

How the rich get richer

Anita Mehta

Thanks to

A S Majumdar (SN Bose Centre, Calcutta)

J M Luck (SPhT, Saclay)

## Plan of talk

- Model ingredients -  $n$  interacting traders via bank
- A tale of two traders
- Infinitely many traders - in a soup! the mean-field limit
- Infinitely many traders - the emergence of monopolists in local neighbourhoods

## A model of $n$ interacting traders - basic ingredients

- $n$  traders interact via bank
- Wealth  $m_i(t)$  for  $i = 1, \dots, n$  of each trader evolves as:
 
$$\frac{dm_i}{dt} = \left( \frac{\alpha}{t} - \frac{1}{t^{1/2}} \sum_j g_{ij} \frac{dm_j}{dt} \right) m_i - \frac{1}{m_i}$$
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- Net gain from trader transactions:
  - $\boxed{\triangleright}$  **Gross** amount  $g_{ij}x$ (total loss of other traders)
  - $\boxed{\triangleright}$  This is also taxed, so **net** amount depleted as  $1/t^{1/2}$ .

## Some notations

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- A trader who is **poorer** than threshold goes bankrupt **and dies...**


## A tale of two (actually all $n \geq 2$ ) traders

The socialist case - two equally poor traders

- Common wealth  $x(s)$  maintained by symmetry forever:

$$x' = \frac{(2\alpha-1)x^2-2-gx^3}{2x(1+gx)}$$

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**Moral** - Only those who are BORN rich stand a chance...


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


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- In Stage II, all traders interact  $\Rightarrow$  with a collective, slow dynamics
- The richest trader 'consumes' all others... ..and may live to tell the tale... ..ONLY if he was born richer than  $y_*$ !
- Two well-separated time scales of fast and slow dynamics  $\Rightarrow$  glassy dynamics!

**Glassy dynamics: b) universality**

- For exponential distribution of initial wealth, survival probability decays as

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In fact, universality much stronger: only the **tail exponent** of the distribution determines most features.

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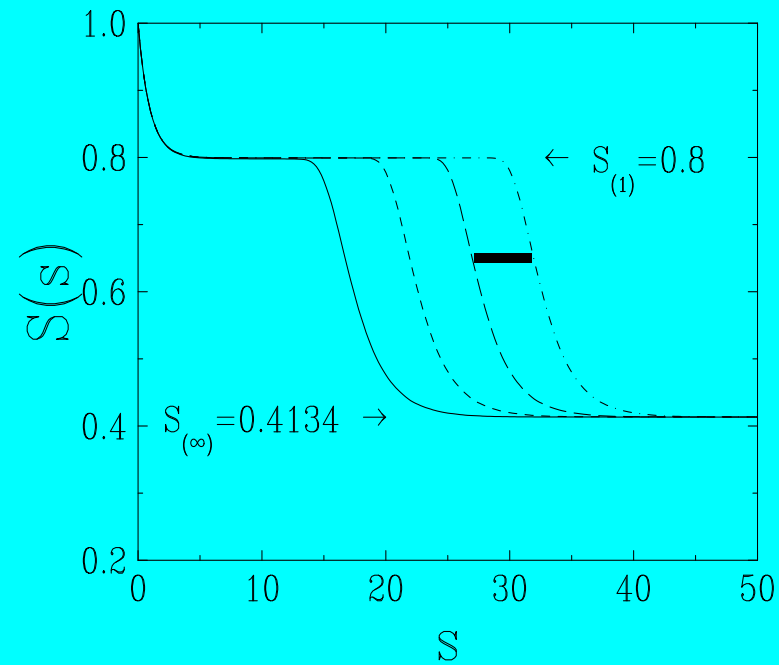
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- **however...**
- Effect of **neighbourhoods** comes into play in **slow collective** dynamics of Stage II:
  - ▷  $S(s)$  decays from  $S_{(1)}$  to **non-trivial limiting value**  $S_{(\infty)}$ !!
  - ▷ a *finite* number of traders survive!

**Moral: Every 'para' creates a 'mastan'!**

## Two-step relaxation and ageing

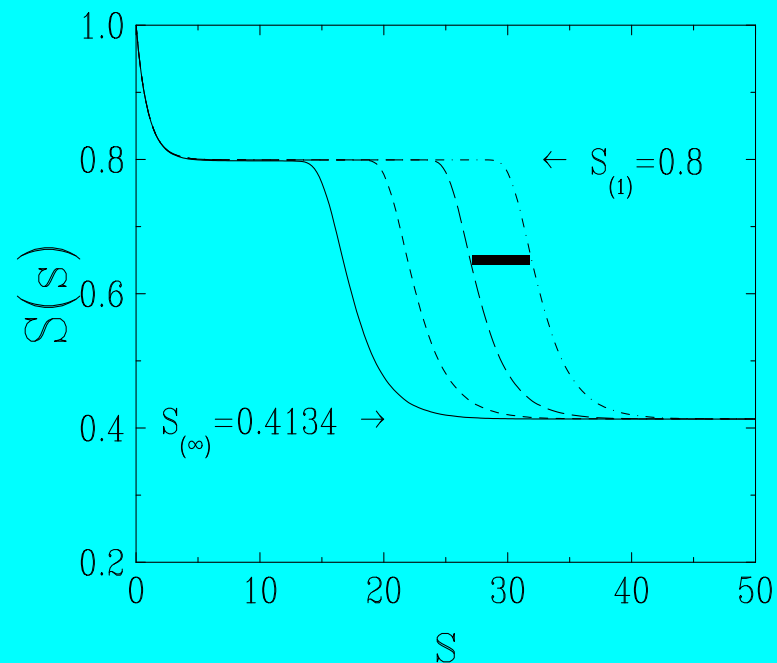
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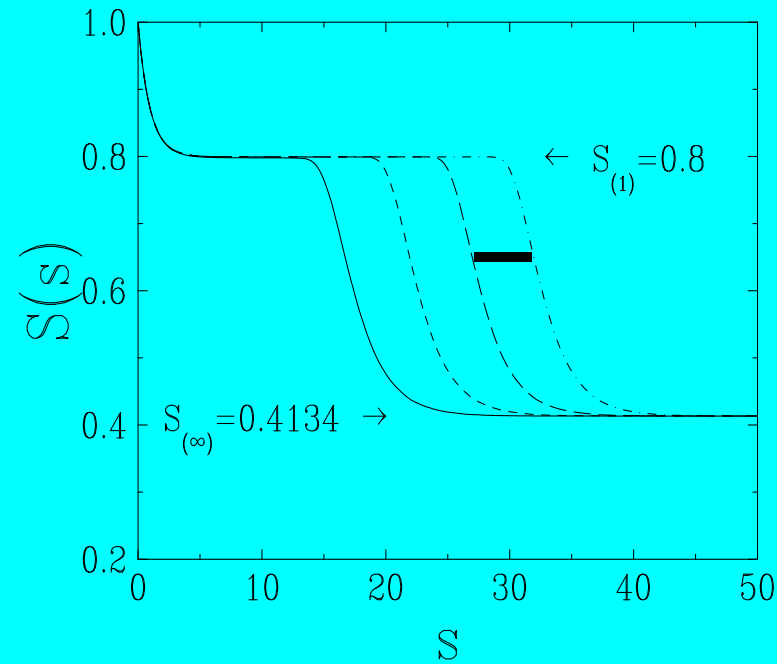
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- The weaker the trading strength, the longer it takes for monopolists to emerge - **ageing**!

## Survivors at $S_{(\infty)} = \text{monopolists}$

- After Stage II, system in non-trivial *attractor* - each trader has a *monopoly*, and keeps getting richer forever !
- Such attractors are *metastable states*, **valleys in existing random energy landscape!**
- Particular metastable state chosen is that which is most easily be reached...
- Number  $\mathcal{N}$  of such states grows exponentially with number of sites  $N$ :  $\mathcal{N} \sim \exp(N\Sigma)$   
 $\square$   $\Sigma$  is the *complexity*!
- $S_{(\infty)}$  is **density of a typical attractor** - fraction of initial traders which survive forever!

## The fate of a marketplace: patterns of monopolists

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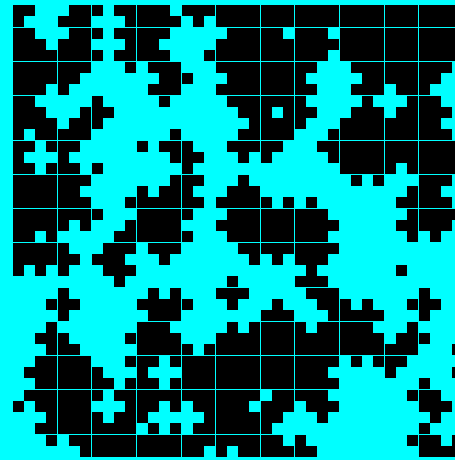
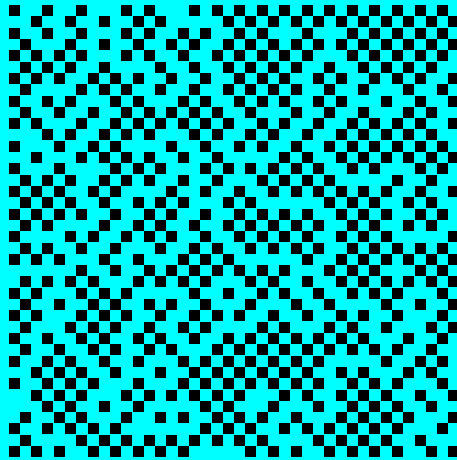
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**Moral:** Every mastan needs his own space..

## Pattern formation

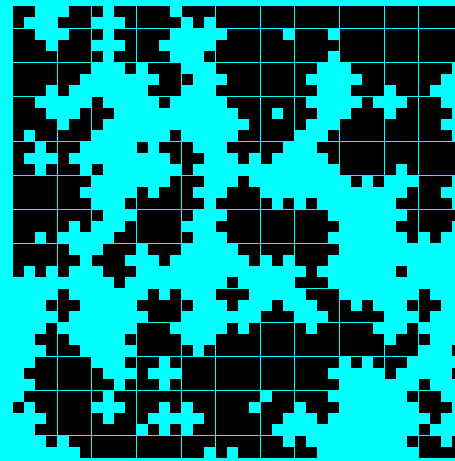
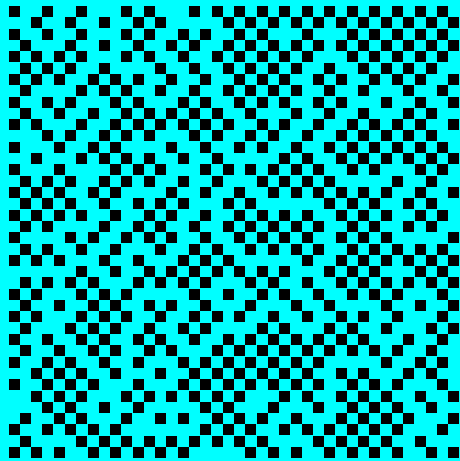
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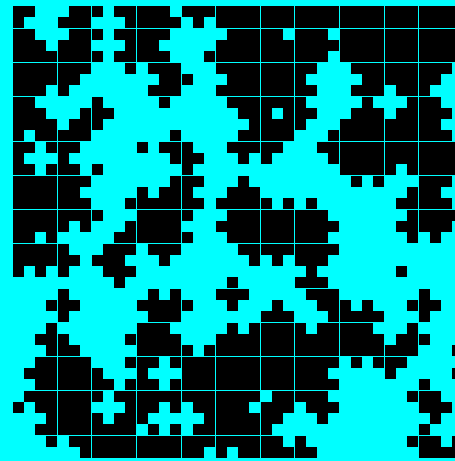
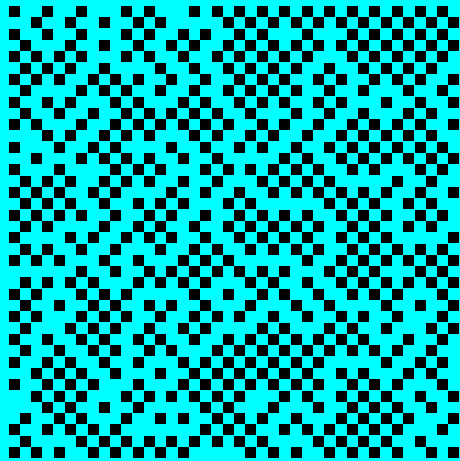
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- Random structure entirely **inherited** from initial wealth distribution
- Nearest neighbours of **monopolists** are **paupers** - but next-nearest ones likely to be monopolists!

► confirmed by correlation functions

**Moral: Those who are born rich survive to get richer, while the poor eventually disappear**

'Some are born to sweet delight  
Some are born to endless night'

William Blake