

# Reconstructing the free energy landscape of a mechanically unfolded model protein

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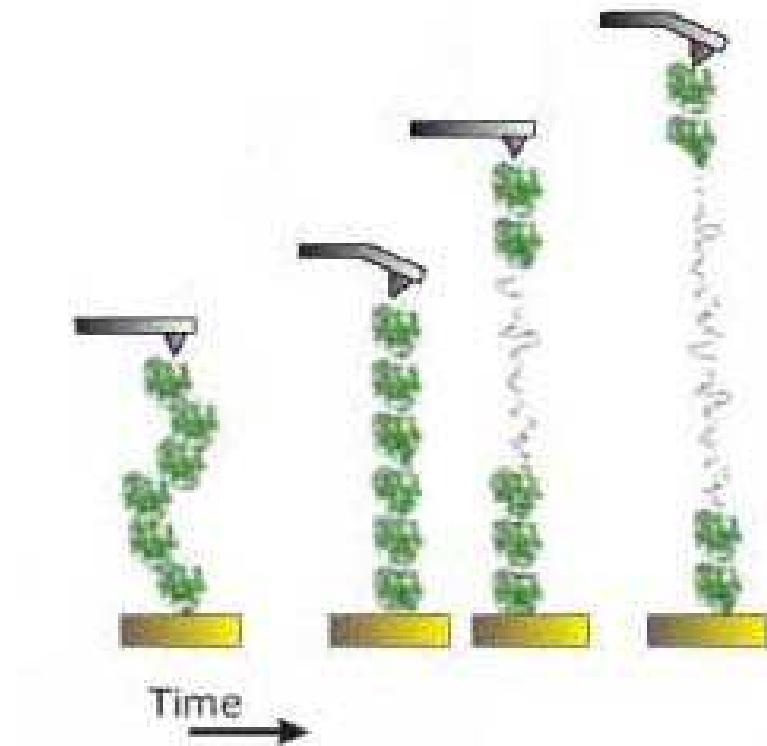
(Politecnico di Torino)



# Introduction

Reconstruction of the (equilibrium) free energy landscape of a protein from out-of-equilibrium mechanically unfolded configurations (Atomic Force Microscope) via two methods:

- Extended Jarzynski Equality
- thermodynamical averages over Inherent Structures (IS) of the protein  
ISs  $\equiv$  local minima of the potential energy



# Summary

- Jarzynski Equality (JE)
- Extended Jarzynski Equality (EJE)
- Protein model and thermodynamic features ( $T_\theta, T_f, T_g$ )
- Pulling protocol
- EJE reconstruction
- Inherent structures (ISs)
- EJE versus ISs reconstruction
- Conclusions and perspectives

To be read:

- D.J. Wales, *Energy Landscapes* (Cambridge Univ. Press, 2003);
- C. Jarzynski *Phys. Rev. Lett.* 78, 2690 (1997)

# Reversible Work

The system is described by the **Hamiltonian**  $H(x, \mu)$ , where  $x$  defines the state of the system and  $\mu$  is an external parameter that can be manipulated.

- Within the **canonical ensemble** the equilibrium state is described by the Gibbs distribution  $p_{\mu}^{eq}(x) = \frac{e^{-H(x, \mu)\beta}}{Z_{\mu}}$
- The **partition function** is  $Z_{\mu} = \int dx e^{-H(x, \mu)\beta}$   
The **free energy** reads as  $F_{\mu} = -\log Z_{\mu}/\beta$
- The derivative of  $F_{\mu}$  with respect to the parameter  $\mu$  gives:

$$\frac{\partial F_{\mu}}{\partial \mu} = \int dx p_{\mu}^{eq}(x) \frac{\partial H}{\partial \mu} = \left\langle \frac{\partial H}{\partial \mu} \right\rangle_{\mu}$$

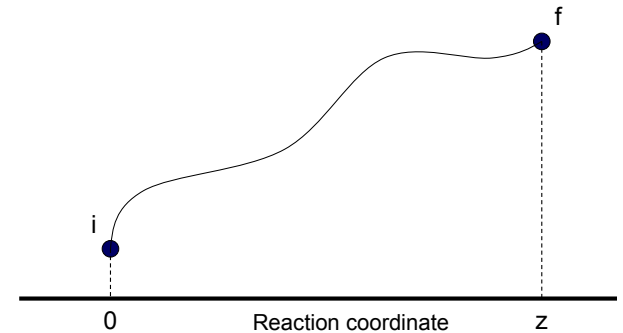
where  $\langle \cdot \rangle_{\mu}$  is the average done within the canonical ensemble

- A finite variation of the parameter induces the following variation of  $F_{\mu}$   
 $\Delta F = F_{\mu} - F_0 = \int_0^{\mu} d\mu' \left\langle \frac{\partial H}{\partial \mu} \right\rangle_{\mu'} \equiv W_{rev}$
- At equilibrium the **reversible work** done on the system is equal to the free energy variation  $\Delta F = W_{rev}$   
 $W_{rev}$  does not fluctuate, since it is an equilibrium average of an observable. <sup>a</sup>

<sup>a</sup> Tolman, The principles of statistical mechanics (Oxford, 1938)– Imparato & Peliti (cond-mat/0706.1134)

# Jarzynski equality (JE)

Jarzynski equality <sup>a</sup> relates the work done on the system during an **out-of-equilibrium process** to the difference of **equilibrium** free energy.



<sup>a</sup>C. Jarzynski *Phys. Rev. Lett.* 78, 2690 (1997)

$$(1) \quad \langle e^{-\beta W_{if}} \rangle_{t_f} = e^{-\beta(F_z(t_f) - F_0)} \quad \beta = 1/kT, \quad F_0 = F_z(0)$$

where:

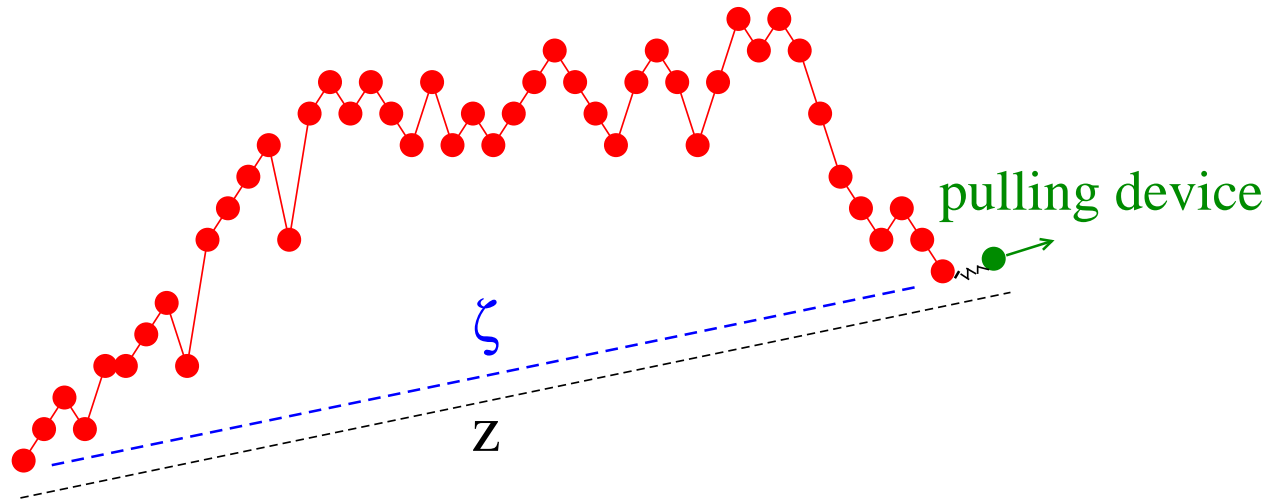
- $\langle \dots \rangle_{t_f} \rightarrow$  average over repetitions of the same experiment (protocol)
- Initial and final equilibrium states
- $W_{if} \rightarrow$  work done on the system -  $W_{if}$  fluctuates due to thermal fluctuations  

$$W_{if} = \int dW = \int_{t=0}^{t=t_f} dt \dot{z} \frac{\partial H(x(t), z)}{\partial z}$$
- $z \rightarrow$  externally controlled manipulation parameter (position of the pulling device)
- $z = z(t) \quad t \in [0, t_f]$  manipulation protocol

Problem  $\rightarrow$  JE gives the equilibrium  $F$ -profile + the pulling device as a function of  $z$

# Extended Jarzynski equality (EJE)

stretching of a polypeptidic chain



$$(2) \quad \langle \delta(\zeta - \zeta(x)) e^{-\beta[W - U_{z(t)}(\zeta)]} \rangle_t = e^{-\beta(F(\zeta) - F_0)}$$

where: <sup>a</sup>

- $F(\zeta) = -kT \ln \int dx \delta(\zeta - \zeta(x)) e^{-\beta H(x)}$
- $U_{z(t)}(\zeta) = c[z(t) - \zeta]^2/2 \rightarrow$  coupling energy between device and protein
- $\zeta$  = end-to-end-distance  $\rightarrow$  internal collective coordinate
- $z \rightarrow$  distance between the first bead and the pulling device

<sup>a</sup>G. Hummer and A. Szabo, *PNAS* **98**, 3658 (2001), A. Imparato and L. Peliti, *J. Stat. Mech.* 03005 (2006)

# The protein model (I)

The simplified model assumes that the aminoacids (the residues) are represented by the  $C_\alpha$  positioned along **a one dimensional chain** and the aminoacids are of three types only :

**B=hydrophobic**, **P=polar** , **N=neutral**

The simplified interactions are :

- a stiff nearest-neighbour harmonic potential intended to maintain the **bond distance almost constant** :  $V^{harm}$ ;
- a three body interactions which accounts for the bond angles :  $V^{ang}$  ( $\theta_0 = 105$ );
- a four-body potential corresponding to the dihedral terms and responsible for the formation of secondary structures  $V^{dih}$  (in this case  **$\beta$ -sheets** are favourite);
- a long-range Lennard-Jones potential reproducing in an effective way the presence of the solvent  $V^{LJ}$  (**hydrophobic and hydrophilic** mediated interactions among residues);

This simple model has been widely studied in the last **17 years**, because it reproduces some general feature of **protein folding**, in particular depending on the **aminoacid sequence** **bad** or **good** folders are observables, moreover it can lead to the formation of different secondary structures ( **$\alpha$ -elices** or  **$\beta$ -sheets**).

This model with the parameter here studied favourites the formation of **four stranded  $\beta$ -barrel native configurations**.

# The protein model (II)

Model **BPN** (B=hydrophobic, P=polar, N=neutral)  $N = 46$

Sequence:  $B_9N_3(PB)_4N_3B_9N_3(PB)_5P$

 Intramolecular potential <sup>a</sup>:

$$(3) \quad V = \sum_{i=1}^{N-1} V_i^{harm} + \sum_{i=2}^{N-1} V_i^{ang} + \sum_{i=2}^{N-2} V_i^{dih} + \sum_{i=1}^{N-3} \sum_{j=i+3}^N V_{ij}^{LJ}$$

$$V_i^{harm} = \alpha(r_{i,i+1} - \sigma)^2$$

$$V_i^{ang} = A \cos(\theta_i) + B \cos(2\theta_i)$$

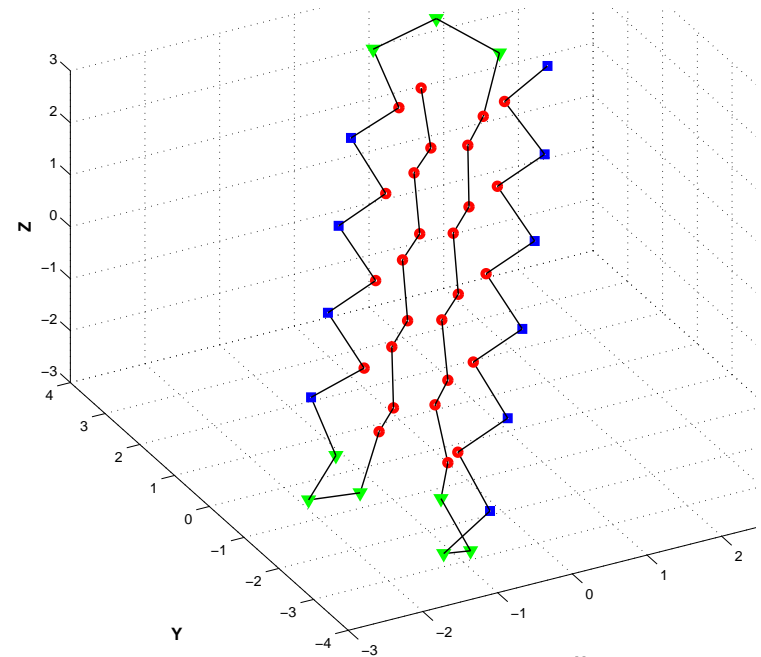
$$V_i^{dih} = A_i [1 + \cos(\phi_i)] + B_i [1 + \cos(3\phi_i)]$$

$$V_{ij}^{LJ} = C_{ij} \left[ \left( \frac{\sigma}{r_{ij}} \right)^{12} - D_{ij} \left( \frac{\sigma}{r_{ij}} \right)^6 \right]$$

 Global minimum of  $V \rightarrow$  native configuration

 Langevin dynamics:

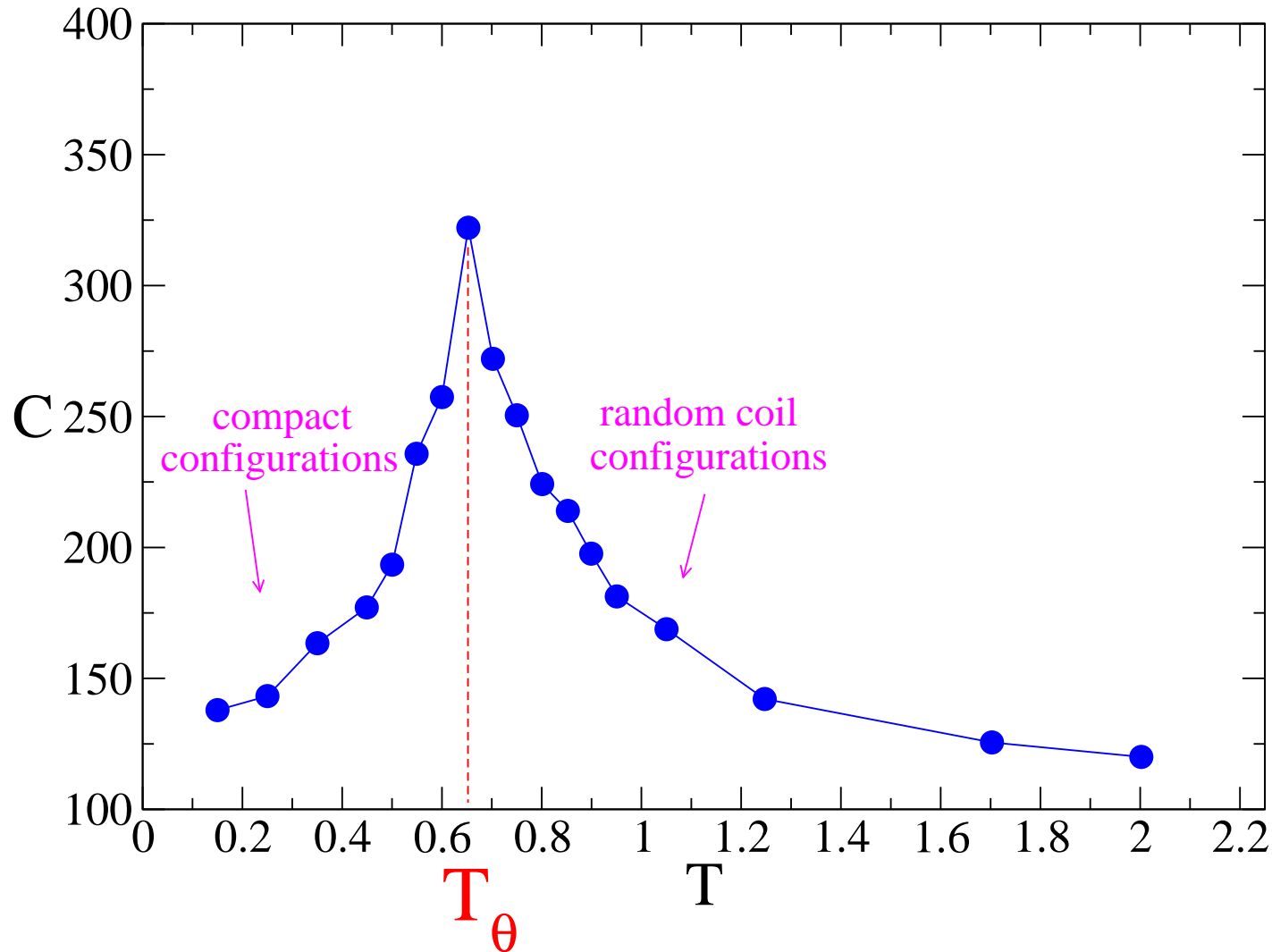
$$(4) \quad m\ddot{\mathbf{r}}_i = -\nabla V - \gamma\dot{\mathbf{r}}_i + \eta(t) \quad i = 1, N$$



<sup>a</sup> J.D. Honeycutt and D. Thirumalai, *PNAS* **87**, 3526 (1990), R.S. Berry et al, *PNAS* **94**, 9520 (1999)



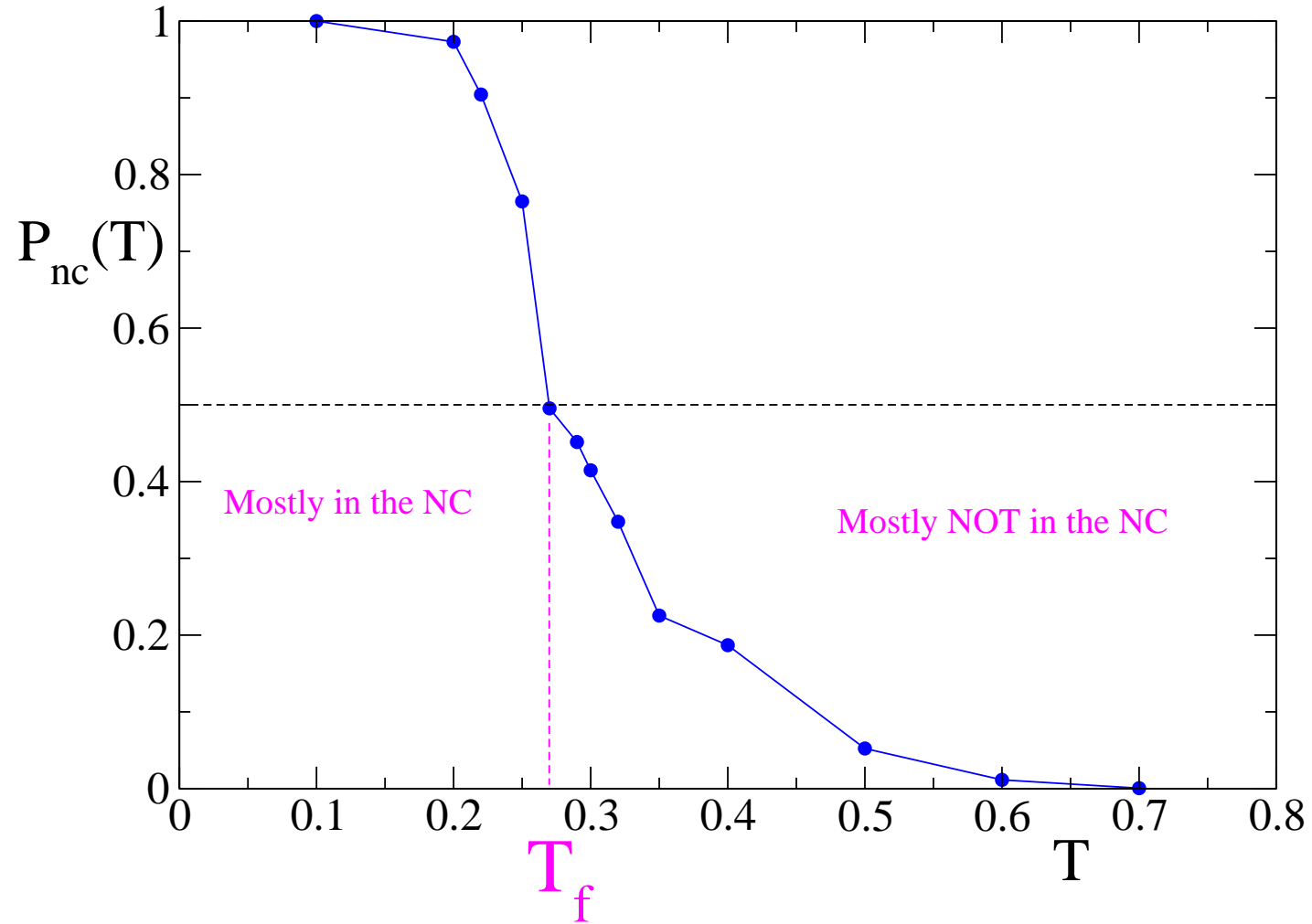
# Hydrophobic collapse temperature



$$C(T_\theta) = C^{max} \rightarrow T_\theta = 0.65(1) \quad \text{where} \quad C(T) = \frac{\langle E^2 \rangle - \langle E \rangle^2}{T^2} \quad a$$

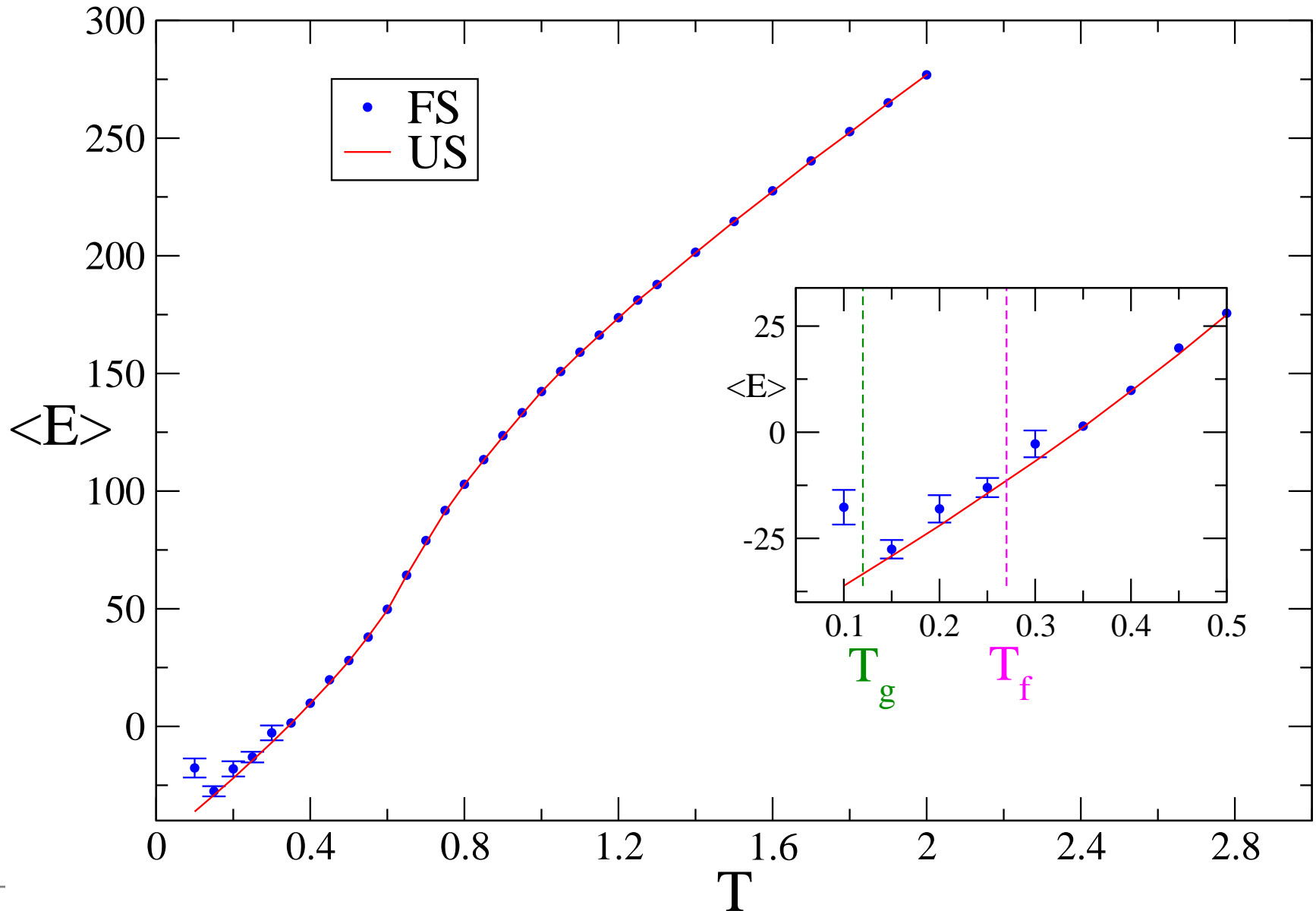
<sup>a</sup>De Gennes, Scaling concepts in polymer physics (1979),

# Folding temperature

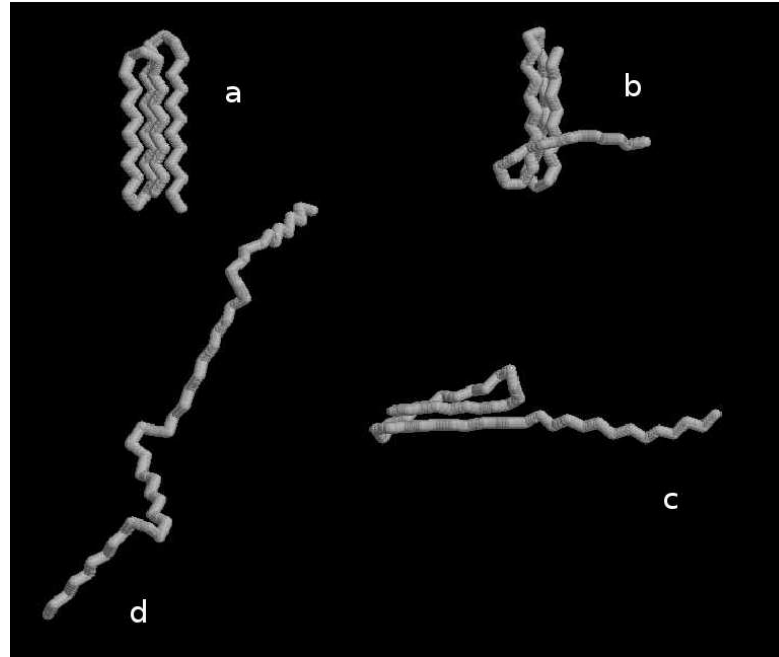


$$P_{nc}(T_f) = 0.5 \rightarrow T_f = 0.27(1)$$

# Glassy temperature



# Pulling protocol



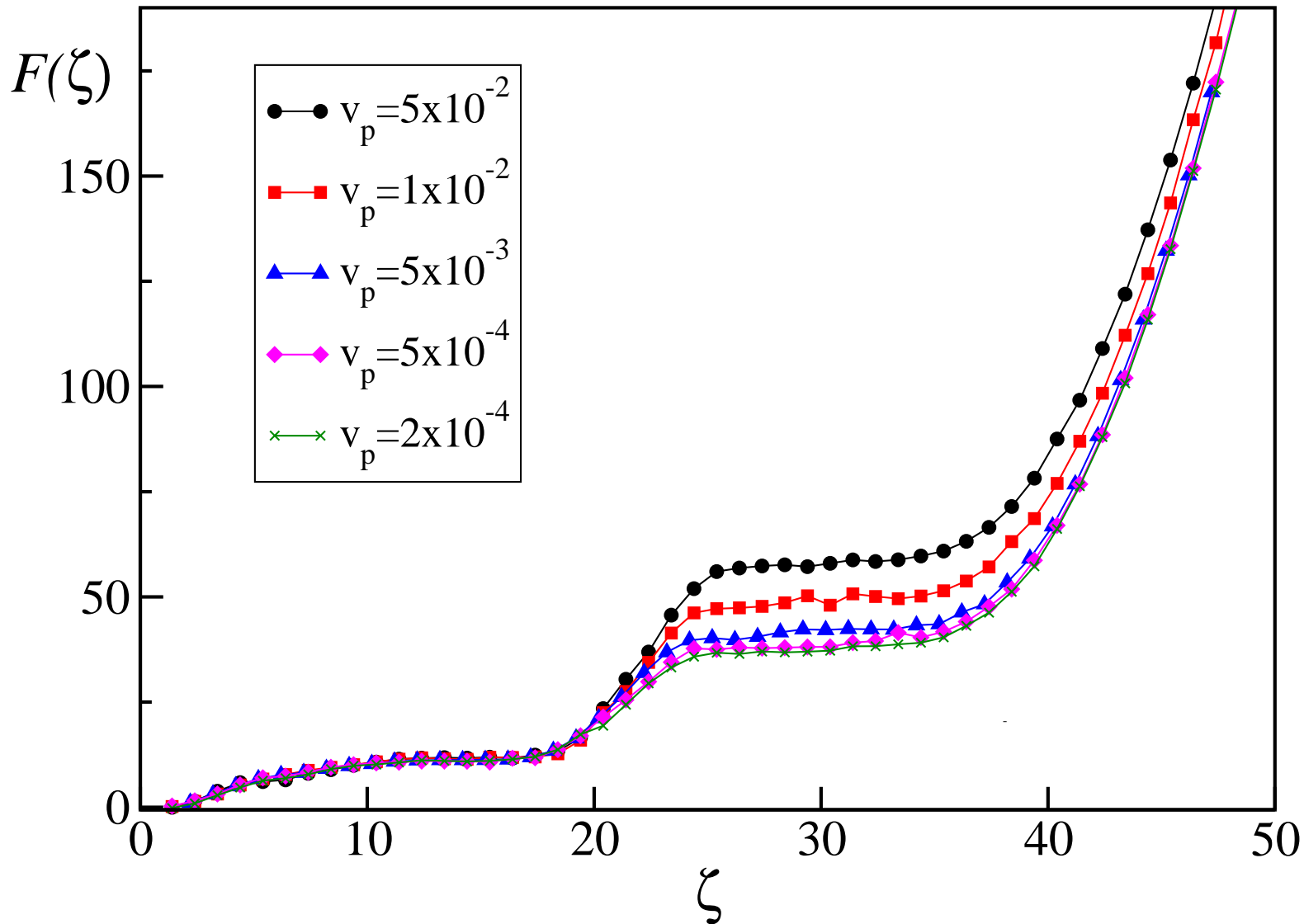
- the first bead is kept fixed and the last is attached to the pulling device (a stiff spring) moving along a fixed direction with the law: <sup>a</sup>  
$$z(t) = z(0) + v_p t \quad t \in [0, t_f] \quad \text{linear protocol } (v_p = \text{constant velocity})$$
$$U(\xi) = k/2(z(t) - \xi(t))^2 \quad \text{external potential}$$
- forced unfolding performed at constant temperature via Langevin dynamics

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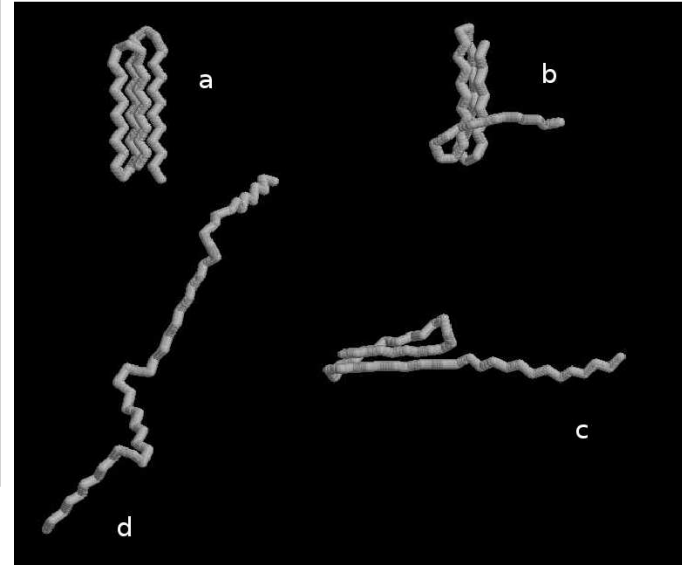
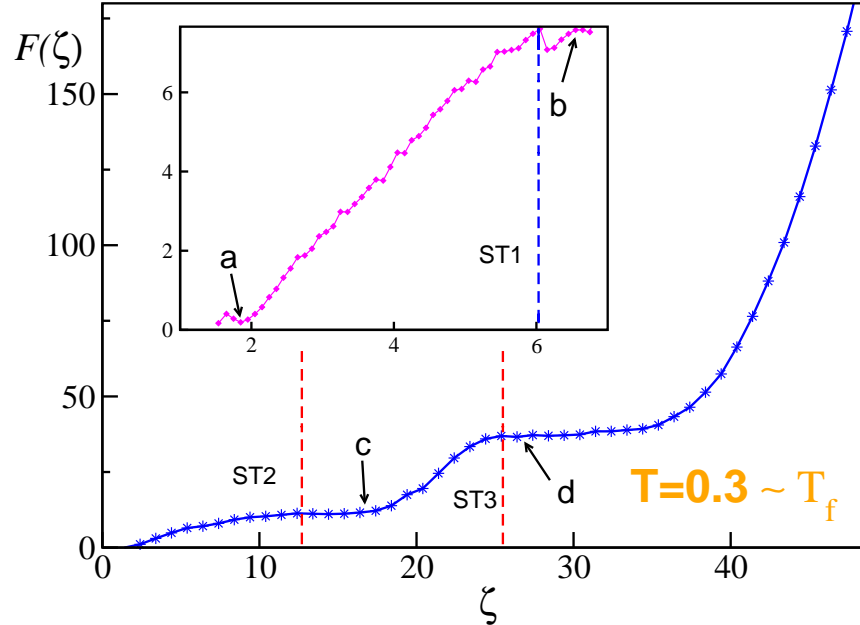
<sup>a</sup> Analogous to experimental setups N.C. Harris *et al.* PRL (2007)

# EJE: asymptotic reconstruction

T=0.3

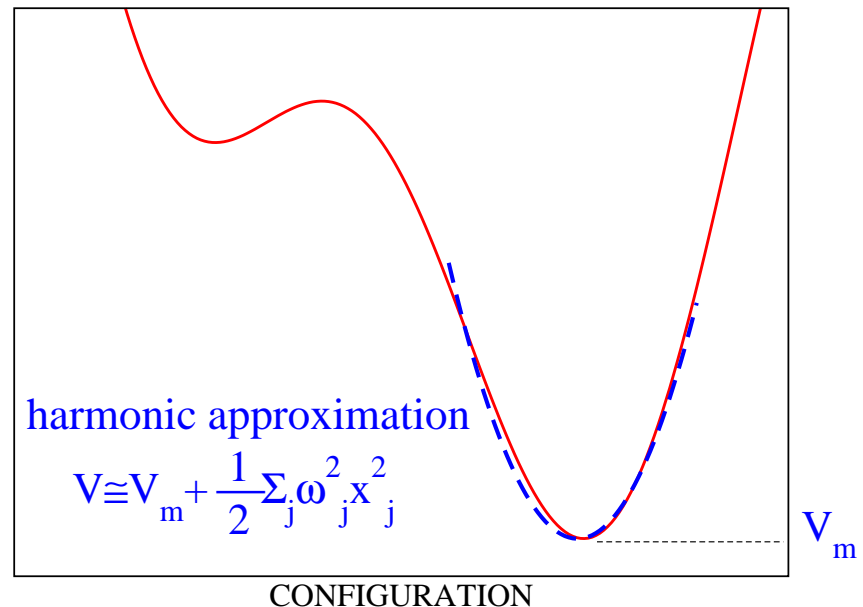
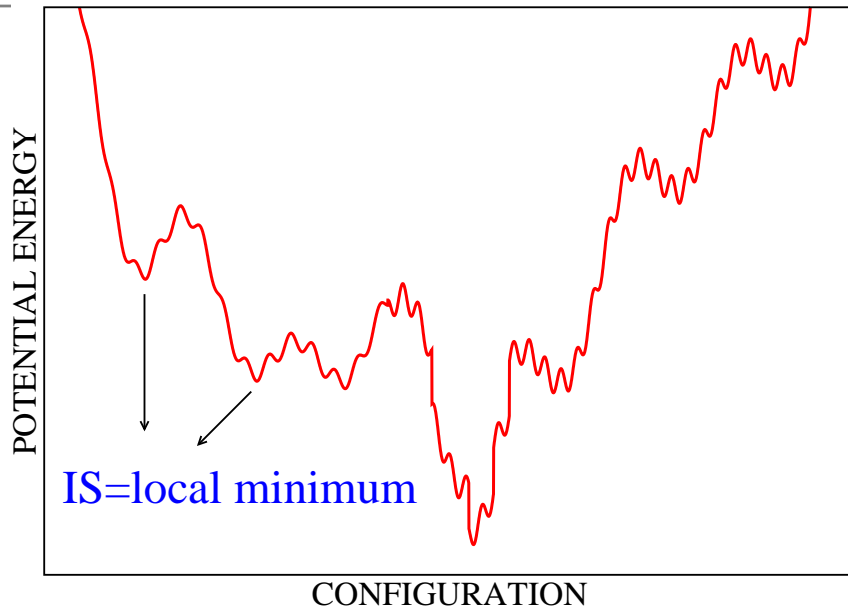


# EJE reconstruction



- **ST1** → **Escape from the native valley**, below  $\zeta \sim 6$  the configurations are similar to the NC
- **ST2** corresponds to pull completely out of the  $\beta$ -barrel the last strand (i.e.  $(PB)_5P$ ), the **plateau**  $13 < \zeta < 18.5$  is due to the stretching of the strand (**no work done**);
- **ST3** is associated to the **complete destabilization of the core of the protein** induced by pulling out the third strand, the plateau is associated to configurations similar to (d).
- The final quadratic rise corresponds to the stretching of bond angles and distances beyond their equilibrium values ( $\zeta > \zeta_{trans}$ )

# Inherent structures (ISs)



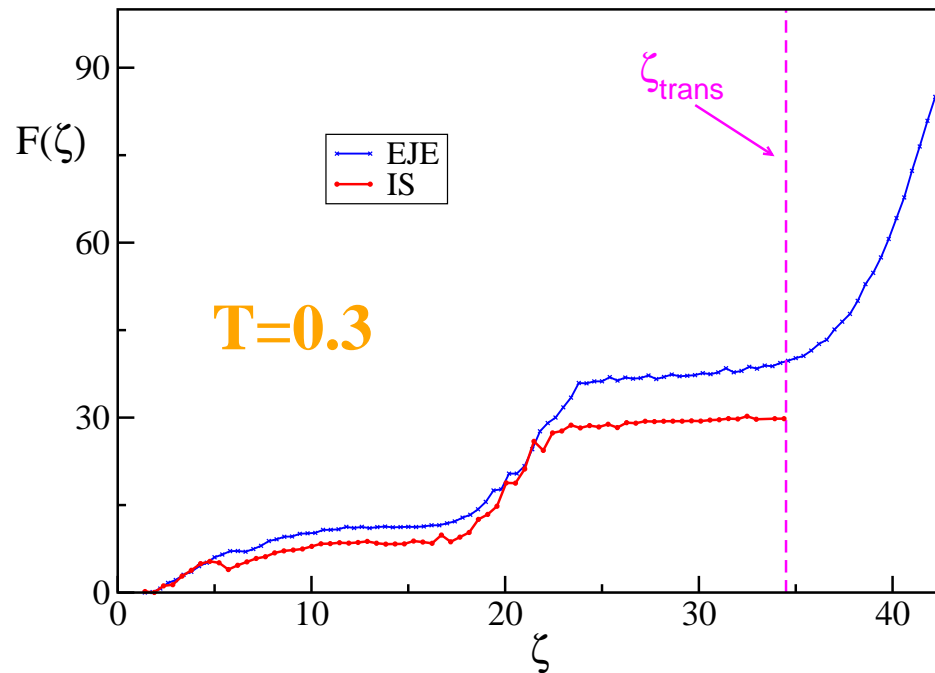
Within the IS formalism and assuming harmonic basins of attraction: <sup>a</sup>

$$(5) \quad e^{-\beta F_{IS}} = Z_{IS} = \sum_m e^{-\beta(V_m + W_m)} \propto \sum_m e^{-\beta V_m} \prod_{j=1}^{3N-6} (k_B T / \omega_m^j) \quad \text{where :}$$

- $V_m$  (resp.  $W_m$ ) → potential (resp. vibrational free) energy of the IS;
- $\{\omega_m^j\}$  → frequencies of the vibrational modes.

<sup>a</sup>Wales, *Energy Landscapes* (2003); Nakagawa & Peyrard, PNAS (2006)

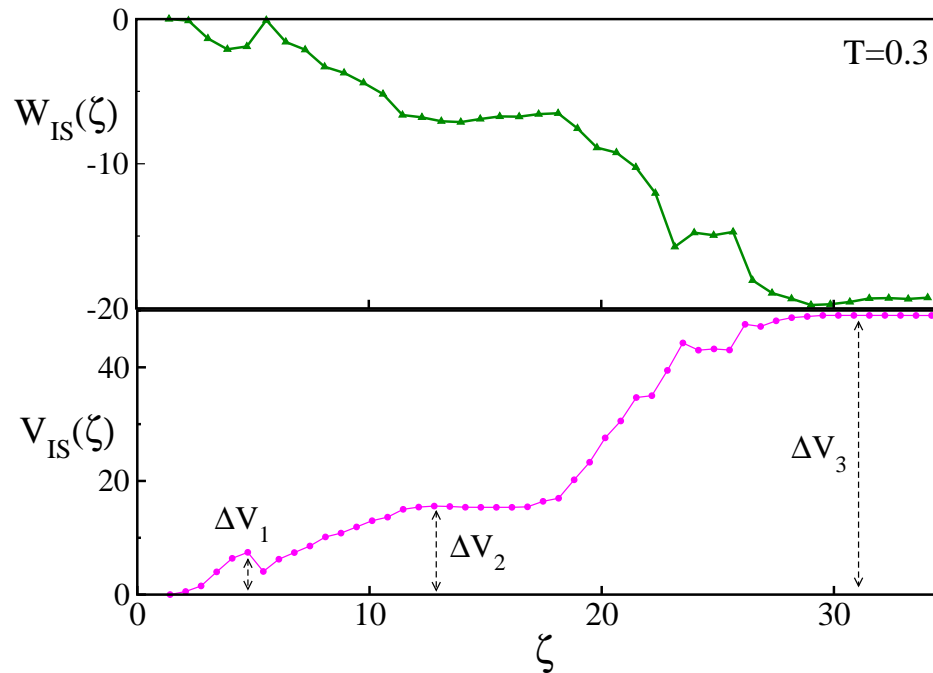
# EJE versus ISs reconstruction



- Good agreement up to  $\zeta \sim 20$ , up to this end-to-end distance the protein unfolds along the funnel **jumping from one minima to another** ;
- At higher  $\zeta$  the underestimation given by the IS reconstruction should be noticeably reduced by including also **the saddles in the IS analysis**.
- $\zeta > \zeta_{trans}$  **no more minima in the landscape, only saddles**



# Energetic and entropic barriers



$$(6) \quad V_{IS}(\zeta) = \sum'_m V_m e^{-\beta(V_m + W_m)} / Z_{IS}(\zeta)$$

where  $\sum'_m$  is limited to IS with end-to-end distance within  $[\zeta, \zeta + \delta\zeta]$ .

$$\Delta V_i = \text{energetic barrier} \quad \text{transition temperature} \rightarrow T_t^i = \frac{2\Delta V_i}{3N} \quad i = 1, 2, 3$$

$$T_t^1 = 0.11(1) \sim T_g \quad T_t^2 = 0.23(2) \sim T_f \quad T_t^3 = 0.72(1) \sim T_\theta$$

# Conclusions and perspectives

The equilibrium free energy landscape for a **good folder** sequence has been reconstructed as a function of an internal coordinate of the system (**the end-to-end distance  $\zeta$** ) via two independent methods <sup>a</sup>

- the agreement between the **IS** and the **EJE** reconstruction suggests that the two methodologies are consistent and able to reproduce equilibrium properties of the model;
- the **structural transitions** induced by pulling can be related to **thermodynamical aspects of folding**, thus indicating that  $\zeta$  is a **good reaction coordinate** at least for this model protein;

Recent publication of the first experimental free energy reconstruction using the EJE for a **Titin I27 domain**: **N.C. Harris *et al.* PRL (2007)**

Future plans:

- Application of the two methods to reconstruct the free energy landscape of a **bad folder** (same number and types of residues of the good folder but random sequence).
- Analysis of the protein pulling with the constant force protocol.

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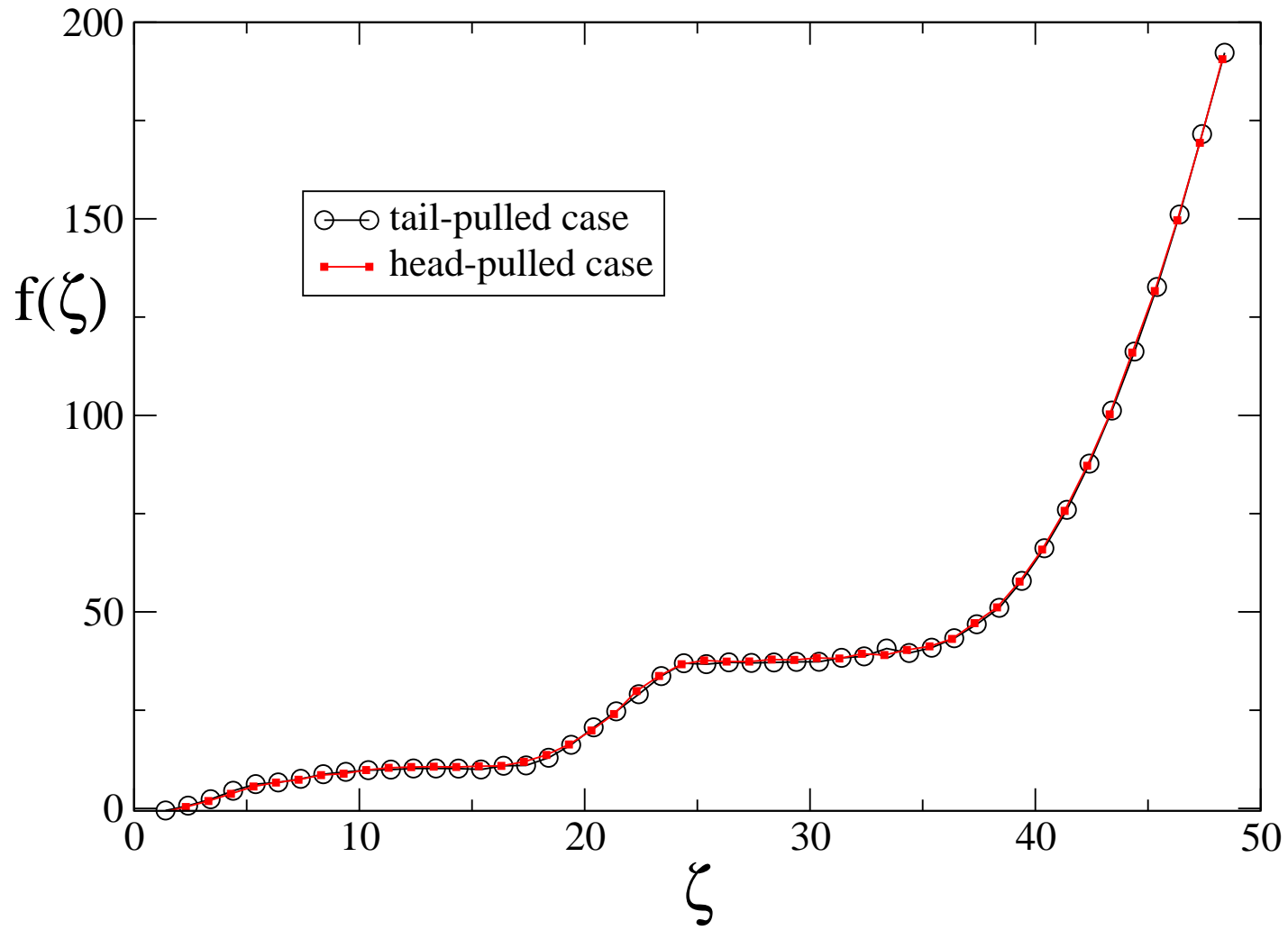
<sup>a</sup> A. Imparato, S. Luccioli, A.T, PRL (2007)

**THANK YOU  
FOR YOUR ATTENTION!**

<http://www.fi.isc.cnr.it/users/alessandro.torcini/>

# Tail-pulled versus head-pulled case

$$T=0.3, v_p=5 \times 10^{-4}$$



Agree with F.-Y Li *et al.*, Phys. Rev. E 63 021905 (2001)

# Langevin dynamics

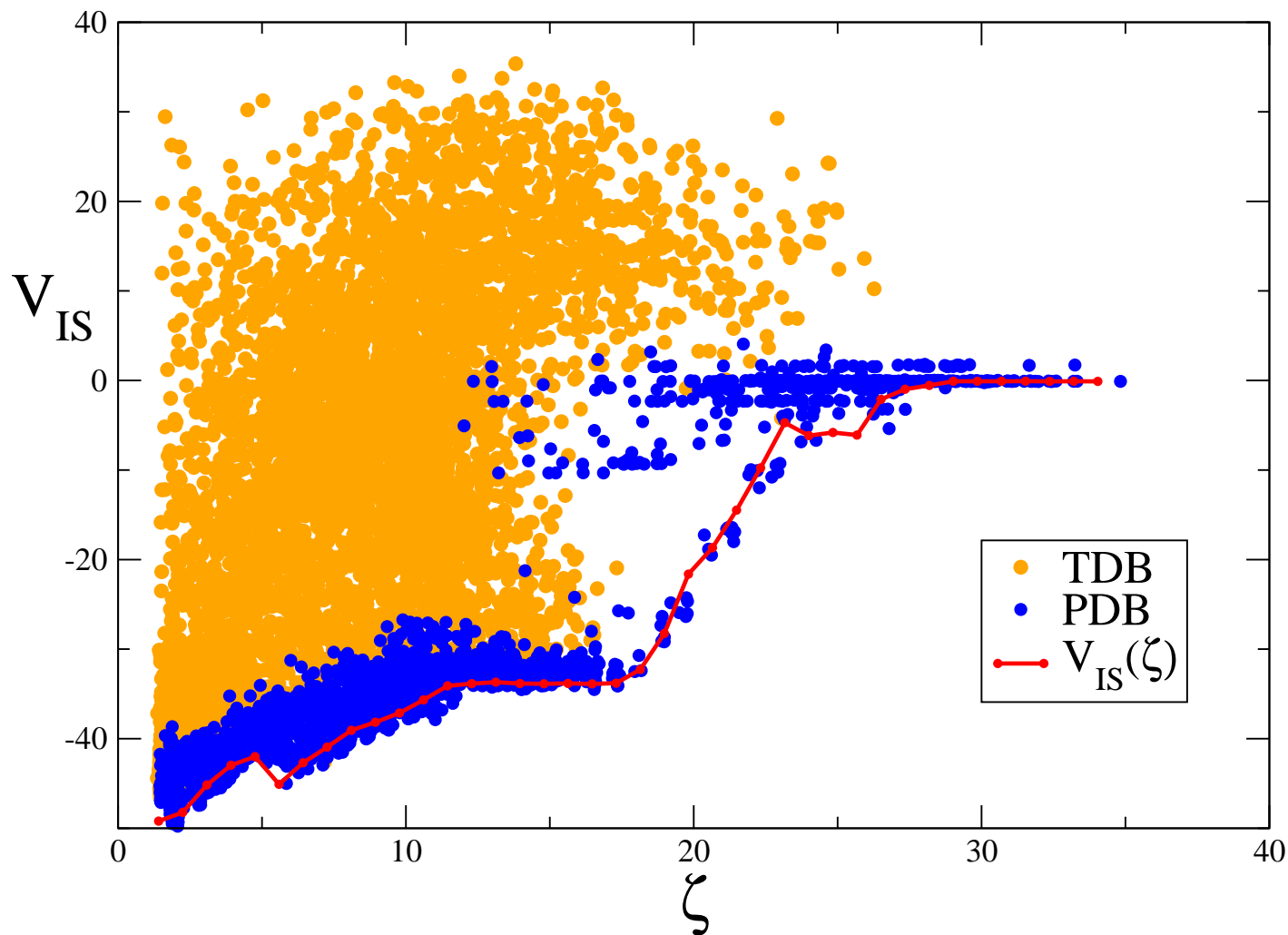
Canonical dynamics:

$$(7) \quad m\ddot{\mathbf{r}}_i = \mathbf{F}(\mathbf{r}_i) - \gamma\dot{\mathbf{r}}_i + \eta(t) \quad i = 1, N$$

where:

- $\langle \eta(t) \rangle = 0$      $\langle \eta_\alpha(t)\eta_\beta(t') \rangle = (2K_B T \gamma / m) \delta(t - t') \delta_{\alpha, \beta}$      $\alpha, \beta = x, y, z$
- $\mathbf{F} = -\nabla V$      $\gamma \rightarrow$  friction coefficient

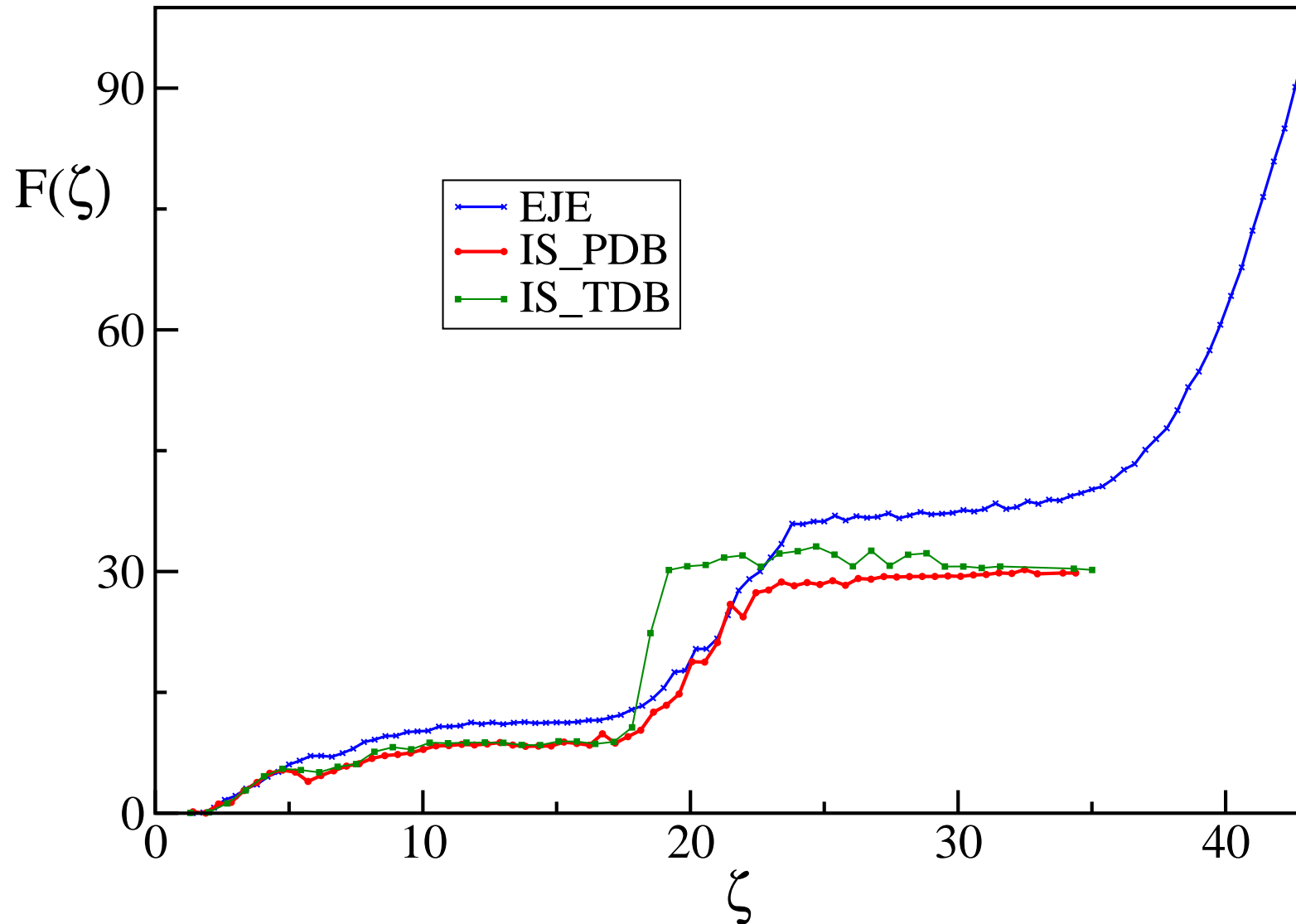
# ISs data banks



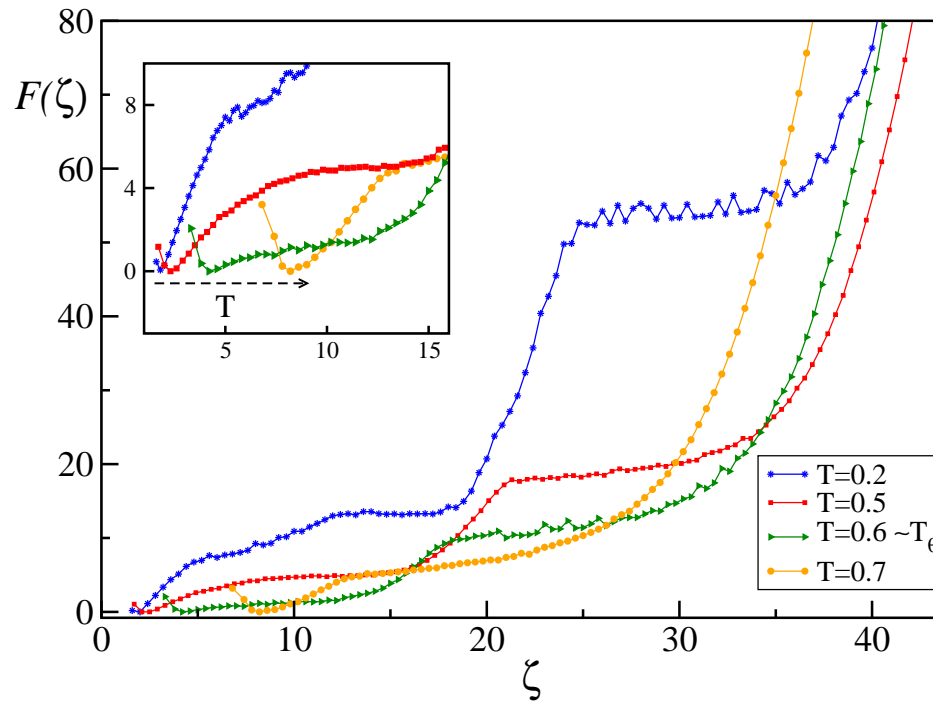
Two data bank of ISs (thermal data bank - TDB and pulling data bank - PDB) sampling the configurations visited in MD simulations and by relaxing via a steepest descent dynamics.

# EJE versus ISs reconstruction

T=0.3



# EJE: various temperatures



- $T \leq T_f$  → the absolute minimum of  $F(\zeta)$  is associated to the NC with  $\zeta_0 \sim 2$ ;
- $T_f < T < T_\theta$  the free energy exhibits minima at  $\zeta > \zeta_0$ : the NC is no more the most favourite configuration, however the ST2 and ST3 barriers are lower but still present;
- $T > T_\theta$  only the ST2 barrier remains, the protein is mainly in extended configurations like (c) with some residual barrel structure.