SOME STYLIZED FACTS REVISITED: CONSEQUENCES FOR FLUCTUATION SCALING

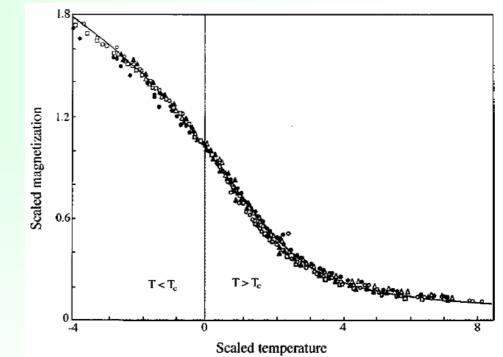
János Kertész and Zoltán Eisler Institute of Physics Budapest Univ. of Technology and Economics

## Outline

- Universality in Physics (!) and Finance (?)
- Fluctuation scaling universality classes
- Fluctuation (multi-)scaling in finance
- Volume scaling revisited
- Size matters: Non-universal scaling
- Conclusions

## **Universality in physics**

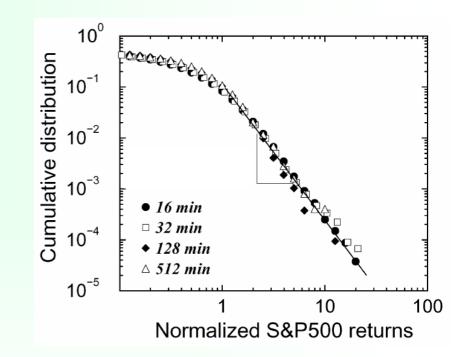
- 5 different magnetic materials (CrBr<sub>3</sub>, EuO, Ni, YIG, Pd<sub>3</sub>Fe)
- the curves collapse



- "different systems behave the same"
- power law behavior, e.g.,  $M \propto H^{1/\delta}$

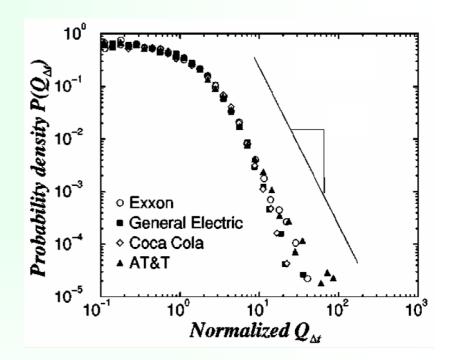
## **Universality in finance**

- the "inverse cube law"
  - price changes (returns)
  - 1000 NYSE companies
  - outside Levy regime



### Universality in finance?

- the "inverse half cube law"
  - trading volume (Q) or value (f)
  - Levy stable regime



#### Delicate questions related to extrapolation

P. Gopikrishnan et al., Phys. Rev. E 62, 4493 (2000)

#### **Fluctuation scaling**

Activity at site *i* in a multi-channel observation:  $f_i(t)$ 

E.g. traffic at induction loops, web-site visits,

packages through a router, current at a circ. element...

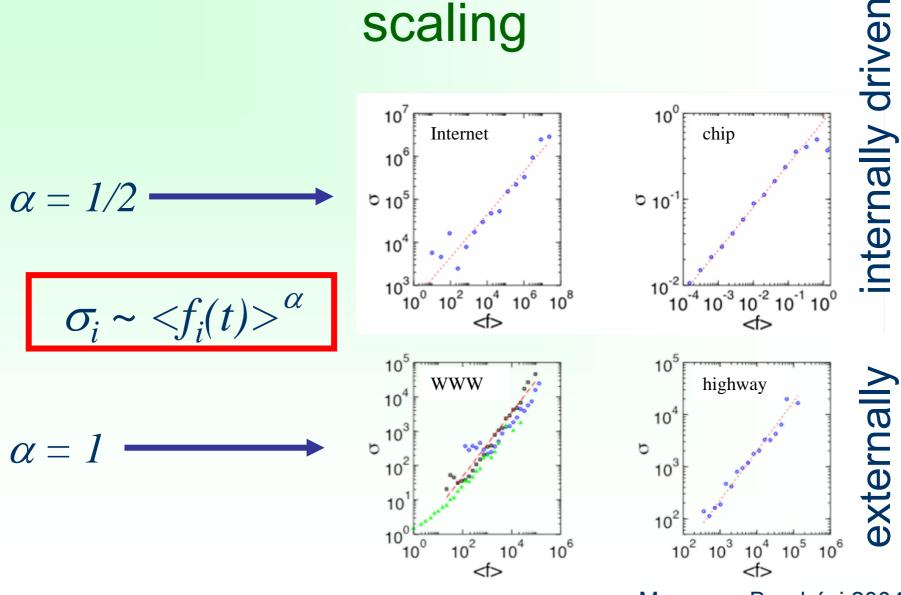
Fluctuation scaling:

$$\sigma_i \sim \langle f_i(t) \rangle^{\alpha}$$

#### Found in many systems

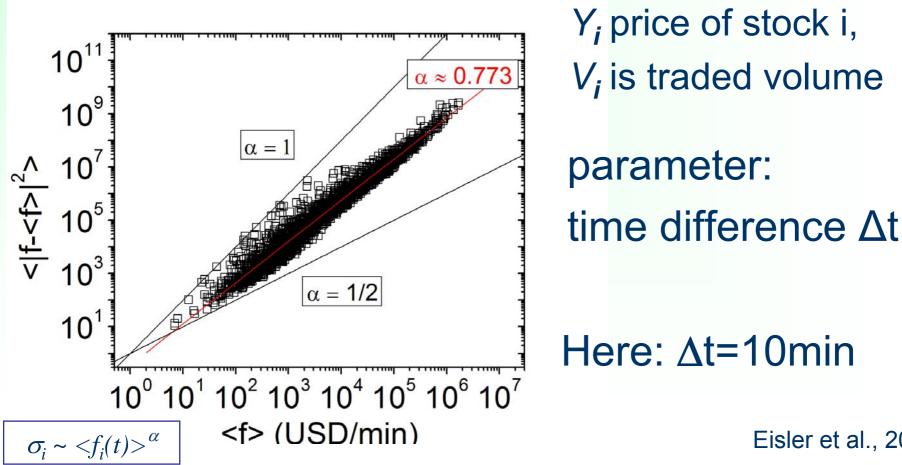
#### Menezes, Barabási 2004

# Universality classes in fluctuation scaling



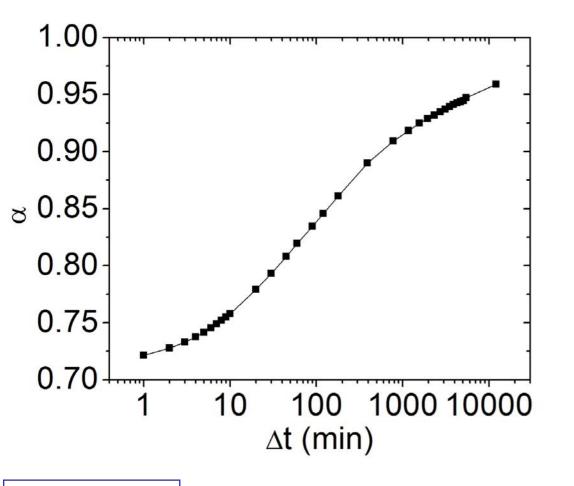
Menezes, Barabási 2004

#### Fluctuation scaling in stock market data $f_i^{\Delta t}(t) = \sum Y_i(\tau)V_i(\tau)$ Activity: flow $\tau \in [t,t+\Delta t]$



Eisler et al., 2005

#### Results for stock market data

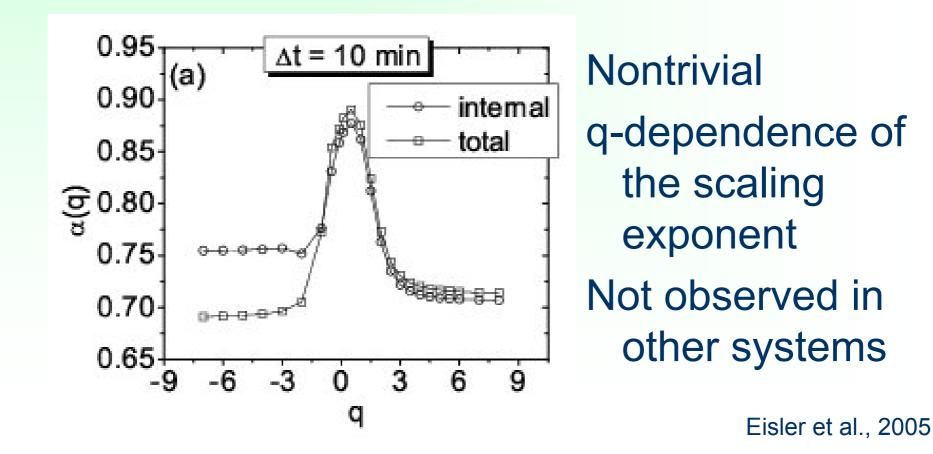


*∆t*-dependent, non-universal exponents

 $\sigma_i \sim \langle f_i(t) \rangle^{\alpha}$ 

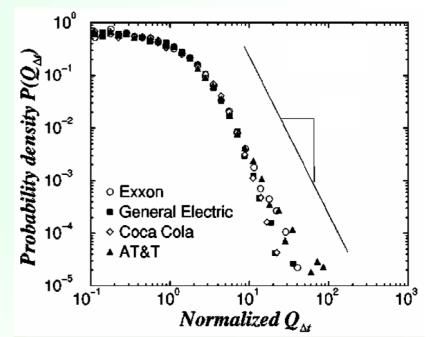
#### Multiscaling in stock market data

$$\left\langle \left| f_{i} - \left\langle f_{i} \right\rangle \right|^{q} \right\rangle = C_{f}^{q}(q; ) \left\langle f_{i} \right\rangle^{q \alpha(q; )}$$



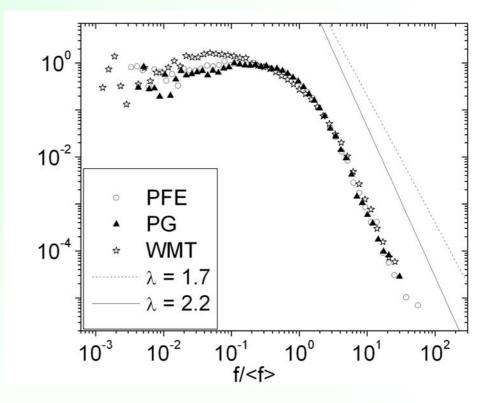
#### The distribution of traded value

- the "inverse cube half law"
  - trading volume (Q) or value (f)
  - Levy stable regime: No second moment!



#### The distribution of traded value

- analysis of 1000 top companies using extensions of Hill's method
- tail exponent greater than 2
  - Gaussian stable regime



# Beyond averages: The distribution of traded value

- fat tails
- tail exponent greater than 2
- analysis of 1000 top companies
- increasing effective exponents
  - Gaussian stable regime

Δt	λ
1 min	2.4 ± 0.23
5 min	2.8 ± 0.5
15 min	3.1 ± 0.6
60 min	$3.45 \pm 0.8$
120 min	3.8 ± 1.1
390 min	5.1 ± 0.8

# Non-universal correlations of traded value (1)

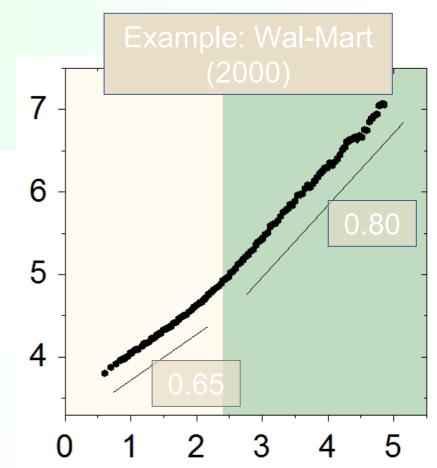
- The measured tail exponents are larger than 2
  - standard deviation exists on all time scales
  - for a stock *i*, the Hurst exponent *H(i)* can be defined as

$$\sigma_{i}(\Delta t) = \left\langle \left(f_{\Delta t} - \left\langle f_{\Delta t} \right\rangle\right)^{2} \right\rangle = C_{i} \Delta t^{H(i)}$$

- persistent: H > 0.5
- uncorrelated: H = 0.5

# Non-universal correlations of traded value (2)

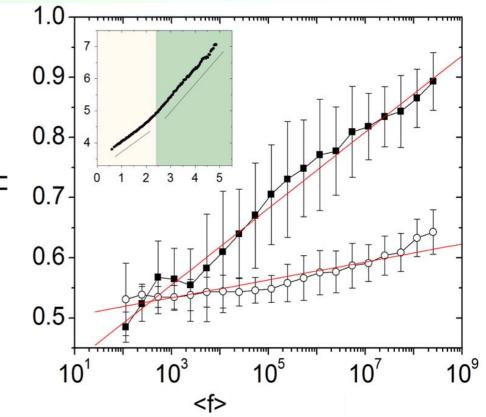
- Stocks display a crossover
  - at ∆t ≈ 390 min = 1 day
  - from weaker to stronger correlation



Z. Eisler, J. Kertész, arXiv:physics/0508156

### **Capitalization dependence**

- H non-universal!
- depends on  $\langle f \rangle$ which is a monotonous function  $_{\rm T}$ of the company size
  - γ(Δt < 250 min) = 0.016 ± 0.001
  - γ(Δt > 630 min) =
    0.063 ± 0.002



$$H(\langle f \rangle) = H(\langle f \rangle = 1) + \gamma \log\langle f \rangle$$

Z. Eisler, J. Kertész, arXiv:physics/0508156

# Non-universal correlations of traded value (3)

- $\langle f \rangle$  strongly depends on capitalization
  - capitalization acts as a parameter that determines the strength of correlations present in trading activity
  - the effect is weak on an intraday scale
  - it is much stronger for day-to-day fluctuations
- a clear logarithmic law: only the order of magnitude matters!

$$H(\langle f \rangle) = H(\langle f \rangle = 1) + \gamma \log\langle f \rangle$$

Z. Eisler, J. Kertész, arXiv:physics/0508156

#### **Relation to fluctuation scaling**

$$\sigma_{i}(\Delta t) = \left\langle \left( f_{\Delta t} - \left\langle f_{\Delta t} \right\rangle \right)^{2} \right\rangle = C_{i} \Delta t^{H(i)}$$

$$\sigma_i \sim \langle f_i(t) \rangle^{\alpha}$$

- A self-consistent scheme
- γ the same for both scalings
- Multiscaling in *∆t* too
- For details see
- Eisler and Kertész: PRE & EJP (in press) + archive

## Summary

- Scaling and universality concepts have to be handled with care in finance
- No inverse cube half law -> 2-nd moment of volume distribution exists
- Size matters! log dependence of H
- Fluctuation (multi-)scaling observed
- Related to volume (multi-)scaling

#### THANK YOU