# Discrete relaxation path sampling of Morse clusters <br> Boris Fačkovec and David J. Wales <br> Department of Chemistry, University of Cambridge 

## Summary

A two-dimensional cluster of six Morse discs $\left(\right.$ Morse $\left._{6}{ }^{2 D}\right)$ is a useful model system for studying self-assembly. A previous theoretical study [M2D] using discrete path sampling [DPS] qualitatively agrees with experiments [E2D].

In the present work, discrete relaxation path sampling [DRPS], a recently developed method for efficient simulation of rare events, is explained and applied to this system. The systematic approach of DRPS produces an accurate master equation at a relatively low computational cost. The results are in satisfactory quantitative agreement with experiments.

## Characteristics of the system

6 solid polymer (polystyrene, density $\sim$ of water) spheres with diameter of about $1.3 \mu \mathrm{~m}$ are strongly bound to a coverslip of a sample cell at $T=300 \mathrm{~K}$ - sodium dodecyl sulfate (SDS) micelles in salty water cause individual polymer cells to attract each other via depletion interactions of around $b k_{B} T$, where $b \in(1,10)$

- the system is simulated via Morse potential

$$
V(r)=e^{\rho(1-r)}\left(e^{\rho(1-r)}-2\right),
$$

where all distances are measured in $\sigma_{0}=1.3 \mu \mathrm{~m}$ and the energy in $\varepsilon_{0}=b k_{B} T$ with the range parameter $\rho=30$, mass $\mu_{0} \sim 10^{-15} \mathrm{~kg}$, time $\tau_{0} \sim 10^{-4} \mathrm{~s}$
evaporation of the cluster is prevented by constraining the simulation to a circular box with diameter $r_{\text {box }}=3 \sigma_{0}$
-the system has 4 minima (considering optical isomers)
structures of the minima


- numbers of transitions between minima are experimentally observed - 11 states can be obtained from the minima by breaking 1 contact


20 additional (7-contact) structures were also considered as states for DRPS; all 6- and less-contact structures were lumped into a single state - friction constant (simulating water resistance) $\gamma \sim 3000 \mu_{0} / \tau_{0}$

## Thermodynamics

parallel tempering simulations for 13 reciprocal temperatures between $\beta \varepsilon_{0}=3$ to $\beta \varepsilon_{0}=9$.

| $\beta$ | 1 | 2 | 3 | 8 B | 7 B | $<7 \mathrm{~B}$ |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| 3.0 | 0.1 | 0.2 | 0.1 | 1.0 | 1.8 | 96.8 |
| 6.0 | 7.6 | 25.5 | 11.9 | 27.8 | 10.7 | 4.5 |
| 7.0 | 11.0 | 36.3 | 16.6 | 15.9 | 3.0 | 0.5 |
| 8.0 | 10.8 | 41.5 | 19.6 | 7.9 | 0.5 | 0.0 |
| 9.0 | 13.8 | 43.5 | 19.8 | 3.1 | 0.1 | 0.0 |

ratio of minima (2:6:3:3) given by symmetry (rotational and vibrational degrees of freedom contribute negligibly); agrees with [E2D] and [M2D] populations agree with [E2D] at $\beta \varepsilon_{0}$ between 6 and 7
depletion interaction (estimated at $\sim 2 k_{B} T$ ) might not be dominant

## Dynamics

relaxation times calculated for each pair of topological neighbours - relaxation times more reliable at lower friction $\rightarrow$ extrapolation

kinetic Monte Carlo used to get the number of transitions

|  | $\mathrm{T} \leftrightarrow \mathrm{C}$ | $\mathrm{T} \leftrightarrow \mathrm{P}$ | $\mathrm{C} \leftrightarrow \mathrm{P}$ |
| :---: | :---: | :---: | :---: |
| expt. | 55 | 63 | 140 |
| $\beta \varepsilon_{0}=6$ | 300 | 1000 | 1800 |
| $\beta \varepsilon_{0}=7$ | 130 | 220 | 530 |
| $\beta \varepsilon_{0}=8$ | 60 | 80 | 200 |

rounded numbers of transitions per 26 hours

## Acknowledgement

Bakala Foundation
Department of Chemistry
King's College, Cambridge


## Discrete relaxation path sampling

- links energy landscape methods [EL] with MD sampling. Rare events are studied in 5 steps:


## 1. space partitioning

- configuration space is fully partitioned (no void typical for reactive flux methods) - good partitioning: compact cells without significant internal barriers



## 2. sampling thermodynamics

- several configurations are randomly sampled from the equilibrium distribution
- constrained Monte Carlo or any other enhanced sampling method that does not require a progress coordinate (parallel tempering, nested sampling etc.) can be used


## 3. constrained MD

- starting from the equilibrium distribution inside cell, random Maxwell-Boltzmann velocities - stopped after a trajectory leaves the cell; simulation run to both trajectory ends - four types of quantities are sampled, exit probabilities from cell interior and cell boundaries, mean exit times and mean boundary-to-boundary trajectory lengths



## 4. solving relaxation equations

- the relaxation rate from one cell to one neighbouring cell is obtained
- the pair of cells is isolated from the rest using equilibrium boundary conditions - derived from decomposition of relaxation into exit and reinitiation at the boundaries - can be propagated numerically, but an analytical solution exists $\rightarrow$ solving linear system



## 5. regrouping

- if an observable state is composed of multiple DRPS states, the DRPS kinetic network must be regrouped and the DRPS states lumped
- the new graph transformation [NGT] uses reactive flux-based equation
- diagonalisation of the rate matrix is used in a relaxation-based lumping formula [RGRP] - we are currently developing a computationally inexpensive relaxation-based lumping formula


## Conclusion

- DRPS provides a hybrid methodology, which includes sampling dynamics and a master equation framework. Simulations can be systematically improved, so that the accuracy can achieve quantitative agreement with experiments.
- the centre of the shifting particle is constrained to a narrow channel (grey below); the diffusion time through this channel is so long that the particle returns back to the original position more frequently than it progresses to the product state
- calculation of the correction factor for transition state theory will be expensive $\rightarrow$ space partitioning
- the binding energy is probably greater than the one suggested in the original paper [E3D]



## References

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