# **Self-Organised Criticality: Self-Organised Criticality:**

### **What does it mean and is it What does it mean and is it important? important?**

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# **What is criticality**

### Lack of characteristic scale







### Typical scale





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# **And when does it occur**

In thermodynamic systems at the critical temperature

 $M = \langle S(r) \rangle$ 





# **The correlation function**

The critical behaviour is identified from the functional form of the correlation function

$$
C(r,0) = \langle [S(0,0) - \langle S \rangle][S(r,0) - \langle S \rangle] \rangle = r^{-\eta} \exp\{-\gamma_{\xi}\}\
$$

Where the correlation length  $\left|\xi\right|$  diverges as the critical temperature is approached

 $\xi(T) \propto (T - T_c)^{-\nu}$   $\longrightarrow$   $C(r) = r^{-\eta}$ 

# Temporal behaviour

$$
C(0,t) = \langle [S(0,0) - \langle S \rangle][S(0,t) - S] \rangle = t^{-\alpha} \exp\{-t/2\}
$$

As critical behaviour is approach:

 $\tau\rightarrow\infty$ 

The power spectrum

$$
\left|\hat{S}(\omega)\right|^2 \propto \omega^{-\beta} \qquad \text{where} \qquad \alpha = 1 - \beta
$$

Hence  $\,\beta\thickapprox\!1\quad$  is very interesting

# Scale free behaviour out of equilibrium

### Spatial fractals

• Clouds

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- Mountains
- Cauliflower
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**Snow on ground** Snow on ground Canopy

**Canopy** 

### Temporal O. Moriya et al, *Phys. Rev. Lett*. 80, 2833 (1998)



FIG. 1. Schematic illustration of the experimental setup.

- Quasars
- Ocean current
- Pressure variation in speech



FIG. 3. Log-log plot of power spectra  $P(f)$  of time series signals in *fully closed*. The straight line with the slope of  $-4/3$ in the figure is a guide for the eyes.

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# **An explanation needed!**

If fractals and 1/f spectra are so common there must surely be one universal mechanism behind

### PHYSICAL REVIEW

### **LETTERS**

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Self-Organized Criticality: An Explanation of 1/f Noise

Per Bak, Chao Tang, and Kurt Wiesenfeld

Physics Department, Brookhaven National Laboratory, Upton, New York 11973 (Received 13 March 1987)

We show that dynamical systems with spatial degrees of freedom naturally evolve into a self-organized critical point. Flicker noise, or  $1/f$  noise, can be identified with the dynamics of the critical state. This picture also yields insight into the origin of fractal objects.

# The sandpile model by BTW

- Add sand grain by grain
- If local slope  $z > z_c$  then relax

Induce avalanches of different sizes.



#### Self organisation:

Non tuning beside slow driving



# Properties of the sandpile model

Power law distribution of avalanches



#### From BTW's PRL

FIG. 2. Distribution of cluster sizes at criticality in two and three dimensions, computed dynamically as described in the text. (a)  $50 \times 50$  array, averaged over 200 samples; (b)  $20 \times 20 \times 20$  array, averaged over 200 samples. The data have been coarse grained.

But not so fractal

### Spatial extent of avalanches



FIG. 1. Self-organized critical state of minimally stable clusters, for a 100×100 array.

And the power spectrum turned out to be  $\text{ }\frac{1}{2} \text{ }$  , except when driven at edge only. **f**

# But other models does exhibit fractals and  $\frac{1}{6}$

### Density fluctuations in a Lattice Gas Model

HJJ, *Phys. Rev. Lett.* 64, 3103 (1990)

Repulsive particles on a lattice.

• Deterministic motion.



#### Monitor number of particles in a sub-section:



#### $N(t) = #$  particles in blue box

#### Power spectrum of *N(t)*



#### Instantaneous dissipation



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# Many more models:

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• Earth quake model (Olami-Feder-Christensen)

• Forest fires or epidemics (Drossel-Schwabl)

All exhibit scale invariance in the form of power laws for the distributions of events or avalanches.

Well, at least to some degree

### Broken scaling

### The ideal situation



### The real situation

#### The Drossel-Schwabl forest fire model



From G. Prussner & HJJ, Phys. Rev. E. **65**, 056707 (2002). See also Grassberger.

### Scaling in the BTW sandpile model



Only avalanches reaching the system edge. Still cutoff does not collapse. (slope = -7/9) From B. Drossel, *Phys. Rev. E*, **61**, R2168 (2000)

# **Experimental evidence:**

#### **Superconductors**



#### Field et al. PRL 74, 1206 (1995)

Droplet formation



Plourde et al. PRL **71**, 2749 (1993)



### Rice pile

### **Earthquakes**





#### K. Christensen et al. Physics, Imperial

http://www.cmth.ph.ic.ac.uk/~kimchris

#### Biological evolution

Gould, Eldredge

Punctuated equilibrium intermittent dynamics

and Raup:

Extinctions power law distributed

#### Something like:



Tangled Nature model of evolution

see http://www.ma.ic.ac.uk/~hjjens

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# **So what is essential?**

Back to Bak, Tang and Wiesenfeld

• Slow driving

• Threshold <>>> local rigidity

System keeps getting stuck in one of many meta-stable states



Eq. of motion for the BTW model:

The algorithm:



Let  $\boldsymbol{E}_{_{\boldsymbol{\Gamma}}}$  denote the height of site no.  $\boldsymbol{r}$ 

Add one grain at a random site  $\mathbf{r}_0 \Rightarrow E_{\mathbf{r}_0} \mapsto E_{\mathbf{r}_0} + 1$ 

$$
\begin{aligned}\n\blacktriangleright \quad & \text{If } E_{\mathbf{r}_0} > E_c \text{ then } E_{\mathbf{r}_0} \mapsto E_{\mathbf{r}_0} - E_c \\
& \qquad E_{\mathbf{r}_n} \mapsto E_{\mathbf{r}_n} + E_c / q\n\end{aligned}
$$

#### Or in equation form:

$$
E(\mathbf{r}, t+1) = E(\mathbf{r}, t) - E_c \Theta(E(\mathbf{r}, t) - E_c) + \sum_{\mathbf{r}_n} \frac{E_c}{q} \Theta(E(\mathbf{r}_n, t) - E_c)
$$

$$
E(\mathbf{r},t+1) - E(\mathbf{r},t) = \frac{E_c}{q} \sum_{\mathbf{r}_n} \Theta(E(\mathbf{r}_n,t) - E_c) - \Theta(E(\mathbf{r},t) - E_c)
$$

Continuum limit

$$
\frac{\partial}{\partial t}E(\mathbf{r},t) = D\nabla^2 \Theta(E(\mathbf{r},t) - E_c) + \eta(\mathbf{r},t)
$$

$$
\frac{\partial}{\partial t}E(\mathbf{r},t) = D\nabla^2 \Theta(E(\mathbf{r},t) - E_c) + \eta(\mathbf{r},t)
$$

 $N$ eed to regularise the  $\theta$ -function. Consider e.g.

 $\Theta(x) = \lim_{\beta \to \infty} f(\beta x)$ 

Where  $f(x)$  is some nice function with

Albert Diaz-Guilera Europhys. Lett. 26, 177 (1994)

 $\lim_{x\to\infty} f(x) = 1$  $\int f(x) dx$ 

Then expand  $f(x) = \sum a_n x^n$ *n*

Include more and more non-linearities and study – using Renormalisation Group – how the correlator

 $\langle E(\mathbf{0},t)E(\mathbf{r},t)\rangle$  behaves.

#### Result of analysis

That the model may be critical.

(at least as judged from continuum equation)

 That criticality in the non-conservative case is only possible if uniformly driven.

(Consistent with the numerics of the OFC model)

<sup>⊗</sup> But procedure is non-rigorous, not clear if results can be trusted, and very heavy.

 $\circledcirc$  Nor can one calculate the exponent of the avalanche distribution



Absorbing state phase transitions (See e.g. R. Dickman, *Physica* A **306**, 90-97 (2002)) Consider two fields: the density of active sites  $\mathcal{P}_a$  the "particle" density  $\zeta$ 

Elimination of  $\,$   $\,$   $\,$   $\,$  leads to the following eq.

#### Langevin eq. with memory term

$$
\partial_t \rho_a(\mathbf{x},t) = D\nabla^2 \rho_a - r(\mathbf{x})\rho_a - b\rho_a^2 + w\rho_a \int_0^t d\tilde{t} \nabla^2 \rho_a(\mathbf{x},\tilde{t}) + \sqrt{\rho_a} \eta(\mathbf{x},t)
$$

Where the growth rate *r*(**x**) is given by the initial condition and the noise is correlated according to

$$
\langle \eta(\mathbf{x},t)\eta(\mathbf{x}',t')\rangle = \Gamma \delta(\mathbf{x}-\mathbf{x}')\delta(t-t')
$$

Related to Directed Percolation.

Nevertheless, difficult to handle. Renormalisation group not yet applied with success.

### Relation to branching processes



#### Uncorrelated process

Distribution of tree sizes  $p(s) \propto s^{-\frac{3}{2}} \exp \Bigl( - \frac{s}{s_0(\sigma)} \Bigr)$  $\infty$ 

The branching ratio

$$
\sigma = \sum_{n=1}^{\infty} n p_n
$$

**Characteristic size** 

$$
s_0(\sigma) \propto (1-\sigma)^{-2}
$$

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# **Exact results**

D. Dhar's  $\Delta$ -matrix formalism for Abelian sandpiles see e.g. Dhar, Phys. Rev. Lett 64, 1613, (1990)

Consider a system consisting of *N* sites *1,2,3,…, N.* Dynamics:

**(1) Addition rule.**  $z_i \mapsto z_i + 1$ 

(2) *Toppling rule.*  $z_i > z_{ic} \Rightarrow z_j \mapsto z_j - \Delta_{ij}$  for  $j = 1, 2, ..., N$ 

## The  $\Delta$ -matrix:  $N\times N$

(a)  $\Delta_{ii} > 0$   $\forall i$ ;  $\forall i$ ; Overcritical sites decrease height

(b)  $\Delta_{ij} \leq 0$   $\forall i \neq j;$ 

 $\Delta_{ii} \leq 0 \qquad \forall i \neq j; \qquad$  Neighbour sites receive height

$$
\sum_{i=1}^N \Delta_{ij} \ge 0 \quad \forall i.
$$

 $(c)$ 

Particles are not created during relaxation

### **Definitions**

Set of stable configurations

$$
S = \left\{C = \left\{z_i\right\} \mid 1 \le z_i \le z_{ic} \ \forall i\right\}
$$

Operators on *S*

 $a_i : S \rightarrow S$ 

Take configuration *C.*

Add one particle to site *i* according to rule (1) and relax according to rule (2).

 $Result = a_i C$ 

Operators commute: *<sup>i</sup> <sup>j</sup> <sup>j</sup> <sup>i</sup> <sup>a</sup> <sup>a</sup>* <sup>=</sup> *<sup>a</sup> <sup>a</sup>*

$$
a_i a_j = a_j a_i
$$

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Set of recurrent configurations

$$
R = \{ C \in S \mid \exists m_i : a_i^{m_i} C = C \ \forall i \}
$$
  
Inverse  $a_i^{-1}$  exists on  $R$   

$$
P(C, t) = const.
$$
 for  $\forall C \in R$   

$$
P(C, t) = \frac{1}{|R|} = \frac{1}{\det \Delta}
$$

### The avalanche exponent

Attempts have been made using the  $\Delta$ -matrix formalism.

 $\boldsymbol{\mathcal{T}}$ 

But no exact result obtained so far.



# **Summary and conclusion**

**What does it mean? What does it mean? Marginal stability and response of all sizes Marginal stability and response of all sizes**

**And is it important? And is it important? Yes, but exactly how, we don't know yet.** 

# References:

P. Bak

*How Nature Works. The since of Self-organized criticality*

Oxford Univ. Press 1997

#### H.J. Jensen

*Organized Criticality. Emergent Complex Behavior in Physical and Biological Systems*

Cambridge Univ. Press. 1998