# Simulating crystallisation mechanisms with long timescale molecular dynamics. 

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Metadynamics of ice and $\mathrm{CaCO}_{3}$
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Prof. John Harding (Sheffield)
Dr Colin Freeman (Sheffield)
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Freezing of a hard-sphere polymer
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## Overview

- Motivation
- Understanding biomineralisation processes.
- Crystal nucleation as a rare event.
- Adventures with metadynamics
- Adapting collective variables from previous MC studies.
- Example - control of crystal orientation by self-assembled organic monolayers.
- Problems going forward.
- Forward-flux sampling on a toy system
- Freezing of a hard-sphere polymer chain.
- Kinetics vs thermodynamics.
- Breakdown of the two state assumption.
- Possible reaction coordinate?


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## Motivation - biomineralisation



Columns of calcite
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## Crystal nucleation as a rare event



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## Crystallisation with metadynamics




Sanz et al. Phys. Rev. Lett. 92, 255701 (2004)

- Adapted collective variables from MC TIP4P ice nucleation studies of Trout. [ Radhakrishnan \& Trout. J.A.C.S. 125, 7743 - 7747 (2003) Phys. Rev. Lett. 90158301 (2003)]
Steinhardt $Q_{6}, Q_{4}$ plus a tetrahedral order parameter and the potential energy.



## Orientation specificity

- Possible bio-mimetic control of crystal orientation.


16-mecaptohexadecanoic acid (MHA)


15-mecaptopentaadecanoic acid (MPA)

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## Orientation specificity



Travaille et al J. Am. Chem. Soc., 2003, 125, 11571-11577

| Chain parity | Even (MHA) | Odd (MPA) |
| :--- | :--- | :--- |
| Nucleation plane <br> (Au substrate) | $(012)$ <br> or <br> $(01 x) x=2-5$ | $(110)$ <br> $(113)$ <br> $(116)$ |



Han \& Aizenberg Angew. Chem. Int. Ed., 2003, 42, 3668-3670

## Simulating orientation specificity



- Use metadynamics to (carefully) drive amorphous to crystalline transition.
- Use Gaussian height around $2 \%$ of smallest surface energy difference.
- SAMs modelled using CHARMM united atom force-field, TIP3P water.
- Mineral-organic terms in Freeman et al J. Phys. Chem. C 111,11943 (2007).
- 8.3 ns metadynamics simulations (or until crystallised) with 2 ns MD for analysis of crystal.
- 310 Kelvin, constant density.


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## Simulating orientation specificity

- Freezing the monolayer gives good epitaxial matching, but wrong result!
- Metadynamics allows us to simulate both the monolayer and the solvent at relevant temperatures.
- Reproduce (consistently) the experimental orientation when allowing flexibility.
- Simulations of polymorph-selecting monolayers are underway with improved potentials for $\mathrm{CaCO}_{3}$.


54 \% bulk calcite (001) nucleation plane


39 \% bulk calcite (012) nucleation plane

## Methodology problems

- Using metadynamics to;
- Predict structures
- Map gross features and changes in free energy landscapes
- Going beyond this requires better collective variables for crystallisation.
- Screen candidate CVs against path sampling data?
- TPS/TIS/FFS + likelihood maximisation.
- Issues with path sampling for systems with many glassy/amorphous minima?




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## Attractive hard sphere chain




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## Properties

- Thermodynamics of system extensively studied previously.
[ Taylor, Paul and Binder. Phys. Rev. E. 79, 050801 (2009) J. Chem. Phys. 131, 114907 (2009) ]
- Single stage "protein-like" collapse for $\chi \lesssim 1.06$
- We study globule-crystal transition for larger $\chi$.
- Brute force sampling feasible for $\chi \geq 1.15$.
- Use forward flux sampling (FFS) for smaller $\chi$.
- Simulations use collision dynamics (CD) with a stochastic component to represent coupling to a heat bath.


Brute force CD trajectory at transition temperature.

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## Sampling and FFS

- All globule states can be connected by short CD trajectories.
- Different realisations of the crystal state separated by high barriers.
- Breakdown of two-state assumption.

_工 Free energy surface
$=P(E)$ at transition $T$
$\longrightarrow$ High T $P(E)$
—— Low $T(E)$

8192 configurations at each FFS interface

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## Transition temperature via kinetics

- Systematic upward shift of transition temperature vs Wang-Landau (WL) MC simulations.
- Attribute this to inability of CD to sample transitions between realisations of crystal.
- Kinetic hindering of transitions in direction $A \rightarrow B$ ?



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## An improved reaction coordinate?



- Compute Laplacian matrix $G$

$$
G_{i j}= \begin{cases}-1 & \text { if }|i-j|>1 \text { and } r_{i j} \leq \chi \sigma, \\ 0 & \text { if }|i-j|>1 \text { and } r_{i j}>\chi \sigma, \\ 0 & \text { if }|i-j|=1, \\ -\sum_{k, k \neq j} G_{k j} & \text { if }|i-j|=0 .\end{cases}
$$

- $\quad \gamma$ is largest eigenvalue.
- G sometimes treated as analogue of Hessian.
- Related to SPRINT coordinate of Pietrucci \& Andreoni, Phys. Rev. Lett. 107, 085504 (2011).


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## Summary

- Biomineralisation
- Gained some insight via metadynamics using naïve collective variables.
- Issues with going beyond this. Need better CVs and path sampling methods for very rugged landscapes.
- Kinetics of polymer crystallisation
- Can a two-state treatment every capture rates correctly?
- Insight into reaction coordinate from topology / mode analysis?


## Crystallisation from the melt

- DQ \& Rodger, P. M. A metadynamics-based approach to sampling crystallisation events. Mol. Simul., 2009, 35, 613-623.
- DQ \& Rodger, P. M. Metadynamics simulations of ice nucleation and growth. J. Chem. Phys., 2008, 128, 154518.

Crystallization on self-assembled monolayers

- DQ; Rodger, P. M.; Freeman, C. L.; Harding, J. H. \& Duffy, D. M.

Metadynamics simulations of calcite crystallization on self-assembled monolayers. J. Chem. Phys., 2009, 131, 094703.
Kinetics of Homopolymer crystallisation

- Ruzicka, S.; DQ \& Allen, M.P. Folding kinetics of a polymer. Phys. Chem. Chem. Phys., 2012, DOI: 10.1039/C2CP00051B


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