

# The flow of MD trajectories in peptide-water systems at the moments of conformational transitions

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We study protein (peptide) dynamics.

All biomolecular processes happen in solution: water is a key player.

Frauenfelder *et al*<sup>1</sup> have experimentally shown that protein motions are slaved by water.

The protein molecule provides an ‘active matrix’ necessary for guiding the water’s dynamics towards the biologically relevant changes of the 3D structure (the proteins ‘function’ or folding).

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<sup>1</sup>H. Frauenfelder, et al, *PNAS*, **106**, 512 (2009)

water-peptide  
MD trajectories  
flow

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Introduction

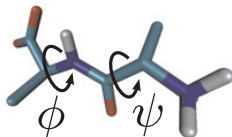
Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

By 'dynamics' we mean time dependent properties of backbone conformation quantified by the values of the dihedral angles:



L-alanyl-L-alanine zwitterion

The method: classical MD in *explicit* water.

The protein is assumed to be in ‘metastable’ conformational states most of the time with infrequent and quick transitions between them.

The main question: how do water molecules influence (if they do) the backbone motion and lead to the conformational transitions?

More specifically: how do molecular trajectories behave before the transition and what is the difference compared to the stable periods?

# Quantifying conformational dynamics

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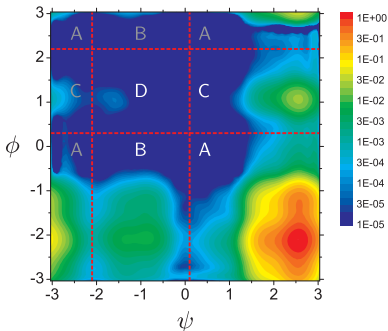
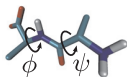
Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions



...AAABABCB...

Probabilities of conformations for a  $1\mu\text{s}$  trajectory and its symbolisation

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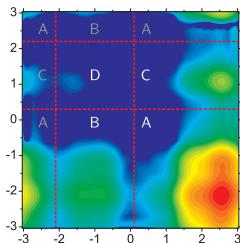
Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions



$s_{i+1}$	<i>A</i>	<i>B</i>	<i>C</i>
<i>s<sub>i</sub></i> <i>A</i>	0.996	0.003	0.001
<i>B</i>	0.261	0.737	0.002
<i>C</i>	0.097	0.002	0.901

The time step is 6ps.

A transition is when symbol 'A' at time step  $i$  changes to symbol 'B' at time step  $i + 1$ .

	$s_{i+1}$	A	B	C
$s_i$				
A		0.996	0.003	0.001
B		0.261	0.737	0.002
C		0.097	0.002	0.901

$A \rightarrow B$  happens once in  $3.1ns$  on average.

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MD trajectories  
flow

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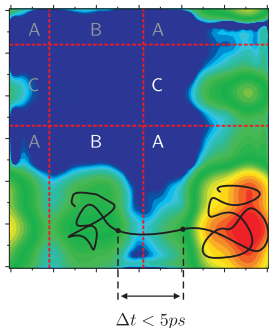
Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions



Markov State Model is valid only for time steps longer than the length of the transition process.

It does not say anything about *how* and *why* the transitions happen.

Solution: build a model that works for smaller time steps.



water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

Instead of the conformational states,  $s_i$ , themselves ( $A, B, C$ ) we consider the  $l$ -long *sequences* of states

$$\overleftarrow{s}_i \equiv \{s_{i-(l-1)} \dots s_{i-2} s_{i-1} s_i\}.$$

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

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There are at most  $3^l$  such states.

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

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There are at most  $3^l$  such states.

We build a Markov model on these states.

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MD trajectories  
flow

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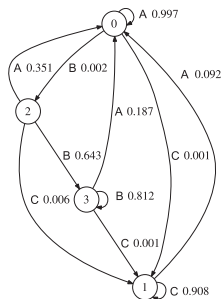
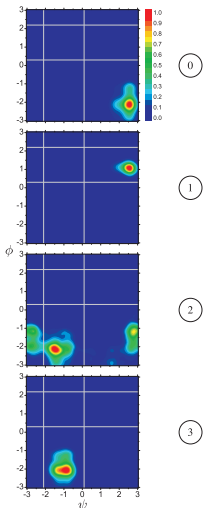
Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions



For 5ps time step the model converges at  $l = 2$ .  
 State '0' corresponds to the original state 'A': it consists of the sequences 'AA'.  
 State '3' corresponds to 'B'.  
 State '2' (sequences 'AB') describes the transitions between 'A' and 'B'.

# The tool for studying *how* and *why* transitions happen

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

The time resolution is limited only by the amount of data (in contrast to the standard MSM where there is a fundamental limit).

Thus, we can identify the transitions with the precision of  $0.3ps$ .

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water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

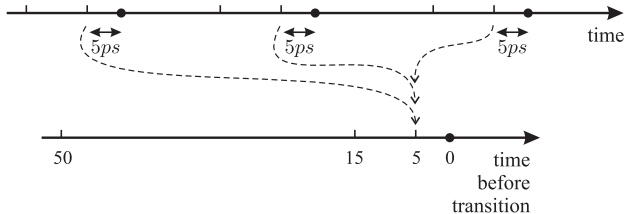
Perturbations

Conclusions

The time resolution is limited only by the amount of data (in contrast to the standard MSM where there is a fundamental limit).

Thus, we can identify the transitions with the precision of  $0.3ps$ .

We collect the time frames at specific times *before* the transitions.



# How water contributes to the transition from A to B

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flow

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Introduction

Water  
distribution

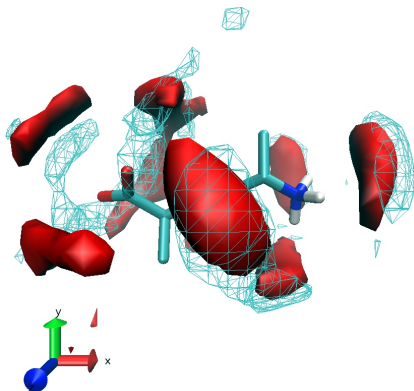
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trajectories**

Water-peptide  
correlation

Perturbations

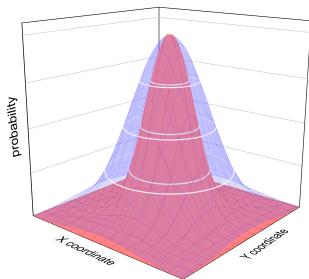
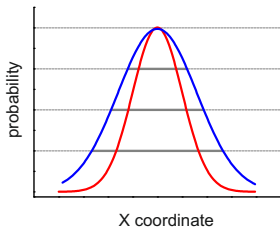
Conclusions

The high probability areas for oxygen (hydrogen) atoms is calculated by averaging over the selected time frames.



High probability areas of oxygen (red) and hydrogen (blue) in state A

More concerted trajectories form narrower probabilities





# The flow of trajectories

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Introduction

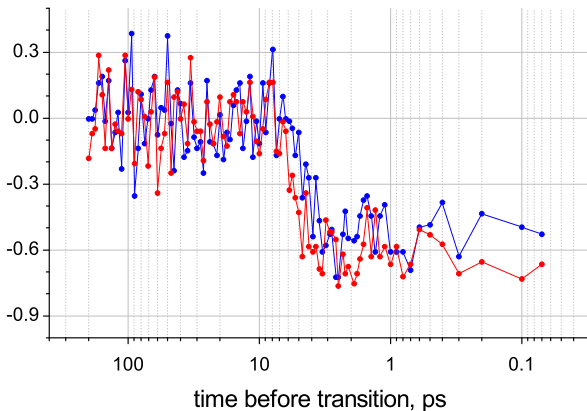
Water  
distribution

**Concerted  
trajectories**

Water-peptide  
correlation

Perturbations

Conclusions



The volume of high probability areas for oxygen (red) and hydrogen (blue) during the transition

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

**Concerted  
trajectories**

Water-peptide  
correlation

Perturbations

Conclusions

Water concentrates at more specific locations just before the transition.

This means that the phase space trajectories pass through a ‘bottleneck’.

# Water distribution correlation with the peptide motion

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories

Water-peptide  
correlation

Perturbations

Conclusions

We quantify the degree of dependence between the high probability water areas and the dihedral angles of the peptide.

Method: Linear Stochastic Estimation.

The probability field  $f(\mathbf{x}, t)$  is first converted to time fluctuations:

$$f'(\mathbf{x}, t) = f(\mathbf{x}, t) - \langle f(\mathbf{x}, t) \rangle_t.$$

Then a linear stochastic fit

$$f'_c(\mathbf{x}, t) = \alpha(\mathbf{x})\phi(t) + \beta(\mathbf{x})\psi(t)$$

to  $f'_c(\mathbf{x}, t)$  is computed by minimising the statistical error  $\langle f' - f'_c \rangle_t$ .

# Water density correlation with the peptide motion

water-peptide  
MD trajectories  
flow

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S Karabasov

Introduction

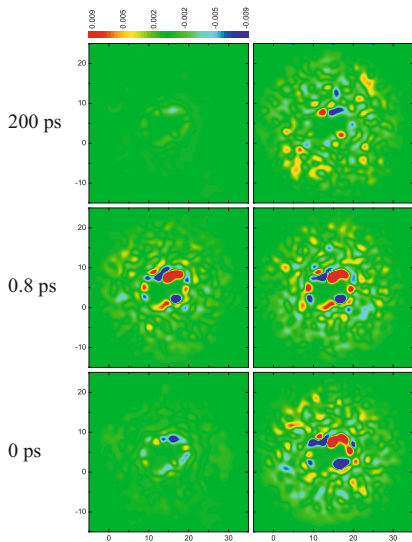
Water  
distribution

Concerted  
trajectories

**Water-peptide  
correlation**

Perturbations

Conclusions



water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

- From 10 to 1ps before the transition the water molecules tend to be located at more specific positions around the peptide compared to more uniform distribution at other times.
- During the transition the dynamics of water distribution becomes highly correlated with the dynamics of the dihedral angles.
- These correlations are completely absent during the stable conformation periods.

# Trajectory perturbation

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

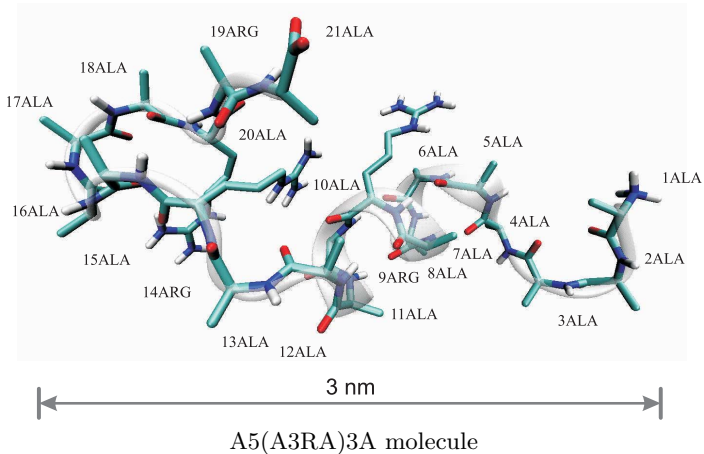
Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions



# How close are the trajectories during transition

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

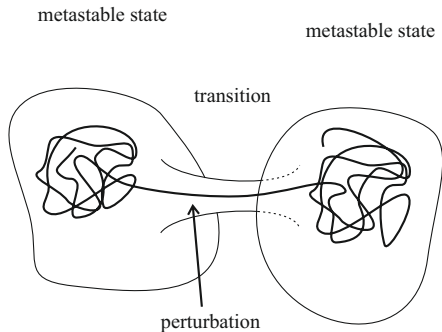
Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

What happens if a trajectory is slightly perturbed just before the transition?



The perturbation is minute: a few degrees rotation of the velocity vector of one of the atoms.

# How close are the trajectories during transition

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MD trajectories  
flow

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S Karabasov

Introduction

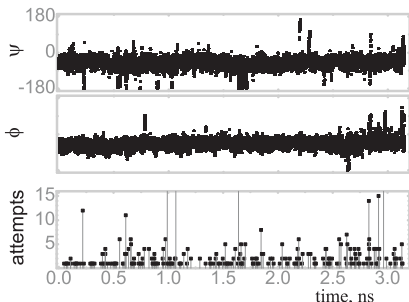
Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

**Perturbations**

Conclusions

The transition does not take place.



19ARG dihedral angles with perturbations; bottom: the number of 'attempts' needed to prevent the transitions



# How close are the trajectories during transition

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

**Perturbations**

Conclusions

Perturbations at random times (even very frequent) do not prevent transitions.

Trajectory flow at the transition is very sensitive to perturbation.

# What degrees of freedom are most sensitive

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flow

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Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

**Perturbations**

Conclusions

Very surprisingly, it does not matter what atom is perturbed!

Even distant water atoms prevent transitions.

# Why this is interesting

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flow

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Introduction

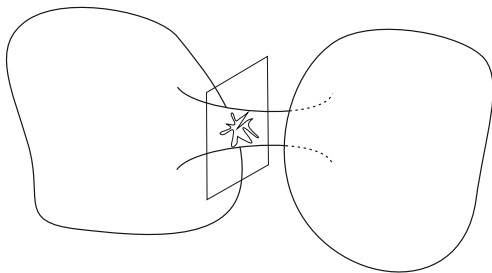
Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions

The shape of the 'cross-section' of the reactive bottleneck is extremely intricate.



Molecularly this means that during the conformational transition all molecules (including water) have to be carefully aligned. This is not a simple 'downhill' motion!

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories

Water-peptide  
correlation

Perturbations

**Conclusions**

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories

Water-peptide  
correlation

Perturbations

**Conclusions**

- Peptides and surrounding water molecules make an integral system for the process of conformational changes; water degrees of freedom must be explicitly included in the reaction coordinates.

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories

Water-peptide  
correlation

Perturbations

Conclusions

- Peptides and surrounding water molecules make an integral system for the process of conformational changes; water degrees of freedom must be explicitly included in the reaction coordinates.
- The flow of the MD trajectories pass through a ‘bottleneck’ during the transitions, the dimensionality of the bottleneck is high and includes the surrounding water degrees of freedom.

- Peptides and surrounding water molecules make an integral system for the process of conformational changes; water degrees of freedom must be explicitly included in the reaction coordinates.
- The flow of the MD trajectories pass through a ‘bottleneck’ during the transitions, the dimensionality of the bottleneck is high and includes the surrounding water degrees of freedom.
- The bottleneck ‘cross-section’ is very complicated: a minute displacement is enough to ‘step off’ the reactive channel; the direction of displacement can be a distant water degree of freedom.

water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

Introduction

Water  
distribution

Concerted  
trajectories  
Water-peptide  
correlation

Perturbations

Conclusions



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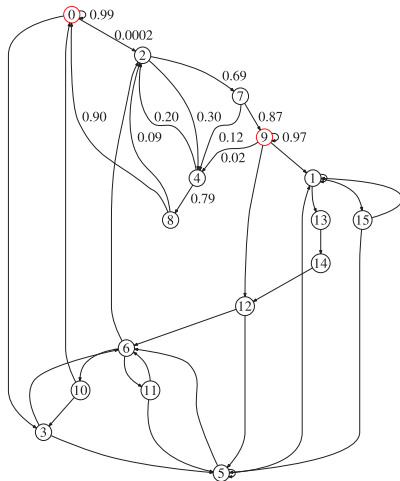


# Hidden Markov model

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MD trajectories  
flow

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For the time step  $0.3ps$   
the states are Markov for  
 $l \geq 4$ .



# Hidden Markov model

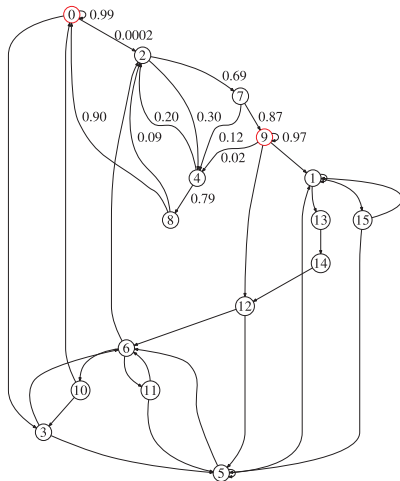
water-peptide  
MD trajectories  
flow

D Nerukh  
S Karabasov

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State '0' corresponds to  
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State '9' corresponds to  
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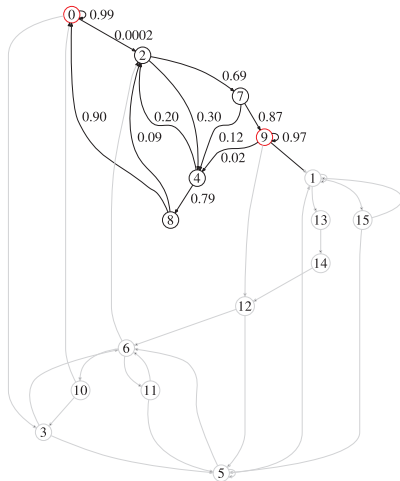


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State '9' corresponds to  
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The states '2, 7, 4, 8' are  
the transition states, they  
describe the mechanism  
(pathways) of the  
transition.

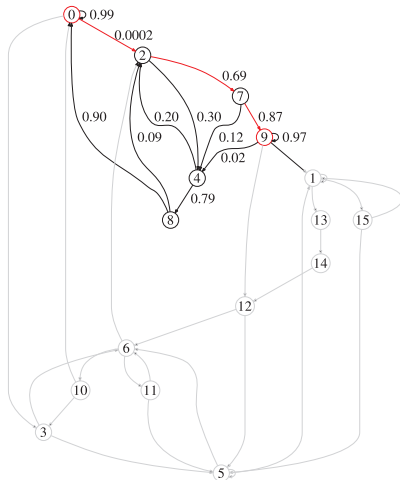


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MD trajectories  
flow

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Direct transition  
(probability: 0.61)

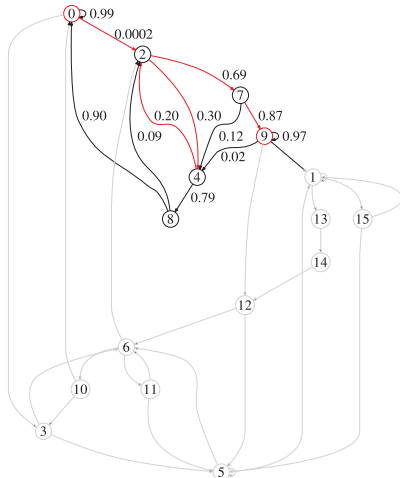


# Hidden Markov model

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MD trajectories  
flow

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With several recrossings  
(probability: 0.04)



Failed attempts of  
transition  
(probability: 0.07)

