

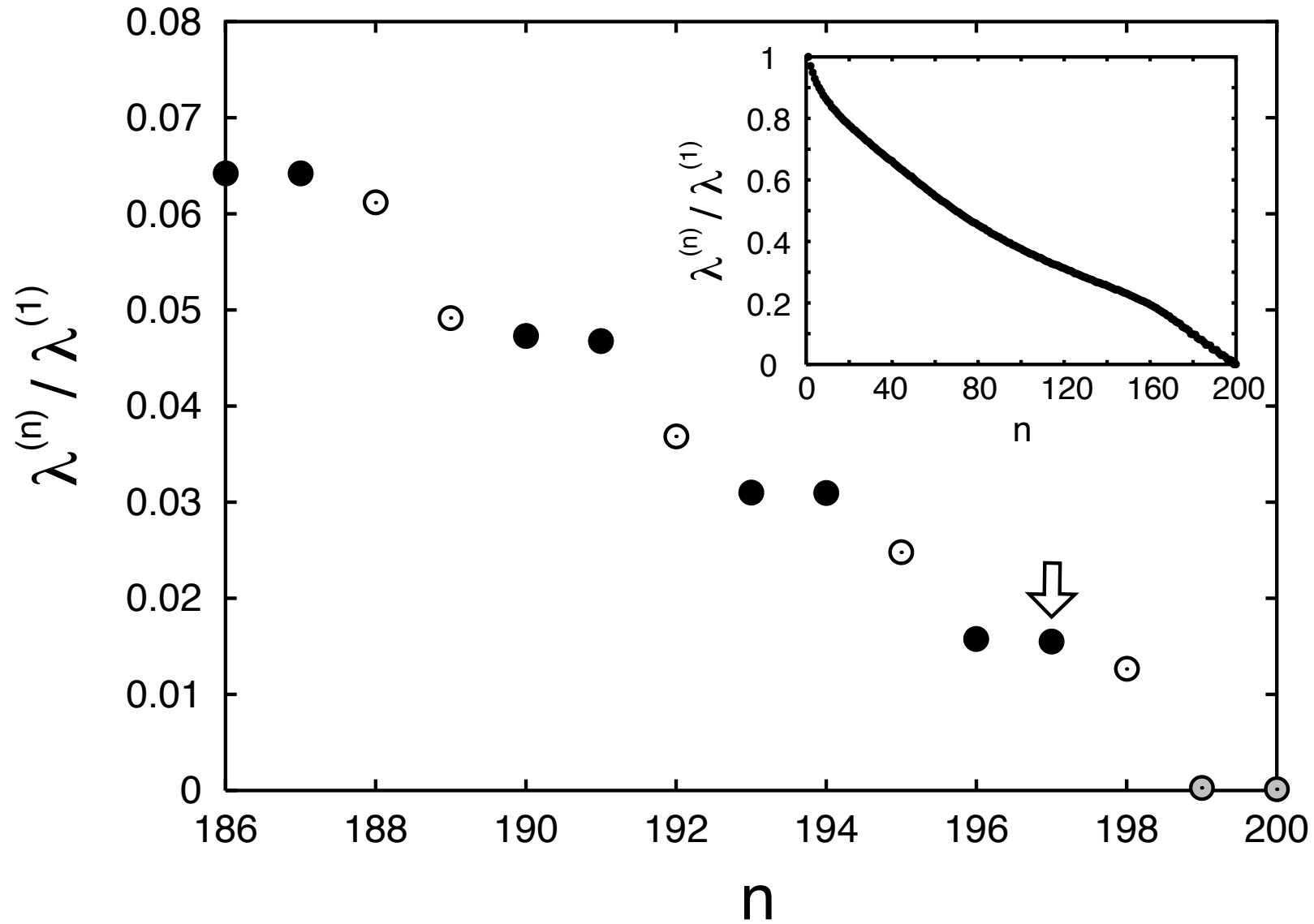
# Lyapunov Exponents Vectors and Modes

by

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# Lyapunov Spectrum



100 hard disks

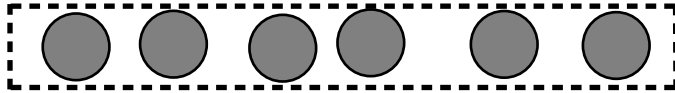
# Contents

- Quasi-one-dimensional system
- Lyapunov modes
- Time dependence
- Two-dimensional systems
- Lyapunov Localization
- Dynamics of the most localized Lyapunov vector

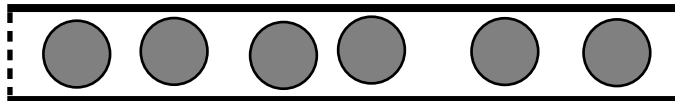
# Quasi-one-dimensional Systems

## Schematic boundary conditions

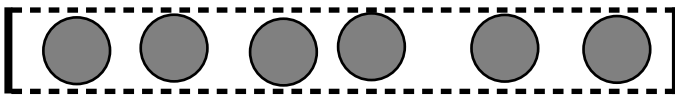
Boundary (P,P)



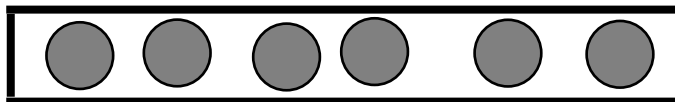
Boundary (P,H)



Boundary (H,P)



Boundary (H,H)



Particle order is invariant, so particle index corresponds to x-coordinate.

Four types of boundary conditions. We mostly use (H,P) boundary conditions.

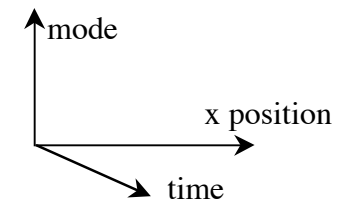
The number and pattern of steps changes with boundary conditions.

Modes observed in the long direction only - x-direction

Simplifies the presentation of modes

NOTATION:

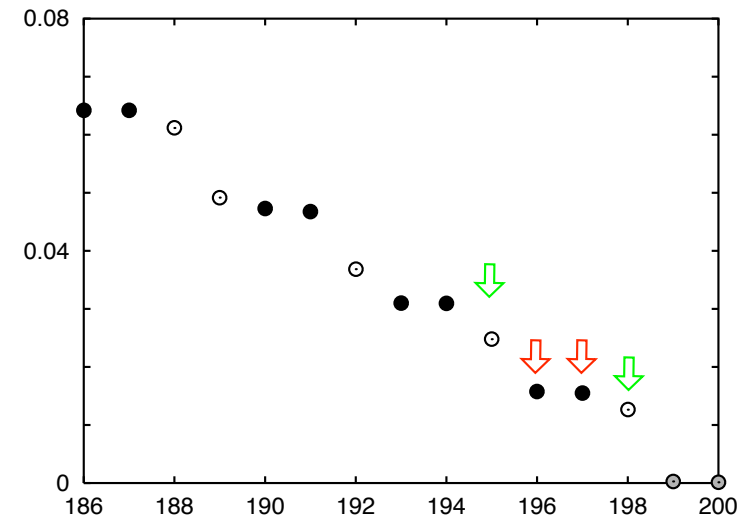
$$\left( \begin{array}{c} X \\ Y \end{array} , \begin{array}{c} X \\ Y \end{array} \right) \\ \{P,H\} \quad \{P,H\}$$



P = periodic

H = hard wall

# Numerical Results for Lyapunov exponents



- Quasi-one-dimensional system  $N=100$
- 200 coordinates + 200 momenta  $\rightarrow$  400 exponents
- (H,P)  $\rightarrow$  4 zero exponents #199, 200, 201, 202
- First 1-point step #198 #203
- First 2-point step #196, 197 #204, 205
- Second 1-point step #195 #206

# General Features

- Numerical calculations using Benettin's scheme
- Step structure in the Lyapunov exponents closest to zero (positive and negative)
- Here: 1-point step, then 2-point step (boundary conditions)
- Lyapunov vectors can exhibit stable delocalized structure - called Lyapunov modes

# Symplectic structure

Symplectic eigenvalue theorem - pairing of Lyapunov exponents

$$\{\lambda_j, -\lambda_j\}$$

Conjugacy of Lyapunov vectors

$$\lambda_j \Leftrightarrow \delta\Gamma_j = \begin{pmatrix} \delta q_j \\ \delta p_j \end{pmatrix} \qquad \lambda_{-j} \Leftrightarrow \delta\Gamma_{-j} = \begin{pmatrix} \delta q_{-j} \\ \delta p_{-j} \end{pmatrix}$$

$$\lambda_{-j} = -\lambda_j \Leftrightarrow \delta\Gamma_{-j} = \begin{pmatrix} \delta q_{-j} \\ \delta p_{-j} \end{pmatrix} = \begin{pmatrix} \delta p_j \\ -\delta q_j \end{pmatrix}$$

Benettin's scheme preserves this structure

# Conserved Quantities

For each conserved quantity of the dynamics there is a zero Lyapunov exponent.  
For (P,P):

Centre of mass

$$\bar{x} = \frac{1}{N} \sum_{i=1}^N x_i \quad \bar{y} = \frac{1}{N} \sum_{i=1}^N y_i$$

Total momentum

$$\bar{p}_x = \frac{1}{N} \sum_{i=1}^N p_{xi} \quad \bar{p}_y = \frac{1}{N} \sum_{i=1}^N p_{yi}$$

Energy

$$\frac{1}{2} \sum_{i=1}^N p_{xi}^2 + p_{yi}^2 = N\bar{e} = NT$$

There can be no exponential separation in the direction of the trajectory.

Time translational invariance  $\bar{t}$

Conjugacy  $\{\bar{x}, \bar{p}_x\}$   $\{\bar{y}, \bar{p}_y\}$   $\{\bar{e}, \bar{t}\}$



# Lyapunov Modes for Zero exponents

Lyapunov Vector notation

$$\delta\Gamma = \begin{pmatrix} \delta\mathbf{q} \\ \delta\mathbf{p} \end{pmatrix} = \begin{pmatrix} \delta x \\ \delta y \\ \delta p_x \\ \delta p_y \end{pmatrix}$$

Noether's theorem transformations corresponding to conserved quantities

$$\delta\Gamma_x = \frac{1}{\sqrt{N}} \begin{pmatrix} 1 \\ 0 \\ 0 \\ 0 \end{pmatrix} \quad \delta\Gamma_y = \frac{1}{\sqrt{N}} \begin{pmatrix} 0 \\ 1 \\ 0 \\ 0 \end{pmatrix} \quad \delta\Gamma_t = \frac{1}{\sqrt{2Ne}} \begin{pmatrix} p_x \\ p_y \\ 0 \\ 0 \end{pmatrix}$$

$$\delta\Gamma_{p_x} = \frac{1}{\sqrt{N}} \begin{pmatrix} 0 \\ 0 \\ 1 \\ 0 \end{pmatrix} \quad \delta\Gamma_{p_y} = \frac{1}{\sqrt{N}} \begin{pmatrix} 0 \\ 0 \\ 0 \\ 1 \end{pmatrix} \quad \delta\Gamma_e = \frac{1}{\sqrt{2Ne}} \begin{pmatrix} 0 \\ 0 \\ p_x \\ p_y \end{pmatrix}$$

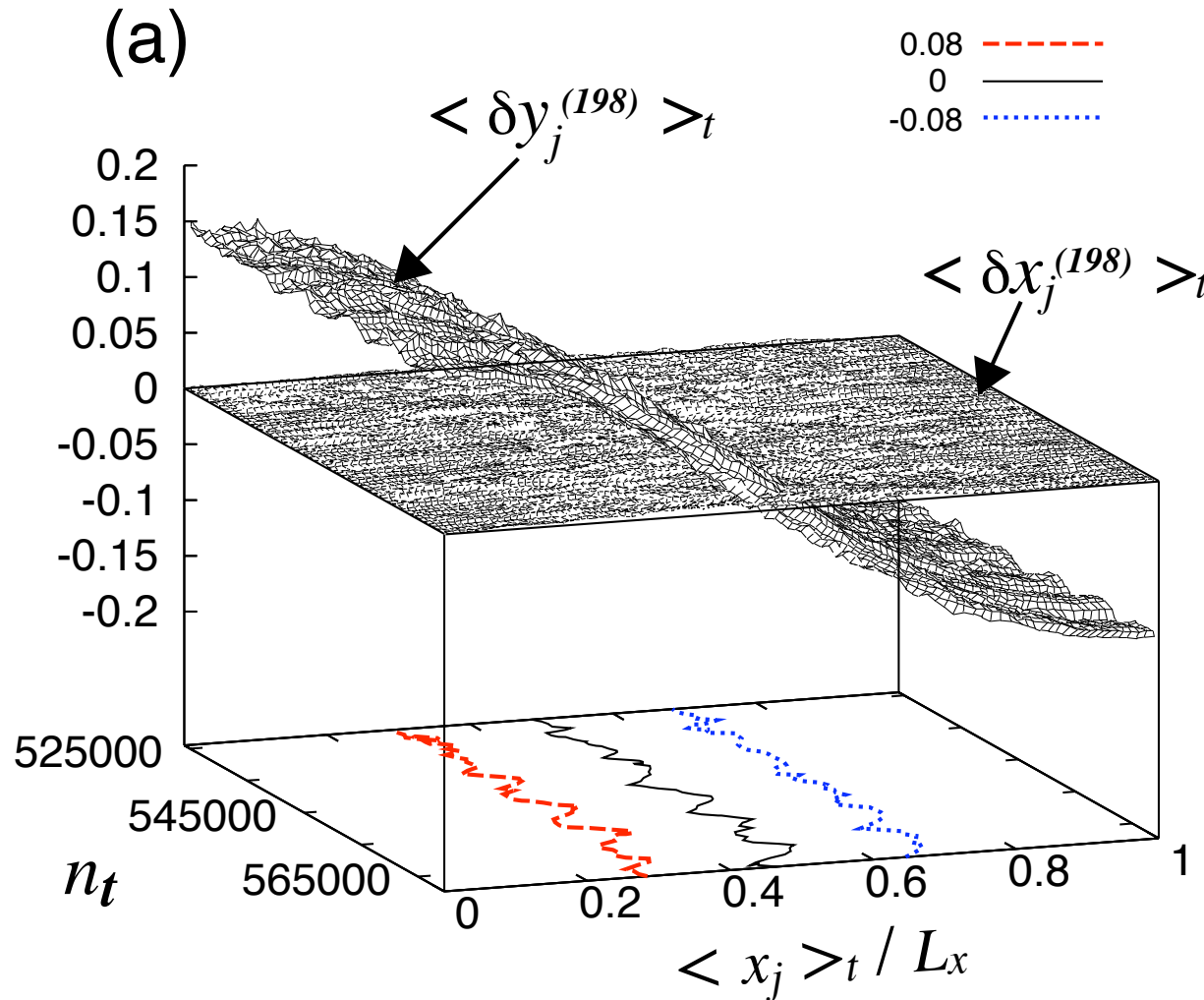
Evidence that these form two independent sub-spaces

$$\{\delta\Gamma_x, \delta\Gamma_y, \delta\Gamma_t\} \quad \{\delta\Gamma_{p_x}, \delta\Gamma_{p_y}, \delta\Gamma_e\}$$

# Lyapunov Modes

# Lyapunov modes

## First 1-point step



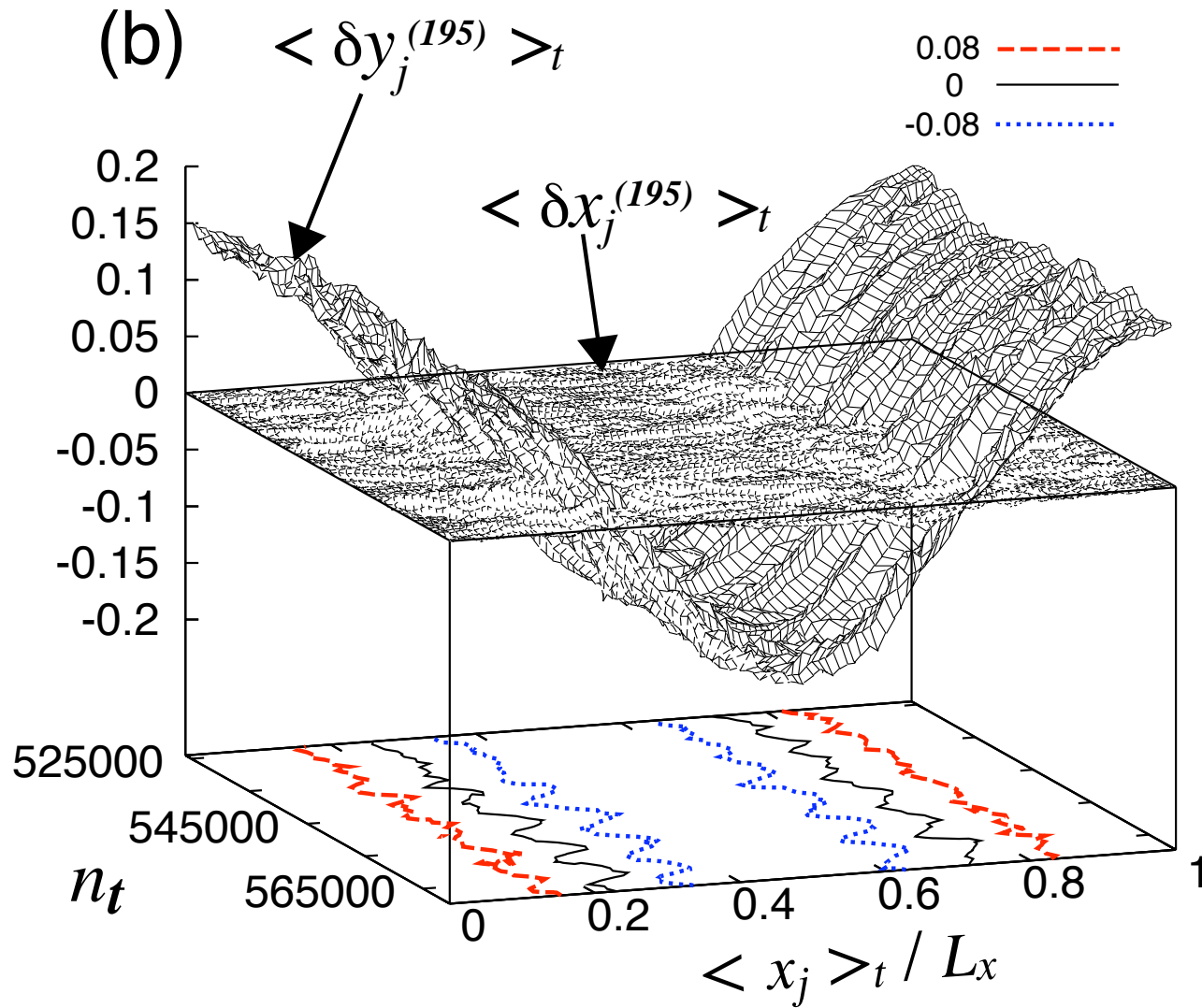
T mode

$$\delta x_j \sim 0 \quad \text{and} \quad \delta y_j \sim \cos\left(\frac{\pi \langle x_j \rangle}{L_x}\right)$$



# Lyapunov modes

## Second 1-point step



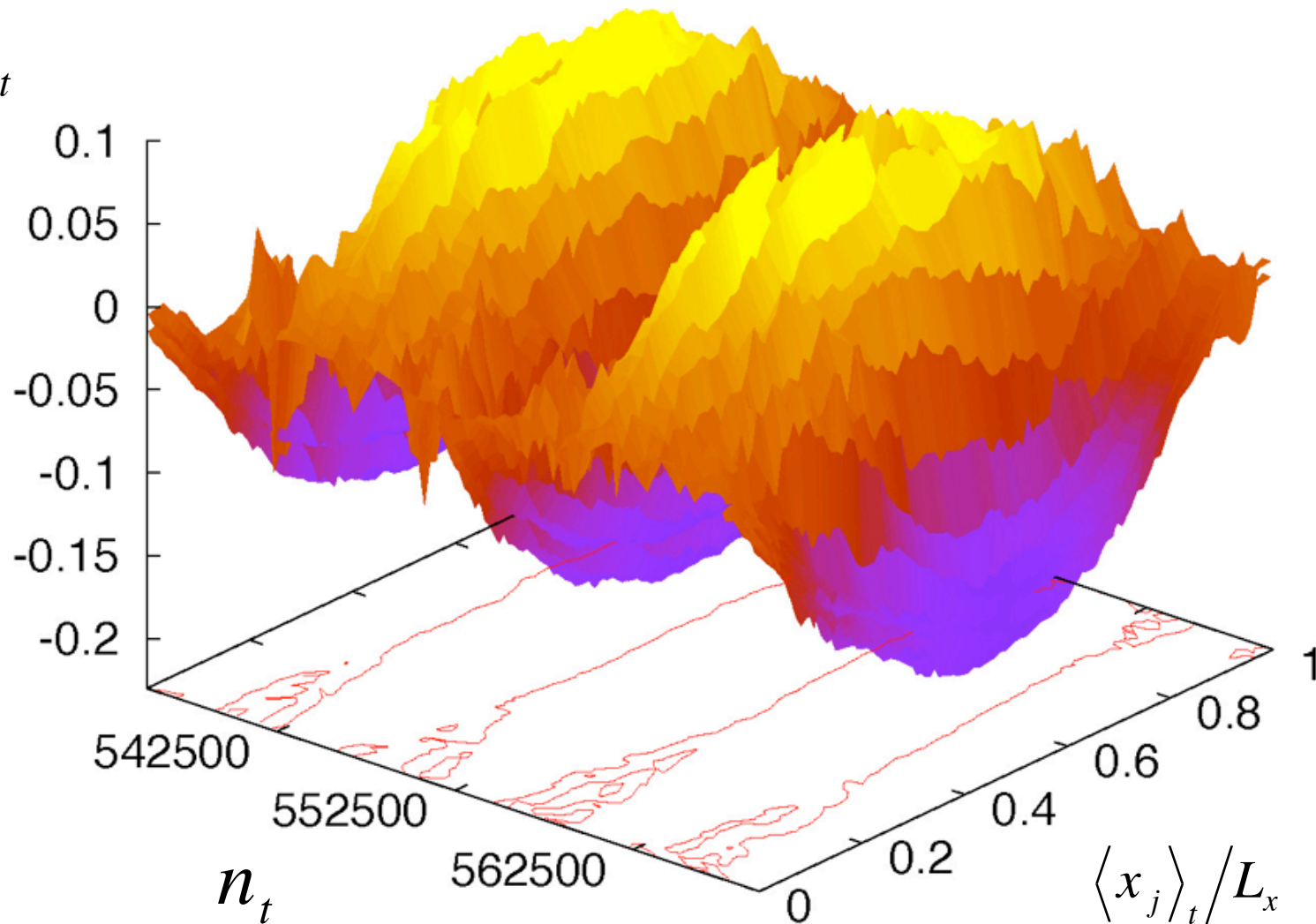
T mode

$$\delta x_j \sim 0 \quad \text{and} \quad \delta y_j \sim \cos\left(\frac{2\pi \langle x_j \rangle}{L_x}\right)$$

Lyapunov modes

First 2-point step

$$\langle \delta x_j^{(197)} \rangle_t$$

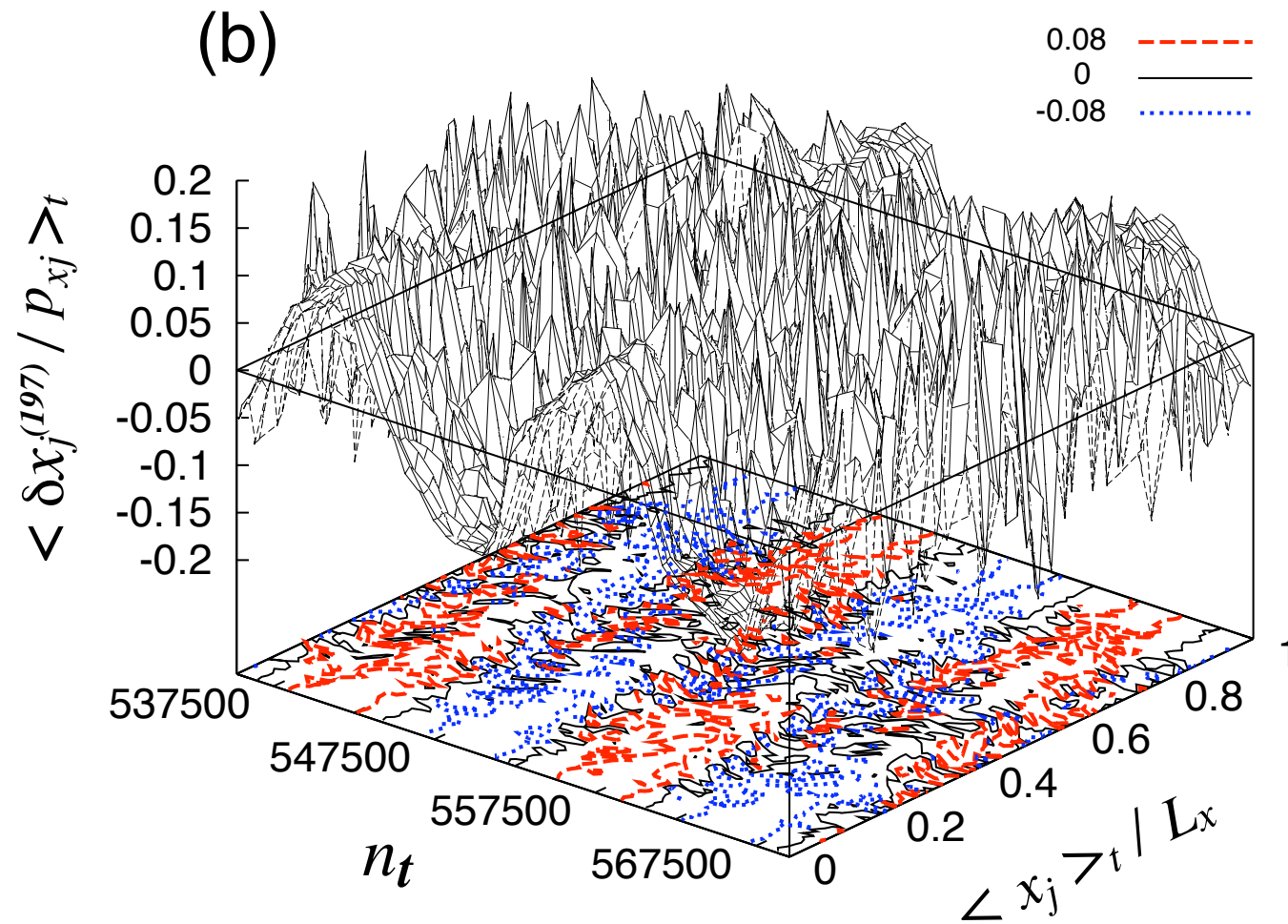


L mode

$$\delta x_j \sim \sin(k_1 x_j) \cos(\omega t)$$

# Lyapunov modes

## First 2-point step



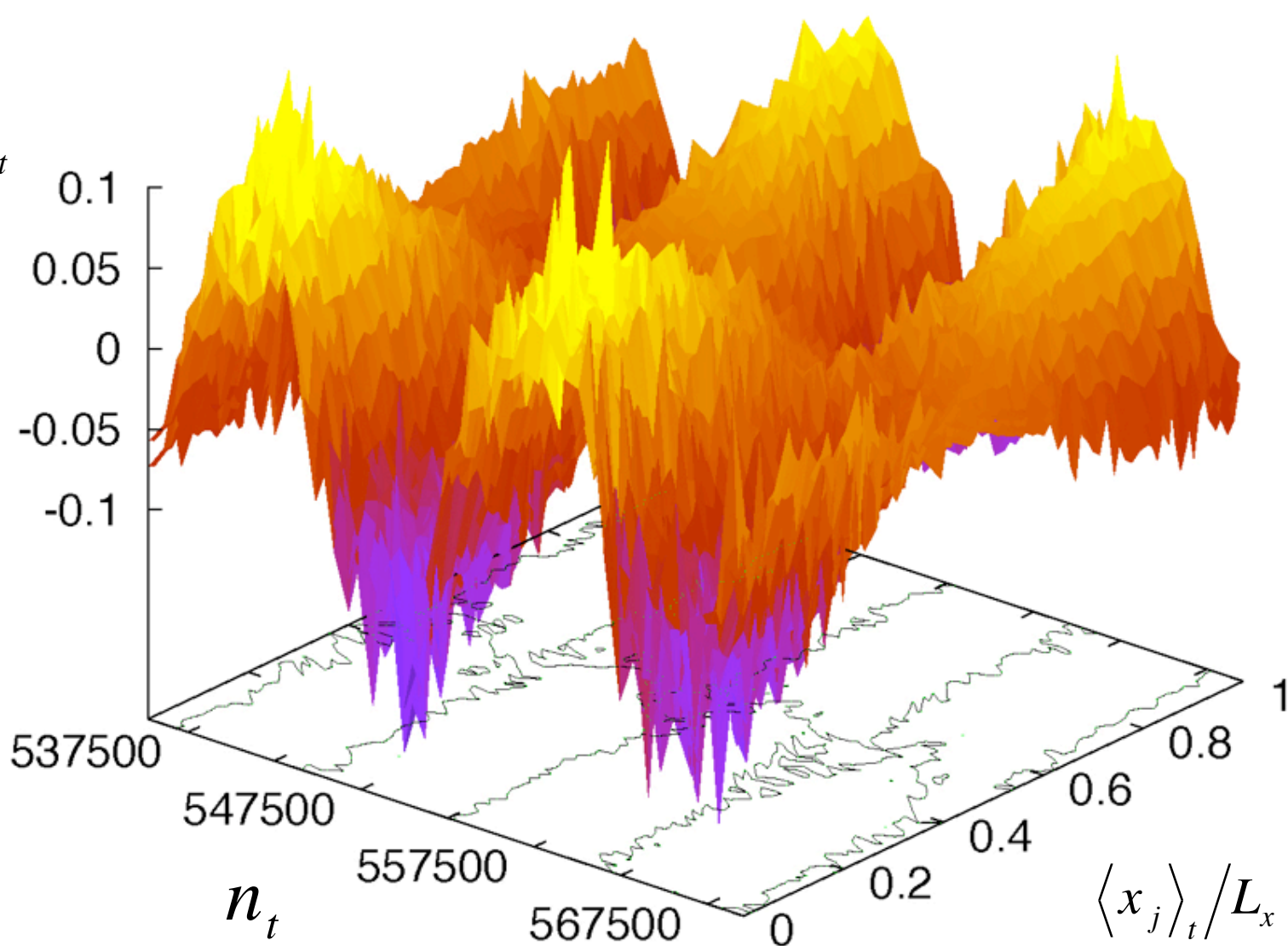
**P mode**

$$\delta x_j \sim p_{xj} \cos(k_1 x_j) \sin(\omega t)$$

# Lyapunov modes

## First 2-point step

$$\left\langle \frac{\delta y_j^{(197)}}{p_{yj}} \right\rangle_t$$

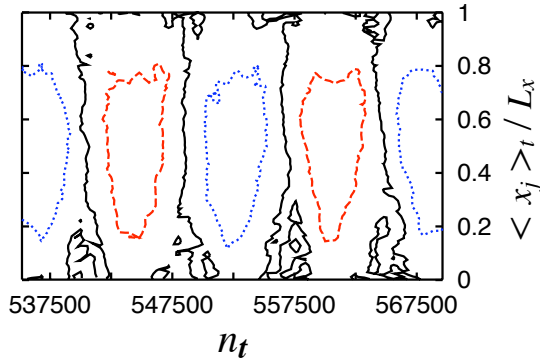
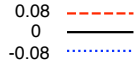


**P mode**

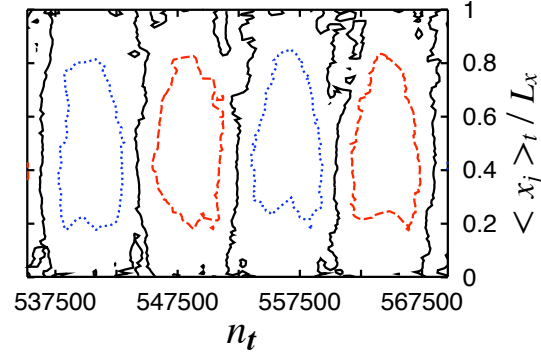
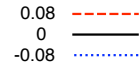
$$\delta y_j \sim p_{yj} \cos(k_1 x_j) \sin(\omega t)$$

# Coordinate

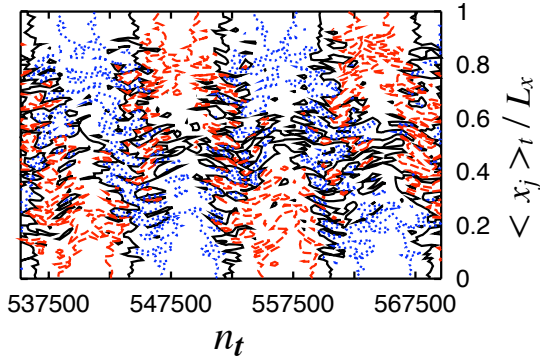
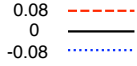
i)  $\langle \delta x_j^{(197)} \rangle_t$



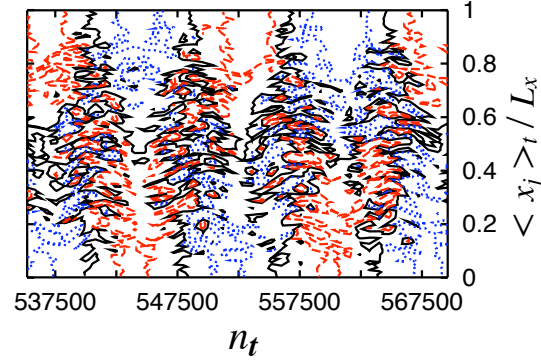
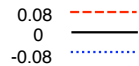
(b)  $\langle \delta x_j^{(196)} \rangle_t$



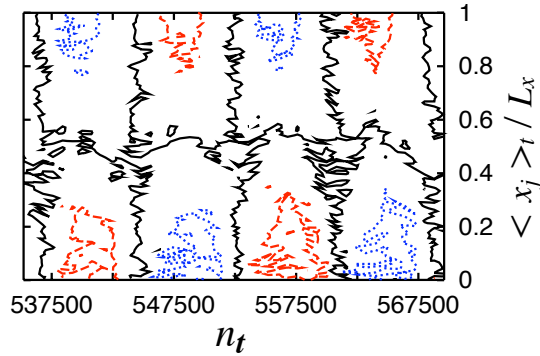
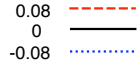
;)  $\langle \delta x_j^{(197)} / p_{xj} \rangle_t$



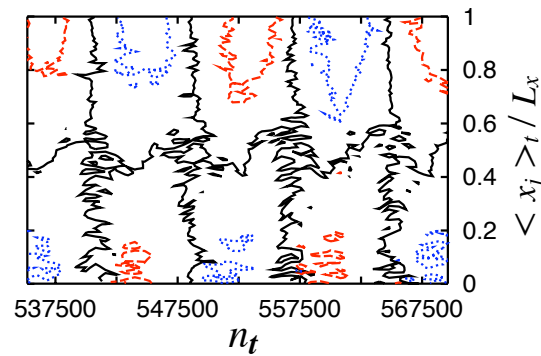
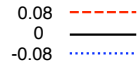
(d)  $\langle \delta x_j^{(196)} / p_{xj} \rangle_t$



;)  $\langle \delta y_j^{(197)} / p_{yj} \rangle_t$

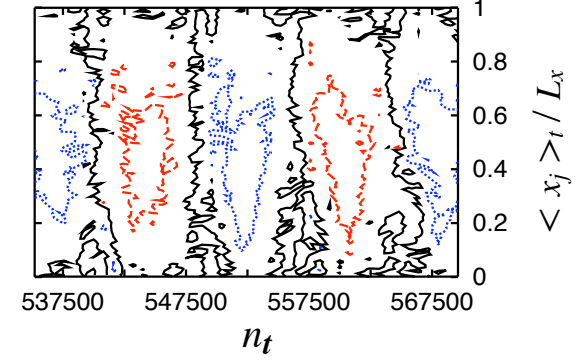
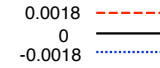


(f)  $\langle \delta y_j^{(196)} / p_{yj} \rangle_t$

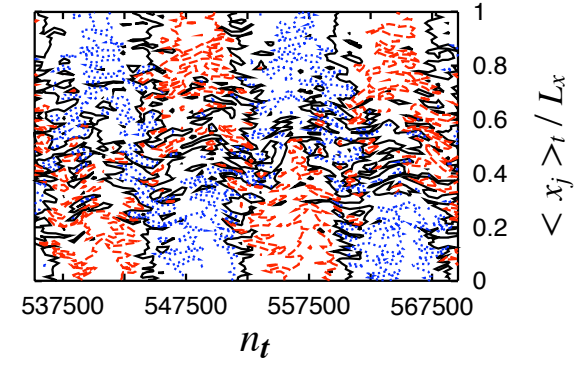
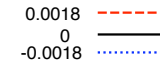


# Momentum

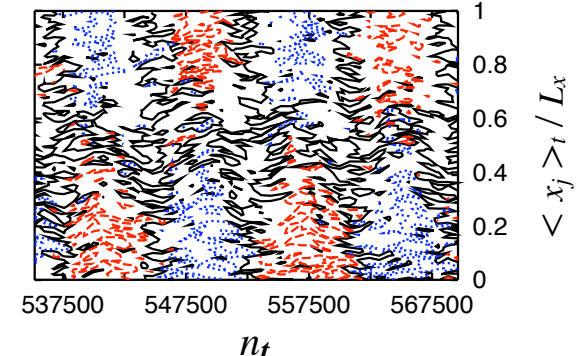
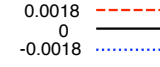
(a)  $\langle \delta p_{xj}^{(197)} \rangle_t$



(b)  $\langle \delta p_{xj}^{(197)} / p_{xj} \rangle_t$



(c)  $\langle \delta p_{yj}^{(197)} / p_{yj} \rangle_t$



197

196

197



# Summary of Modes

For Quasi-one-dimensional system with (H,P)  
the principle contribution to the mode

1-point steps - transverse modes

n=0

$$\delta\Gamma_y = \frac{1}{\sqrt{N}} \begin{pmatrix} 0 \\ 1 \\ 0 \\ 0 \end{pmatrix}$$

n≠0

$$\delta\Gamma_{198} = \begin{pmatrix} 0 \\ \beta \cos kx_j \\ 0 \\ \beta' \cos kx_j \end{pmatrix}$$

$k_n$  - boundary condition dependent

coordinate and momentum components same functional form

$\beta$  and  $\beta'$  depend upon density

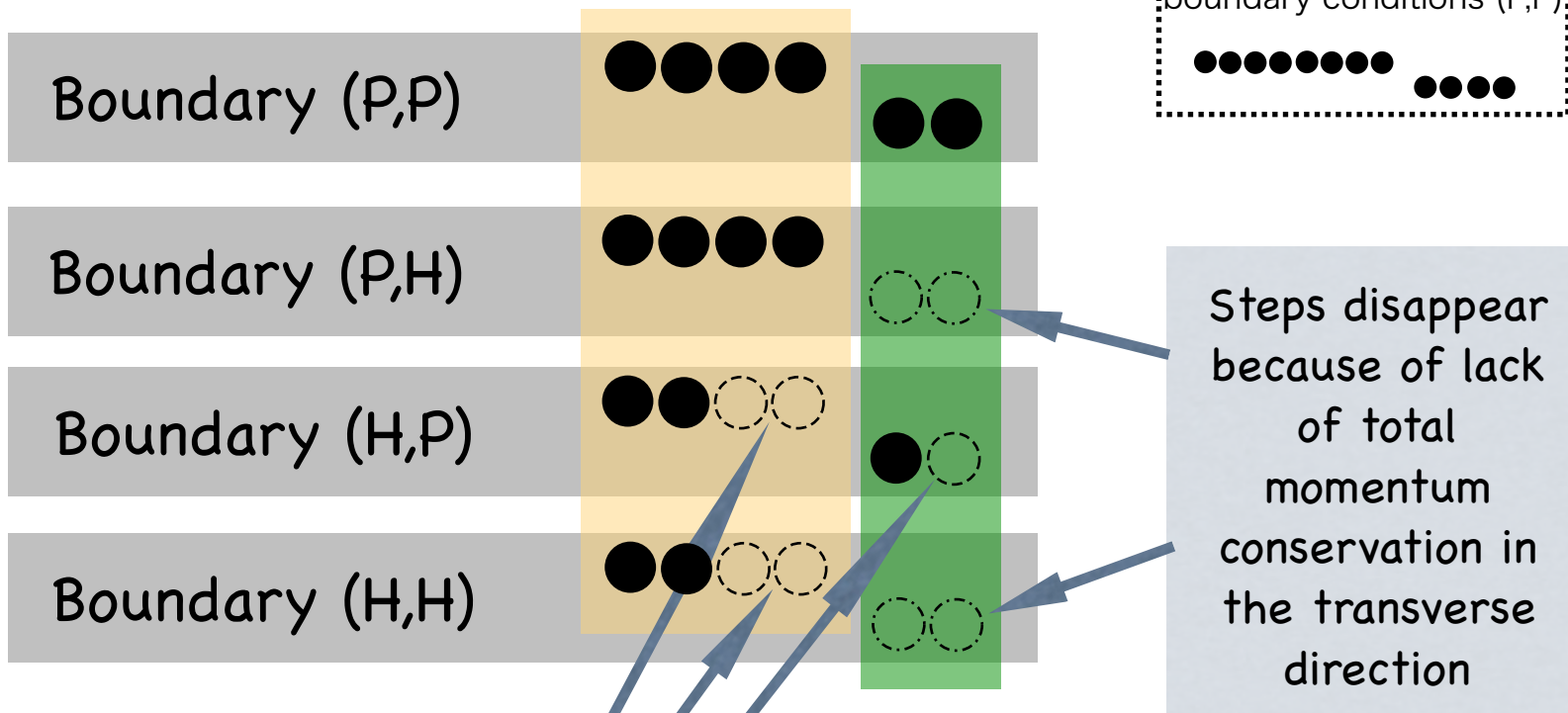
## 2-point steps - longitudinal modes

$$\delta\Gamma_{197} = -\cos\omega t \begin{pmatrix} \alpha \sin kx_j \\ 0 \\ \alpha' \sin kx_j \\ 0 \end{pmatrix} + \sin\omega t \begin{pmatrix} \beta p_{xj} \cos kx_j \\ \beta p_{yj} \cos kx_j \\ \beta' p_{xj} \cos kx_j \\ \beta' p_{yj} \cos kx_j \end{pmatrix}$$

$$\delta\Gamma_{196} = -\sin\omega t \begin{pmatrix} \alpha \sin kx_j \\ 0 \\ \alpha' \sin kx_j \\ 0 \end{pmatrix} + \cos\omega t \begin{pmatrix} \beta p_{xj} \cos kx_j \\ \beta p_{yj} \cos kx_j \\ \beta' p_{xj} \cos kx_j \\ \beta' p_{yj} \cos kx_j \end{pmatrix}$$

# Comparison of Boundary Conditions

Time-dependent longitudinal mode



Lyapunov steps for a square system with boundary conditions (P,P)

Steps disappear because of lack of total momentum conservation in the transverse direction

Half of steps disappear because of the reflection symmetry at hard-wall boundary conditions

Stationary transverse mode

# Time Dependence

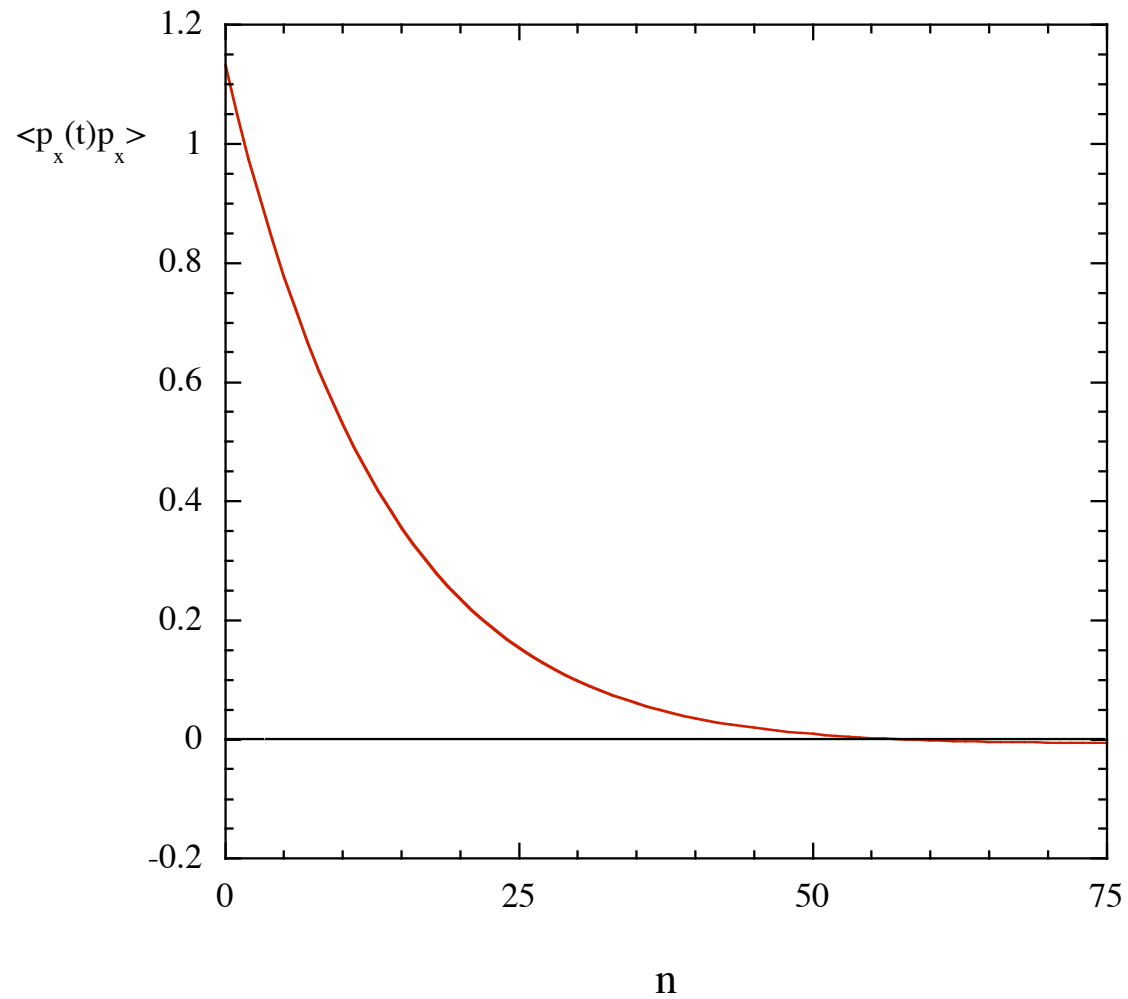
# Time Correlation Functions

- Experimentally measurable quantities
- Time dependent properties
- Integrals give transport coefficients
- Connections with linear response theory

# Velocity autocorrelation function

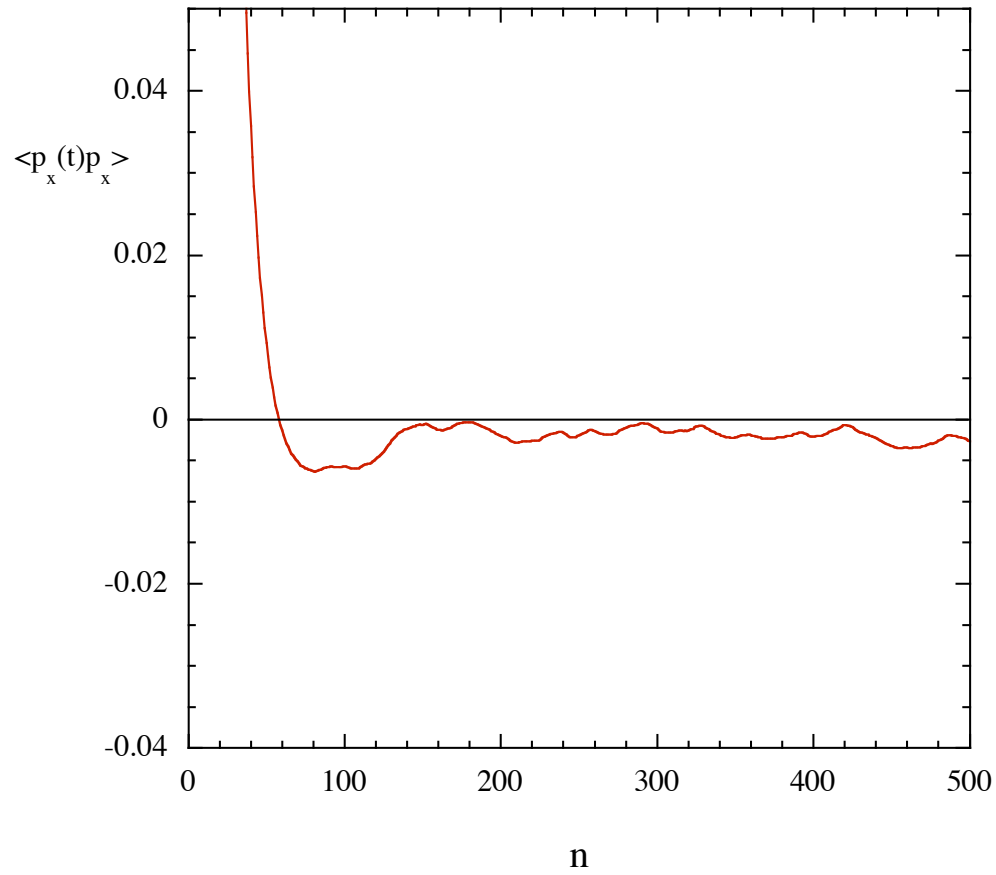
$$\langle p_x(t)p_x(0) \rangle$$

Initial exponential-like decay

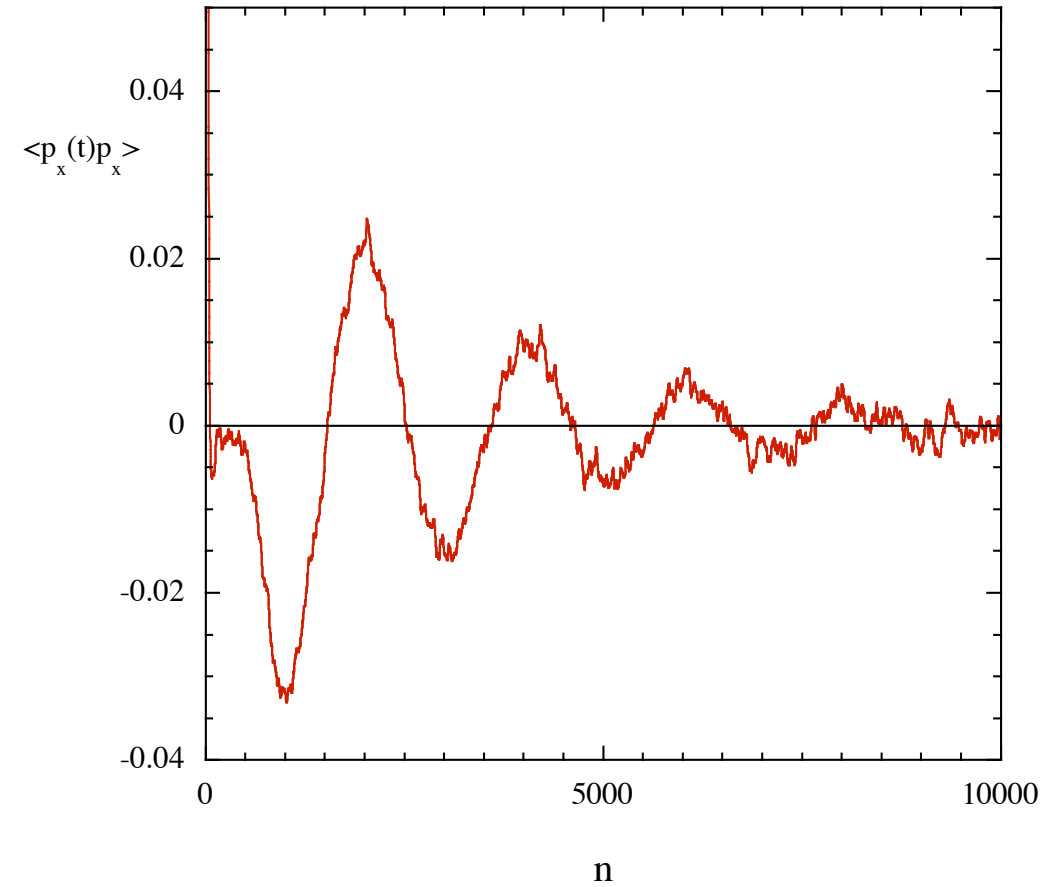




At longer time  
random behaviour



At very long time



# Periods for different Boundary Conditions

	$\tau$	$T_{lyap} \tau$	$T_{acf} \tau$
(P,P)	0.0369	77.0	37.4
(P,H)	0.0371	91.5	45.9
(H,P)	0.0380	154.5	77.4
(H,H)	0.0383	194.5	96.8



# Numerical Results

- Momentum autocorrelation function has oscillatory behaviour at long time

$$\langle p_{x_j}(t)p_{x_j}(0) \rangle \sim \sin \omega t \quad (1)$$

- Lyapunov mode for the 2-points steps is oscillatory

$$\delta x_j \sim p_{x_j} \cos(k_n x_j) \sin \omega_L t$$

- which implies

$$\langle \delta x_j(t) \delta x_j \rangle \sim \sin \omega_L t \quad (2)$$

But:

$$\begin{aligned}\langle \delta x_j(t) \delta x_j \rangle &\sim \langle p_{x_j}(t) p_{x_j} \cos(k_n x_j) \cos(k_n x_j) \rangle \cos \omega_L t \\ &\sim \langle p_{x_j}(t) p_{x_j} \rangle \cos \omega_L t \\ &\sim \sin \omega t \cos \omega_L t \\ &\sim \sin(\omega - \omega_L) t\end{aligned}\quad (3)$$

comparing (2) & (3)

$$\sin \omega_L t \sim \sin(\omega_L - \omega) t$$

Equating arguments

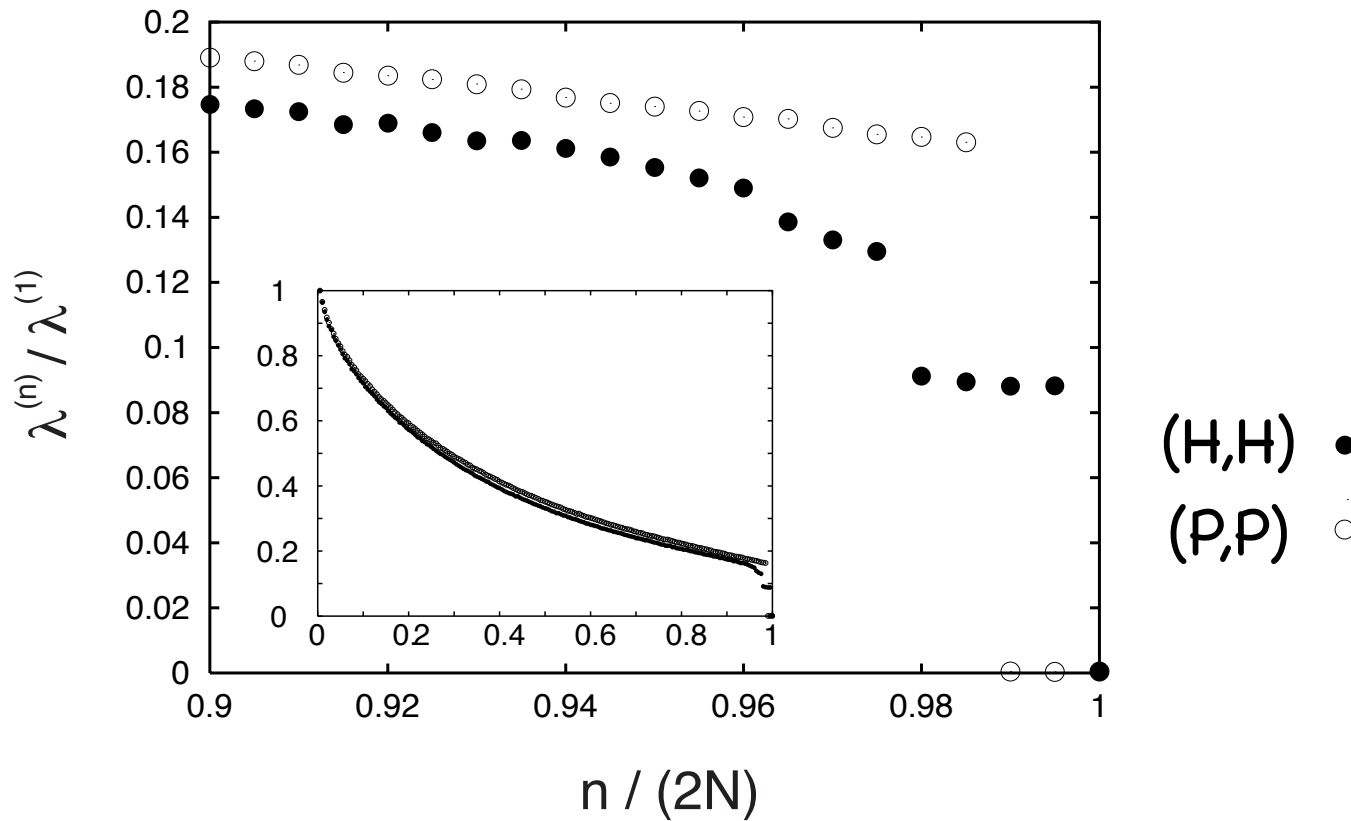
$$\omega_L = \omega - \omega_L$$



$$\omega_L = \frac{1}{2} \omega$$

# Two-dimensional Systems

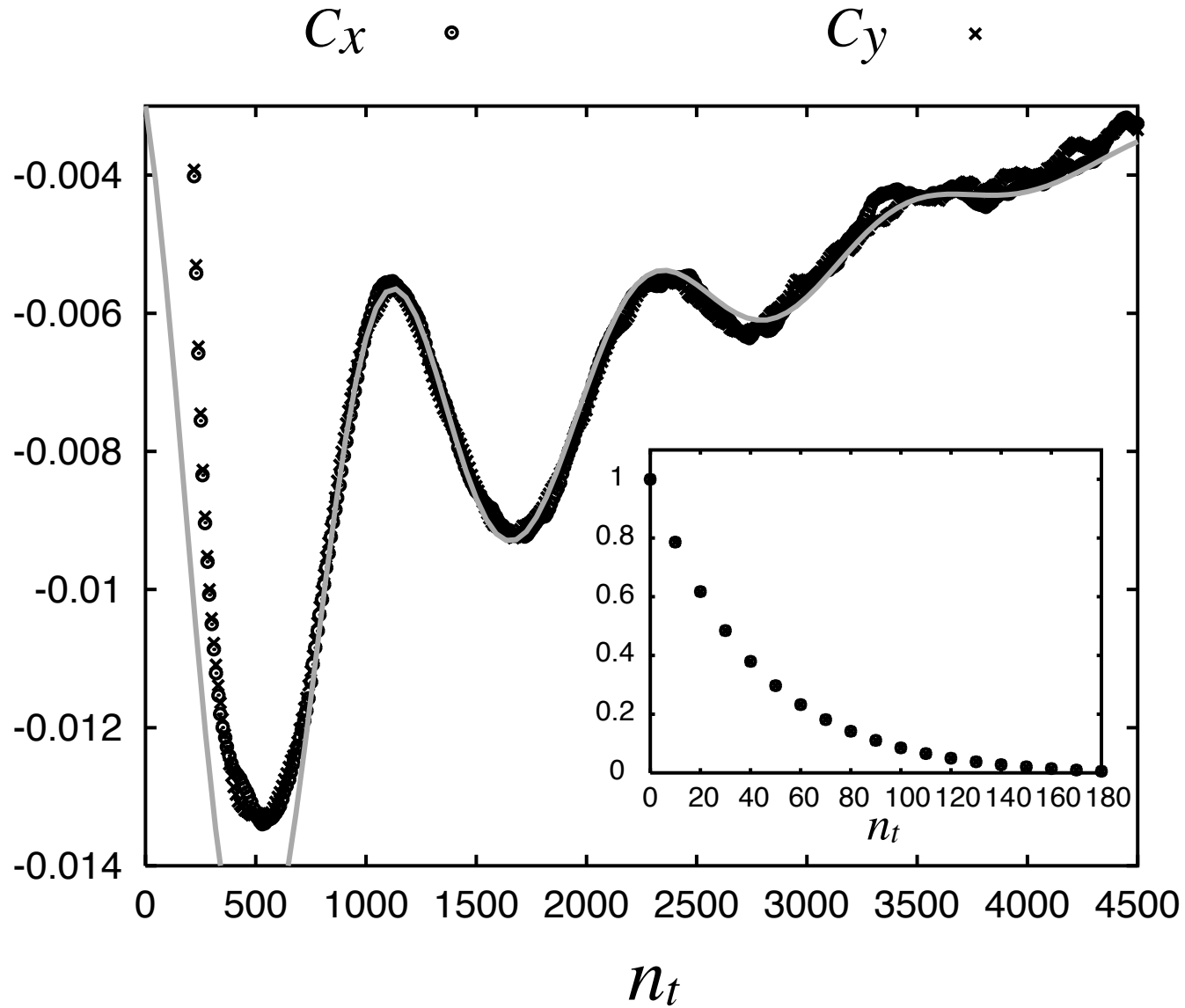
# Lyapunov Spectrum in Two-dimensions



Two-dimensional square  $N=100$

(H,H) has 4-point step, (P,P) has no steps

# Momentum Autocorrelation Function

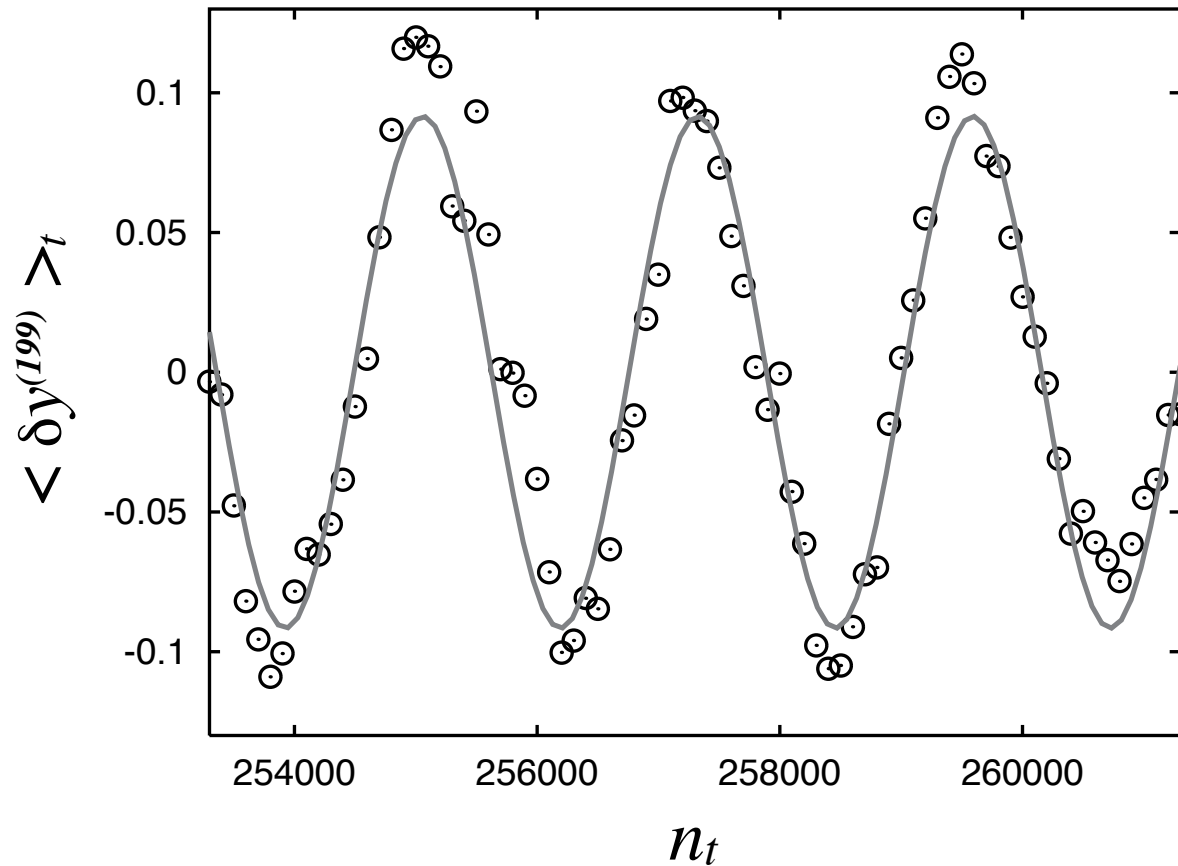


$T_{\text{tcf}}=1189$

Two-dimensional square  $N=100$

# Time Dependence of Lyapunov Mode

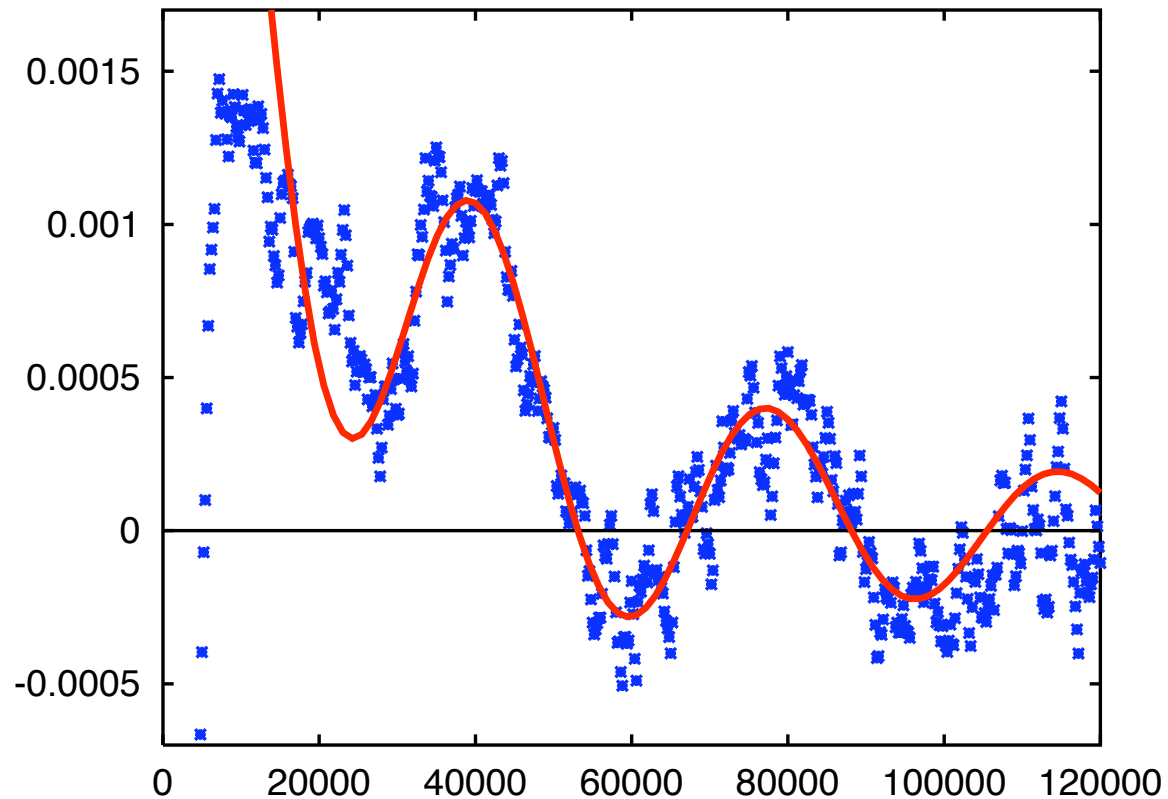
Two-dimensional square  $N=100$



$T_{\text{lyap}}=2267$

$T_{\text{tcf}}=1189$

# Fully Two-Dimensional System



$N=780$

$(H,H)$

$L_y/L_x=0.867$

$N/(L_x L_y)=0.8$

$T_{acf}=37120=T_{lyap}/2$

$T_{lyap}=74031$  (Eckmann et. al.)



# Lyapunov Localization



# Localization

Contribution to n th Lyapunov vector from j th particle

$$\left| \delta \Gamma_j^{(n)}(t) \right|^2 = \left( \delta x_j^{(n)} \right)^2 + \left( \delta y_j^{(n)} \right)^2 + \left( \delta p_{xj}^{(n)} \right)^2 + \left( \delta p_{yj}^{(n)} \right)^2$$

Normalized contribution

$$\gamma_j^{(n)}(t) = \frac{\left| \delta \Gamma_j^{(n)}(t) \right|^2}{\sum_{k=1}^N \left| \delta \Gamma_k^{(n)}(t) \right|^2} \quad 0 \leq \gamma_n^{(j)}(t) \leq 1$$

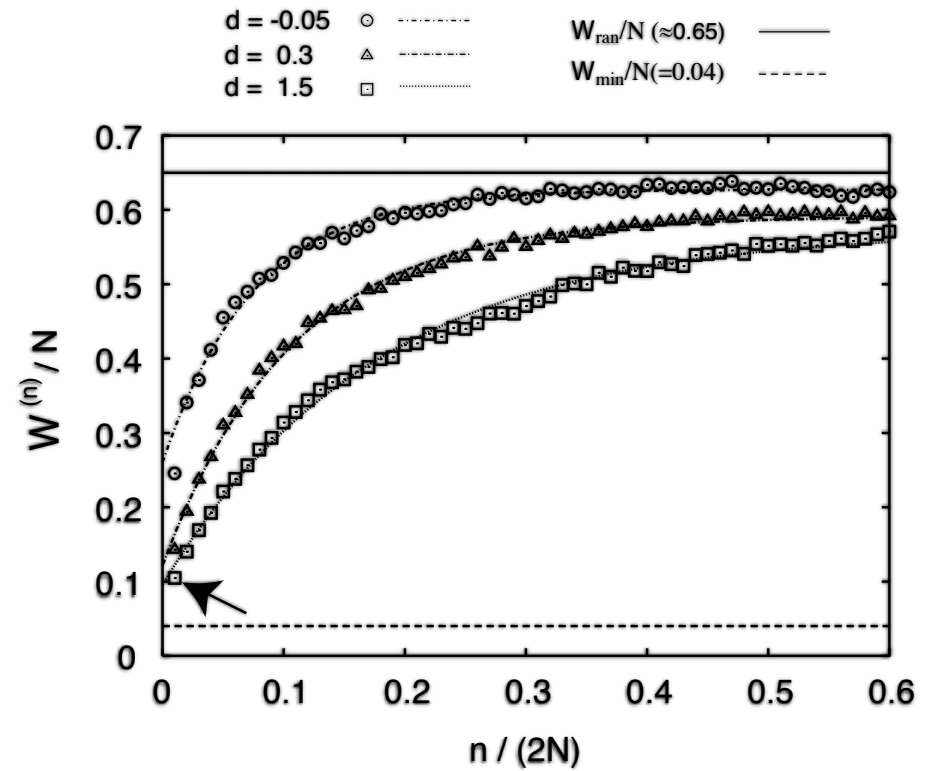
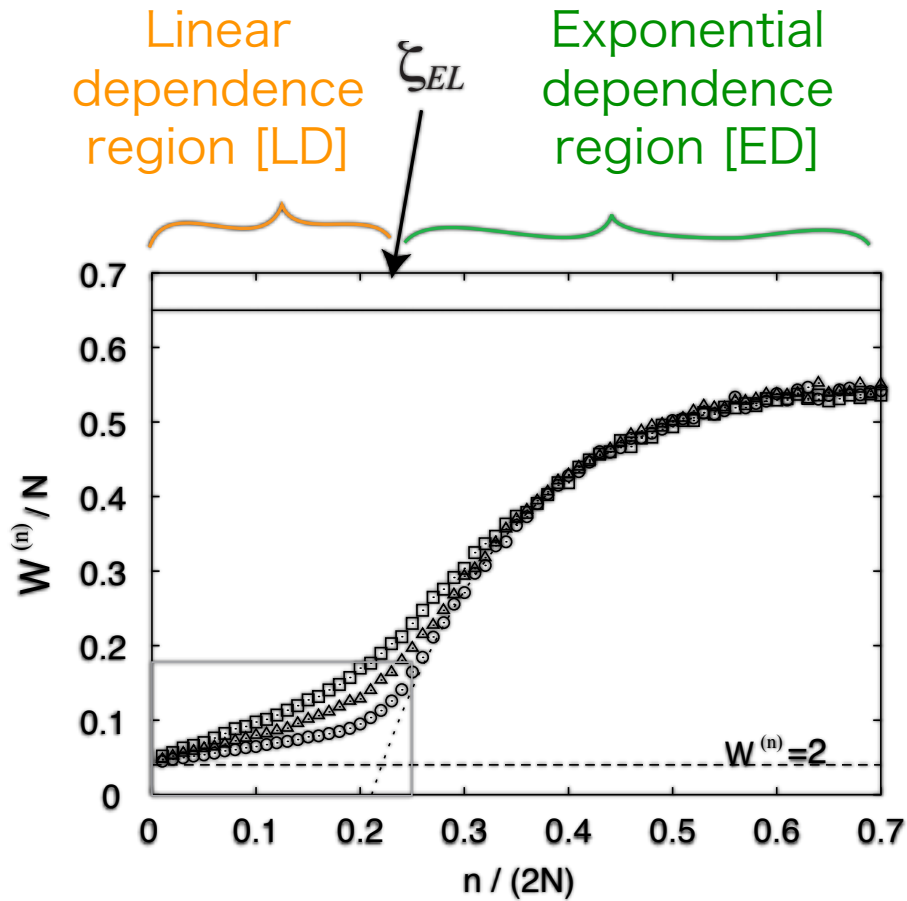
Localization 'width'

$$\frac{\mathcal{W}^{(n)}}{N} = \frac{1}{N} \exp \left( - \sum_{j=1}^N \left\langle \gamma_j^{(n)}(t) \ln \gamma_j^{(n)}(t) \right\rangle \right) \quad \frac{1}{N} \leq \frac{\mathcal{W}^{(n)}}{N} \leq 1$$

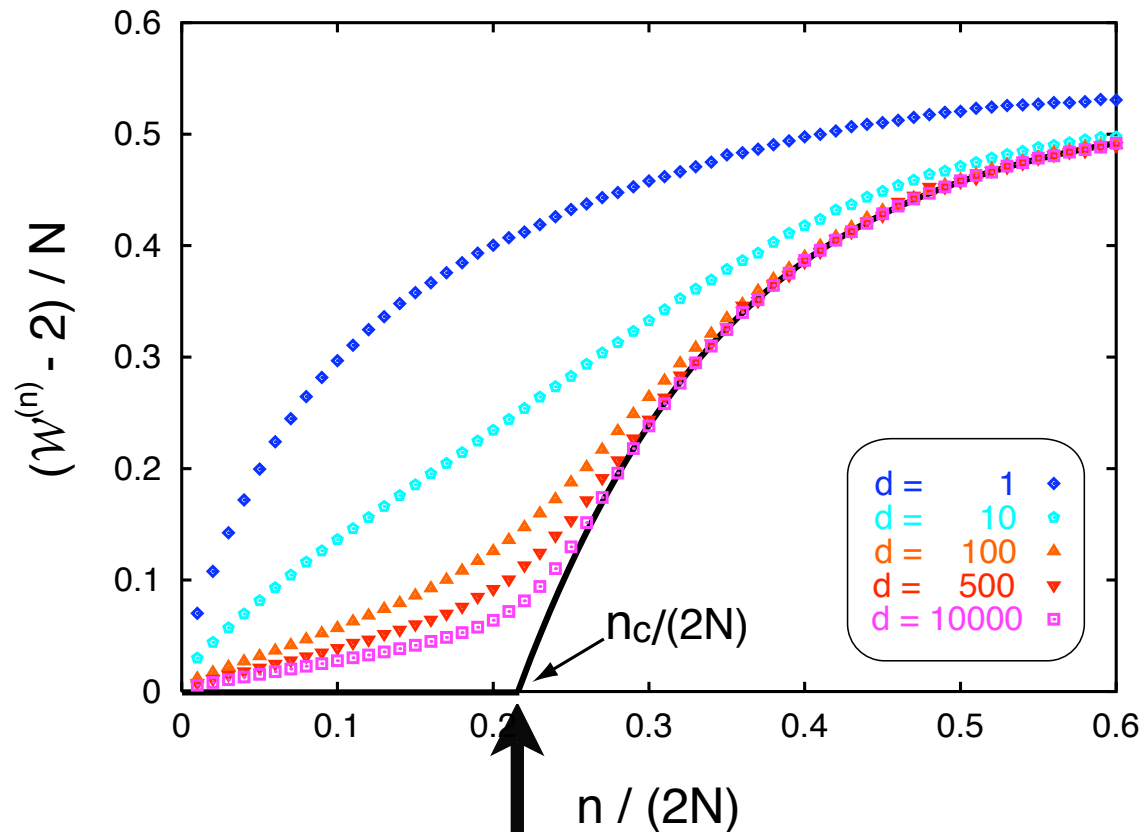
# Localization spectra

Low Density

High Density



# Localization in Low density Limit



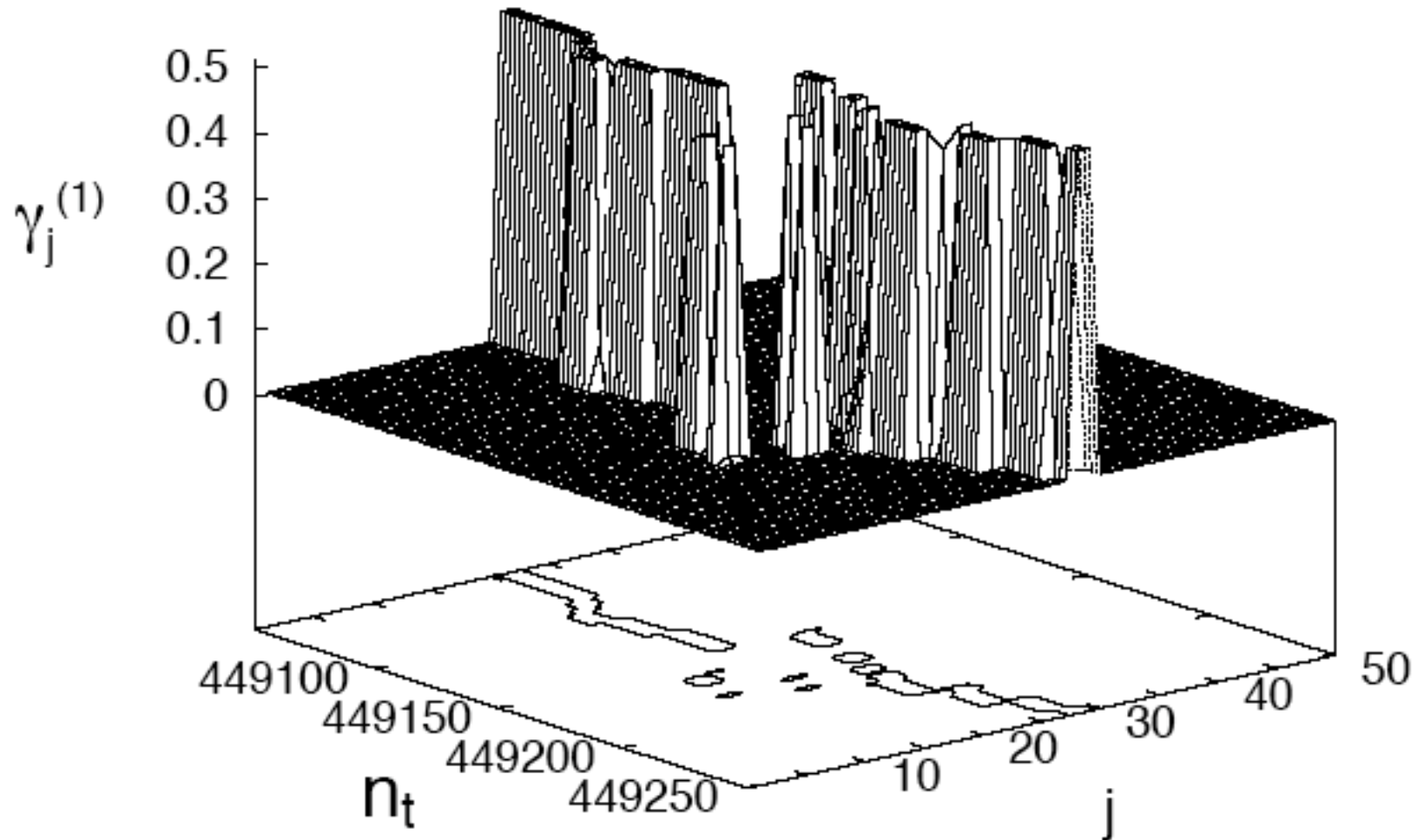
A fixed number of  
strongly localized  
vectors

$0.219 \pm 0.005$

Why does  
this happen?

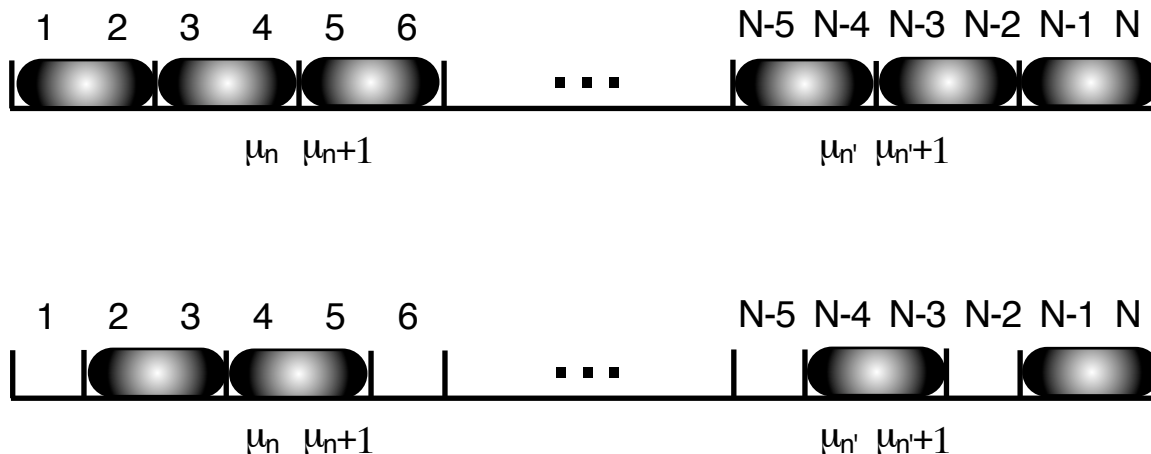
# Localization for the Lyapunov vector of the largest exponent

Quasi-one-dimensional System



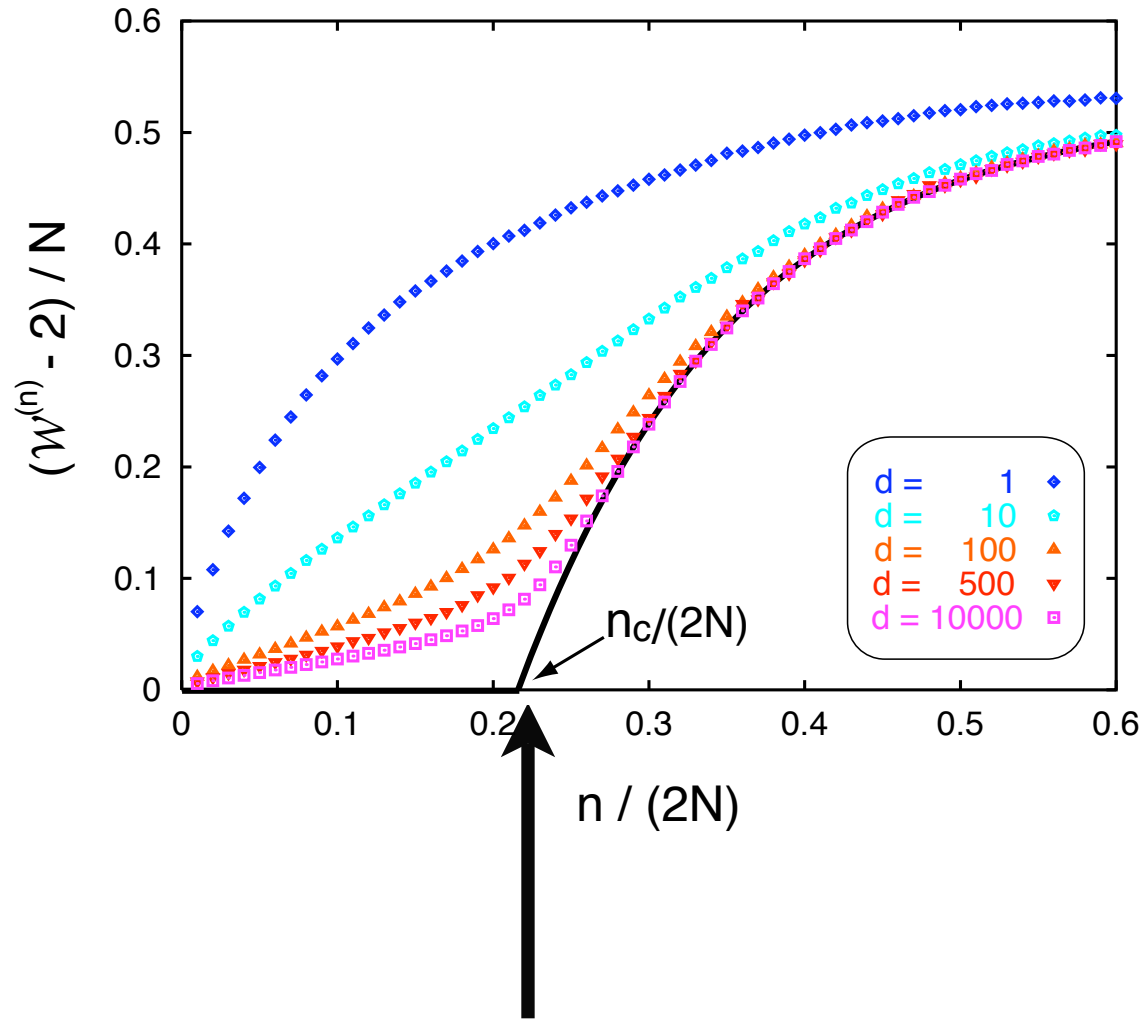
# Randomly Distributed Brick Model

**Conjecture:** The number of **most localized Lyapunov vectors** is equal to the number of **exponents in the linear region**



The number of exponents in the linear region is the **average** number of randomly dropped bricks

# Localization in Low density Limit



Randomly distributed brick model gives 0.216

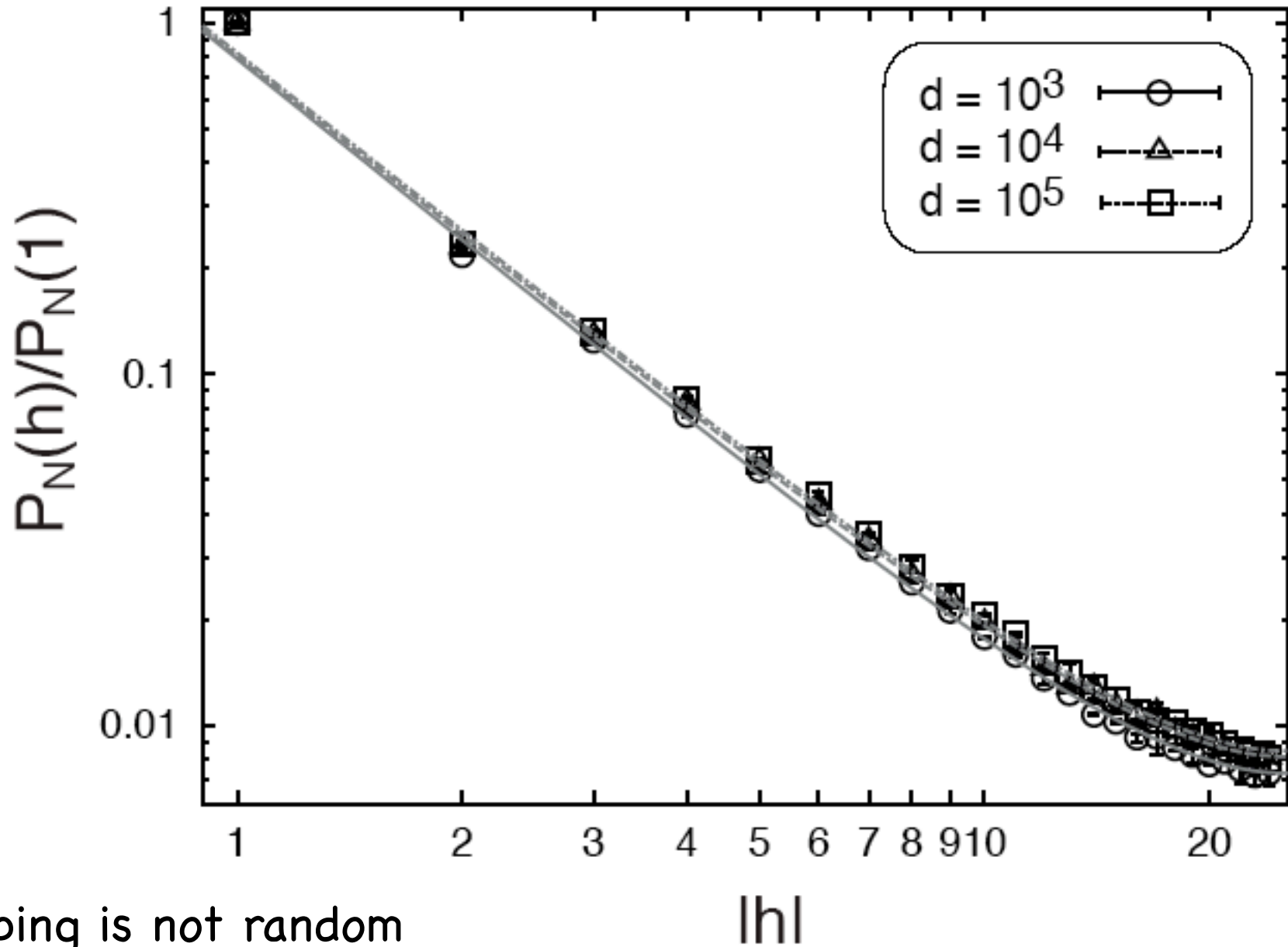
$(0.219 \pm 0.005)$



# Dynamics of the most Localized Lyapunov vector

# Normalized Hopping Rate

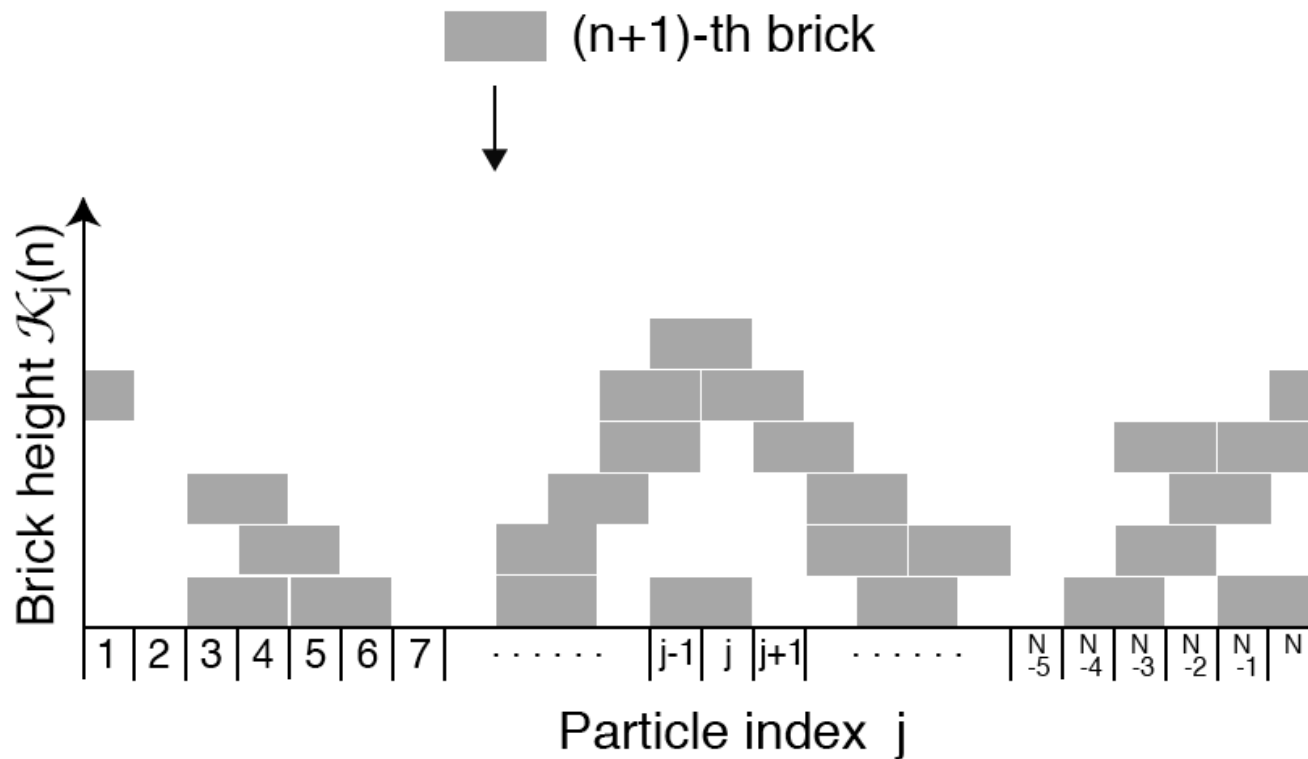
Density dependence



Hopping is not random

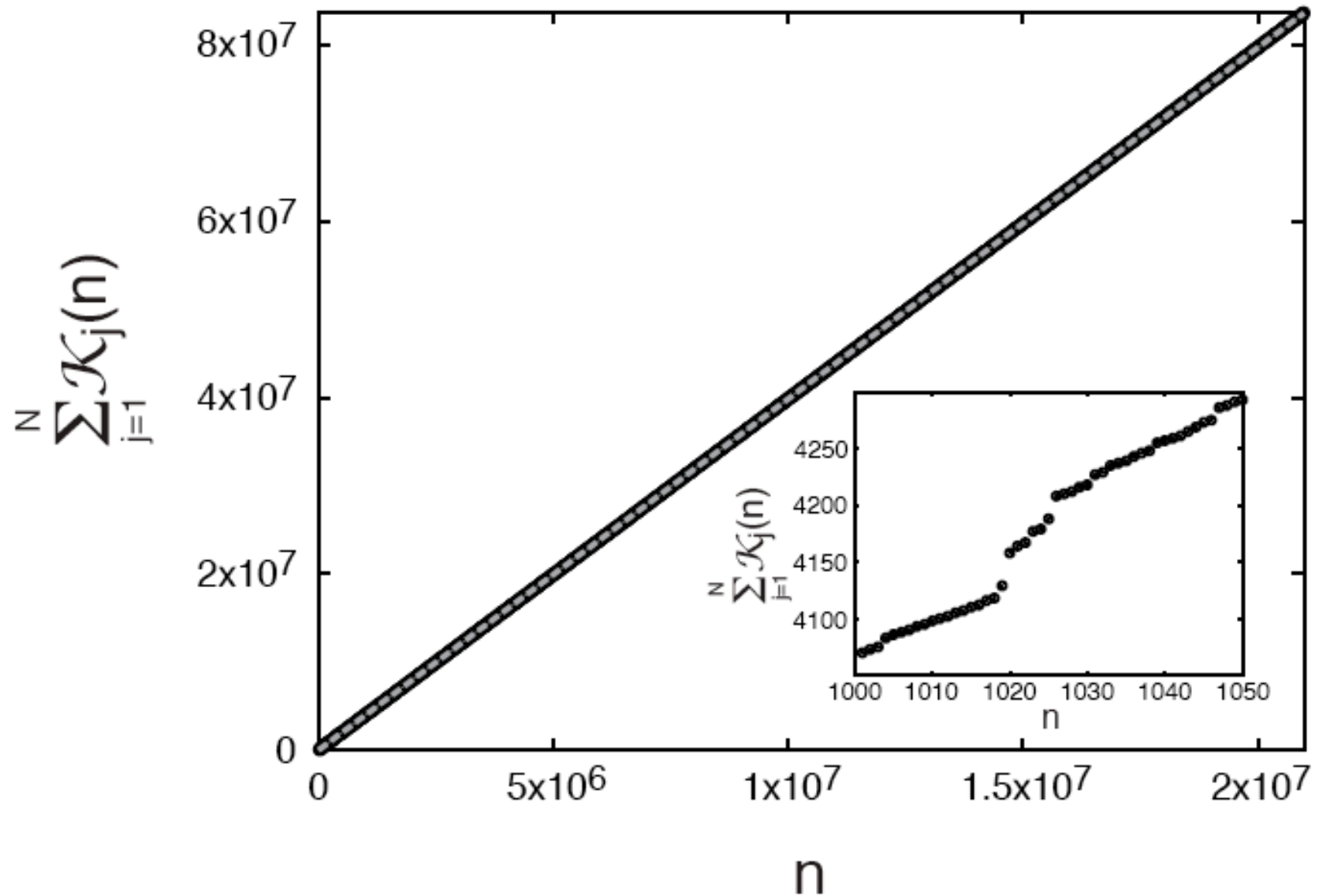
# Brick Accumulation Model

$$\mathcal{K}_l(n) = \begin{cases} \max\{\mathcal{K}_j(n-1), \mathcal{K}_k(n-1)\} + 1 & \text{for } j, k \\ \mathcal{K}_l(n-1) & \text{for } l \notin \{j, k\} \end{cases}$$

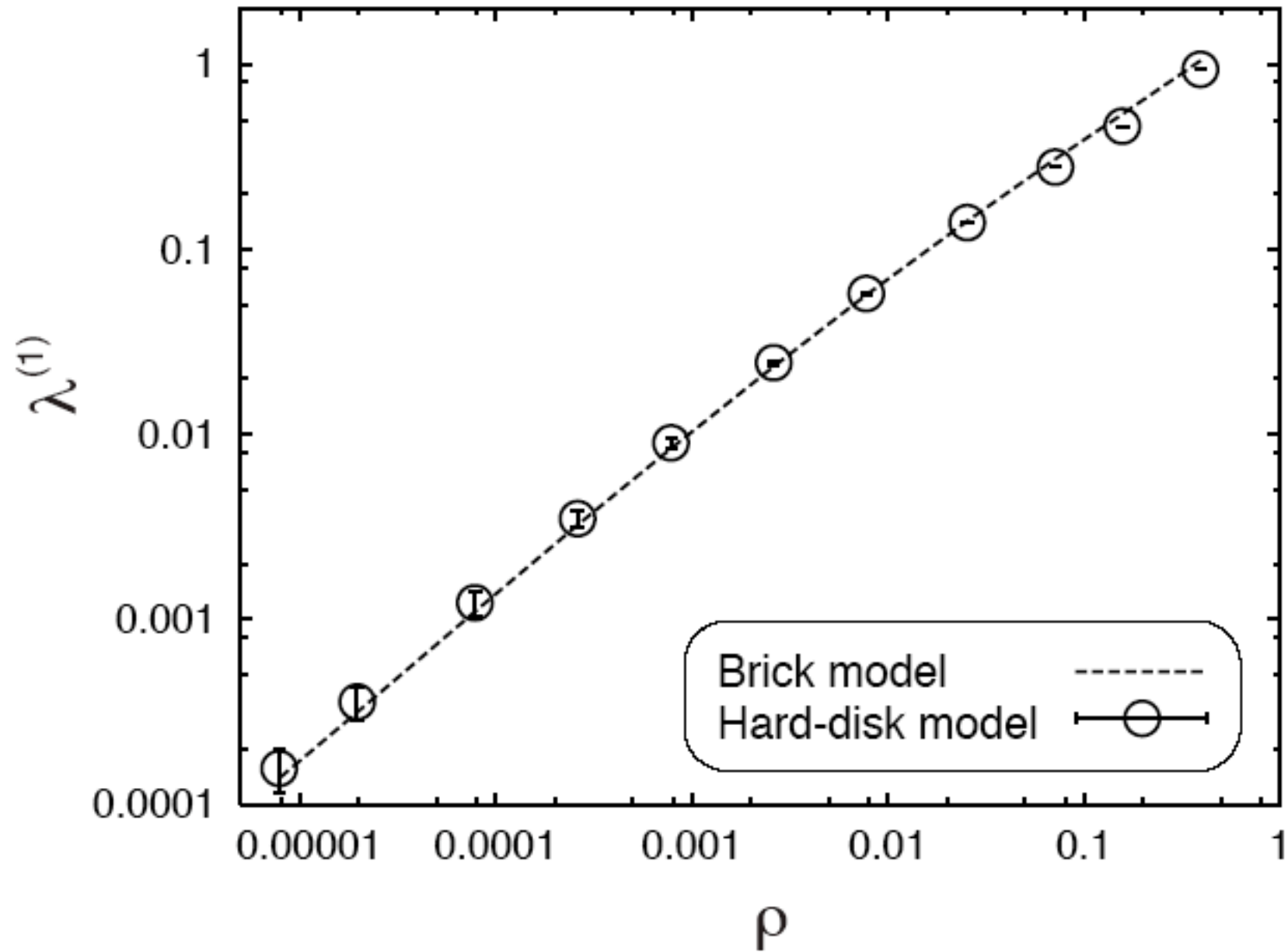


Clock Model

# Total Accumulation Rate



# Largest Lyapunov Exponent





# Conclusions

- Space and time dependent **Longitudinal modes**
- The period of the oscillating **Lyapunov mode** and the period of oscillations in the momentum **auto-correlation function** are related.
- This **connection** is independent of the boundary conditions:  $\omega$  and  $\omega_L$  change but  $\omega_L = \frac{1}{2}\omega$  remains!
- The relation is **correct** for fully two-dimensional systems.
- Linear region in **Localization spectrum** is explained
- Dynamics explained by **brick accumulation model**



NEXT

# Nonequilibrium Heat flow

Left-side  
boundary  
condition

Right-side  
boundary  
condition

$$p'_x = \varepsilon p_{T_L} - (1 - \varepsilon) p_x$$

$$p'_x = -\varepsilon p_{T_R} - (1 - \varepsilon) p_x$$

**HOT**

Quasi-one-dimensional system

**COLD**

**T=10**

**T=1**

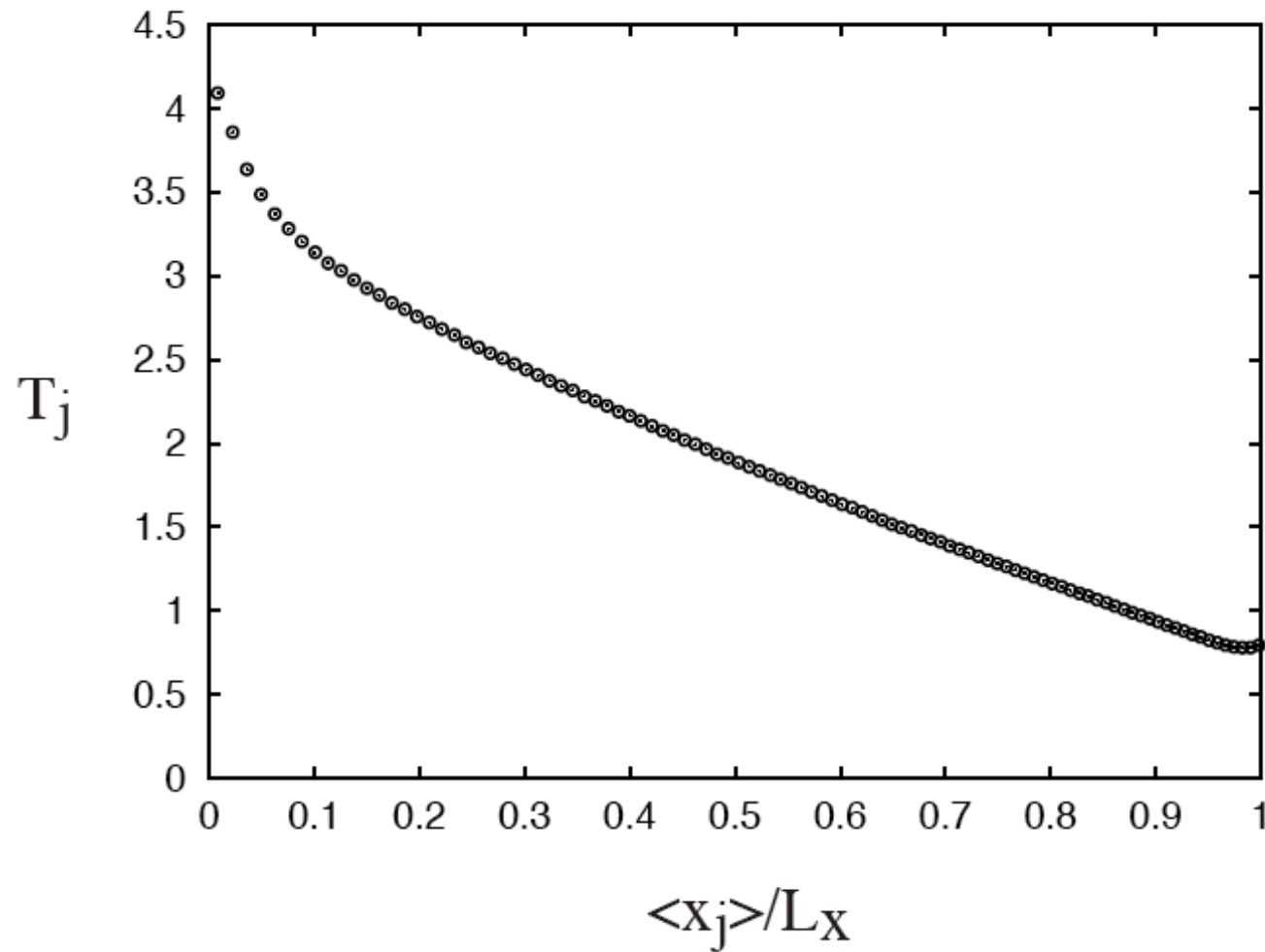
N=100

$\varepsilon = 0.5$

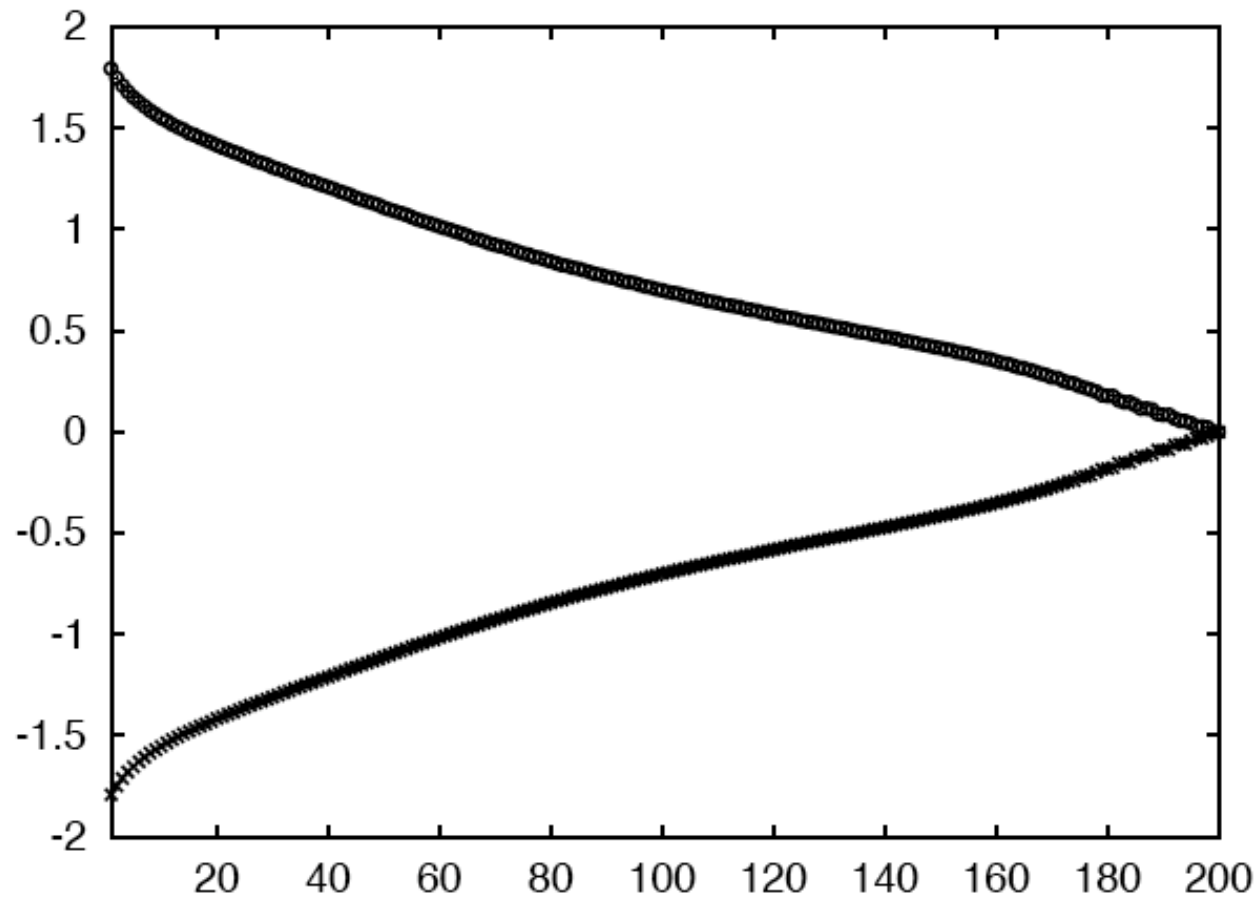
# Temperature Profile

T=10

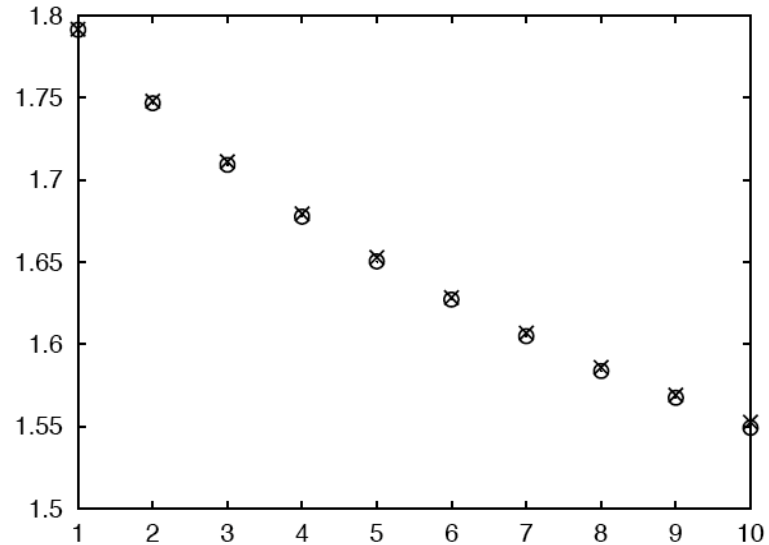
T=1



# Full Spectrum of Lyapunov Exponents



Largest positive and negative exponents



Smallest positive and negative exponents

