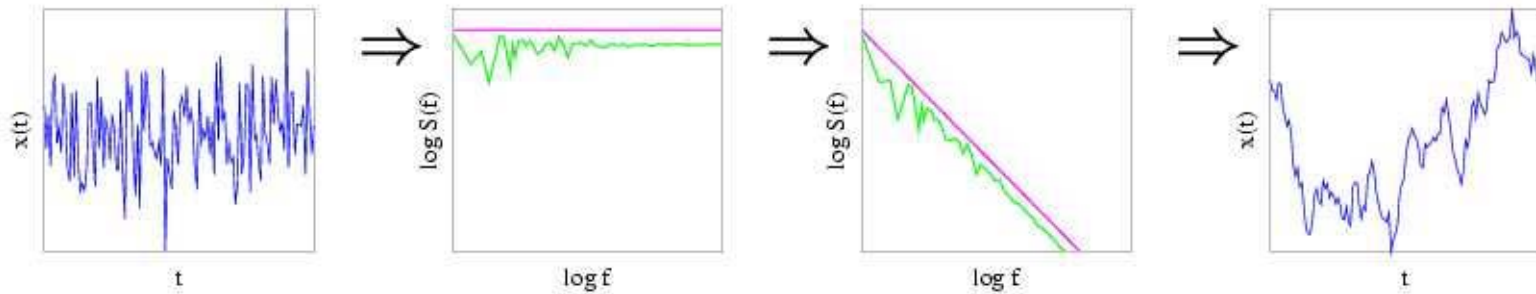
# Boundary condition effects

Nonperiodic signals



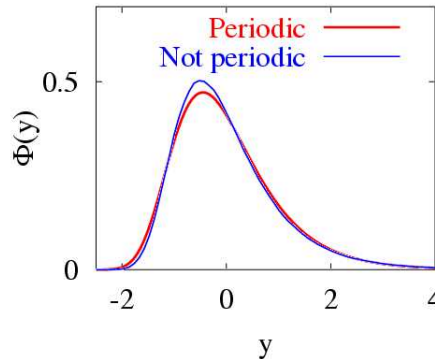
Exact results for  $\alpha = 0.5, 2, \infty$

Numerics:



Window b.c.:

Small difference for  $\alpha = 1$



The difference increases with increasing  $\alpha$ .

Example with  $\alpha = 2$   $\Rightarrow$

# BC effects: probability distributions of the d=1 Ising model

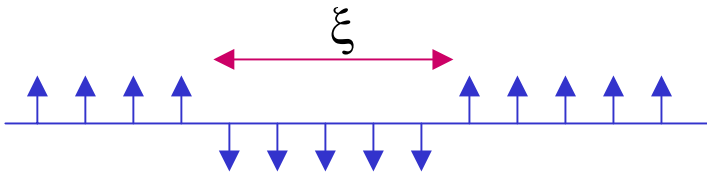
Ising  
model

$$H = -J \sum_n \sigma_n \sigma_{n+1}$$

Finite-size scaling limit

cond-mat/0308442

$$L \rightarrow \infty \quad \xi \propto [1 - \tanh(J/T)]^{-1} \rightarrow \infty$$



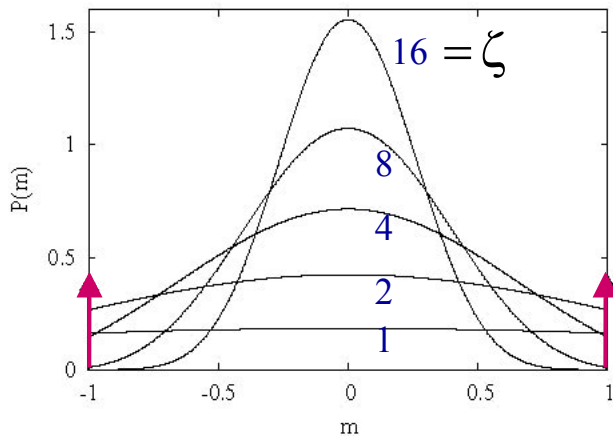
number of  
domain walls

$$\frac{L}{\xi} = 2\zeta$$

fixed

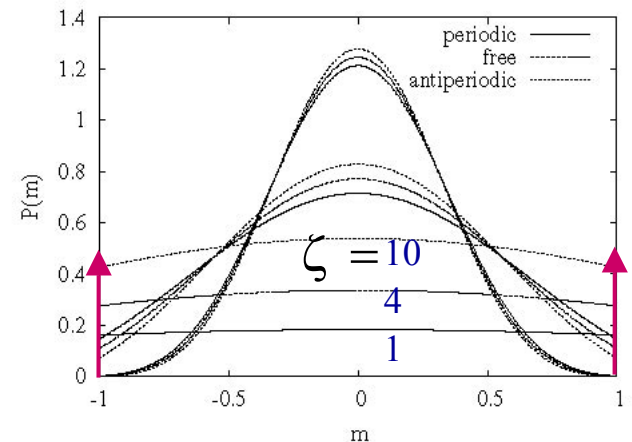
Periodic BC:

$$P(m) = \frac{1}{2 \cosh(\zeta)} \left[ \delta(m+1) + \delta(m-1) + \frac{\zeta}{\sqrt{1-m^2}} I_1(\zeta \sqrt{1-m^2}) \right]$$



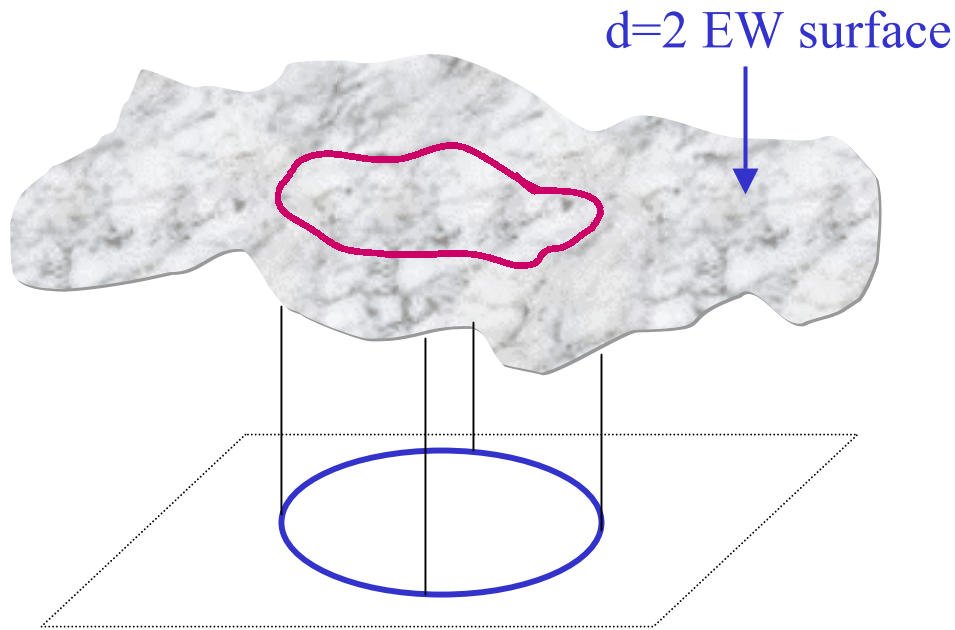
~~$\delta(m \pm 1)$~~  for  
antiperiodic BC

BC dependence:



## Periodic 1/f signal

Are there **periodic** physical systems displaying 1/f fluctuations?

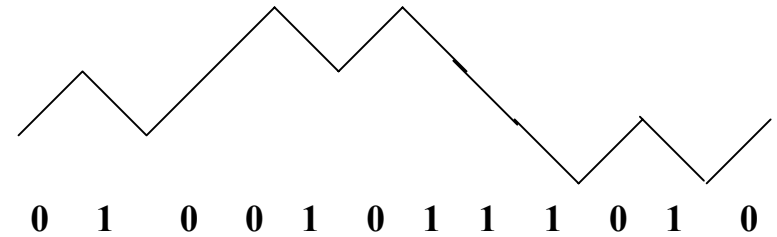


The fluctuations of red line display a perfect 1/f power spectrum.

# Randomness of the digits of $\pi$

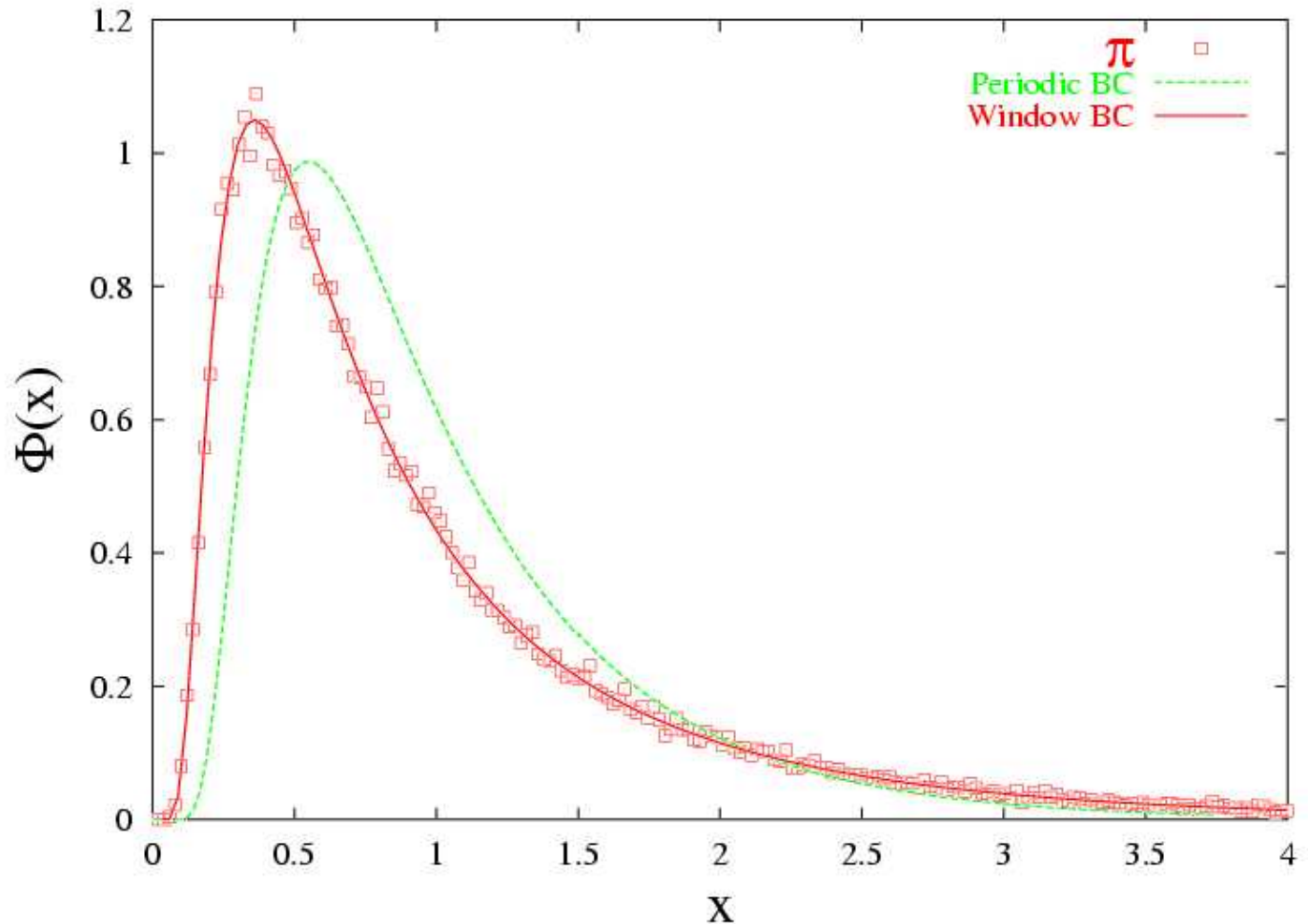
Mapping of  $\pi$  onto a surface

$\pi$



Roughness-distribution of  $\pi$

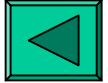
Observing the right boundary conditions is clearly important.



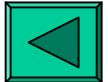


# Homework

(1) Calculate the width distribution for the Mullins-Herring model.



(2) Find the extreme value distribution independent trials if the parent distribution is of power-law form:



$$P_0(x) = \frac{x^{-\mu}}{\mu - 1} \quad 1 \leq x \leq \infty \quad 1 \leq \mu$$