# Chaotic wave packet spreading in one-dimensional disordered nonlinear lattices

#### Haris Skokos

Department of Mathematics and Applied Mathematics University of Cape Town Cape Town, South Africa

E-mail: haris.skokos@uct.ac.za URL: http://math\_research.uct.ac.za/~hskokos/

# **Outline**

- Disordered 1D lattices:
  - √ The quartic disordered Klein-Gordon (DKG) model
  - ✓ The disordered discrete nonlinear Schrödinger equation (DDNLS)
  - **✓ Different dynamical behaviors**
- Chaotic behavior of the DKG and DDNLS models
  - **✓ Lyapunov exponents**
  - **✓ Deviation Vector Distributions**
- The Peyrard-Bishop-Dauxois (PBD) model of DNA
- Summary

#### Work in collaboration with

**Bob Senyange (PhD student): DKG model** 





Bertin Many Manda (PhD student): DDNLS model

Malcolm Hillebrand (PhD student): DNA model



# The DKG and DDNLS models

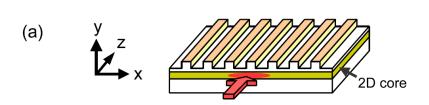
# Interplay of disorder and nonlinearity

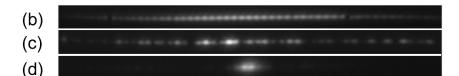
Waves in disordered media – Anderson localization [Anderson, Phys. Rev. (1958)]. Experiments on BEC [Billy et al., Nature (2008)]

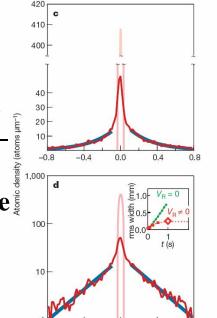
Waves in nonlinear disordered media – localization or delocalization?

Theoretical and/or numerical studies [Shepelyansky, PRL (1993) – Molina, Phys. Rev. B (1998) – Pikovsky & Shepelyansky, PRL (2008) – Kopidakis et al., PRL (2008) – Flach et al., PRL (2009) – S. et al., PRE (2009) – Mulansky & Pikovsky, EPL (2010) – S. & Flach, PRE (2010) – Laptyeva et al., EPL (2010) – Mulansky et al., PRE & J.Stat.Phys. (2011) – Bodyfelt et al., PRE (2011) – Bodyfelt et al., IJBC (2011)]

Experiments: propagation of light in disordered 1d waveguide lattices [Lahini et al., PRL (2008)]







#### The disordered Klein - Gordon (DKG) model

$$H_{K} = \sum_{l=1}^{N} \frac{p_{l}^{2}}{2} + \frac{\tilde{\varepsilon}_{l}}{2} u_{l}^{2} + \frac{1}{4} u_{l}^{4} + \frac{1}{2W} (u_{l+1} - u_{l})^{2}$$

with fixed boundary conditions  $u_0 = p_0 = u_{N+1} = p_{N+1} = 0$ . Typically N=1000.

Parameters: W and the total energy E.  $\tilde{\varepsilon}_l$  chosen uniformly from  $\left| \frac{1}{2}, \frac{3}{2} \right|$ .

**Linear case** (neglecting the term  $u_l^4/4$ )

Ansatz:  $u_l = A_l \exp(i\omega t)$ . Normal modes (NMs)  $A_{v,l}$  - Eigenvalue problem:

$$\lambda A_l = \varepsilon_l A_l - (A_{l+1} + A_{l-1})$$
 with  $\lambda = W\omega^2 - W - 2$ ,  $\varepsilon_l = W(\tilde{\varepsilon}_l - 1)$ 

# The disordered discrete nonlinear Schrödinger (DDNLS) equation

We also consider the system:

$$\boldsymbol{H}_{D} = \sum_{l=1}^{N} \boldsymbol{\varepsilon}_{l} \left| \boldsymbol{\psi}_{l} \right|^{2} + \frac{\boldsymbol{\beta}}{2} \left| \boldsymbol{\psi}_{l} \right|^{4} - \left( \boldsymbol{\psi}_{l+1} \boldsymbol{\psi}_{l}^{*} + \boldsymbol{\psi}_{l+1}^{*} \boldsymbol{\psi}_{l} \right)$$

where  $\varepsilon_l$  chosen uniformly from  $\left|-\frac{W}{2},\frac{W}{2}\right|$  and  $\beta$  is the nonlinear parameter.

Conserved quantities: The energy and the norm  $S = \sum_{l} |\psi_{l}|^{2}$  of the wave packet.

# Distribution characterization

We consider normalized energy distributions  $z_v \equiv \frac{E_v}{\sum_m E_m}$ 

with 
$$E_v = \frac{p_v^2}{2} + \frac{\tilde{\varepsilon}_v}{2} u_v^2 + \frac{1}{4} u_v^4 + \frac{1}{4W} (u_{v+1} - u_v)^2$$
 for the DKG model,

and norm distributions  $z_v \equiv \frac{|\psi_v|^2}{\sum_l |\psi_l|^2}$  for the DDNLS system.

Second moment:  $m_2 = \sum_{v=1}^{N} (v - \overline{v})^2 z_v$  with  $\overline{v} = \sum_{v=1}^{N} v z_v$ 

Participation number:  $P = \frac{I}{\sum_{v=1}^{N} z_v^2}$ 

measures the number of stronger excited modes in  $z_v$ . Single site P=1. Equipartition of energy P=N.

# Different Dynamical Regimes

Three expected evolution regimes [Flach, Chem. Phys (2010) - S. & Flach, PRE (2010) - Laptyeva et al., EPL (2010) - Bodyfelt et al., PRE (2011)]  $\Delta$ : width of the frequency spectrum, d: average spacing of interacting modes,  $\delta$ : nonlinear frequency shift.

#### Weak Chaos Regime: $\delta < d$ , $m_2 \propto t^{1/3}$

Frequency shift is less than the average spacing of interacting modes. NMs are weakly interacting with each other. [Molina, PRB (1998) – Pikovsky, & Shepelyansky, PRL (2008)].

#### Intermediate Strong Chaos Regime: $d<\delta<\Delta$ , $m_2 \propto t^{1/2} \longrightarrow m_2 \propto t^{1/3}$

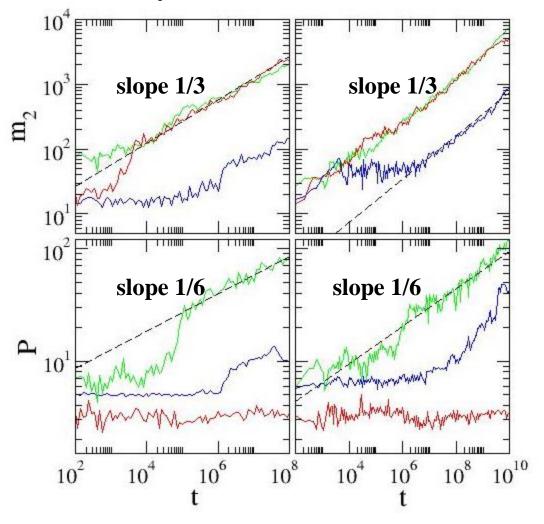
Almost all NMs in the packet are resonantly interacting. Wave packets initially spread faster and eventually enter the weak chaos regime.

#### Selftrapping Regime: $\delta > \Delta$

Frequency shift exceeds the spectrum width. Frequencies of excited NMs are tuned out of resonances with the nonexcited ones, leading to selftrapping, while a small part of the wave packet subdiffuses [Kopidakis et al., PRL (2008)].

# Single site excitations

**DDNLS** W=4,  $\beta$ = 0.1, 1, 4.5 **DKG** W = 4, E = 0.05, 0.4, 1.5



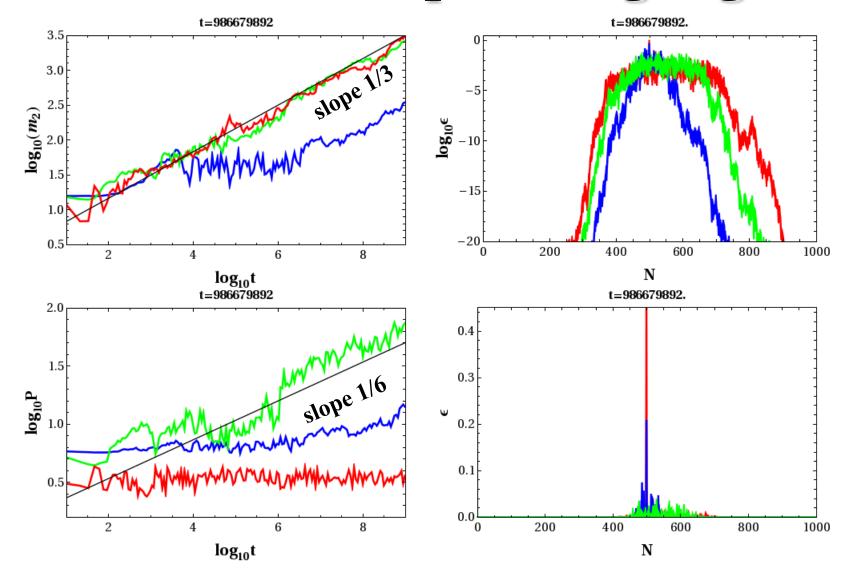
No strong chaos regime

In weak chaos regime we averaged the measured exponent  $\alpha$  (m<sub>2</sub>~t $^{\alpha}$ ) over 20 realizations:

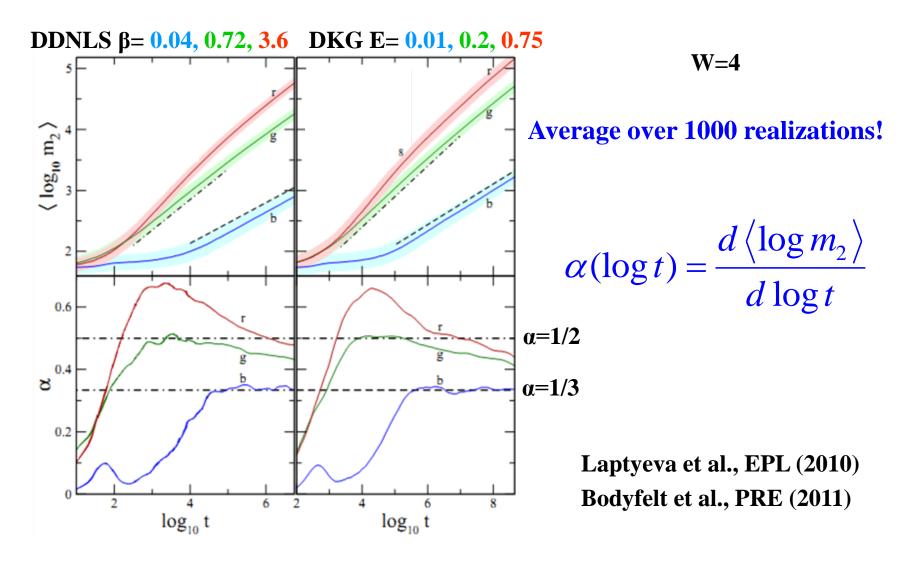
 $\alpha$ =0.33±0.05 (DKG)  $\alpha$ =0.33±0.02 (DDLNS)

Flach et al., PRL (2009) S. et al., PRE (2009)

# DKG: Different spreading regimes



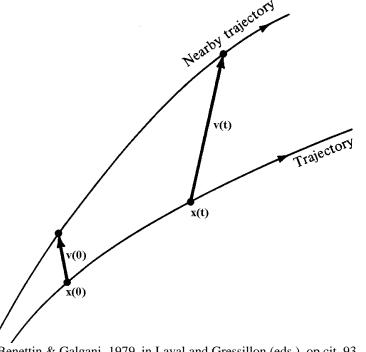
# Crossover from strong to weak chaos (block excitations)



# Variational Equations

We use the notation  $\mathbf{x} = (\mathbf{q}_1, \mathbf{q}_2, \dots, \mathbf{q}_N, \mathbf{p}_1, \mathbf{p}_2, \dots, \mathbf{p}_N)^T$ . The deviation vector from a given orbit is denoted by

$$\mathbf{v} = (\delta \mathbf{x}_1, \delta \mathbf{x}_2, \dots, \delta \mathbf{x}_n)^T$$
, with  $\mathbf{n} = 2\mathbf{N}$ 



The time evolution of v is given by the so-called variational equations:

$$\frac{\mathbf{dv}}{\mathbf{dt}} = -\mathbf{J} \cdot \mathbf{P} \cdot \mathbf{v}$$

where

$$\mathbf{J} = \begin{pmatrix} \mathbf{0}_{\mathbf{N}} & -\mathbf{I}_{\mathbf{N}} \\ \mathbf{I}_{\mathbf{N}} & \mathbf{0}_{\mathbf{N}} \end{pmatrix}, \ \mathbf{P}_{ij} = \frac{\partial^{2} \mathbf{H}}{\partial \mathbf{x}_{i} \partial \mathbf{x}_{j}} \ i, j = 1, 2, \dots, n$$

Benettin & Galgani, 1979, in Laval and Gressillon (eds.), op cit, 93

# Maximum Lyapunov Exponent

Chaos: sensitive dependence on initial conditions.

Roughly speaking, the Lyapunov exponents of a given orbit characterize the mean exponential rate of divergence of trajectories surrounding it.

Consider an orbit in the 2N-dimensional phase space with initial condition  $\mathbf{x}(0)$  and an initial deviation vector from it  $\mathbf{v}(0)$ . Then the mean exponential rate of divergence is:

$$\mathbf{mLCE} = \lambda_1 = \lim_{t \to \infty} \Lambda(t) = \lim_{t \to \infty} \frac{1}{t} \ln \frac{\|\mathbf{v}(t)\|}{\|\mathbf{v}(0)\|} \Big|_{q_n}$$

$$\lambda_1 = 0 \to \mathbf{Regular\ motion}$$

$$\lambda_1 \neq 0 \to \mathbf{Chaotic\ motion}$$

$$10^{-3}$$

$$10^{-3}$$

$$10^{-3}$$

$$10^{-3}$$

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Figure 5.7. Behavior of  $\sigma_n$  at the intermediate energy E=0.125 for initial points taken in the ordered (curves 1-3) or stochastic (curves 4-6) regions (after Benettin et al., 1976).

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# Symplectic integration

We apply the 2-part splitting integrator ABA864 [Blanes et al., Appl. Num. Math. (2013) – Senyange & S., EPJ ST (2018)] to the DKG model:

$$\boldsymbol{H}_{K} = \sum_{l=1}^{N} \left( \frac{\boldsymbol{p}_{l}^{2}}{2} + \frac{\tilde{\boldsymbol{\varepsilon}}_{l}}{2} \boldsymbol{u}_{l}^{2} + \frac{1}{4} \boldsymbol{u}_{l}^{4} + \frac{1}{2W} (\boldsymbol{u}_{l+1} - \boldsymbol{u}_{l})^{2} \right)$$

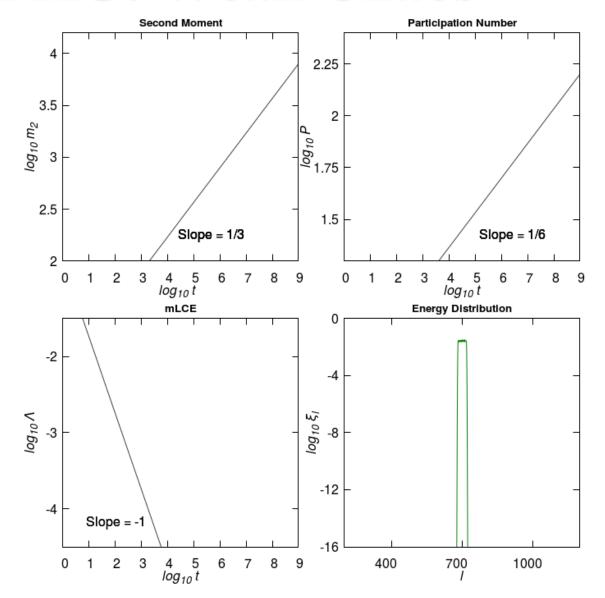
and the 3-part splitting integrator ABC<sup>6</sup><sub>[SS]</sub> [S. et al., Phys. Let. A (2014) – Gerlach et al., EPJ ST (2016) – Danieli et al., MinE (2019) ] to the DDNLS system:

$$H_{D} = \sum_{l} \varepsilon_{l} |\psi_{l}|^{2} + \frac{\beta}{2} |\psi_{l}|^{4} - (\psi_{l+1} \psi_{l}^{*} + \psi_{l+1}^{*} \psi_{l}), \quad \psi_{l} = \frac{1}{\sqrt{2}} (q_{l} + i p_{l})$$

$$H_{D} = \sum_{l} \left( \frac{\varepsilon_{l}}{2} (q_{l}^{2} + p_{l}^{2}) + \frac{\beta}{8} (q_{l}^{2} + p_{l}^{2})^{2} - q_{n}q_{n+1} - p_{n}p_{n+1} \right)$$

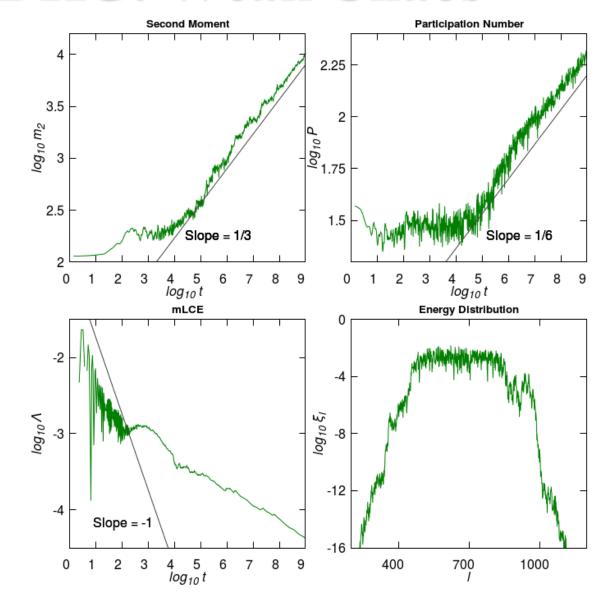
By using the so-called Tangent Map method we extend these symplectic integration schemes in order to integrate simultaneously the variational equations [S. & Gerlach, PRE (2010) – Gerlach & S., Discr. Cont. Dyn. Sys. (2011) – Gerlach et al., IJBC (2012)].

# **DKG: Weak Chaos**



Block excitation L=37 sites, E=0.37, W=3

# **DKG: Weak Chaos**

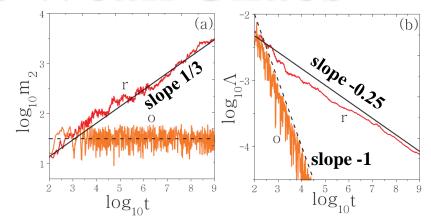


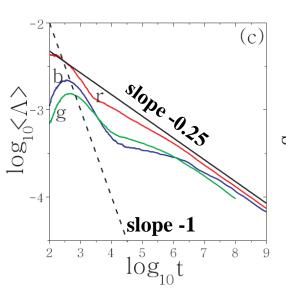
Block excitation L=37 sites, E=0.37, W=3

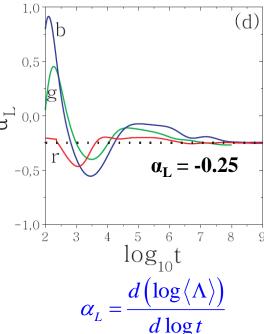
# **DKG: Weak Chaos**

#### **Individual runs**

Linear case E=0.4, W=4







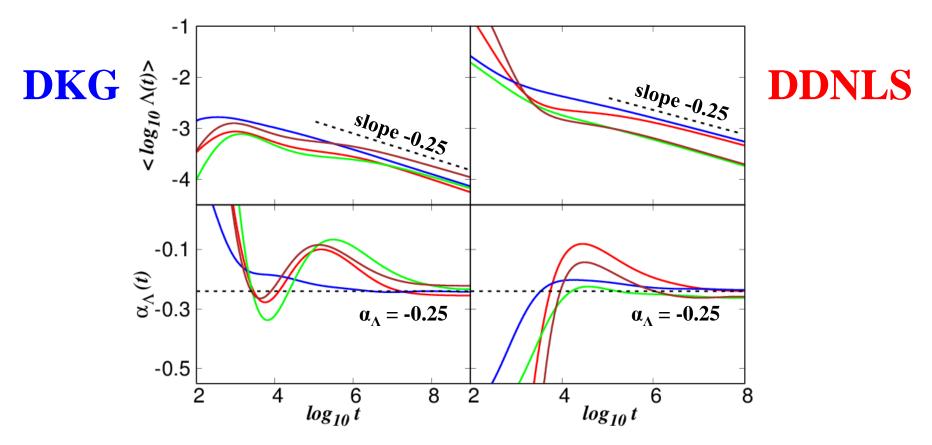
#### Average over 50 realizations

Single site excitation E=0.4, W=4

Block excitation (L=21 sites) E=0.21, W=4 Block excitation (L=37 sites) E=0.37, W=3

S. et al., PRL (2013)

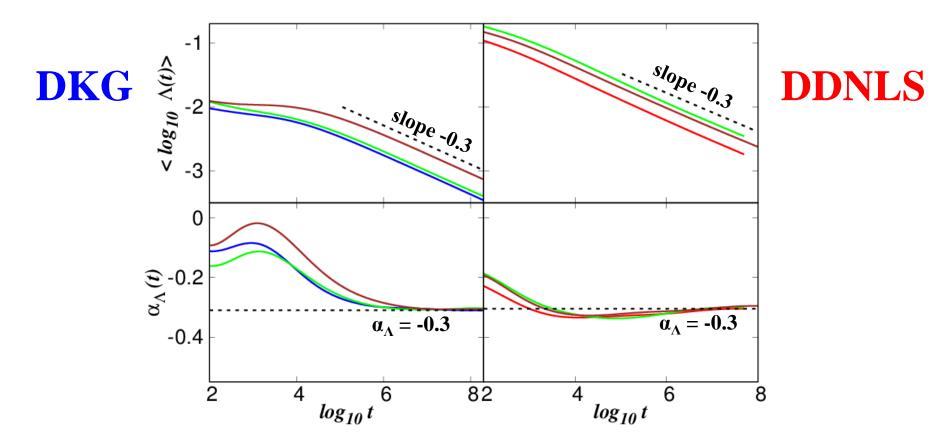
#### Weak Chaos: DKG and DDNLS



Average over 100 realizations [Senyange, Many Manda & S., PRE (2018)]

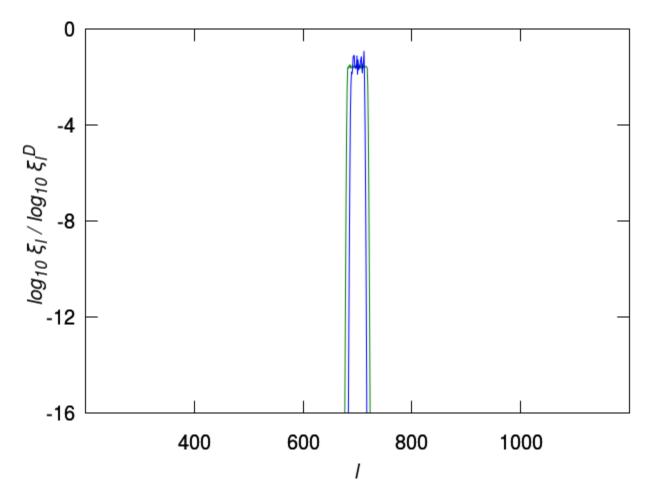
Block excitation (L=37 sites) E=0.37, W=3 Single site excitation E=0.4, W=4 Block excitation (L=21 sites) E=0.21, W=4 Block excitation (L=13 sites) E=0.26, W=5 Block excitation (L=21 sites)  $\beta$ =0.04, W=4 Single site excitation  $\beta$ =1, W=4 Single site excitation  $\beta$ =0.6, W=3 Block excitation (L=21 sites)  $\beta$ =0.03, W=3

# **Strong Chaos: DKG and DDNLS**



Average over 100 realizations [Senyange, Many Manda & S., PRE (2018)]

Block excitation (L=83 sites) E=0.83, W=2 Block excitation (L=37 sites) E=0.37, W=3 Block excitation (L=83 sites) E=0.83, W=3 Block excitation (L=21 sites)  $\beta$ =0.62, W=3.5 Block excitation (L=21 sites)  $\beta$ =0.5, W=3 Block excitation (L=21 sites)  $\beta$ =0.72, W=3.5



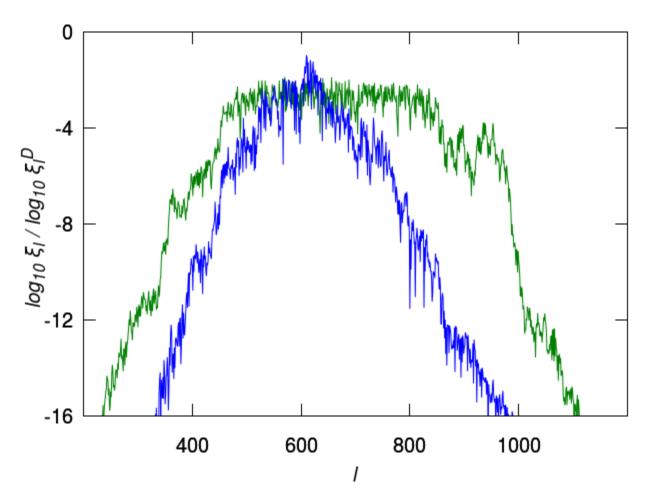
Energy DVD

DKG weak chaos L=37 sites, E=0.37, W=3

**Deviation vector:** 

$$v(t) = (\delta u_1(t), \delta u_2(t), ..., \delta u_N(t), \delta p_1(t), \delta p_2(t), ..., \delta p_N(t))$$

$$\mathbf{DVD:} \boldsymbol{\xi}_{l}^{D} = \frac{\delta u_{l}^{2} + \delta p_{l}^{2}}{\sum_{l} \left(\delta u_{l}^{2} + \delta p_{l}^{2}\right)}$$



**Energy DVD** 

DKG weak chaos L=37 sites, E=0.37, W=3

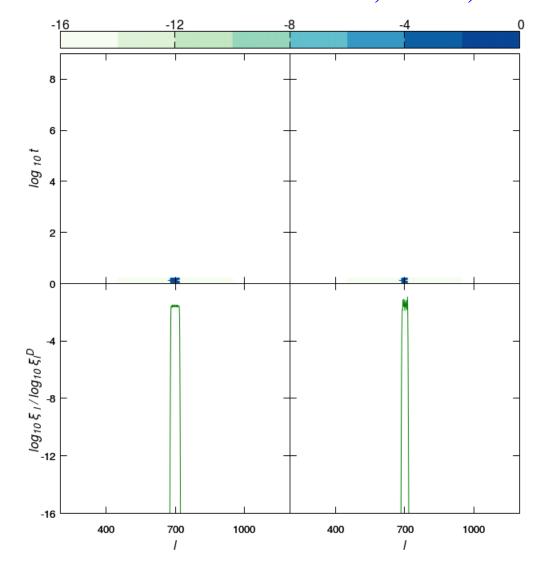
**Deviation vector:** 

$$v(t) = (\delta u_1(t), \delta u_2(t), ..., \delta u_N(t), \delta p_1(t), \delta p_2(t), ..., \delta p_N(t))$$

$$\mathbf{DVD:} \boldsymbol{\xi}_{l}^{D} = \frac{\delta u_{l}^{2} + \delta p_{l}^{2}}{\sum_{l} \left(\delta u_{l}^{2} + \delta p_{l}^{2}\right)}$$

DKG: weak chaos. L=37 sites, E=0.37, W=3

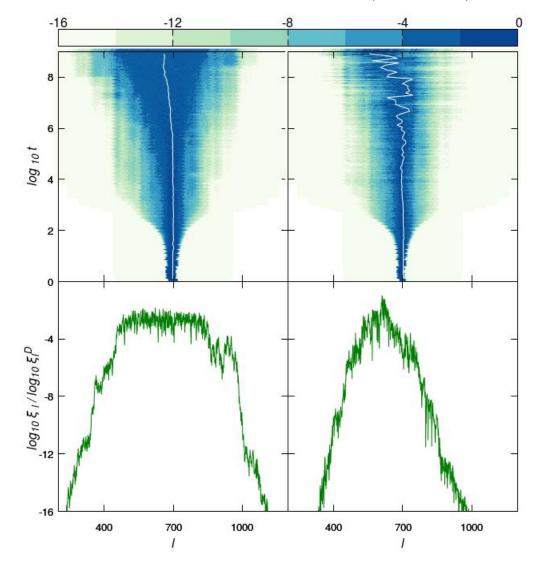




**DVD** 

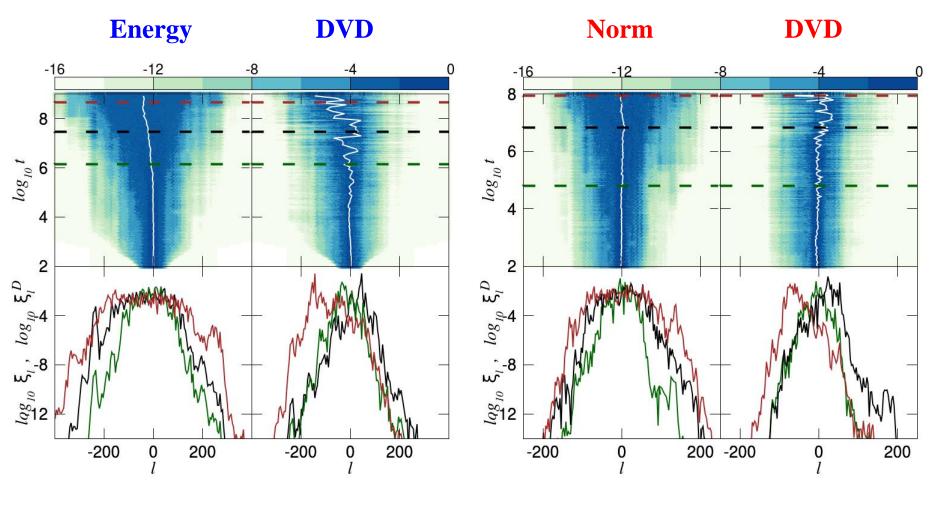
DKG: weak chaos. L=37 sites, E=0.37, W=3

**Energy** 



**DVD** 

#### Weak Chaos: DKG and DDNLS

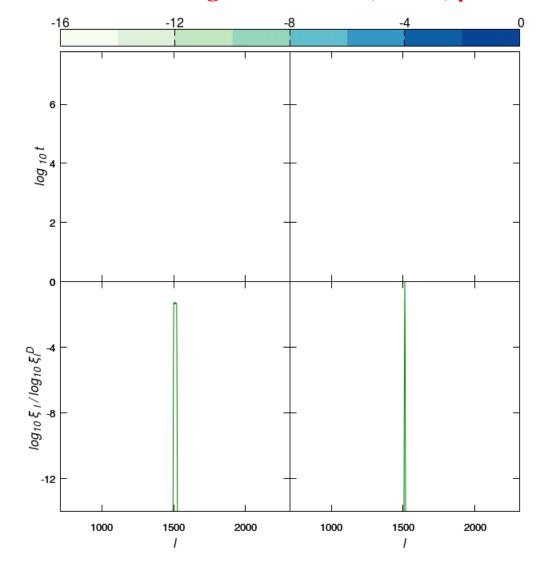


**DKG:** W=3, L=37, E=0.37

**DDNLS:** W=4, L=21,  $\beta$ =0.04

**DDNLS:** strong chaos W=3.5, L=21,  $\beta$ =0.72





**DVD** 

**DDNLS:** strong chaos W=3.5, L=21,  $\beta$ =0.72

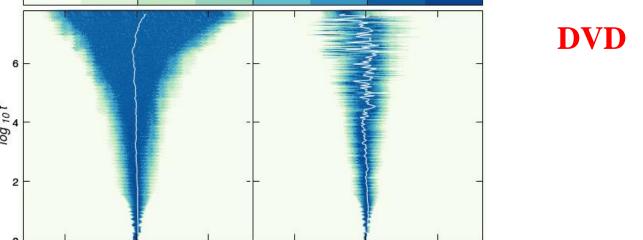
Norm

-12

1000

1500

2000

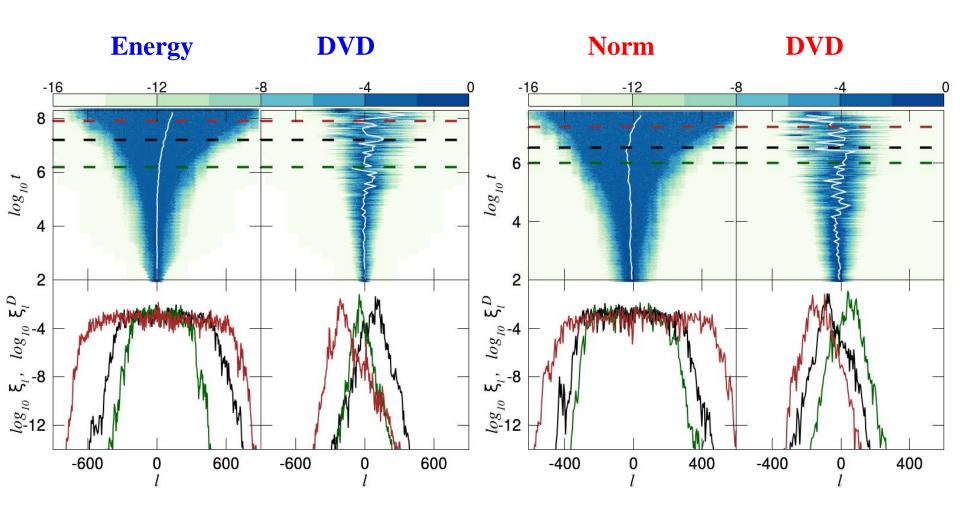


1500

2000

1000

# **Strong Chaos: DKG and DDNLS**



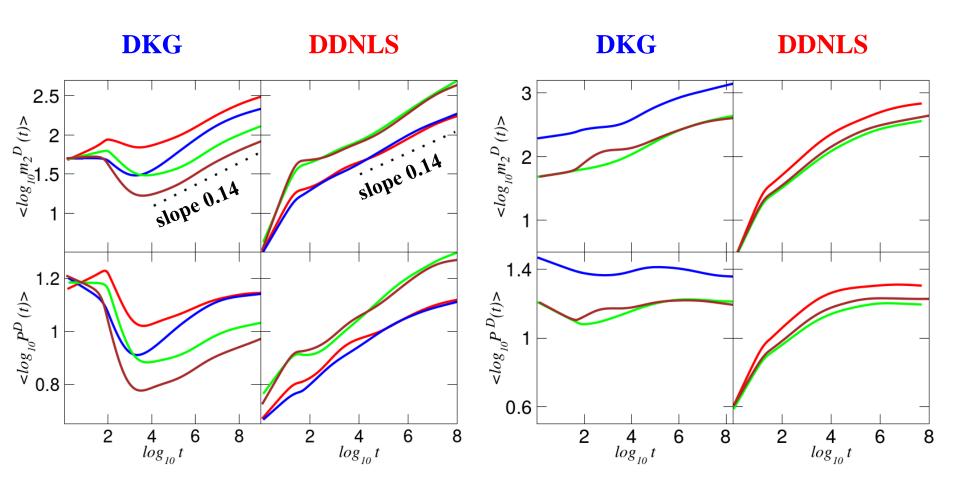
**DKG: W=3, L=83, E=8.3** 

**DDNLS:** W=3.5, L=21,  $\beta$ =0.72

#### **Characteristics of DVDs**

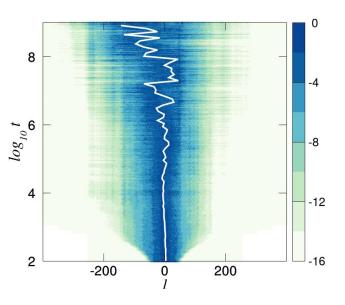
Weak chaos

**Strong chaos** 



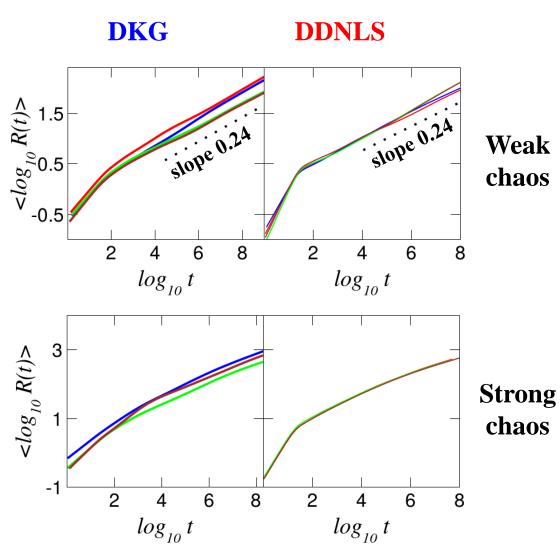
#### **Characteristics of DVDs**

**KG** weak chaos L=37, E=0.37, W=3



Range of the lattice visited by the DVD

$$R(t) = \max_{[0,t]} \left\{ \overline{l}_w(t) \right\} - \min_{[0,t]} \left\{ \overline{l}_w(t) \right\}$$
$$\overline{l}_w = \sum_{l=1}^{N} l \xi_l^D$$

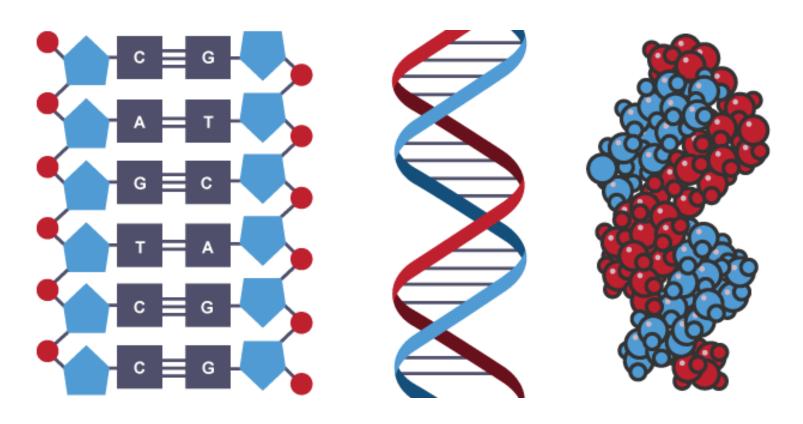


# The PBD model of DNA

#### **DNA** structure

**Double helix with two types of bonds:** 

- Adenine-thymine (AT) two hydrogen bonds
- Guanine-cytosine (GC) three hydrogen bonds



#### Hamiltonian model

#### Peyrard-Bishop-Dauxois (PBD) model

[Dauxois, Peyrard, Bishop, PRE (1993)]

$$H_N = \sum_{n=1}^N \left[ \frac{1}{2m} p_n^2 + \frac{D_n (e^{-a_n y_n} - 1)^2}{2} + \frac{K}{2} (1 + \rho e^{-b(y_n + y_{n-1})}) (y_n - y_{n-1})^2 \right]$$

#### **Bond potential energy (Morse potential)**

GC: D=0.075 eV,  $a=6.9 \text{ Å}^{-1}$ 

AT: D=0.05 eV,  $a=4.2 \text{ Å}^{-1}$ 

#### **Nearest neighbors coupling potential**

 $K=0.025 \text{ eV/Å}^2$ ,  $\rho=2$ ,  $b=0.35 \text{ Å}^{-1}$ 

Different arrangements of AT and GC bonds.

AT AT AT AT AT AT AT AT AT

 $P_{AT}=1 (100\% AT bonds)$ 

Different arrangements of AT and GC bonds.

AT AT AT AT AT AT AT AT



**P**<sub>AT</sub>=1 (100% AT bonds)

 $P_{AT}$ =0.4 (40% AT bonds)

Different arrangements of AT and GC bonds.

AT AT AT AT AT AT AT AT

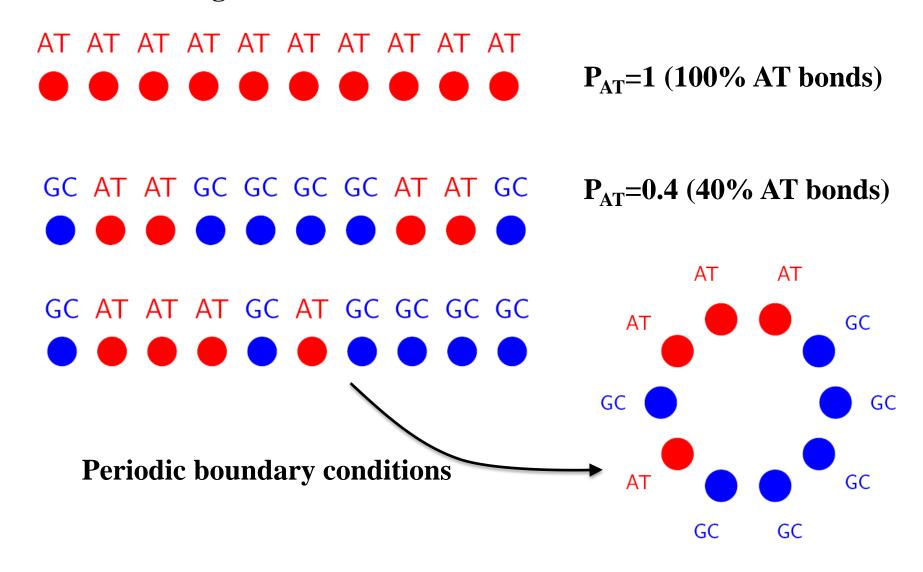


**P**<sub>AT</sub>=1 (100% AT bonds)

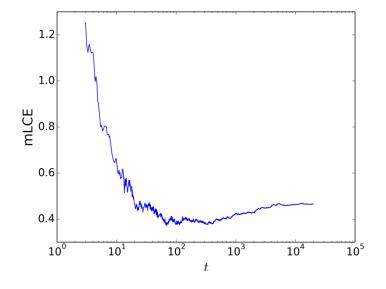
 $P_{AT} = 0.4 (40\% AT bonds)$ 



Different arrangements of AT and GC bonds.

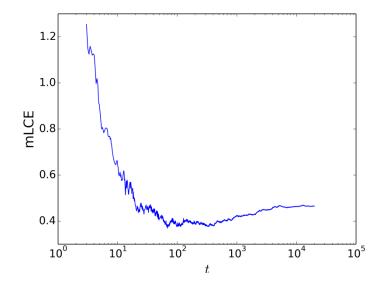


# Lyapunov exponents (E/n=0.04, P<sub>AT</sub>=0.3)



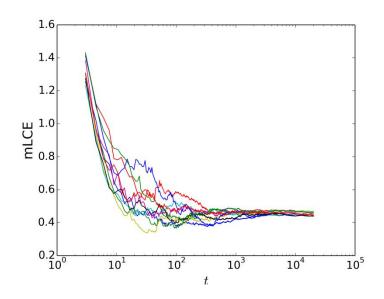
1 realization, 1 initial condition

# Lyapunov exponents (E/n=0.04, P<sub>AT</sub>=0.3)

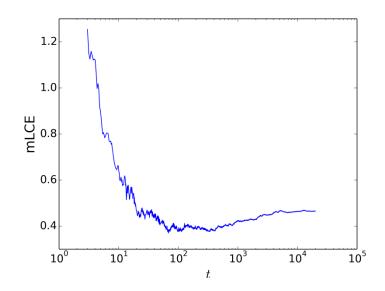


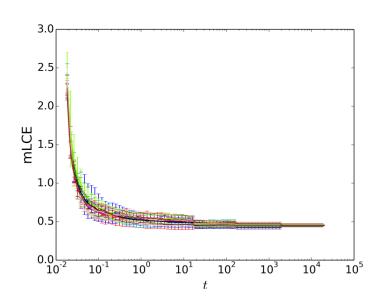
1 realization, 1 initial condition

#### 1 realization, 10 initial conditions



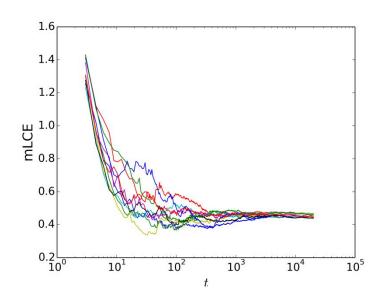
# Lyapunov exponents (E/n=0.04, $P_{AT}$ =0.3)



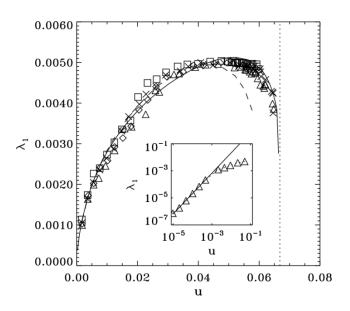


1 realization, 1 initial condition

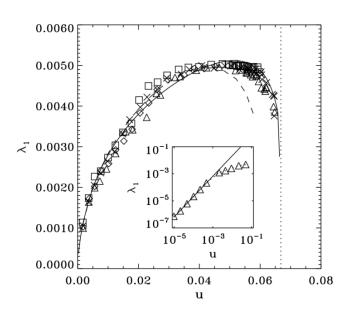
1 realization, 10 initial conditions



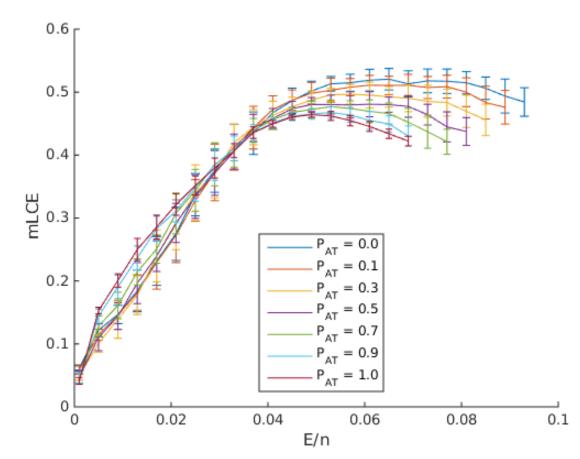
10 realizations, 10 initial conditions

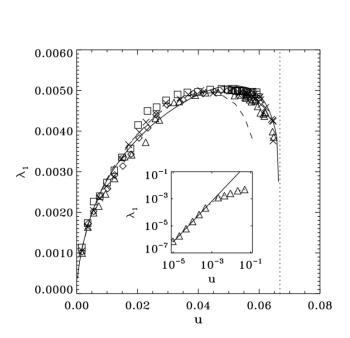


Homogeneous chain [Barré & Dauxois, EPL (2001)]

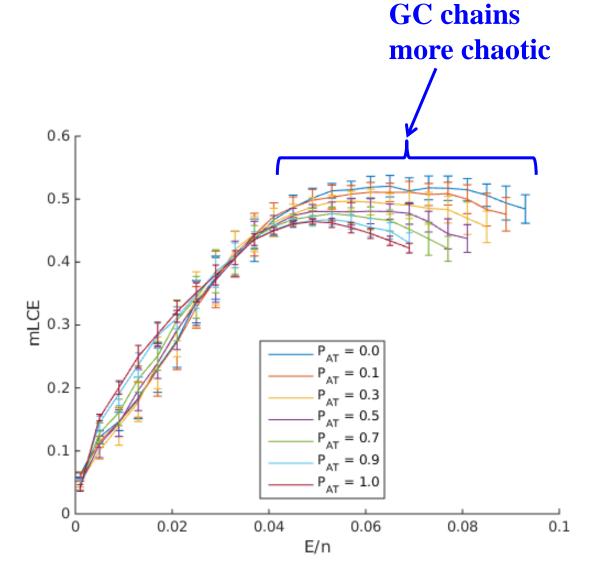


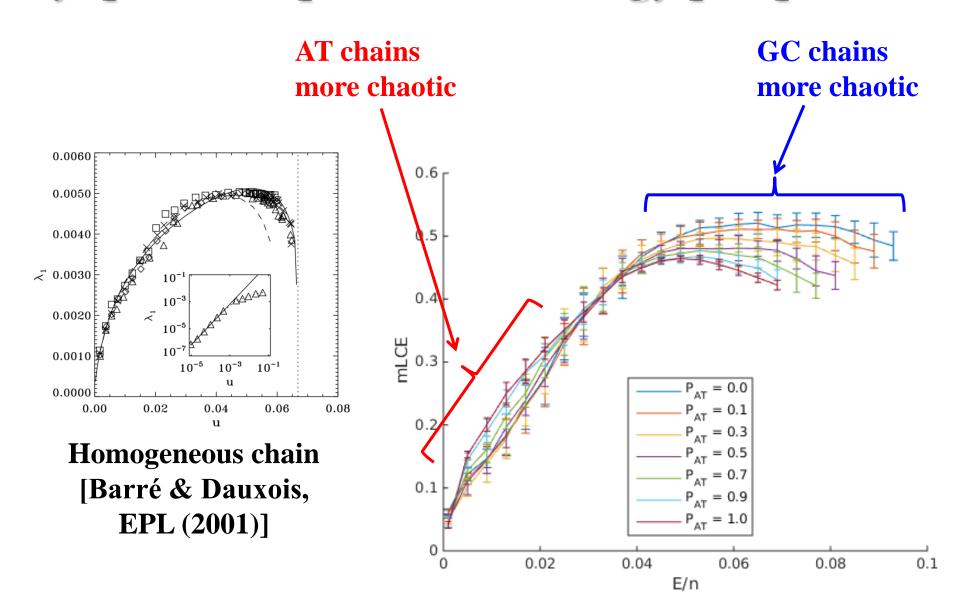
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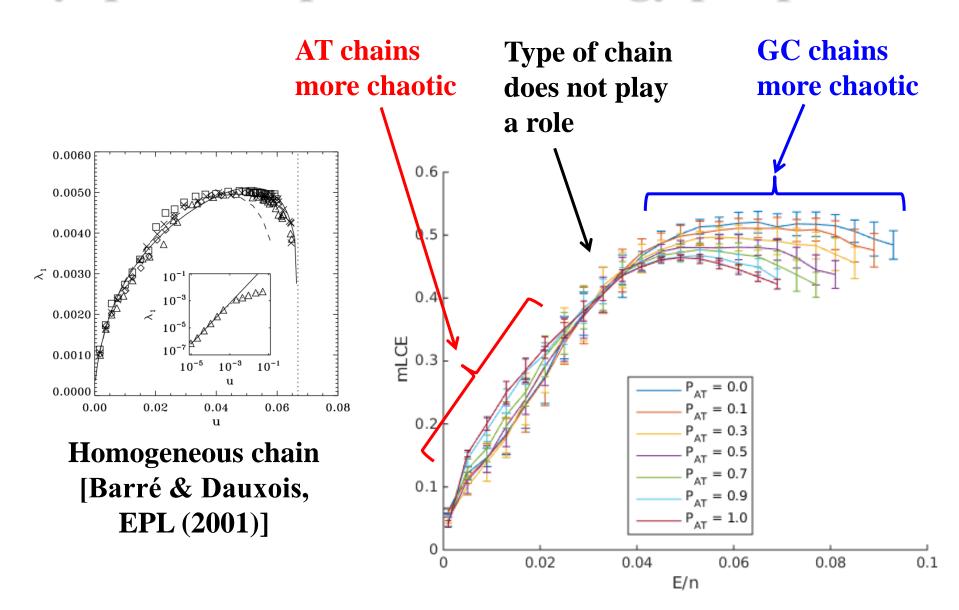




Homogeneous chain [Barré & Dauxois, EPL (2001)]

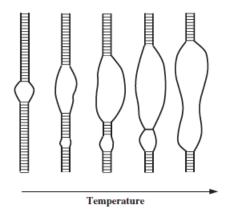






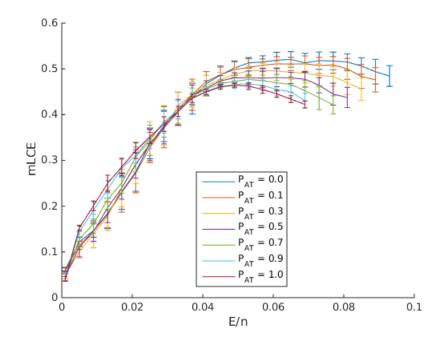
# **DNA** denaturation (melting)

Melting: large bubbles forming in the DNA chain as bonds break



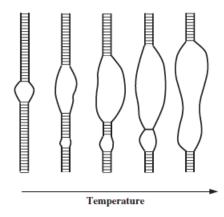
As  $y_n$  increases the exponentials in

$$D_n(e^{-a_ny_n}-1)^2+\frac{K}{2}(1+\rho e^{-b(y_n+y_{n-1})})(y_n-y_{n-1})^2$$
 tend to 0, the system becomes effectively linear and the mLCE  $\rightarrow$ 0.



# **DNA** denaturation (melting)

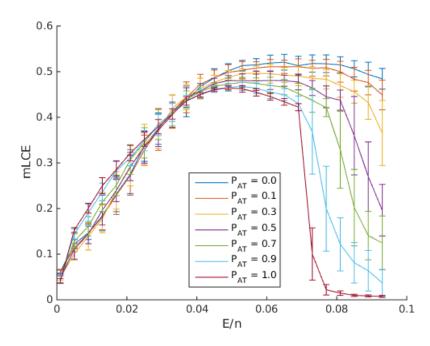
Melting: large bubbles forming in the DNA chain as bonds break



As  $y_n$  increases the exponentials in

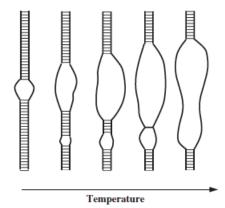
$$D_n(e^{-a_ny_n}-1)^2 + \frac{K}{2}(1+\rho e^{-b(y_n+y_{n-1})})(y_n-y_{n-1})^2$$

tend to 0, the system becomes effectively linear and the mLCE  $\rightarrow$ 0.



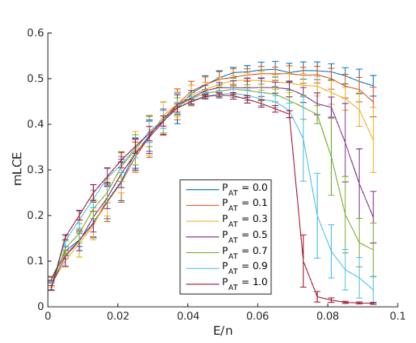
# **DNA** denaturation (melting)

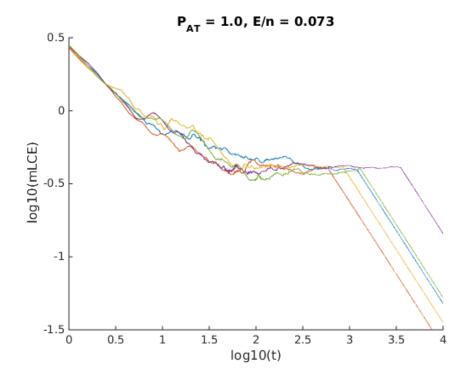
Melting: large bubbles forming in the DNA chain as bonds break

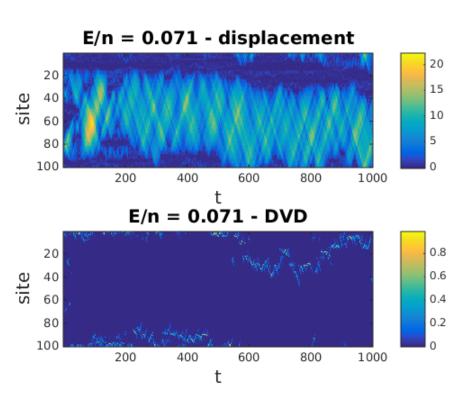


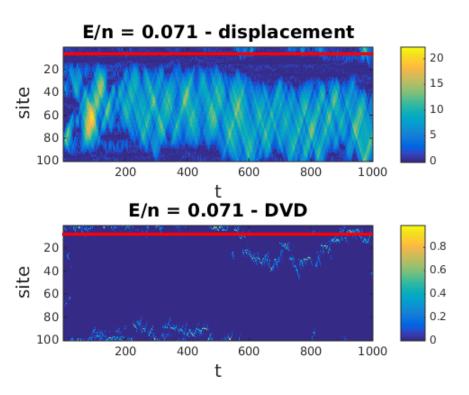
As y<sub>n</sub> increases the exponentials in

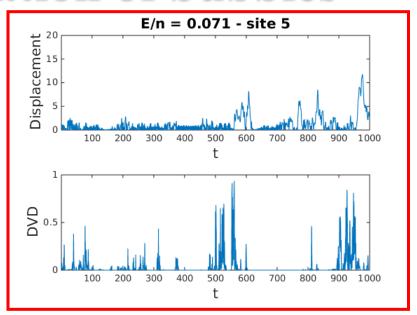
$$D_n(e^{-a_ny_n}-1)^2 + \frac{K}{2}(1+\rho e^{-b(y_n+y_{n-1})})(y_n-y_{n-1})^2$$
 tend to 0, the system becomes effectively linear and the mLCE  $\rightarrow$ 0.

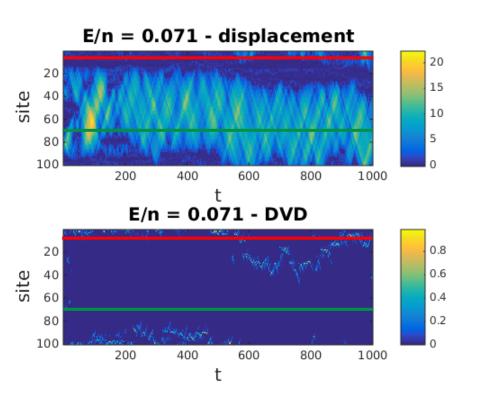


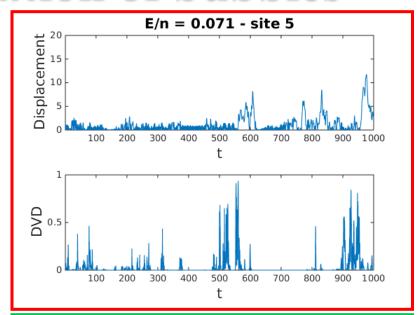


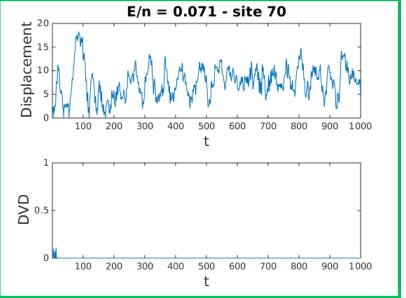




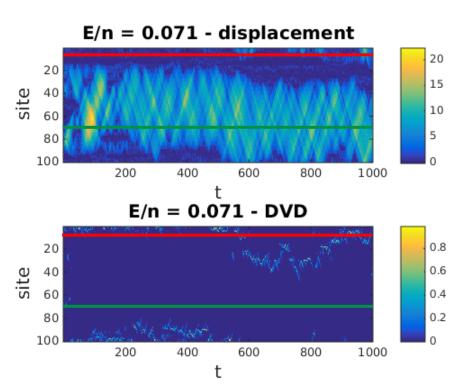


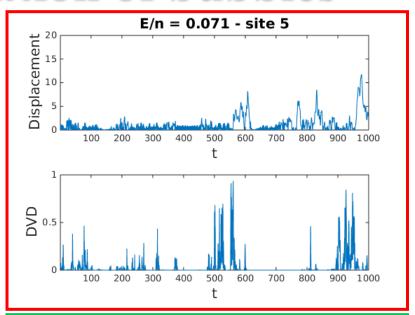


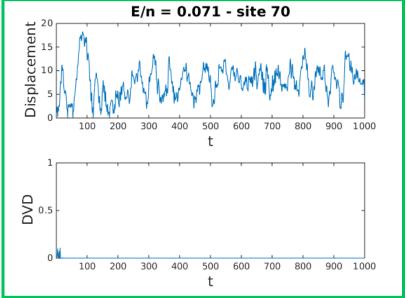




Relation between the concentration of the deviation vector at a site and the formation of a bubble at that site.

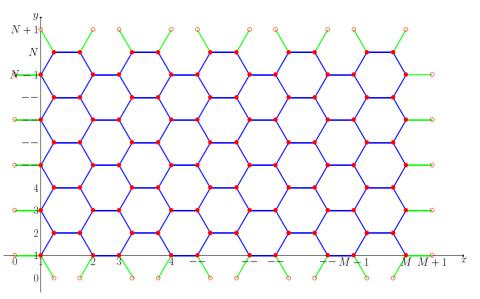




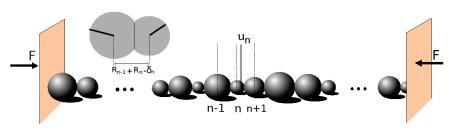


### **Future works**

- DKG and DDNLS models in 2 spatial dimensions
- Extended, sequence-dependent PBD models of DNA
- Models of granular material
- Graphene models

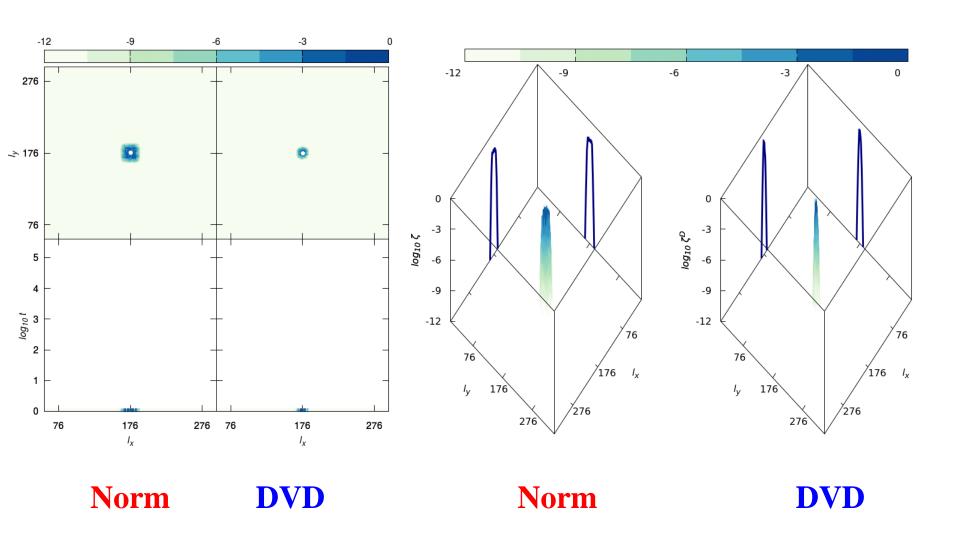






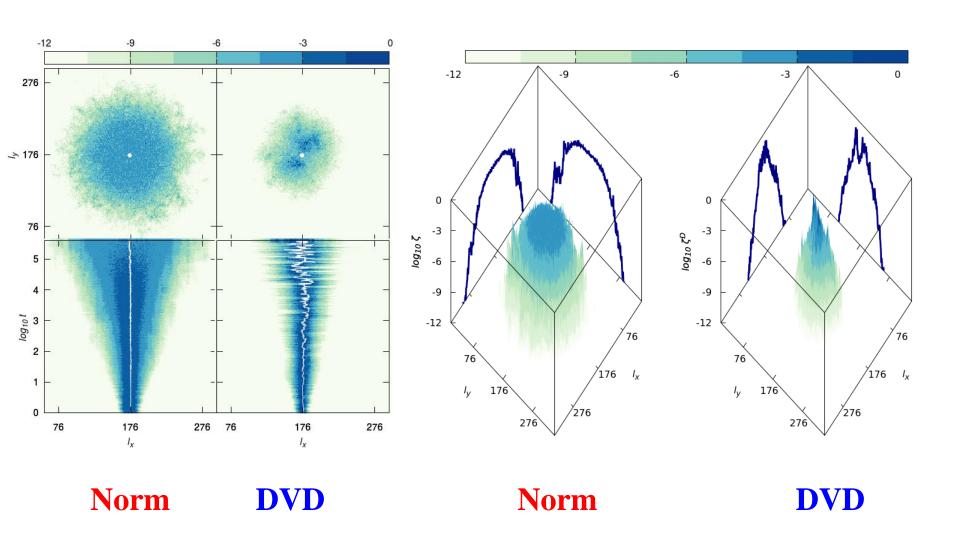
### **Future works**

#### **DDNLS** in 2 spatial dimensions (strong chaos)



### **Future works**

### **DDNLS** in 2 spatial dimensions (strong chaos)



# Summary

- Both the DKG and the DDNLS models show similar chaotic behaviors
- The mLCE and the DVDs show different behaviors for the weak and the strong chaos regimes.
- Lyapunov exponent computations show that:
  - ✓ Chaos not only exists, but also persists.
  - ✓ Slowing down of chaos does not cross over to regular dynamics.
  - ✓ Weak chaos: mLCE ~  $t^{-0.25}$  Strong chaos: mLCE ~  $t^{-0.3}$
- The behavior of DVDs can provide information about the chaoticity of a dynamical system.
  - ✓ Chaotic hot spots meander through the system, supporting a homogeneity of chaos inside the wave packet.
- Heterogeneity influences the chaotic behavior of the DNA chaotic behavior.
- There seems to be a relation between the concentration of the DVD at a site and the formation of a bubble
- B. Senyange, B. Many Manda & Ch. S.: Phys. Rev. E, 98, 052229 (2018) 'Characteristics of chaos evolution in one-dimensional disordered nonlinear lattices'
- M. Hillebrand, G. Kalosakas, A. Schwellnus & Ch. S.: Phys. Rev. E, 99, 022213 (2019) 'Heterogeneity and chaos in the Peyrard-Bishop-Dauxois DNA model'

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