# Self Organised Criticality, its history and recent developments

Gunnar Pruessner

Department of Mathematics Imperial College London

Queen Mary University London, 29 March 2010

Imperial College London

g.pruessner@imperial.ac.uk (Imperial)

SOC, past and present

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# Outline



Models and Experiments

- Scaling and Universality
- qEW and C-DP

### Mechanisms of SOC

- Generic Scale Invariance
- The Absorbing State Mechanism

# 3 Any Answers?



#### The sandpile model:

- Bak, Tang and Wiesenfeld 1987.
- Simple (randomly driven) cellular automaton  $\longrightarrow$  avalanches.
- Intended as an explanation of 1/f noise.
- Generates(?) scale invariant event statistics.

### • The physics of fractals.

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# The BTW model



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# The BTW model



#### Key ingredients:

- Separation of time scales.
- Interaction.
- Thresholds (non-linearity).
- Observables: Avalanche sizes and durations.

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# Experiments



Photograph courtesy of V. Frette, K. Christensen, A. Malthe-Sørenssen, J. Feder, T. Jøssang and P. Meakin.

- Large number of experiments and observations:
- Earthquakes suggested by Bak, Tang and Wiesenfeld.
- Sandpile experiments by Jaeger, Liu and Nagel (PRL, 1989).
- Superconductors experiments by Pla and Nori (PRL, 1991).
- Ricepiles experiments by Frette et al. (Nature, 1996).

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# Theory



From Jeng, Piroux, Ruelle (2006)

- Many exact results for the BTW model. No proof of scaling.
  - Most results for Dhar's Abelian version.
  - Mapping to CFT with central charge -2 (spanning trees);
    - $q \rightarrow 0$  Potts model
  - Correlation functions known exactly.
  - Wave decomposition.
- Fewer results for other models.
- Other models: Established relation to ordinary critical phenomena.
- No exact solution of non-trivial (long ranged spatio-temporal Imperial College correlations) model.

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# Scaling and Universality



Only a few models (Manna and Oslo) display solid scaling.

- Robust against (small) changes in the definition  $\longrightarrow$  universality.
- Manna and Oslo (apparently) in the same universality class.
- Is this the only (proper) universality class in SOC?

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# **Better Models!**

BTW constrained by determinism — stochastic sandpiles!



• Manna model has a Langevin equation

$$\partial_t \phi(\mathbf{r}, t) = \nu \nabla^2 \phi + \lambda \phi(\phi_0 - \phi) + \omega \phi \rho + \sqrt{\phi} \eta(\mathbf{r}, t)$$

and

$$\partial_t \rho(\mathbf{r}, t) = \mathbf{v}_{\rho} \nabla^2 \phi$$

#### similar to directed percolation (C-DP).

- Oslo model implements quenched Edwards Wilkinson equation —> interfaces!
- Field theories for both still unclear.
- Mechanism of self-organisation still unclear.
- Link to known universality classes.

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### Quenched Edwards-Wilkinson and Conserved DP Oslo Model: qEW

$$\partial_t \phi(\mathbf{r}, t) = \nu \nabla^2 \phi(\mathbf{r}, t) + \eta(\mathbf{r}, \phi(\mathbf{r}, t))$$

continuum version of the exact equation of motion of the Oslo model (Pruessner 2003).

- Ordinary phase transition at critical pulling force  $F = F_c$  in  $\partial_t \phi = \ldots + F$ .
- In the Oslo model driving enters as boundary condition  $\phi(\mathbf{0}, t) = E(t)$ .
- Mapping of exponents in interface depinning and SOC (Paczuski, Boettcher 1996).
- Quenched noise term,  $\eta(\mathbf{r}, \phi(\mathbf{r}, t))$ , difficult to handle (Nattermann *et al.* 1992).
- First link between SOC and ordinary critical phenomena as originally envisaged.

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Quenched Edwards-Wilkinson and Conserved DP Manna Model: C-DP

$$\partial_t \phi(\mathbf{r}, t) = \nu \nabla^2 \phi + \lambda \phi(\phi_0 - \phi) + \omega \phi \rho + \sqrt{\phi} \eta$$

with conserved  $\partial_t \rho(\mathbf{r}, t) = v_{\rho} \nabla^2 \phi$  (effective theory — integrate!).

- Describes the Manna Model.
- Link to absorbing state phase transitions and interfaces.
- Link to (tuned) DP (contact process).
- Noise not quenched but Reggeon like.
- Field theory not easy to analyse.
- Same universality class as Oslo model.
- Links qEW and C-DP.

Generic Scale Invariance The Absorbing State Mechanism

# Outline



#### Mechanisms of SOC

#### • Generic Scale Invariance

The Absorbing State Mechanism

#### Any Answers?

# Generic scale invariance I

Constructing a generically scale invariant Langevin equation Most basic Langevin equation of field  $\phi(\mathbf{r}, t)$  (parameterising what?)

$$\partial_t \phi(\mathbf{r}, t) = \nu \nabla^2 \phi(\mathbf{r}, t) - \epsilon \phi(\mathbf{r}, t) + \eta(\mathbf{r}, t)$$

with the usual white, Gaussian noise

$$\langle \eta(\mathbf{r},t)\eta(\mathbf{r}',t')\rangle = 2D\delta(\mathbf{r}-\mathbf{r}')\delta(t-t')$$

and vanishing mean  $\langle \eta(\mathbf{r}, t) \rangle = 0$ . Integrate:

$$G_1(r, \epsilon) = \frac{D\pi}{\sqrt{\epsilon\nu}} \exp(-|r|\sqrt{\epsilon/\nu})$$
  

$$G_3(r, \epsilon) = \frac{D}{2\nu r} \exp(-|r|\sqrt{\epsilon/\nu})$$

Scale invariance recovered for  $\epsilon = 0$ . How?

g.pruessner@imperial.ac.uk (Imperial)

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# Generic scale invariance I

Constructing a generically scale invariant Langevin equation

How? Conservation! (Hwa and Kardar 1989):

$$\partial_t \phi(\mathbf{r}, t) = \nu \nabla^2 \phi(\mathbf{r}, t) - \epsilon \phi(\mathbf{r}, t) + \eta(\mathbf{r}, t)$$

But exponents trivial...

# Generic scale invariance II Adding some spice

Adding non-linear terms

$$\partial_t \phi(\mathbf{r}, t) = \mathbf{v} \nabla^2 \phi(\mathbf{r}, t) + \frac{\lambda}{2} \partial_{\parallel} \phi(\mathbf{r}, t)^2 + \eta(\mathbf{r}, t)$$

generates non-trivial exponents. In general, diffusion is anisotropic:

$$\partial_t \phi(\mathbf{r}, t) = (\nu_{\parallel} \partial_{\parallel}^2 + \nu_{\perp} \nabla_{\perp}^2) \phi(\mathbf{r}, t) + \frac{\lambda}{2} \partial_{\parallel} \phi(\mathbf{r}, t)^2 + \eta(\mathbf{r}, t)$$

Problem: non-conservative noise and conservative Langevin equation is "forcing scaling". Manna and Oslo are conservative in the bulk.

# Generic scale invariance III

Conservative noise - naively

Original equation

$$\partial_t \phi(\mathbf{r}, t) = \mathbf{v} \nabla^2 \phi(\mathbf{r}, t) - \mathbf{\epsilon} \phi(\mathbf{r}, t) + \eta(\mathbf{r}, t)$$

with conservative noise

$$\langle \eta(\mathbf{r},t)\eta(\mathbf{r}',t')\rangle = -2D\nabla^2\delta(\mathbf{r}-\mathbf{r}')\delta(t-t')$$

gives (Fourier transform)

$$\langle \phi(\mathbf{k},t)\phi(\mathbf{k}',t)\rangle = D \frac{(2\pi)^{d+1}\delta(\mathbf{k}+\mathbf{k}')}{\nu\mathbf{k}^2+\epsilon}\mathbf{k}^2$$

In the conservative limit ( $\epsilon \rightarrow 0$ ) the field  $\phi(\mathbf{r}, t)$  is  $\delta$ -correlated in real space.

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Generic scale invariance IV Conservative noise (Grinstein, Lee, Sachdev 1990)

Anisotropy in diffusion

$$\partial_t \phi(\mathbf{r}, t) = (\mathbf{v}_{\parallel} \partial_{\parallel}^2 + \mathbf{v}_{\perp} \nabla_{\perp}^2) \phi(\mathbf{r}, t) - \epsilon \phi(\mathbf{r}, t) + \eta(\mathbf{r}, t)$$

and conservative noise

$$\langle \eta(\mathbf{k},\omega)\eta(\mathbf{k}',\omega')\rangle = -2(D_{\parallel}\partial_{\parallel}^{2}+D_{\perp}\partial_{\perp}^{2})\delta(\mathbf{r}-\mathbf{r}')\delta(t-t')$$

gives (Fourier transform)

$$\langle h(\mathbf{k},t)h(\mathbf{k}',t)\rangle = \frac{(2\pi)^3\delta(\mathbf{k}+\mathbf{k}')(D_{\parallel}k_{\parallel}^2+D_{\perp}k_{\perp}^2)}{\nu_{\parallel}k_{\parallel}^2+\nu_{\perp}k_{\perp}^2+\epsilon}$$

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# Generic scale invariance IV

Conservative noise (Grinstein, Lee, Sachdev 1990)



After Fourier transforming, a quadrupole-like structure appears:

$$\begin{split} \langle h(\mathbf{x},t)h(\mathbf{x}',t)\rangle &= \frac{1}{2} \left( \frac{D_{\parallel}}{\nu_{\parallel}} + \frac{D_{\perp}}{\nu_{\perp}} \right) \delta(\mathbf{x} - \mathbf{x}') \\ &+ \frac{\sqrt{\nu_{\parallel}\nu_{\perp}}}{2\pi r^2} \left( \frac{D_{\parallel}}{\nu_{\parallel}} - \frac{D_{\perp}}{\nu_{\perp}} \right) \frac{\nu_{\parallel} \sin^2 \theta - \nu_{\perp} \cos^2 \theta}{\left( \nu_{\parallel} \sin^2 \theta + \nu_{\perp} \cos^2 \theta \right)^2} \end{split}$$

g.pruessner@imperial.ac.uk (Imperial)

# Generic scale invariance V Summary

$$\partial_t \phi(\mathbf{r}, t) = (\mathbf{v}_{\parallel} \partial_{\parallel}^2 + \mathbf{v}_{\perp} \partial_{\perp}^2) \phi + \eta(\mathbf{r}, t)$$

- *Generic* scale invariance (Hwa and Kardar, 1989, and Grinstein, Lee and Sachdev 1990)
- No mass term  $-\epsilon \phi$  on the right  $\longrightarrow$  conservative dynamics.
- Anisotropy required in the presence of conserved noise.
- Non-trivial exponents in the presence of non-linearities and non-conserved noise.
- Concept abandoned with the arrival of non-conservative models (FFM [1990], OFC [1992], BS [1993]).

# The Absorbing State Mechanism

Dickman, Vespignani, Zapperi 1998

- SOC model: activity ρ<sub>a</sub> leads to dissipation
- dissipation reduces particle density ζ
- density is reduced until system is inactive
   → absorbing phase
- external drive increases particle density

 $\longrightarrow$  back to active phase

An SOC model can be seen as an AS model that drives itself into the inactive phase by dissipation  $\epsilon$  and is pushed back into the active phase by external drive *h*.

$$\dot{\zeta} = h - \epsilon \rho_a \xrightarrow{\text{stationarity}} \rho_a = h/\epsilon$$

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# The Absorbing State Mechanism

Dickman, Vespignanim Zapperi 1998 and Pruessner, Peters 2006



Idea: SOC drives  $h/\epsilon = \rho_a$  to 0 as  $L \to \infty$ Leading orders:  $h(L) = h_0 L^{-\omega}$  and  $\epsilon(L) = \epsilon_0 L^{-\kappa}$ 

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# The Absorbing State Mechanism

Dickman, Vespignanim Zapperi 1998 and Pruessner, Peters 2006



#### Analysis based on real scaling function.

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# The Absorbing State Mechanism

Dickman, Vespignanim Zapperi 1998 and Pruessner, Peters 2006



What is the resulting scaling of other observables if the order parameter is forced to scale like  $\rho_a \propto L^{\kappa-\omega}$ ?  $\longrightarrow$  New exponent  $\mu > \nu$  replaces  $\nu$ , so that  $\langle \rho \rangle \propto L^{\beta/\mu}$ ,  $L^d \sigma^2(\rho) L^{\gamma/\mu}$  etc.

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# The Absorbing State Mechanism

Dickman, Vespignanim Zapperi 1998 and Pruessner, Peters 2006



Problem: SOC exponents would be affected by the way how driving and dissipation are implemented  $\rightarrow$  no universality. Fey, Levine and Wilson suggest that critical point is not reached.

g.pruessner@imperial.ac.uk (Imperial)

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- Does SOC exist in computer models? Yes. Manna and Oslo models are robust and universal.
- Does SOC exist in nature or experiments? Possibly, superconductors and granular media.
- Is SOC ubiquitous? Apparently not.
- Is SOC understood? Maybe, AS Mechanism suggested, but has problems.
- Is it worth understanding? Certainly: Understanding of long-range correlations in nature and criticality without tuning.

#### Thanks!

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