

Exploring Energy Landscapes

Objective: to exploit **stationary points** (minima and transition states) of the PES as a computational framework (*J. Phys. Chem. B*, **110**, 20765, 2006):

- **Basin-hopping** for global optimisation (*J. Phys. Chem. A*, **101**, 5111 1997).

The landscape is transformed via local minimisation: $\tilde{E}(\mathbf{X}) = \min E(\mathbf{X})$.

Steps are proposed via **geometrical perturbations**, and accepted or rejected according to criteria such as the change in **energy**, e.g. via **Metropolis**.

- Basin-sampling for global thermodynamics (*J. Chem. Phys.*, **124**, 044102, 2006).

This approach uses the superposition method, where the total partition function is written as a sum over minima, $Z(T) = \sum_a Z_a(T)$.

- Discrete path sampling for global kinetics (*Mol. Phys.*, **100**, 3285, 2002).

Transition state searches are used to construct a kinetic transition network. Rate constants are extracted assuming Markovian dynamics and a unimolecular rate theory for individual minimum-to-minimum transitions.

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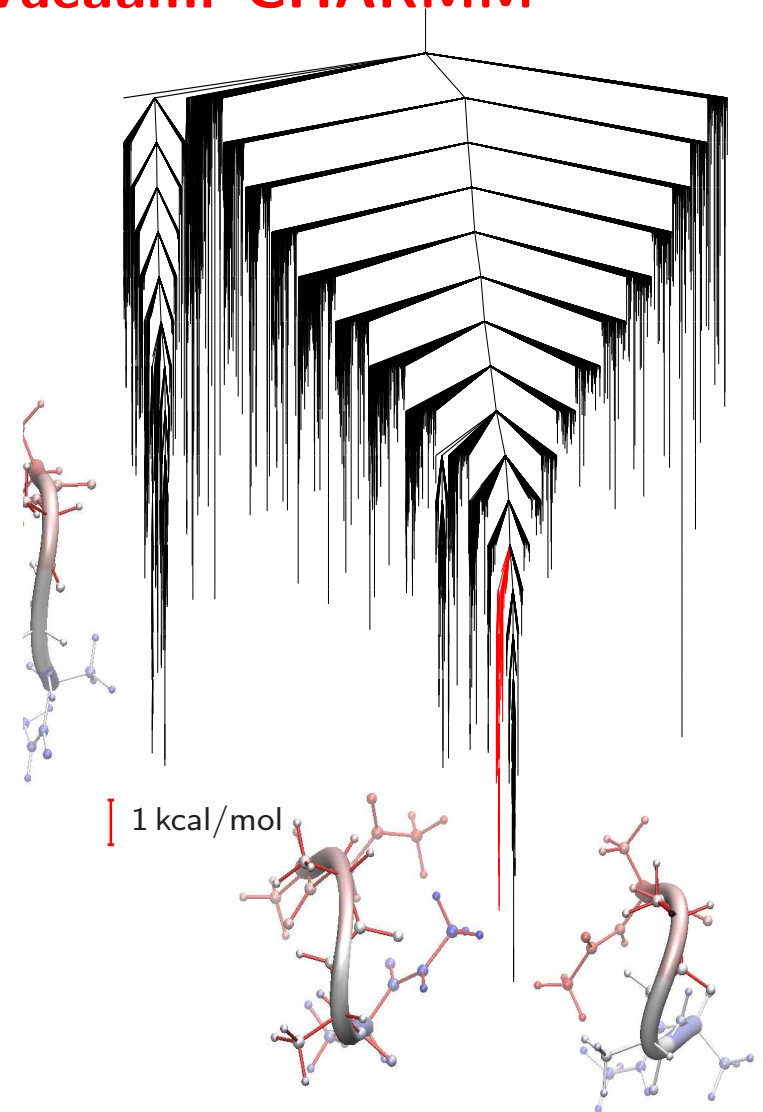
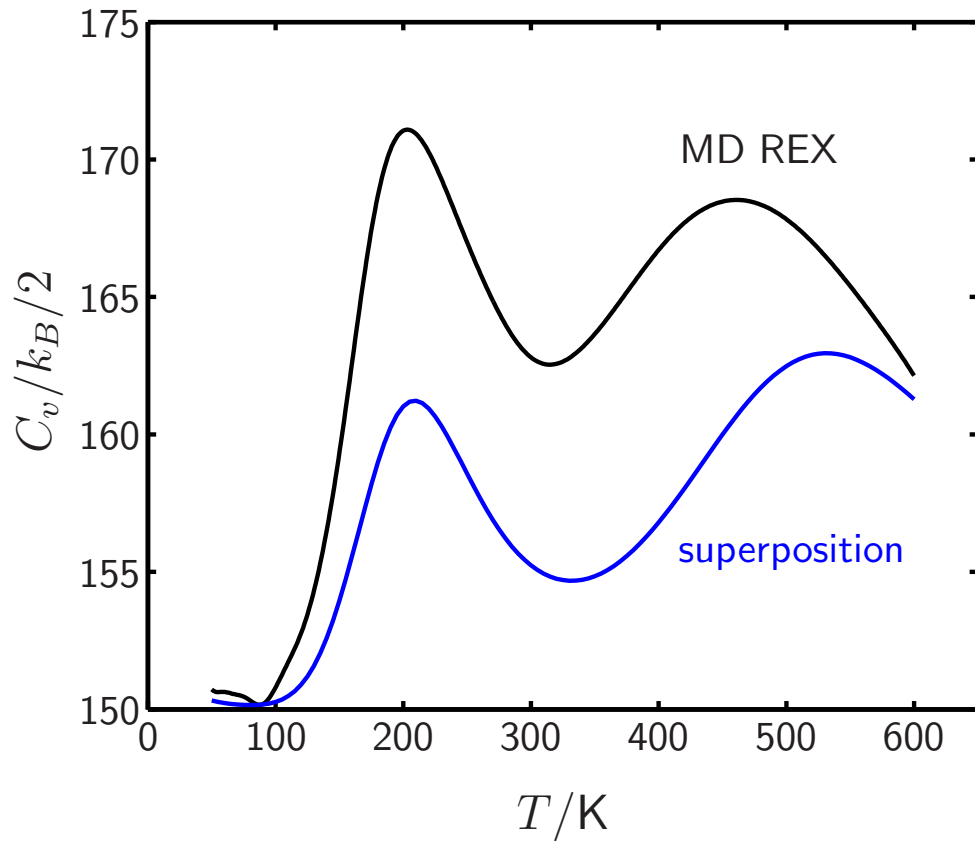
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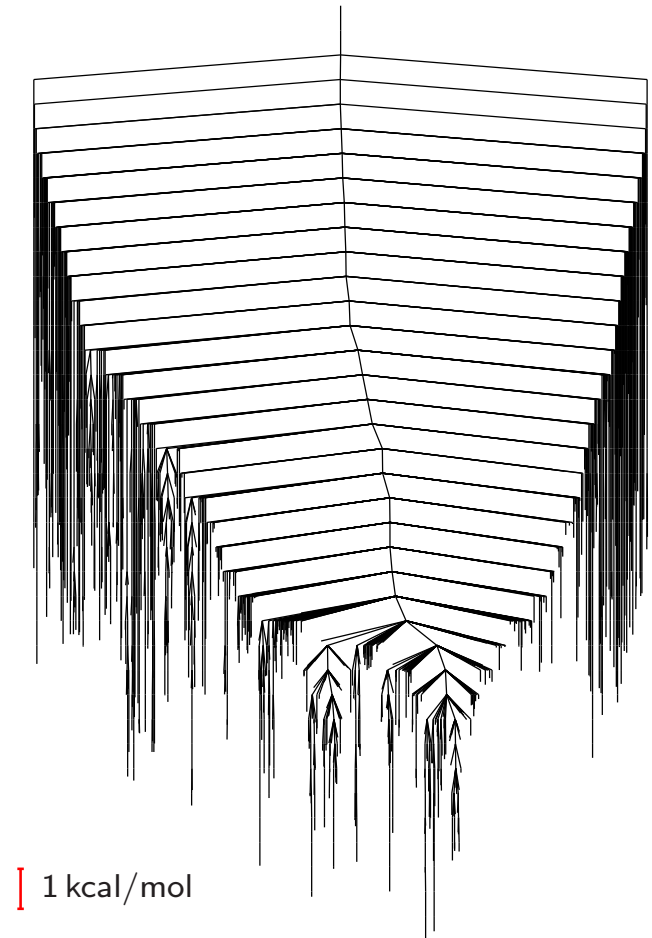
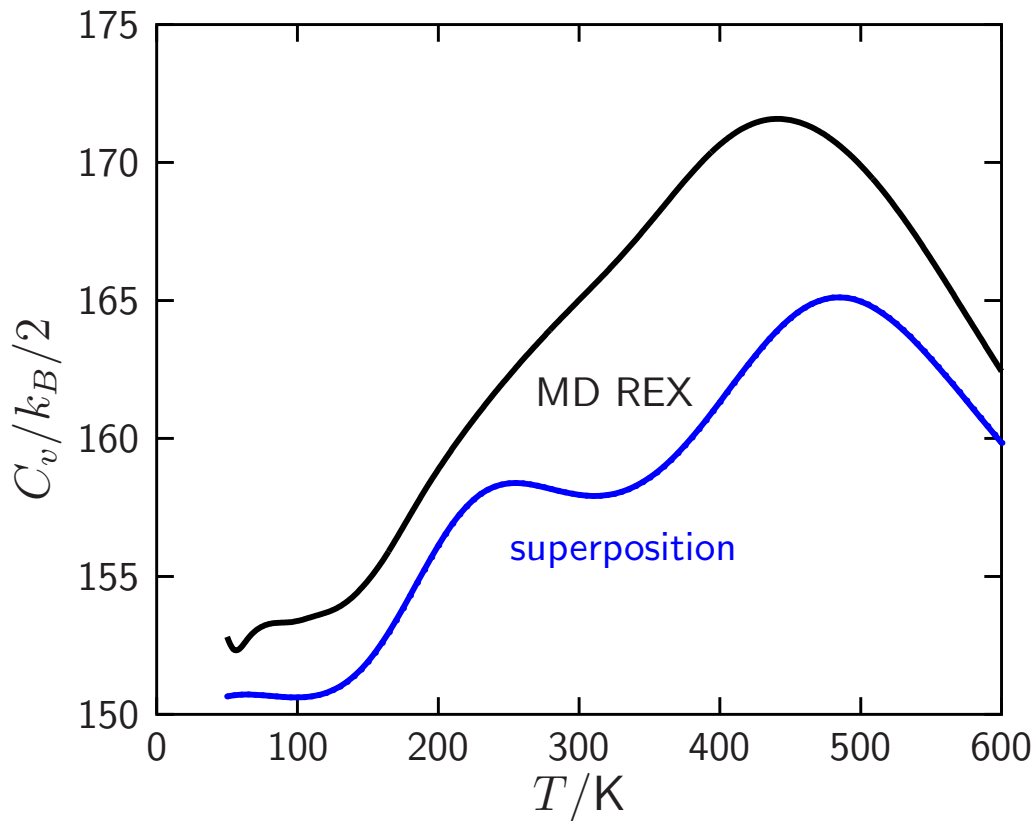
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Thermodynamics for Ala₄ in Vacuum: CHARMM



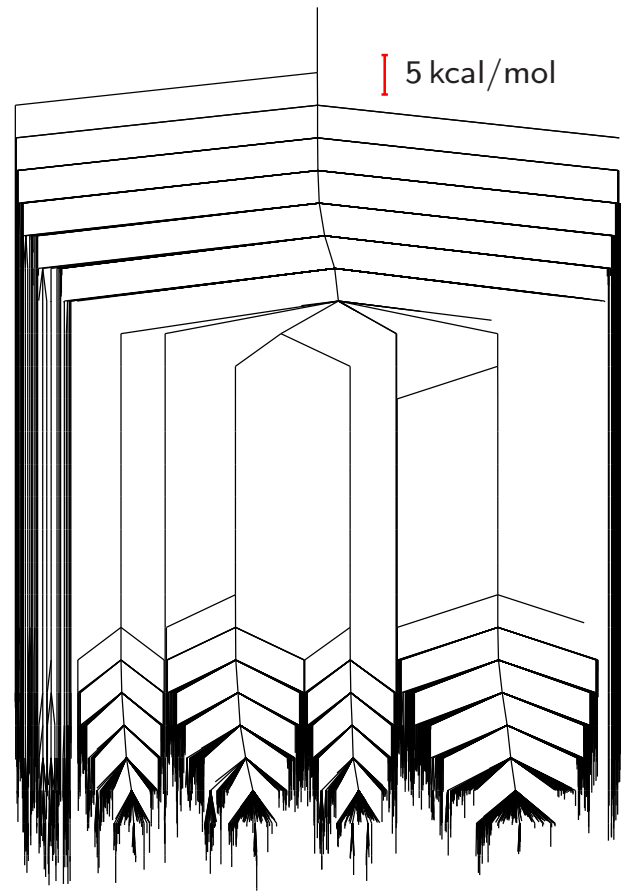
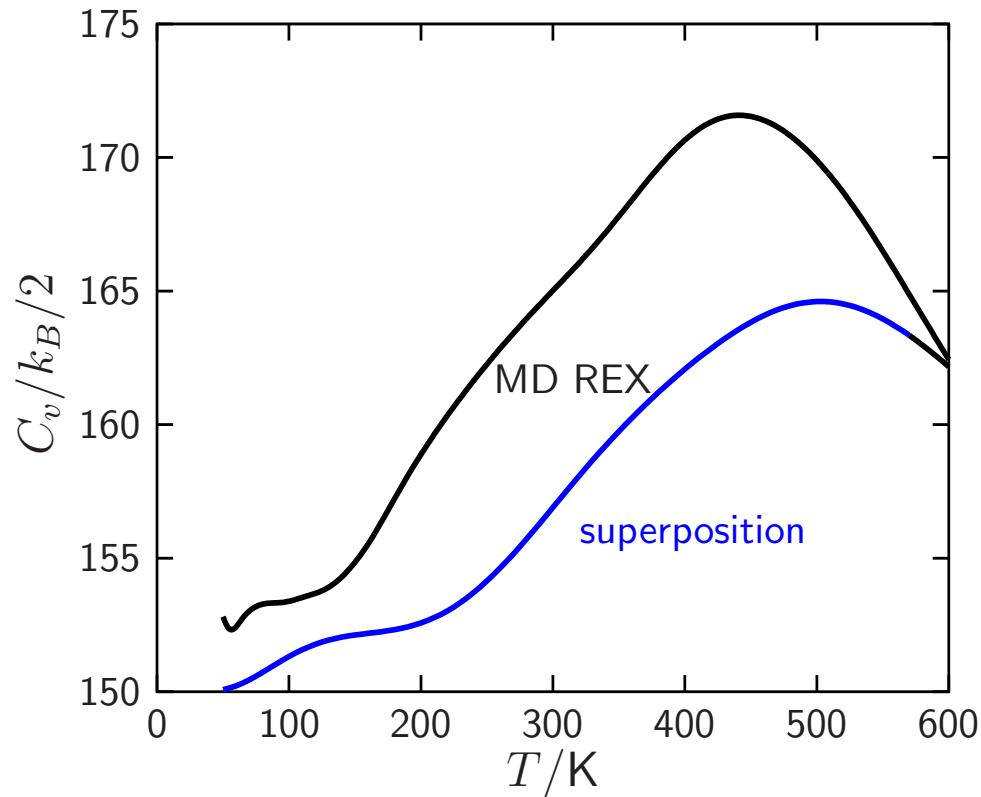
Ala₄ in vacuum (charmm27) has a **low** temperature C_v **peak**, corresponding to the hundred or so lowest minima in the **disconnectivity graph**. The **high** temperature peak corresponds to the finite system analogue of **melting**.

Thermodynamics for Ala₄ in Vacuum: AMBER



Ala₄ in vacuum (**amber99sb**) appears to be similar to CHARMM.

Thermodynamics for Ala₄ in Vacuum: AMBER



In fact, the **global minimum** for this potential has a mixture of **L** and **D** amino acids. The landscape separates into regions with different **L/D** composition, separated by barriers of order **90 kcal/mol**.

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Geometry Optimisation

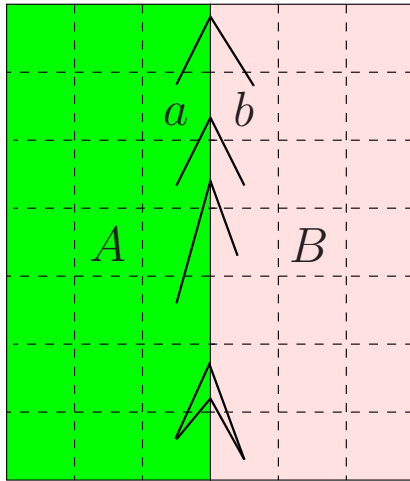
Minimisation: Nocedal's algorithm, **LBFGS**, with line searches removed.

Transition states: single-ended searches use **hybrid eigenvector-following** ('Defect Migration in Crystalline Silicon', *Phys. Rev. B*, **59**, 3969, 1999); double-ended searches use the **doubly-nudged** elastic band approach (*J. Chem. Phys.*, **120**, 2082, 2004; cf. Henkelman and Jónsson).

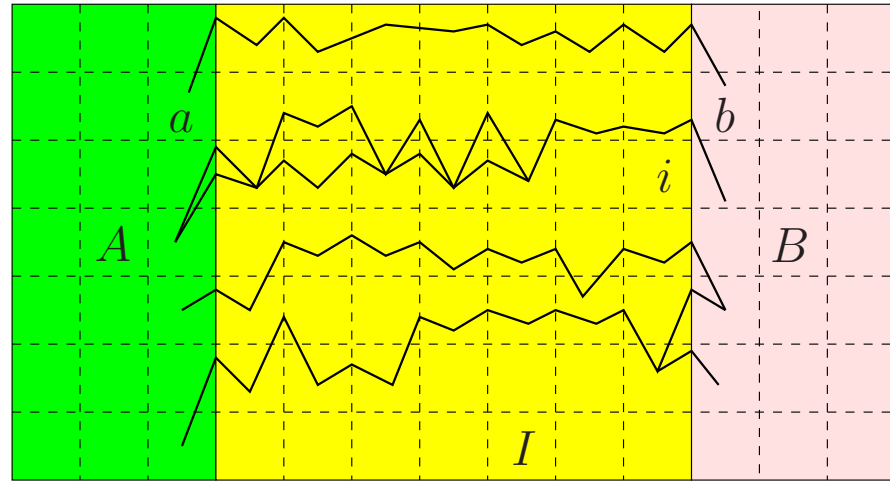
The **GMIN** (global optimisation), **OPTIM** (transition states and pathways) and **PATHSAMPLE** (discrete path sampling) programs are available under the **Gnu** General Public License. Access to the svn source can be arranged for **developers**. Current **svn** tarball image: <http://www-wales.ch.cam.ac.uk>.

Interfaces to many **electronic structure** codes are included. Example: **split interstitial migration** in crystalline silicon (*Chem. Phys. Lett.*, **341**, 185, 2001).

Discrete Path Sampling (*Mol. Phys.*, **100**, 3285, 2002; **102**, 891, 2004).



no intervening minima



$$\frac{p_a(t)}{p_{a'}(t)} = \frac{p_a^{\text{eq}}}{p_{a'}^{\text{eq}}} \quad \dot{p}_i(t) = 0 \quad \frac{p_b(t)}{p_{b'}(t)} = \frac{p_b^{\text{eq}}}{p_{b'}^{\text{eq}}}$$

Phenomenological $A \leftrightarrow B$ rate constants can be formulated as sums over **discrete paths**, defined as sequences of local minima and the transition states that link them, weighted by equilibrium occupation probabilities, p_b^{eq} :

$$k_{AB}^{\text{SS}} = \frac{1}{p_B^{\text{eq}}} \sum_{a \leftarrow b} P_{ai_1} P_{i_1 i_2} \cdots P_{i_{n-1} i_n} P_{i_n b} \tau_b^{-1} p_b^{\text{eq}} = \frac{1}{p_B^{\text{eq}}} \sum_{b \in B} \frac{C_b^A p_b^{\text{eq}}}{\tau_b},$$

where $P_{\alpha\beta}$ is a **branching probability** and C_b^A is the **committor** probability that the system will visit an A minimum **before** it returns to the B region.

Discrete path sampling builds connected databases of stationary points that are relevant to global **kinetics** (*Int. Rev. Phys. Chem.*, **25**, 237, 2006).

The paths that make the **largest** contributions to k_{AB}^{SS} can be extracted using the **Dijkstra** or **recursive enumeration** algorithms, using edge weights $-\ln P_{\alpha\beta}$ (*J. Chem. Phys.*, **121**, 1080, 2004; *J. Phys. Chem. B*, **112**, 8760, 2008).

A **hierarchy** of expressions can be obtained for the rate constants:

$$k_{AB}^{SS} = \frac{1}{p_B^{\text{eq}}} \sum_{b \in B} \frac{C_b^A p_b^{\text{eq}}}{\tau_b}, \quad k_{AB}^{NSS} = \frac{1}{p_B^{\text{eq}}} \sum_{b \in B} \frac{C_b^A p_b^{\text{eq}}}{t_b}, \quad k_{AB} = \frac{1}{p_B^{\text{eq}}} \sum_{b \in B} \frac{p_b^{\text{eq}}}{\mathcal{T}_{Ab}}.$$

τ_b , t_b and \mathcal{T}_{Ab} are the mean **waiting times** for a transition from b to an adjacent minimum, to any member of $A \cup B$, and to the A set, with $\tau_b \leq t_b \leq \mathcal{T}_{Ab}$.

k_{AB} is formally **exact** within a **Markov** assumption for transitions between the states, which can be **regrouped**. Additional approximations come from **incomplete sampling**, and the **densities of states** and the **unimolecular rate theory** used to describe the **local** thermodynamics and kinetics.

Rates from Graph Transformation (*JCP*, **124**, 234110, 2006; **130**, 204111, 2009)

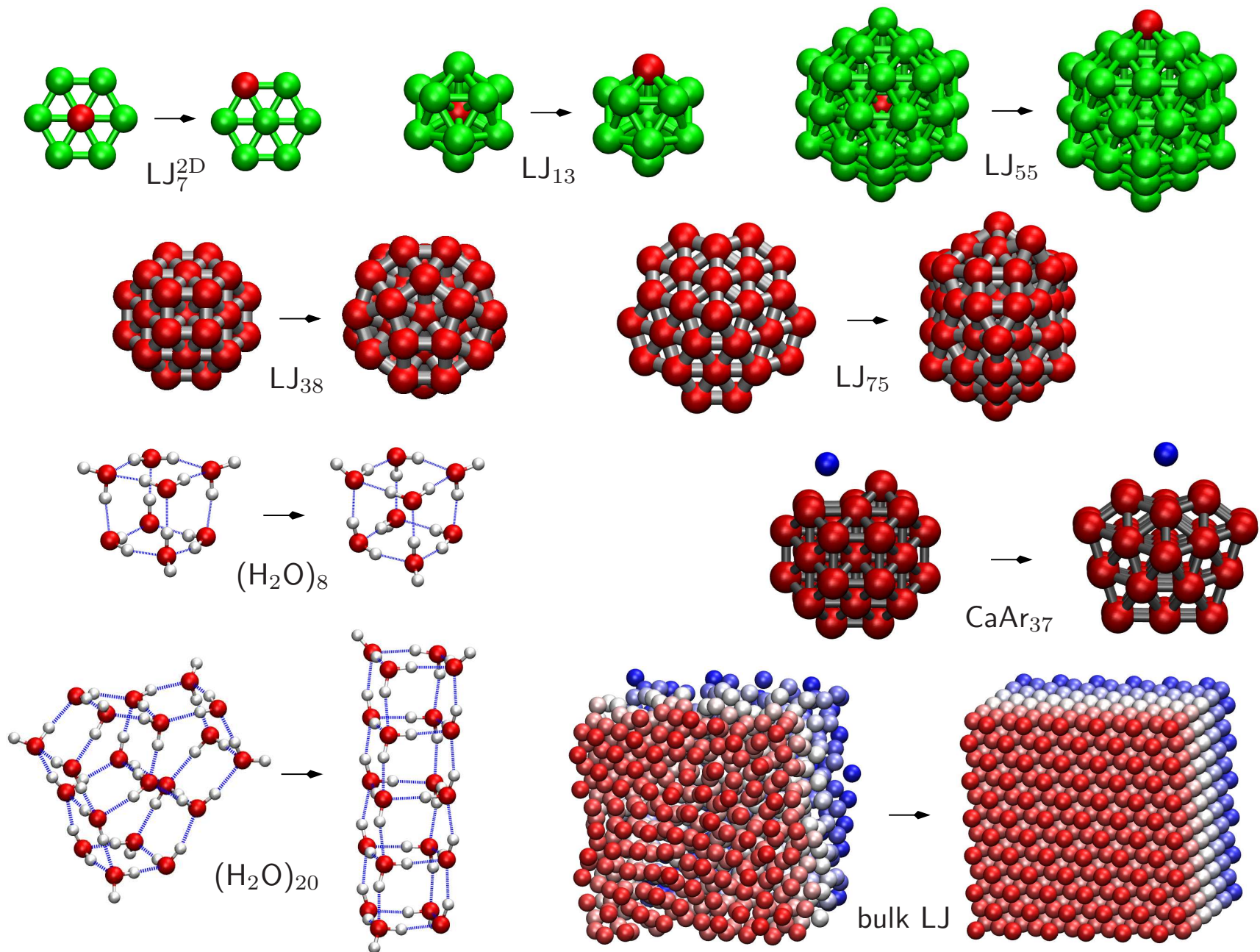
The deterministic **graph transformation** procedure is **non-stochastic** and **non-iterative**. Minima, x , are progressively **removed**, while the branching probabilities and waiting times in adjacent minima, β , are **renormalised**:

$$P'_{\gamma\beta} = P_{\gamma\beta} + P_{\gamma x} P_{x\beta} \sum_{m=0}^{\infty} P_{xx}^m = P_{\gamma\beta} + \frac{P_{\gamma x} P_{x\beta}}{1 - P_{xx}}, \quad \tau'_{\beta} = \tau_{\beta} + \frac{P_{x\beta} \tau_x}{1 - P_{xx}}.$$

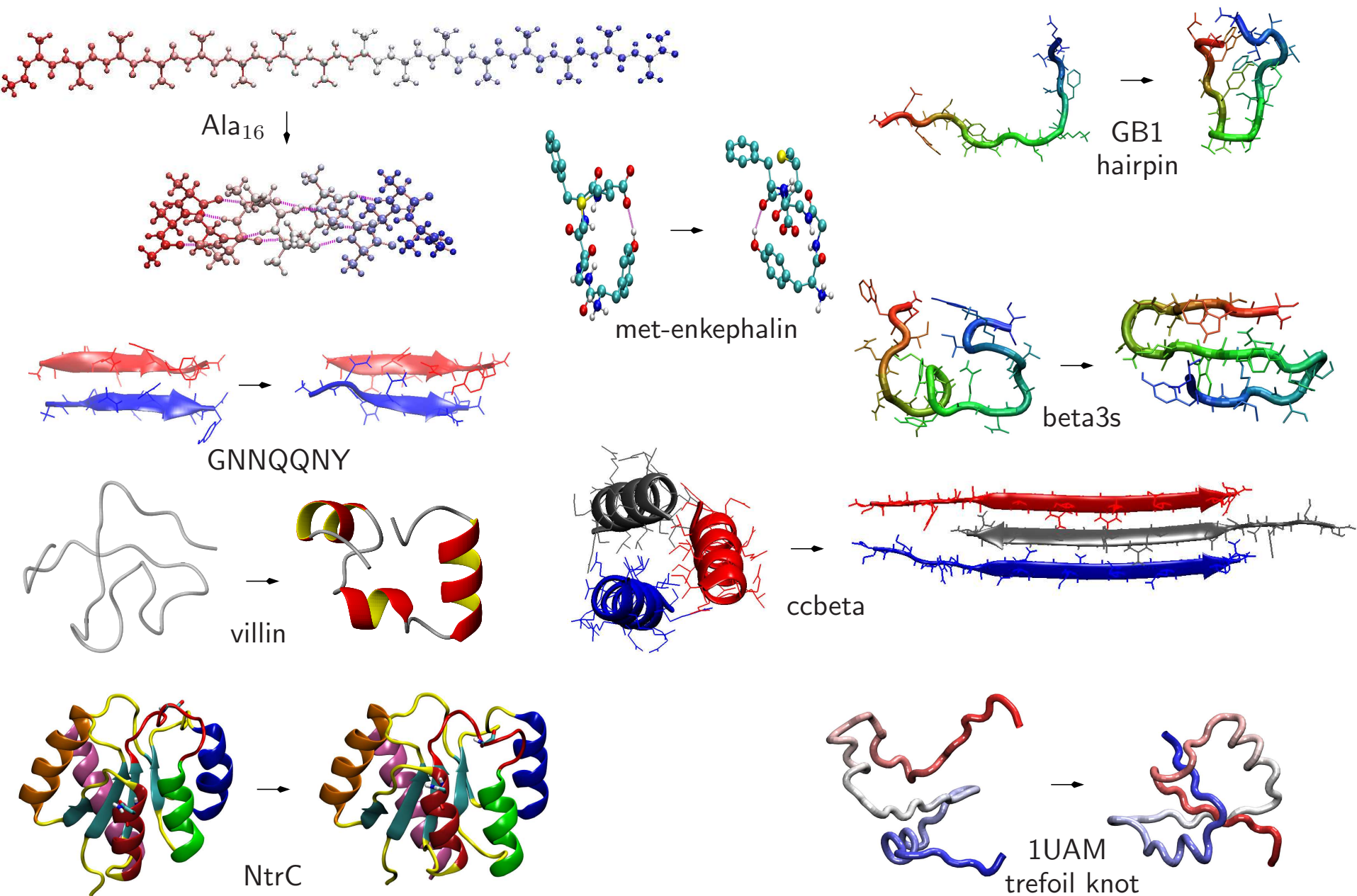
Each transformation **conserves** the **MFPT** from every reactant state to the set of product states with an execution time **independent** of temperature:

kT/K	$\Delta F_{\text{barrier}}$	N_{min}	N_{ts}	NGT/s	SOR/s	KMC/s
298	5.0	272	287	8	13	85,138
298	4.5	2,344	2,462	8	217,830	
1007	-	40,000	58,410	35	281	1,020,540
1690	-	40,000	58,410	39	122,242	

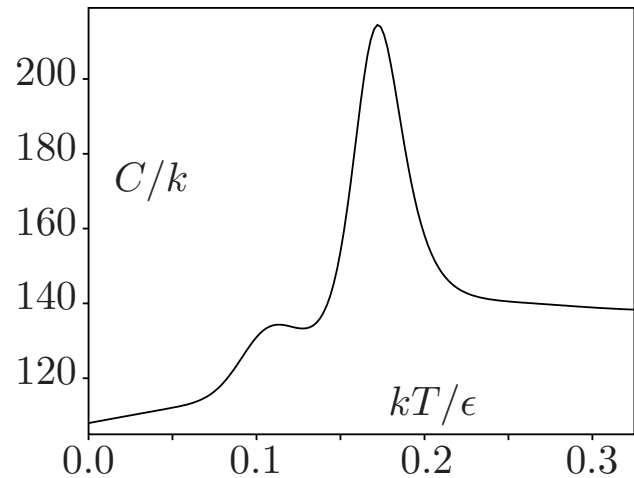
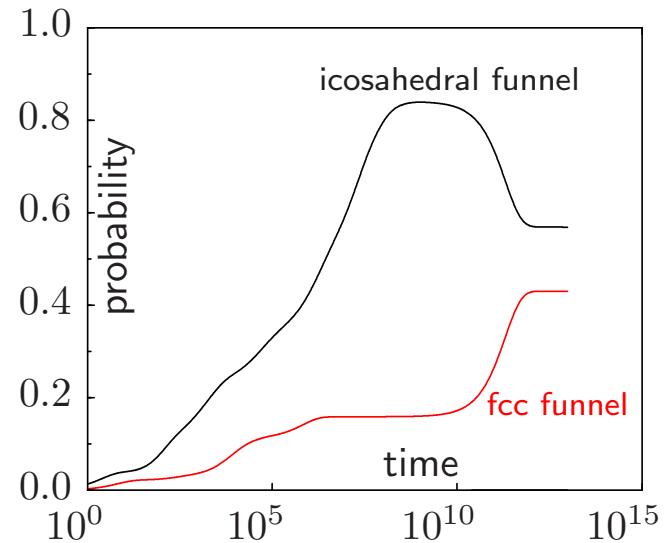
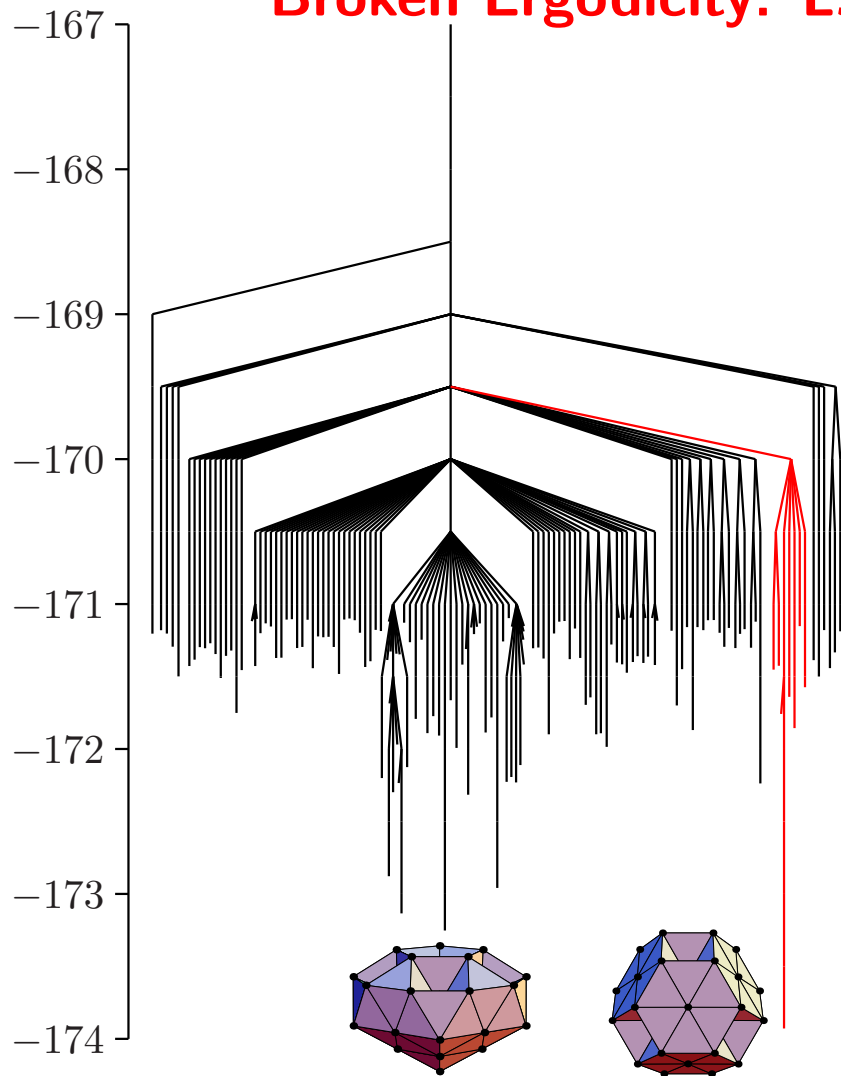
Discrete Path Sampling Examples I



Discrete Path Sampling Examples II



Broken Ergodicity: LJ_{38} (*Phys. Rev. E*, **60**, 3701, 1999)



LJ_{38} exhibits a **double funnel** due to competition between icosahedral and truncated **octahedral** morphologies. The interconversion rate for Ar_{38} is calculated as 55 s^{-1} at 14 K where a **solid-solid** transition occurs.

Simulating structural transitions by direct transition current sampling: The example of LJ₃₈

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¹*CEA, DEN, Service de Recherches de Métallurgie Physique, F-91191 Gif-sur-Yvette, France*

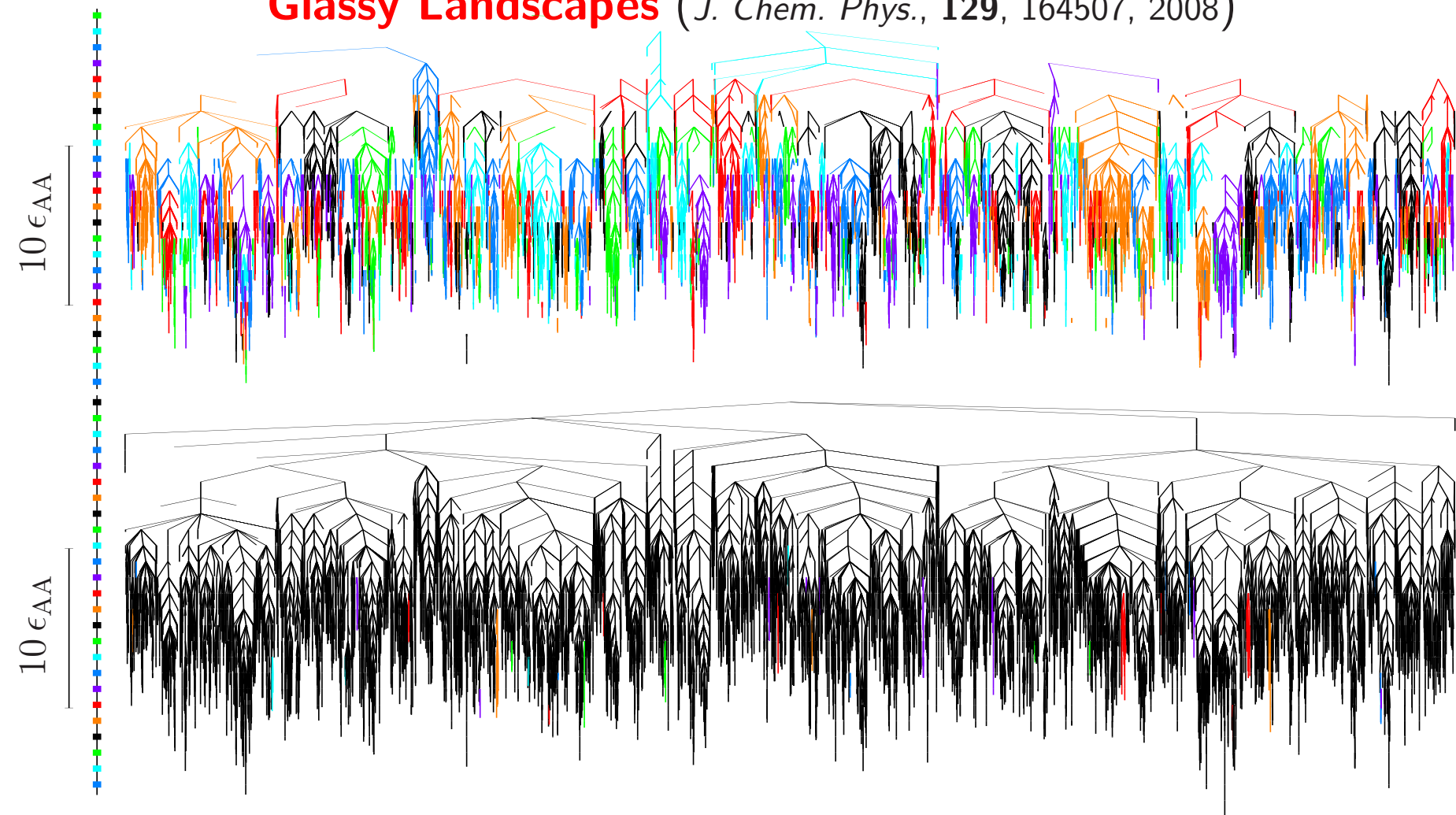
²*CNRS; ESPCI, 10 rue Vauquelin, UMR 7636 PMMH, 75005 Paris, France*

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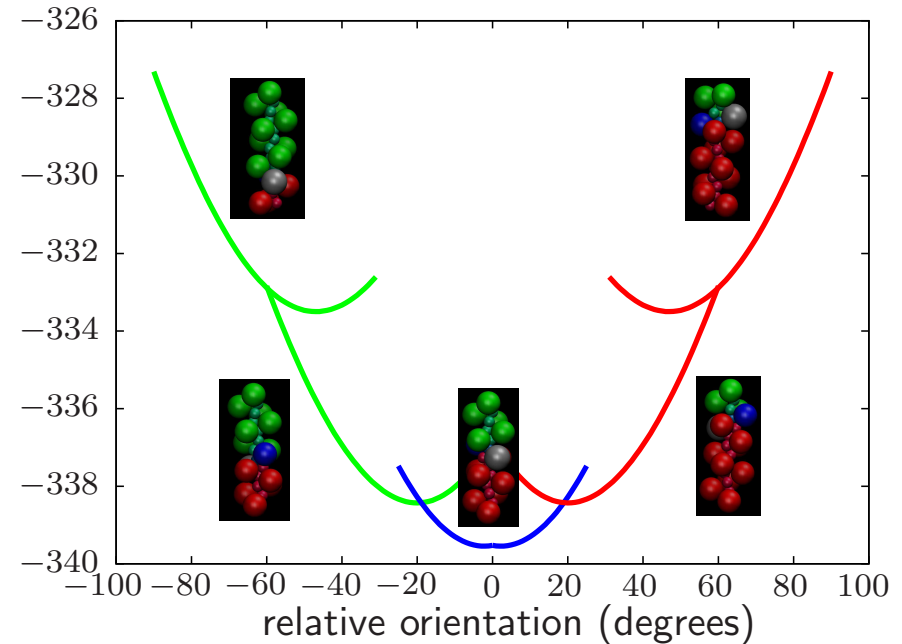
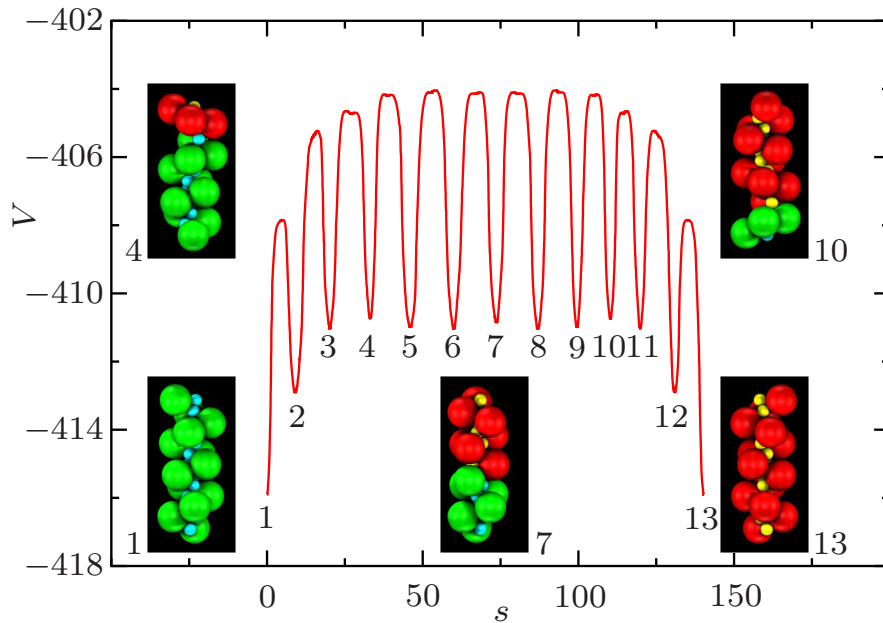
Another attempt to study the transitions between the two funnels of LJ₃₈ relies on the use of transition path sampling.³³ Because of the number of metastable states separating the two main basins, the traditional shooting and shifting algorithm failed here, despite previous success for smaller LJ clusters.³⁹ The authors thus developed a two-ended approach which manages to successfully locate reaction paths between the two basins: they started from a straight trial trajectory linking the two minima, and obtained convergence towards trajectories of energies similar to those obtained in the discrete path sampling approach.³³ Although the authors point out the lack of ergodicity in the sampling within their approach and the sensitivity on the “discretization” of the trajectories, this is nevertheless a progress and the main drawback remains the high computational cost (the work needed 10^5 h of central processing unit (cpu) time) to obtain such converged trajectories. In contrast, the simulations we present below required less than 10^2 h of cpu time.

Glassy Landscapes (*J. Chem. Phys.*, 129, 164507, 2008)



Disconnectivity graphs for **BLJ₆₀** including only transition states for **noncage-breaking** (top) and **cage-breaking** (bottom) paths. Changes in colour indicate **disjoint** sets of minima. Cage-breaking transitions, defined by **two** nearest-neighbour changes, define a higher order **metabasin** structure.

Nanodevices (Soft Matter, 7, 2325, 2011)

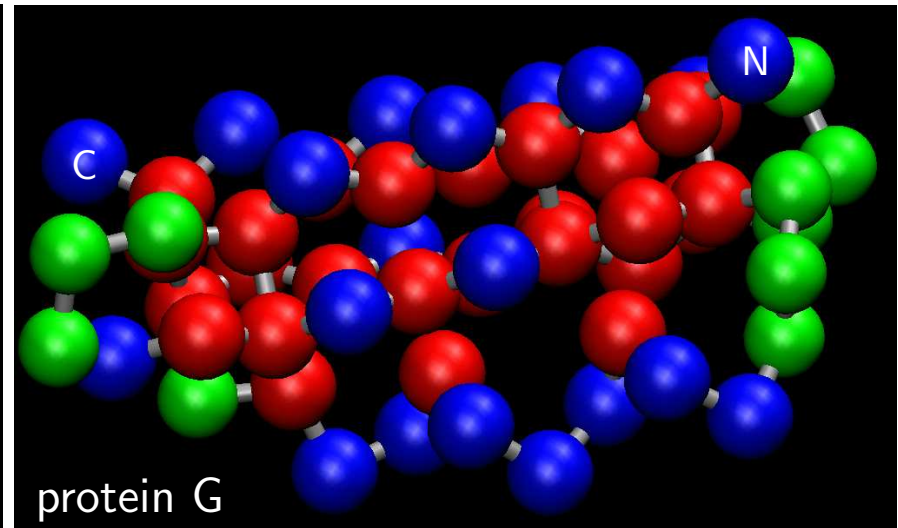
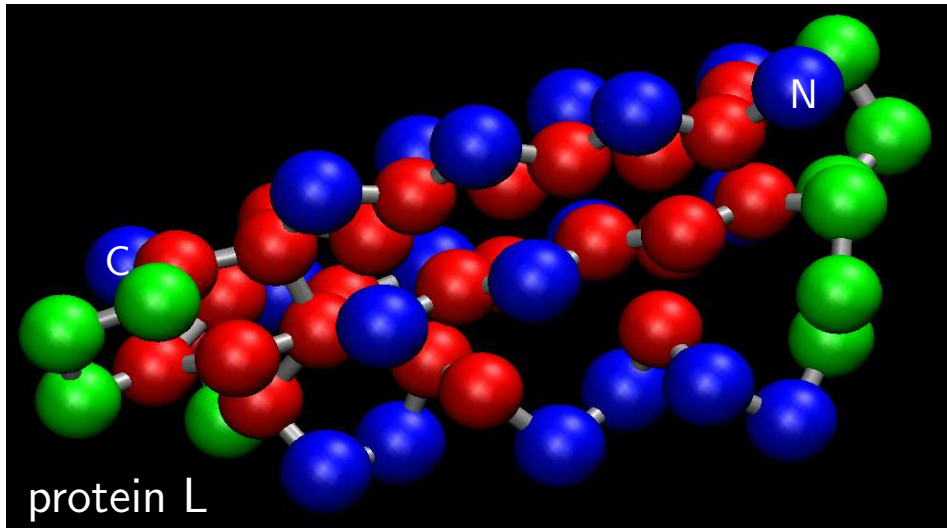


Coupled **linear** and **rotary** motion has been characterised for a helix composed of 13 asymmetric **dipolar dumbbells** in the presence of an **electric field**.

The helix changes **handedness** as the boundary between segments propagates along the strand via successive steps that switch the dumbbells.

Applying a **torque** to the helix systematically drives a **defect** and associated **ligand** along the chain; moving the ligand could produce **rotatory motion**.

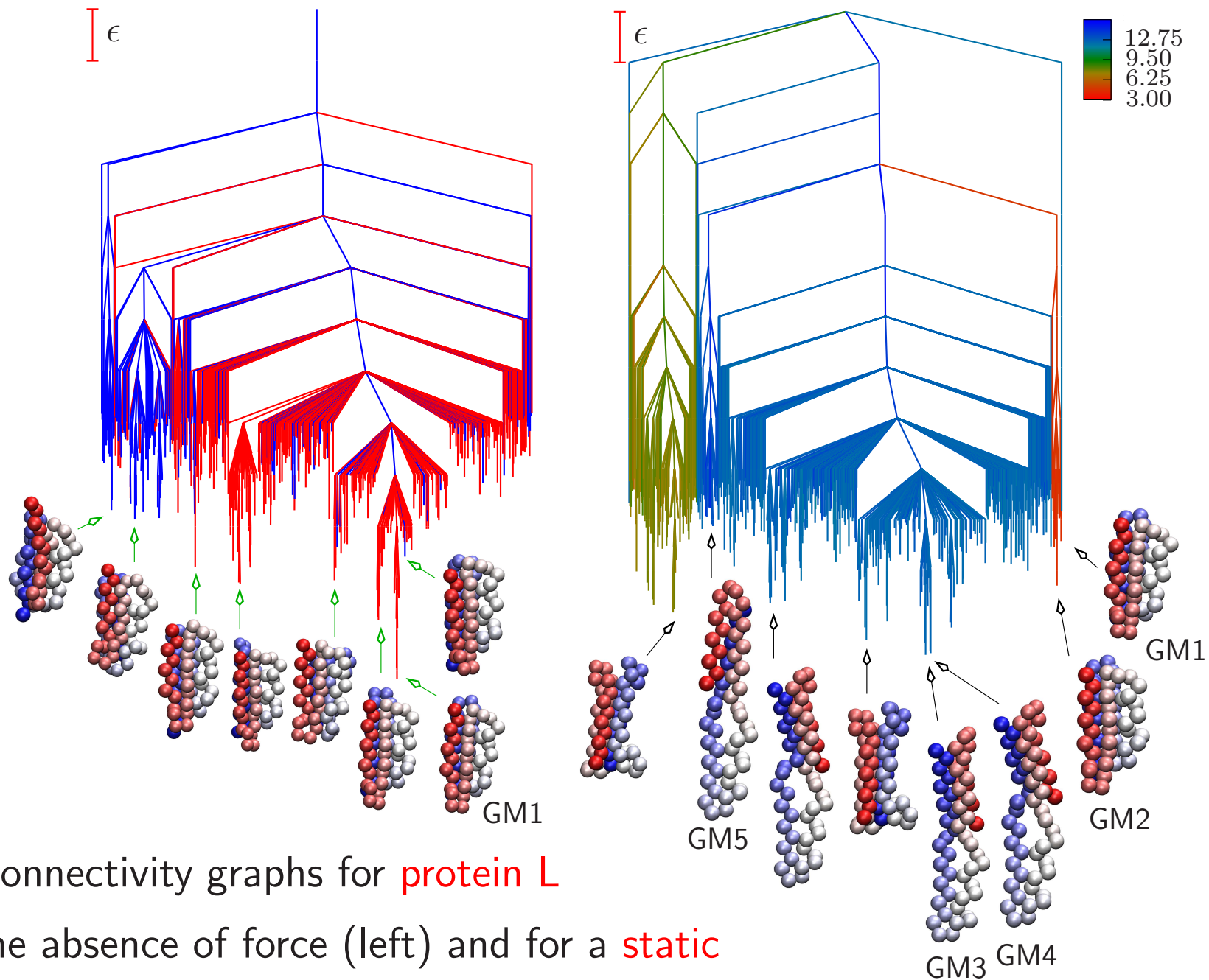
Folding and Pulling for Protein L and Protein G



Folding pathways and the **evolution** of the energy landscape as a function of **static force** have been analysed for protein **L** and protein **G** using the sequence-dependent **BLN** model of Brown, Fawsi and Head-Gordon.

Single site residues: **B**=hydrophobic, **L**=hydrophilic, and **N**=neutral.

Both proteins have a central **α -helix** packed against a four-stranded **β -sheet** composed of two **β -hairpins**, despite little sequence identity. Protein L forms the **N-terminal** hairpin 1 first, followed by the **C-terminal** hairpin 2, but the order is **reversed** for protein G, which exhibits an early **intermediate**.



Disconnectivity graphs for **protein L**

in the absence of force (left) and for a **static**

pulling force (right) applied between beads **10** and **32**.

Regrouping Stationary Point Databases

Lumping local minima together (recursively) if they are separated by **low** barriers or **fast** rates reduces the dimension of the kinetic transition network (*J. Chem. Phys.*, **123**, 234901, 2005; *J. Chem. Phys.*, **121**, 1080, 2004). It also provides a self-consistent definition of **products** and **reactants**.

The **occupation probability** and **free energy** of a group of minima, J are

$$p_J^{\text{eq}}(T) = \sum_{j \in J} p_j^{\text{eq}}(T) \quad \text{and} \quad F_J(T) = -kT \ln \sum_{j \in J} Z_j(T),$$

and the free energy of the **transition states** connecting J and L is then

$$F_{LJ}^{\dagger}(T) = -kT \ln \sum_{(lj)^{\dagger}} Z_{lj}^{\dagger}(T), \quad l \in L, j \in J,$$

$$\text{with} \quad k_{LJ}^{\dagger}(T) = \sum_{(lj)^{\dagger}} \frac{p_j^{\text{eq}}(T)}{p_J^{\text{eq}}(T)} k_{lj}^{\dagger}(T) = \frac{kT}{h} \exp \left[-\frac{\left(F_{LJ}^{\dagger}(T) - F_J(T) \right)}{kT} \right].$$