

# Enhanced Diffusion in Disordered Systems

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E. Ben-Naim and P.L. Krapivsky, Phys. Rev. Lett. **102**, 190602 (2009)

Talk, paper available from: <http://cnls.lanl.gov/~ebn>

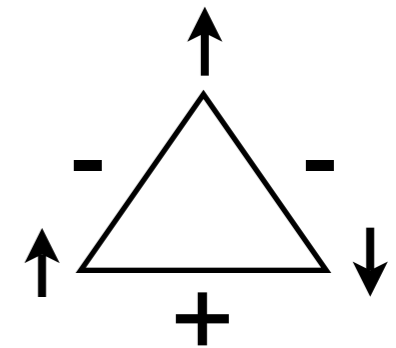
Non-local effects in pattern formation, Haifa, June 18, 2009

# Plan

1. Model: diffusion of interacting particles in disordered one-dimensional system
2. Motion of non-interacting particles in disorder
3. Motion on interacting particles in disorder

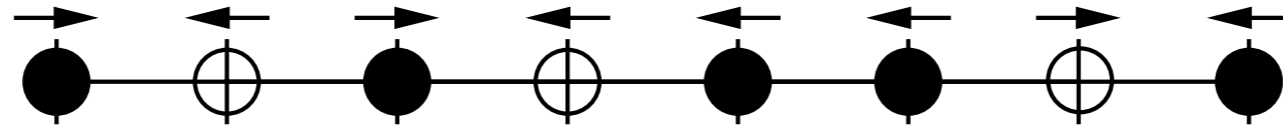
# Disorder

- Disorder underlies many interesting phenomena
  - Localization (Anderson 58)
  - Glassiness & slow relaxation (Sherrington & Kirkpatrick 75, Parisi 79)
  - Frustration (Ramirez 94)
- Influence of disorder:
  - Well understood for non-interacting particles
  - Open question for interacting particles (lee & ramakrishnan 85)
- De-localization of two interacting particles (Shepelyansky 93)



Interplay between disorder and particle interaction

# Model System



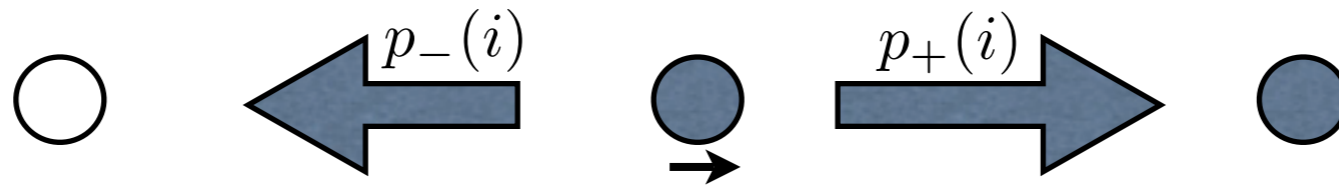
- Infinite one-dimensional lattice
- Identical particles with concentration  $c$
- Dynamics: particles move left and right with two rules:
  - (i) Disorder:** random, uncorrelated bias at each site

$$p_+ = \begin{cases} \frac{1}{2} + \epsilon & \text{with probability} = \frac{1}{2} \\ \frac{1}{2} - \epsilon & \text{with probability} = \frac{1}{2} \end{cases}$$

- (ii) Interaction:** via exclusion, one particle per site

Minimal model with disorder and interaction

# Particle Dynamics



- Pick a particle out of  $N$  randomly
- Say particle is located at site  $i$ .
- (i) Disorder: site dependent, governs motion
  - With probability  $p_+(i)$  move to the right by one site
  - With probability  $p_-(i) = 1 - p_+(i)$  move to the left one site
- (ii) Interaction: via exclusion
  - Accept the move if new site is vacant
  - Reject the move if new site is occupied
- Augment time by  $1/N$

Monte Carlo Simulation Procedure

# Parameters

- Two parameters: concentration  $c$ , disorder strength  $\epsilon$
- Generalizes two “seminal” diffusion processes:
  1. Sinai Diffusion: no interaction,  $c \rightarrow 0$  Sinai 82
  2. Single-File Diffusion: no disorder,  $\epsilon \rightarrow 0$  Levitt 73

(i) Disorder is small

$$\epsilon \ll 1$$

(ii) Concentration is finite

$$c = \frac{1}{2}$$

# One Question

- Displacement of a particle  $x$
- No overall bias, average displacement vanishes

$$\langle x \rangle = 0$$

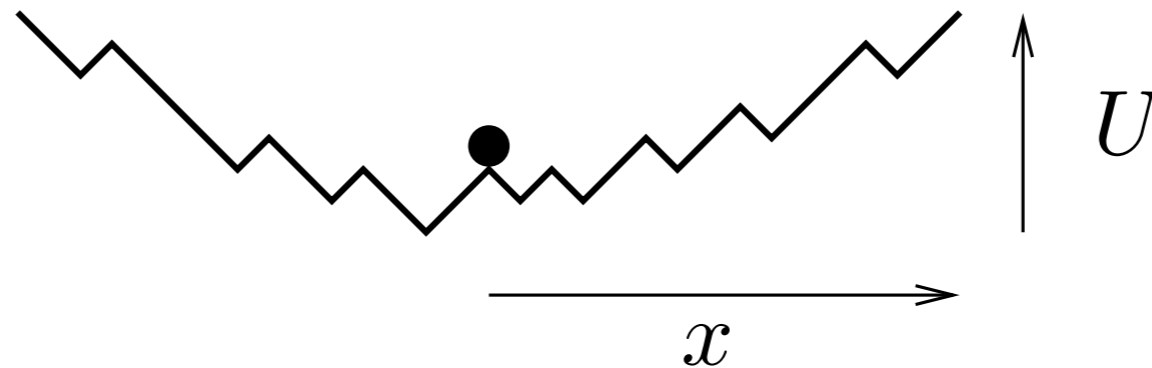
- How does the variance grow with time?

$$\sigma^2 = \langle x^2 \rangle = ?$$

# 2. Non-interacting Particles



# Non-interacting particles



- Particle is trapped in a stochastic potential well

$$U(x) = \sum_{i=1}^x [p_+(i) - p_-(i)]$$

- Potential well is a random walk

$$U \sim \epsilon \sqrt{x}$$

- Escape time is exponential with depth of well

$$t \sim e^U \sim e^{\epsilon \sqrt{x}}$$

- Logarithmically slow displacement

$$x \sim \epsilon^{-2} (\ln t)^2$$

# Distribution of Displacements

- Scaled displacement

$$\xi = \frac{x}{(\ln t)^2}$$

- Distribution is exactly known

Golosov 84  
Kesten 86

$$F(\xi) = \frac{2}{\pi} \sum_{n=0}^{\infty} (-1)^n \left(n + \frac{1}{2}\right)^{-1} \exp \left[ -\pi^2 |\xi| \left(n + \frac{1}{2}\right)^2 \right]$$

- Non-gaussian statistics

$$F(\xi) \sim \exp \left[ -\text{const.} \times |\xi| \right]$$

# Early time: random walk

- Ignore biases

$$\epsilon = 0$$

- In each step

$$\begin{aligned}\langle x \rangle &= 0 \\ \langle x^2 \rangle &= 1\end{aligned}$$

- In  $t$  steps: average and variance are additive

$$\begin{aligned}\langle x \rangle &= 0 \\ \langle x^2 \rangle &= t\end{aligned}$$

- Purely diffusive motion

$$\sigma = t^{1/2}$$

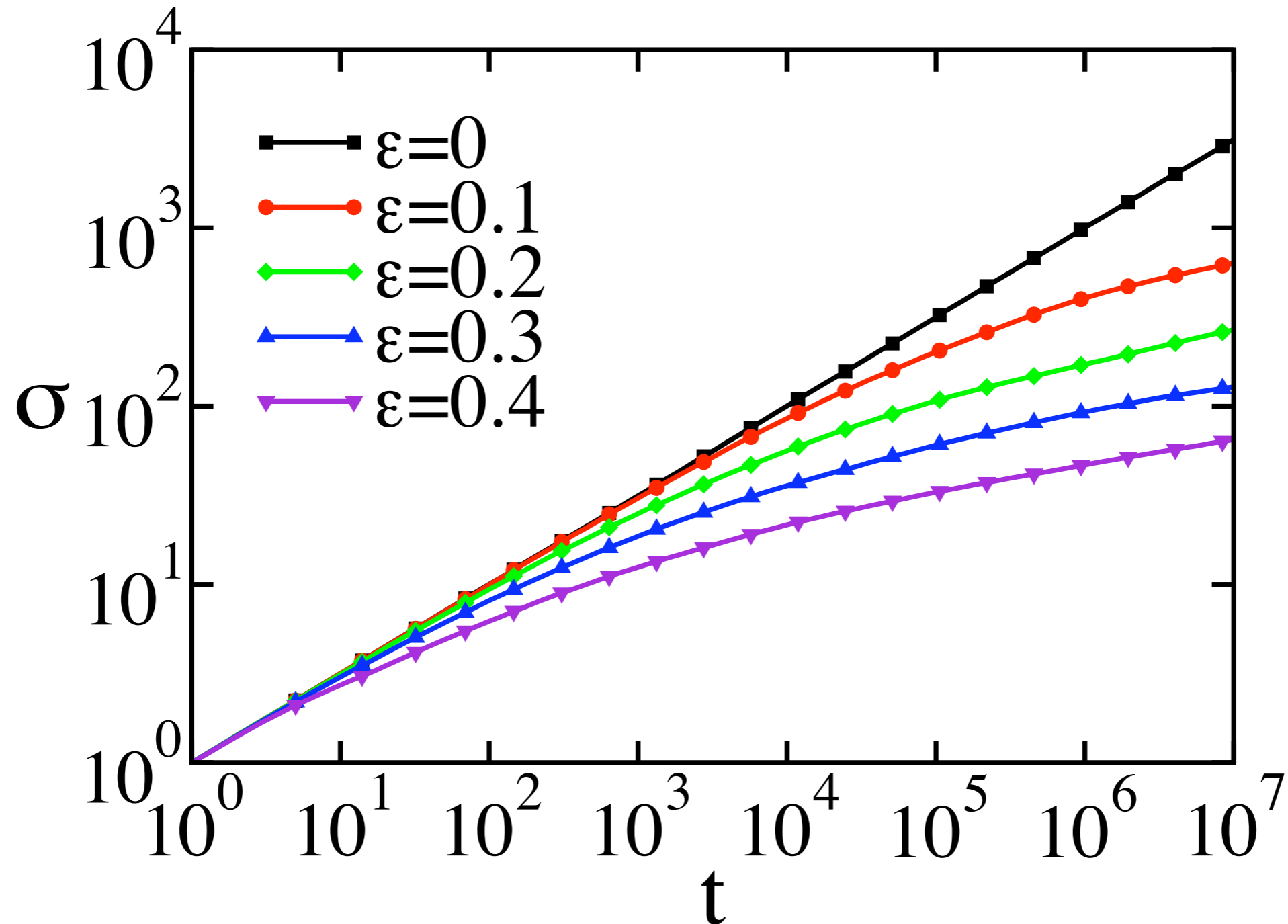
# Two time regimes

- When disorder is small, there are two time regimes
- Early times: disorder is irrelevant, simple diffusion
- Late times: disorder is relevant, particle trapped
- Crossover obtained by matching two behaviors

$$\sigma \sim \begin{cases} t^{1/2} & t \ll \epsilon^{-4}, \\ \epsilon^{-2} (\ln t)^2 & t \gg \epsilon^{-4}. \end{cases}$$

**Without particle interactions:  
disorder slows particles down**

# Numerical Simulations



Monotonic dependence on disorder strength:  
stronger disorder implies smaller displacement

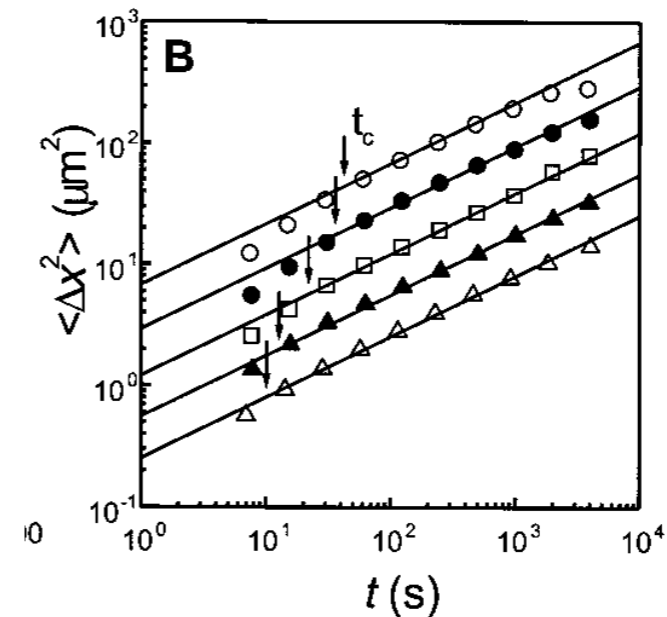
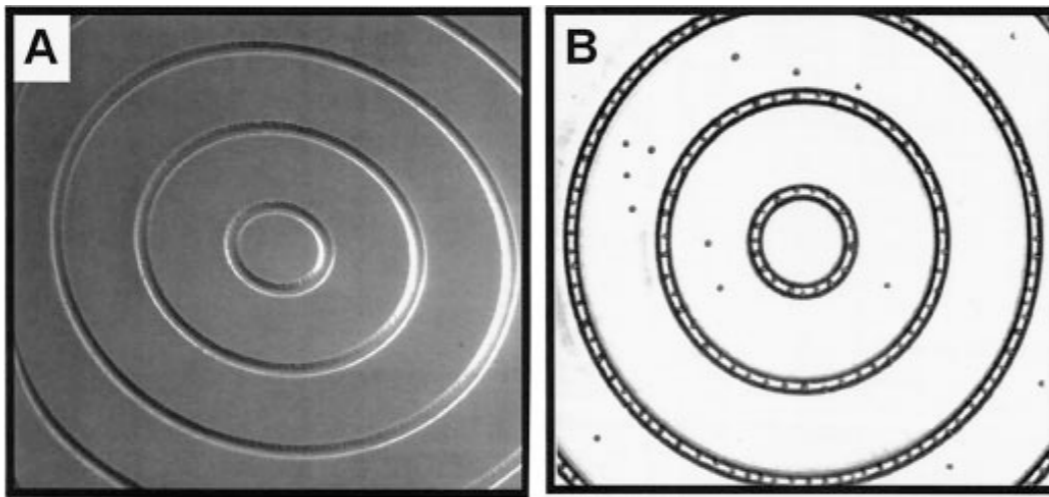
# 3. Interacting Particles

# Early times

- Disorder is irrelevant, problem reduces to single file diffusion or simple exclusion process
- Particles motion is sub-diffusive
- Observed in colloidal rings and biological channels

$$\sigma \sim t^{1/4}$$

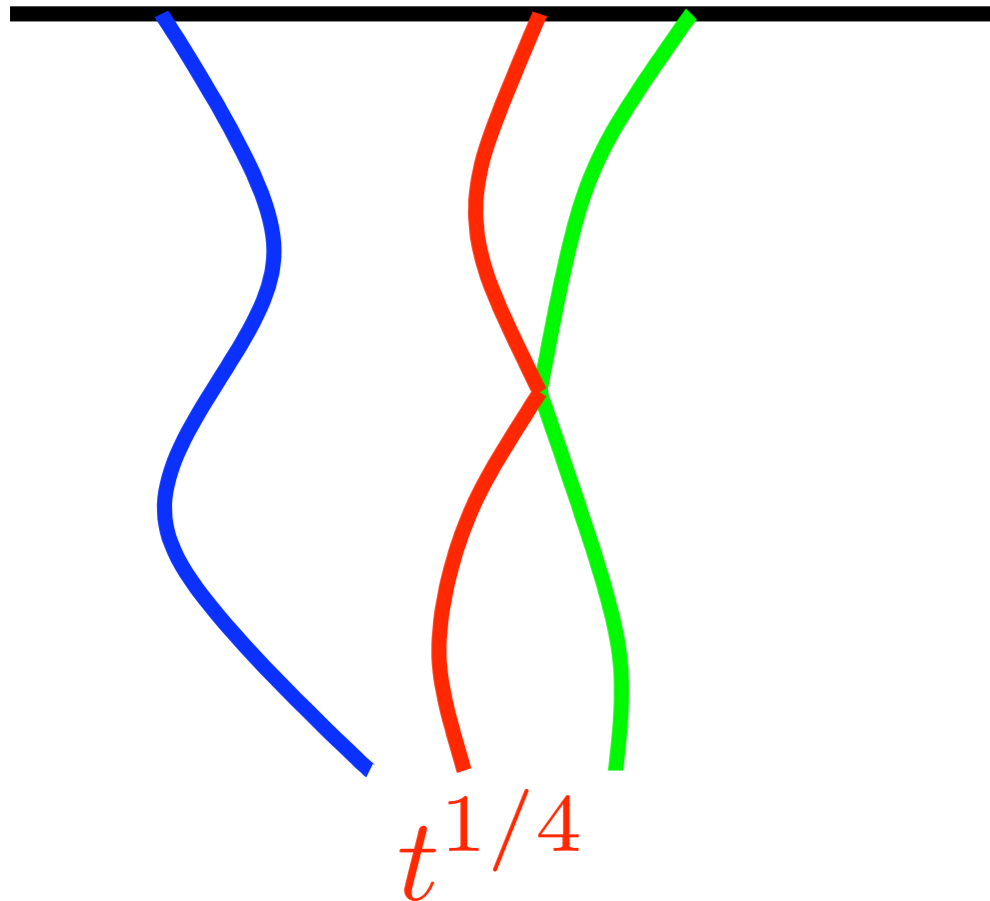
Harris 63  
Levitt 73  
Alexander 78  
van Beijeren 83  
Percus 85



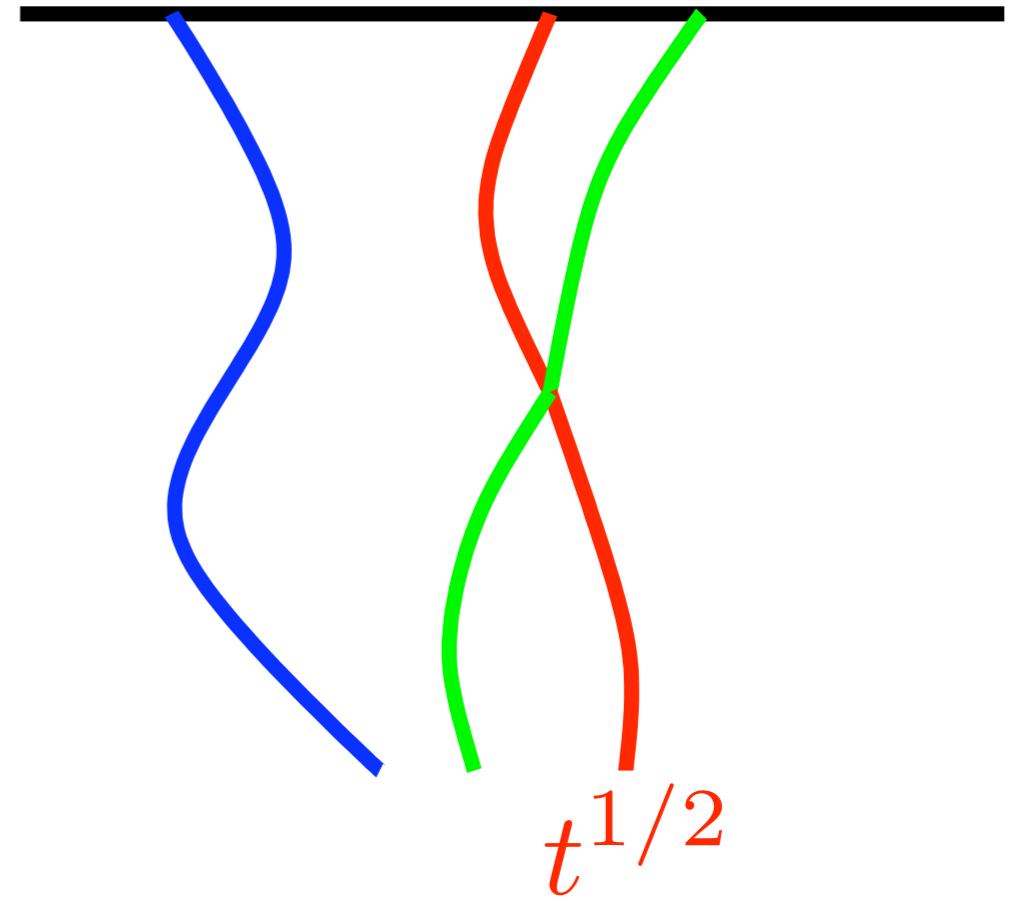
Bechinger 00  
Lin 02

Exclusion hinders motion of particles

interacting particles



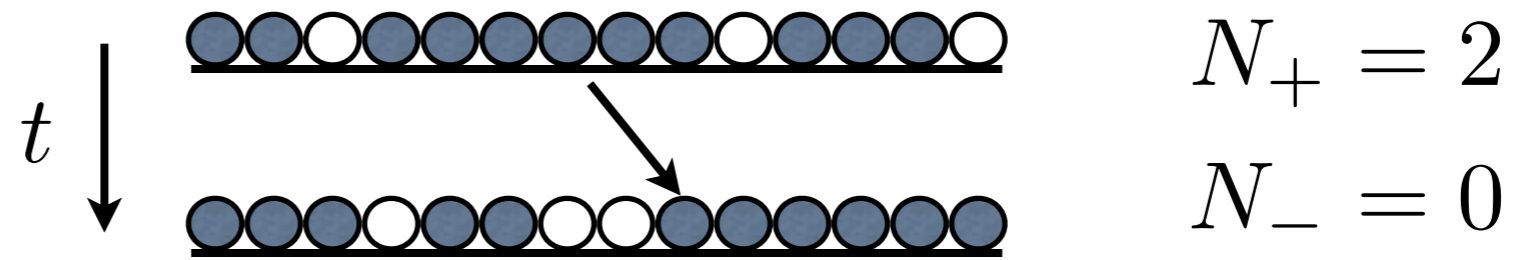
noninteracting particles



Exchange identities when two particles cross!



# Heuristic Derivation



- Dense limit

$$c \rightarrow 1$$

- Particles move by exchanging position with vacancies

$$x = N_+ - N_-$$

- Excess vacancies

$$|N_+ - N_-| \sim N^{1/2}$$

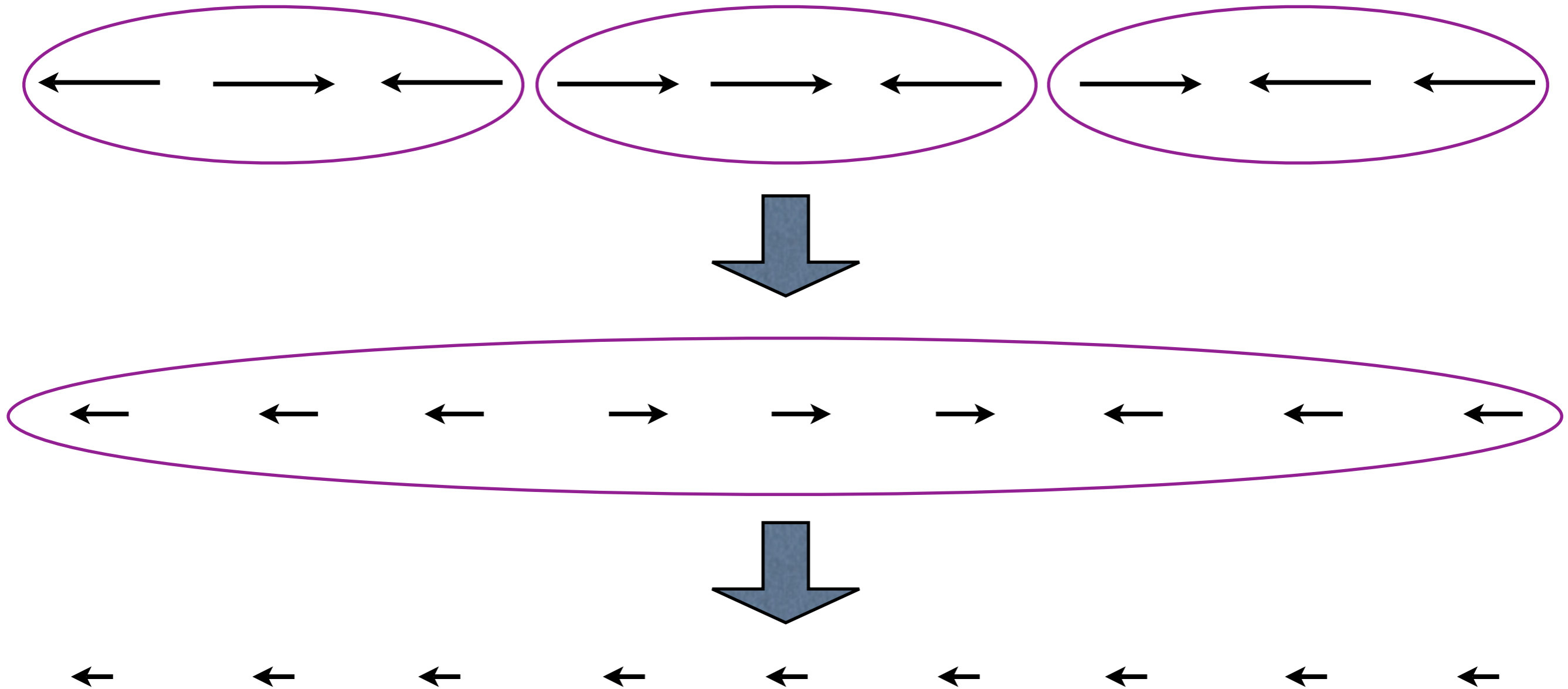
- Total number of vacancies over the diffusive length  $t^{1/2}$

$$N \sim (1 - c)t^{1/2}$$

- Displacement

$$x \sim t^{1/4}$$

# Random Velocity Field



**Magnitude of velocity diminishes with length**  
**Local biases lead to directed motion**

# Intermediate times

- Local biases exist, cause directed motion
- Particle visits  $\sigma = n_+ + n_-$  distinct sites in time  $t$
- Disorder is random, so there is a diffusive excess

$$\Delta = |n_+ - n_-| \sim \sigma^{1/2}$$

- Local drift velocity is proportional to excess

$$v \sim \epsilon \Delta / \sigma \quad \Rightarrow \quad v \sim \epsilon \sigma^{-1/2}$$

- The displacement is super-diffusive

$$\sigma \sim vt \sim \epsilon t \sigma^{-1/2} \quad \Rightarrow \quad \sigma \sim (\epsilon t)^{2/3}$$

**With particle interactions:  
disorder speeds particles up!**

# Late times

- Interaction is irrelevant, problem reduces to Sinai diffusion
- The exponential escape time is dominant
- Imagine particles lines up to exit the cage

$$t \sim e^U \text{ replaced by } t \sim x e^U$$

- Particles motion remains logarithmically slow

$$\sigma \sim \epsilon^{-2} (\ln t)^2$$

**Ultimate asymptotic behavior:  
particles motion is logarithmic slow**

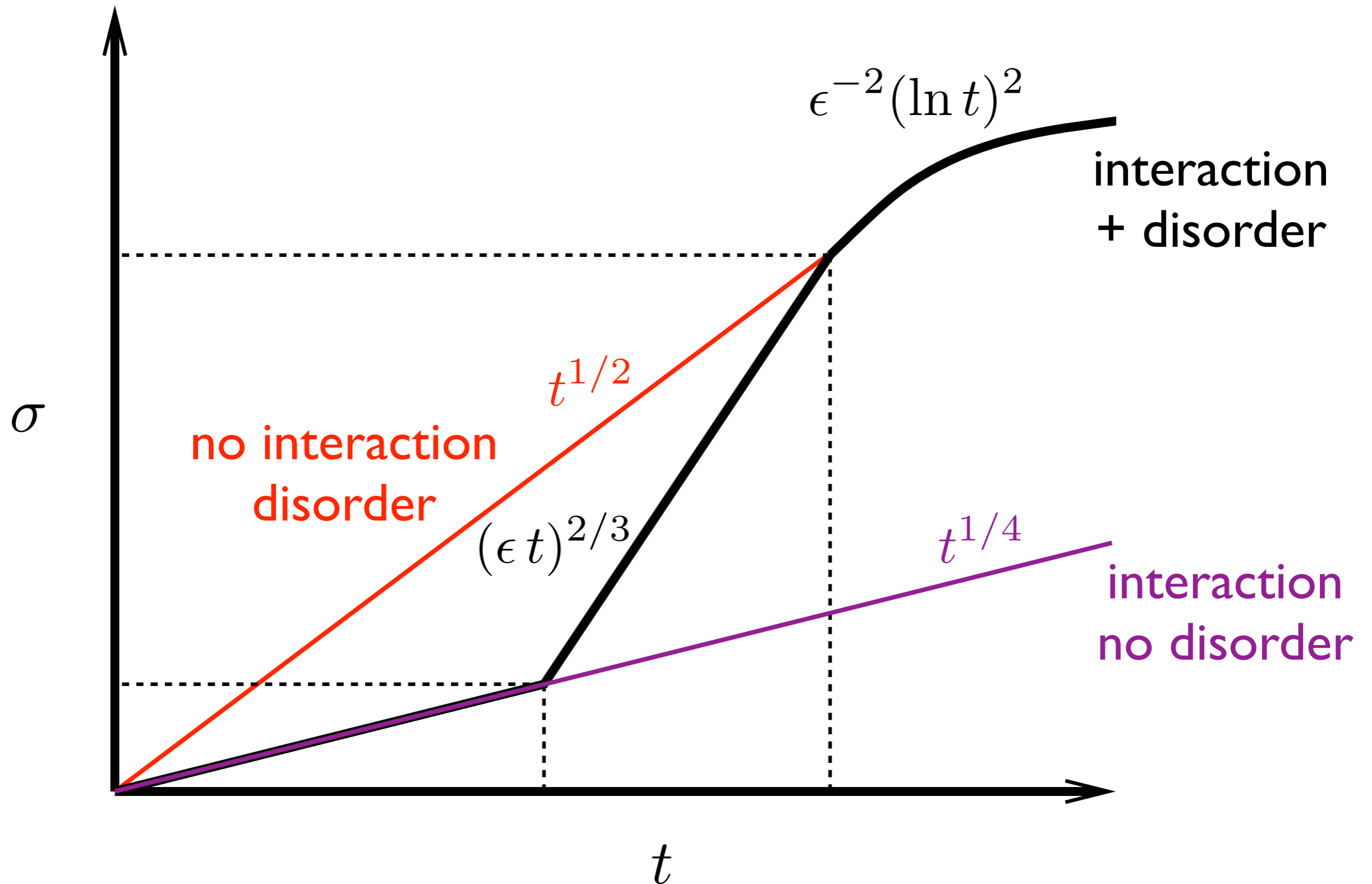
# Three time regimes

- Early times: interaction is relevant, sub-diffusion
- Intermediate times: disorder & interaction both relevant, super-diffusion
- Late times: disorder relevant, caging

$$\sigma \sim \begin{cases} t^{1/4} & t \ll \epsilon^{-8/5}, \\ (\epsilon t)^{2/3} & \epsilon^{-8/5} \ll t \ll \epsilon^{-4}, \\ \epsilon^{-2} (\ln t)^2 & t \gg \epsilon^{-4}. \end{cases}$$

**Small disorder:  
mobility is enhanced over a long period**

# Three time regimes



# Can we ignore the cage at intermediate times?

- Of course, the hopping time is of order one
- The escape time is appreciable when

$$t \sim \exp(U) \quad \Rightarrow \quad U \gg 1 \quad \Rightarrow \quad \epsilon \sqrt{x} \gg 1$$

- The cage is relevant only at late times

$$x \gg \epsilon^{-2}$$

Yes, we can (ignore the cage)!

# Heuristic argument does not utilize particle interactions!

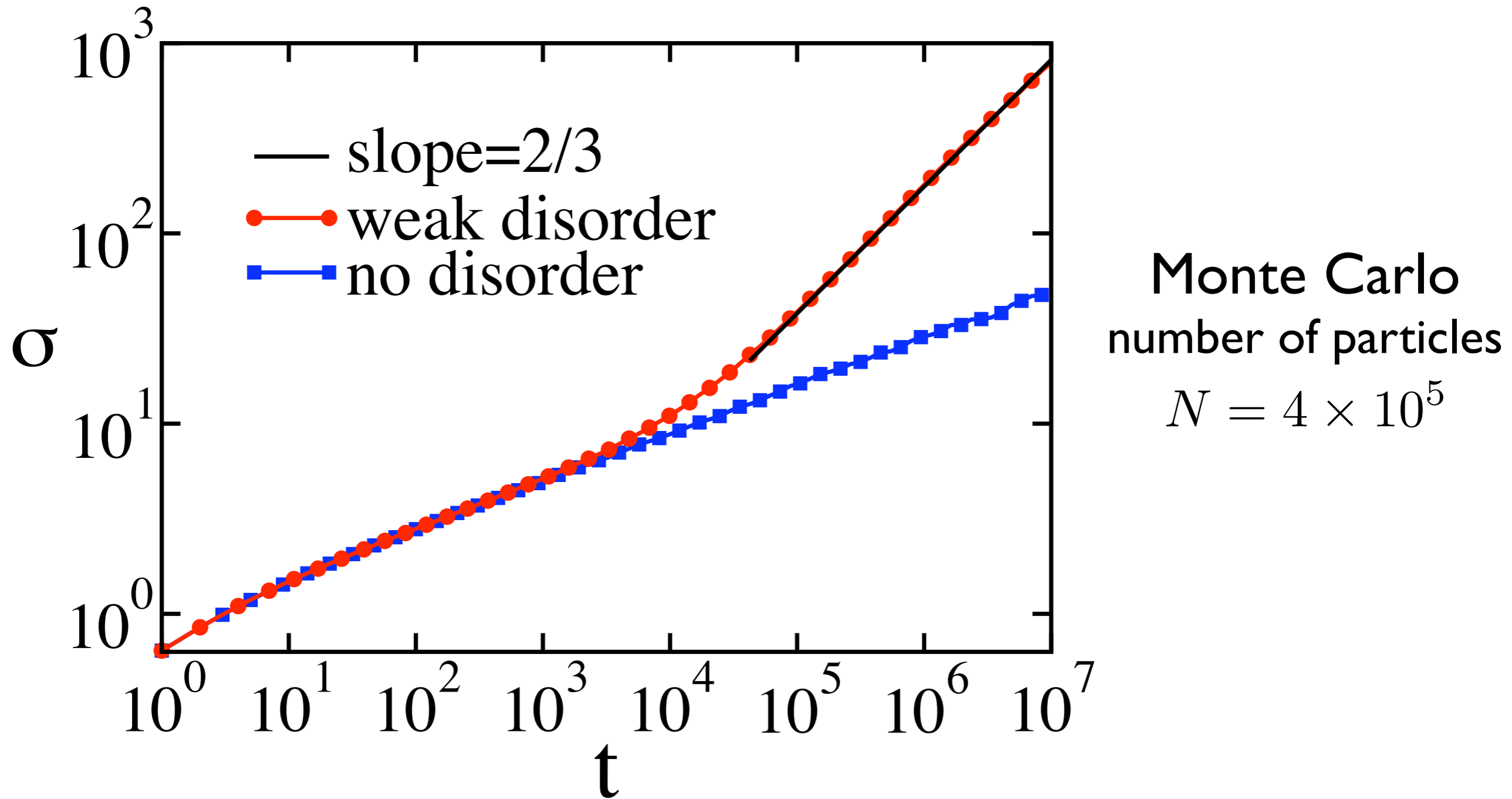
- Therefore, super-diffusive transport must be relevant for non-interacting particles!
- However, the diffusive transport overwhelms the super-diffusive transport

$$t^{1/2} \gg (\epsilon t)^{2/3} \quad \text{for} \quad t \ll \epsilon^{-4}$$

Small convective correction exists without interactions,  
but is irrelevant

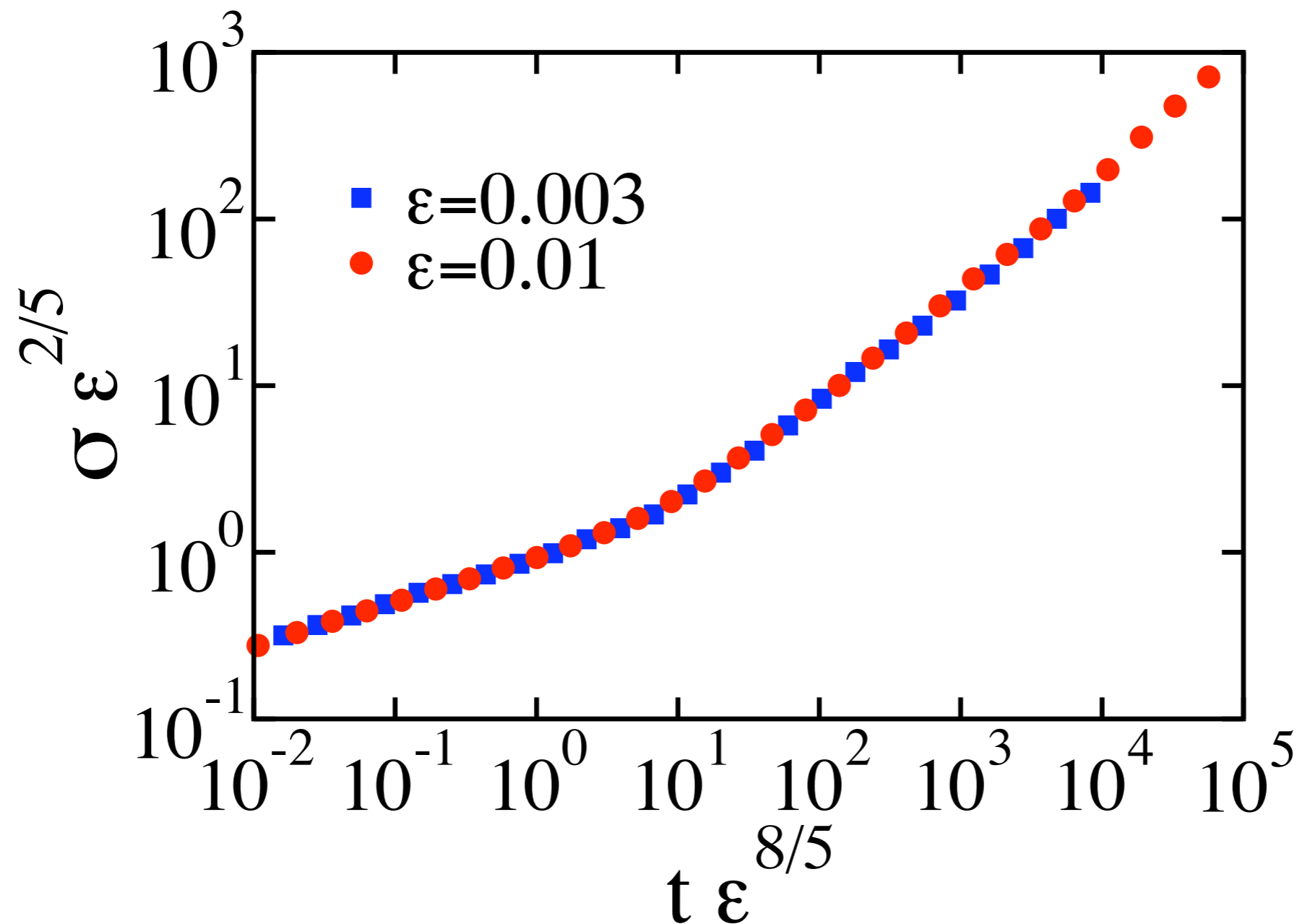


# Early and intermediate time behavior for a weak disorder



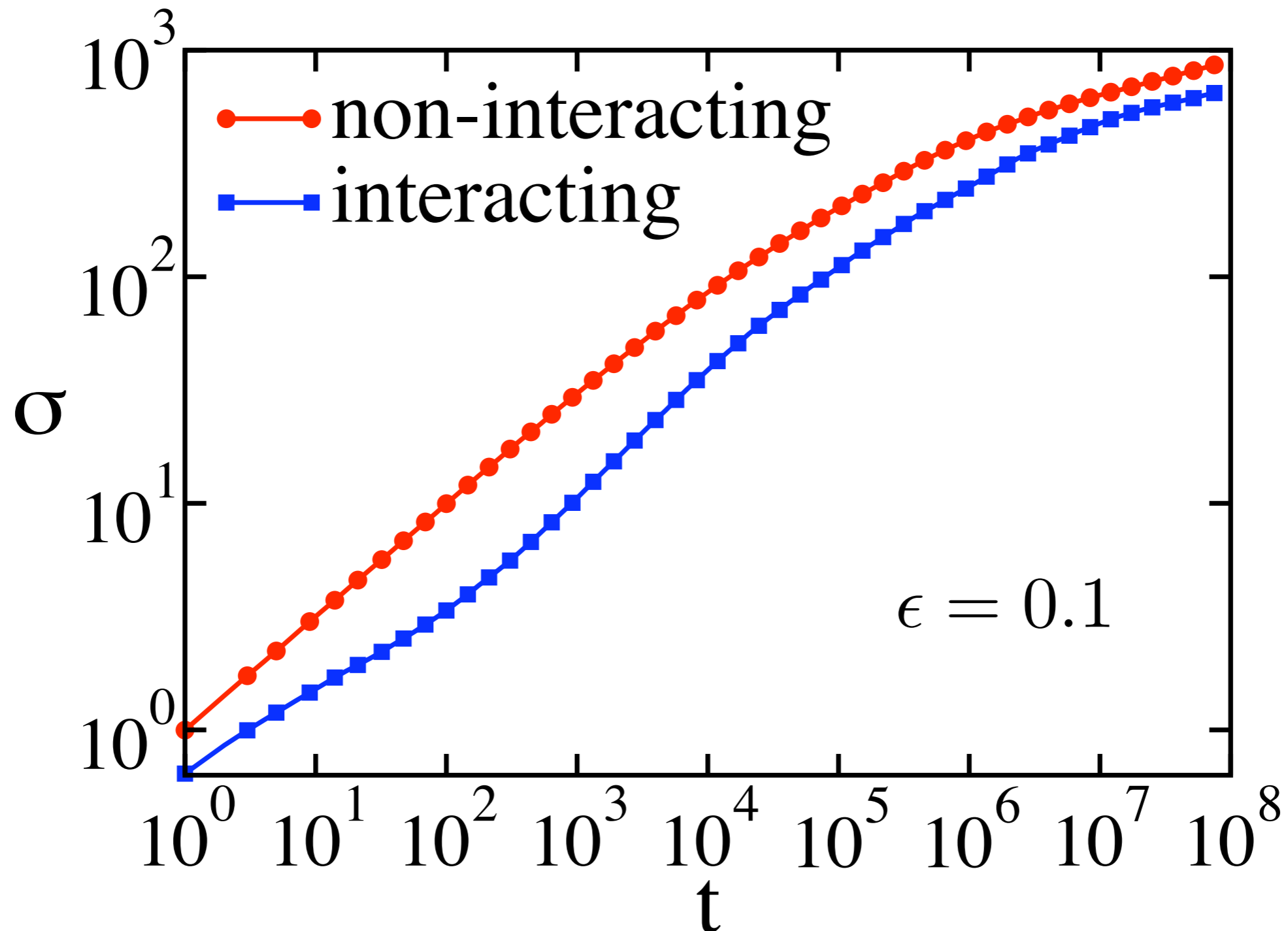
Qualitative and quantitative agreement  
with scaling theory

# Early and intermediate time behavior for two different weak disorders



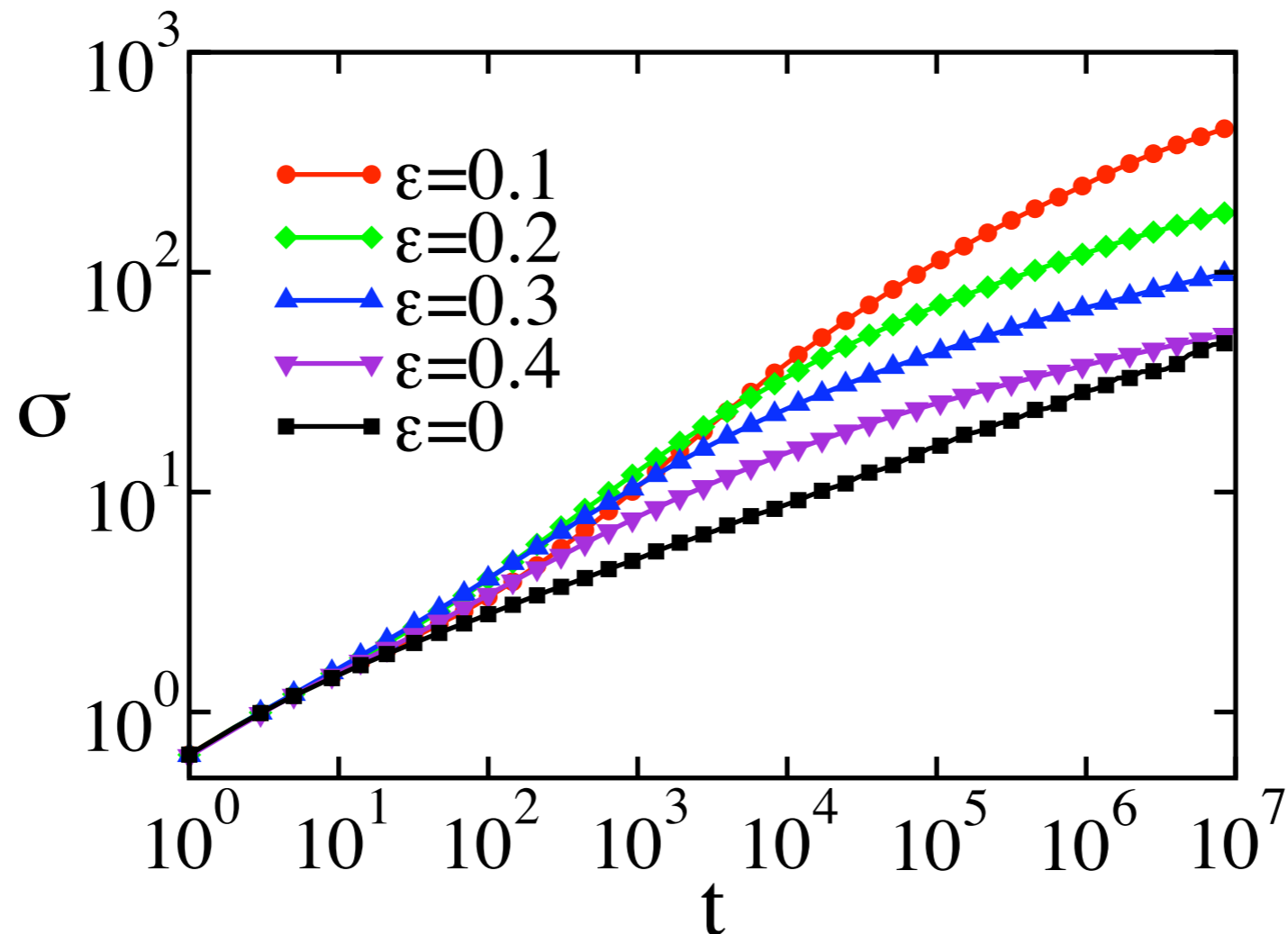
Universal scaling function for the displacement

# Late time behavior for a moderate disorder



Suggests that interaction becomes irrelevant

# Early and intermediate time behavior for moderate disorders



1. Mobility is enhanced at all disorder strengths
2. Displacement is not monotonic with disorder
3. Eventually, no-disorder catches up
4. But why is the crossover time so large?

# Giant crossover time

- Compare ultimate asymptotic behaviors with interaction

- Without disorder

$$\sigma \sim t^{1/4}$$

- With small disorder

$$\sigma \sim \epsilon^{-2} (\ln t)^2$$

- The crossover time is astronomical

$$t \sim \epsilon^{-8}$$

In practice, small disorder generates stronger transport in an interacting particle system

# Generalizations

- ✓ Different concentrations
- ✓ Disorder with variable strengths
- Synchronous dynamics = parallel updates

Qualitative behavior appears to be robust

# Summary

- Without interactions: disorder slows particles down
- With interactions: disorder speeds particles up, at least for a very long time
  - Early times: sub-diffusive displacements
  - Intermediate times: super-diffusive displacement
  - Late times: logarithmically slow displacement
- Intricate interplay between interaction and disorder

# Outlook

- Beyond scaling theory: a mathematical theory
- Distribution of displacements
- Different types of disorder
- Self-averaging?
- Experiments: colloids, granular biology, microfluids
- Disorder as a mechanism to control transport in matter



# Formally

- Particular state of the system

$$|\psi\rangle = |\cdots 001101001 \cdots\rangle$$

- Probabilistic description

$$|\phi(t)\rangle = \sum_{\psi} P(\psi, t) |\psi\rangle$$

- Time evolution

$$\partial_t |\phi\rangle = \mathcal{L} |\phi\rangle$$

- Evolution operator

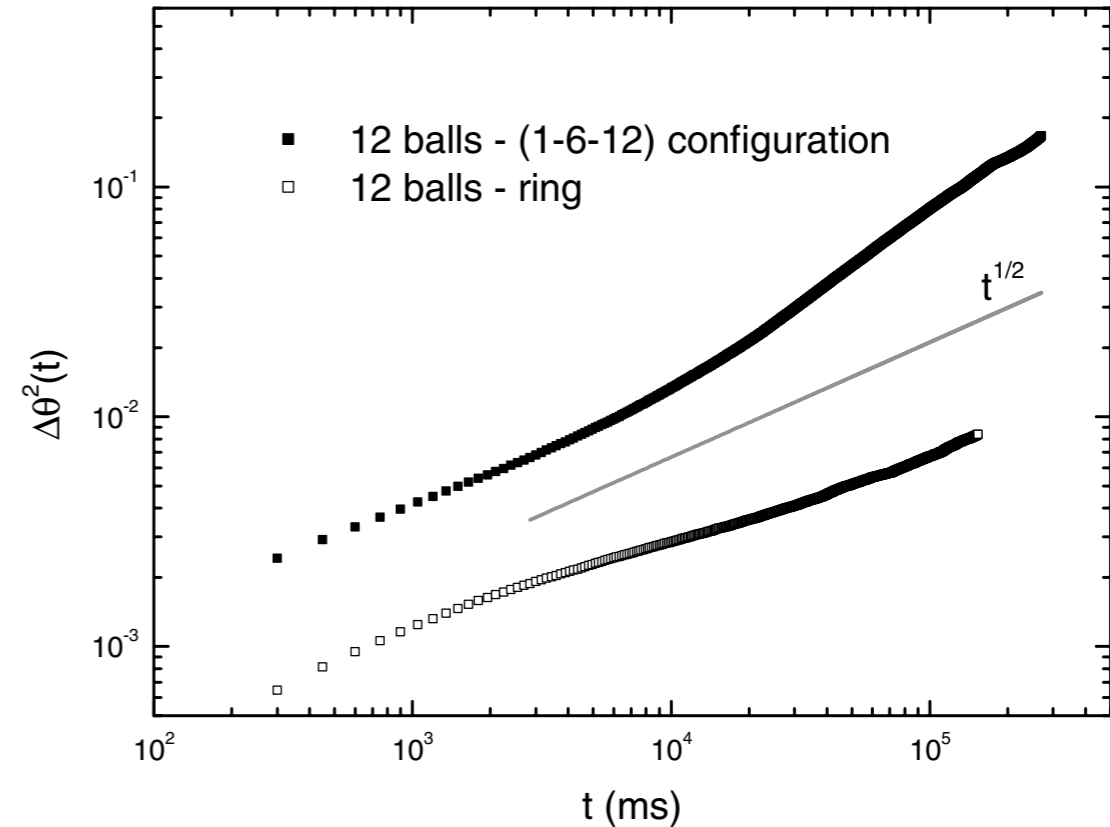
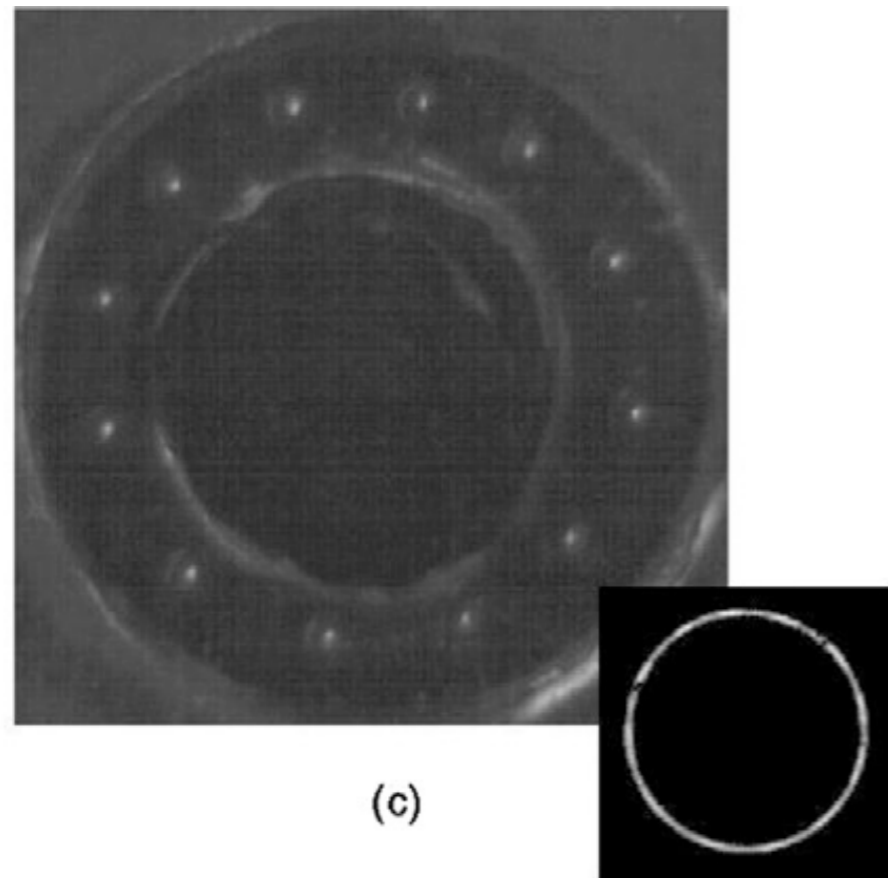
$$\mathcal{L} = \sum_i \left[ l_i a_{i-1}^\dagger a_i + r_i a_{i+1}^\dagger a_i \right]$$

$$\begin{aligned} a_i |1\rangle &= |0\rangle \\ a_i^\dagger |0\rangle &= |1\rangle \end{aligned}$$

- Formal solution

$$|\phi(t)\rangle = e^{\mathcal{L}t} |\phi(0)\rangle$$

# Experiments: enhanced diffusion



$$\sigma \sim t^\alpha \quad \alpha > 0.3$$

Modulated (irregular) quasi-1D colloidal channel

“The laws of physics:  
it’s what you can and can not do in an experiment”

Talia Ben-Naim, 6