

Refs: Ch. 16 in F+S

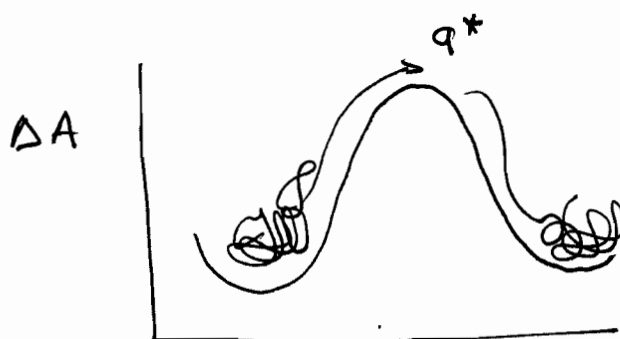
Bolhuis et al., Annu. Rev. Phys. Chem.  
53: 291:318 (2002)

Erp + Bolhuis, J. Comp. Phys. 205: 157-181  
 (2005)

## Rare Events / Activated Processes

Maximum MD time scales for atomistic simulations  
 $\sim 10^{-7}$  s (100 ns)

Many processes have activated dynamics -  
 Systems spend a lot of time on one side  
 of barrier,  
 but once they  
 reach it,  
 transition to  
 other state is  
 quick



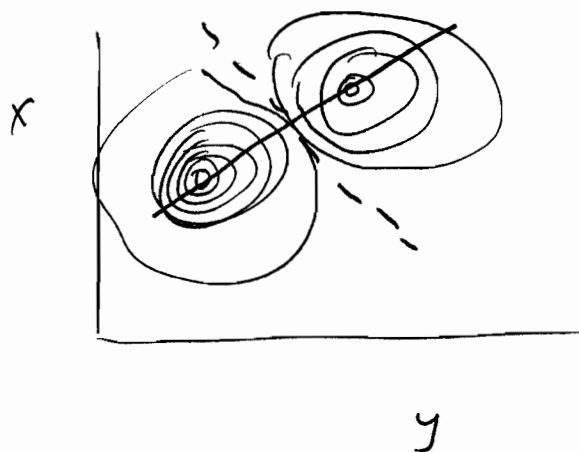
Examples: conformational (cis/trans) transitions  
 diffusion in glassy matrix  
 protein folding?

$$\text{Rate} = \left\{ \begin{array}{l} \text{Probability of finding} \\ \text{system at top of} \\ \text{barrier, } q = q^* \end{array} \right\} \times \left\{ \begin{array}{l} \text{Rate at which} \\ \text{Systems at} \\ q^* \text{ cross to} \\ \text{other side} \end{array} \right\}$$

↑  
Can be very low if  
barrier is high

↑  
allows for "recrossing"  
-systems can slide  
back

Key difficulty: In realistic systems with many degrees of freedom + solvent, appropriate "reaction coordinate" is not known (and may be very complex)



example in 2D

- Solutions:
- A. Parallel Replica Dynamics
  - B. Transition Path / Interface Sampling

## Parallel Replica Dynamics

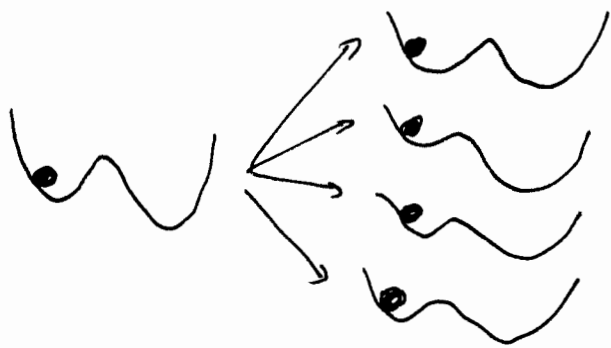
A.F. Voter, Phys. Rev. B 57:13985-88 (1998)

Only assumption: rare events obey exponential decay  
(1st order) kinetics

Probability of system  
remaining in initial  
state after time  $t$  }  $P(t) = \exp(-kt)$

e.g. protein folding  $k \sim \frac{1}{\text{ms}}$   $t \rightarrow 0$   $P(t) \rightarrow 1$   
 $t \gg \frac{1}{k}$   $P(t) \rightarrow 0$

How do we probe ms time scales with simulations  
of  $O(10^5 \text{ ns})$ ?  $\rightarrow$  Run many replicas in  
parallel; each has small prob. of observing  
transition.



Step 1: replicate  
initial state into  
 $M$  copies ( $M \gg 1$ )

Step 2: Run each  
copy separately -

- until a transition is observed on one  
processor  $i$ :

Increment  
time by

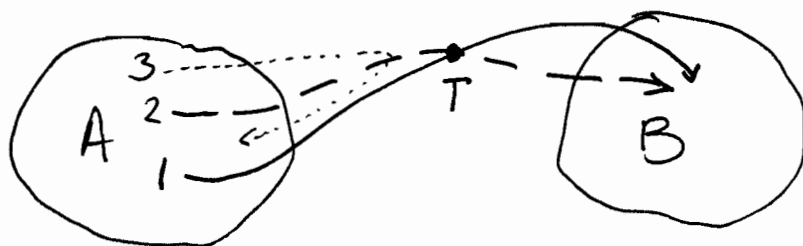
$$t_{\text{sum}} = \sum_{j=1}^M t_j$$

Step 3: Replace all replicas by configuration  $i$ , continue simulation (for multi-step transitions).

### Transition Path Sampling:

"Throwing Ropes over Rough Mountain passes, in the Dark"

key idea: Importance Sampling in Trajectory Space



- \* Stable, long-lived, well characterized ensembles of states A and B (not always easy)
- \* Start from arbitrary trajectory 1 that connects states A and B (may need to initialize near barrier and integrate forward/backwards in time)
- \* Perturb trajectory 1 at random time slice (e.g. by changingy momenta). Generate trajectory 2 by integrating backwards/forward in time

We cannot perturb just the initial conditions of trajectory 1 because most likely the resulting trajectory will not end up in B

Accept (reject) new trajectory as part of the ensemble if it starts at A and ends at B, with probability

$$P = \min \left\{ 1, \frac{N(n)}{N(o)} \right\} \left[ = \min \left\{ 1, \exp(-\beta \Delta u) \right\} \right]$$

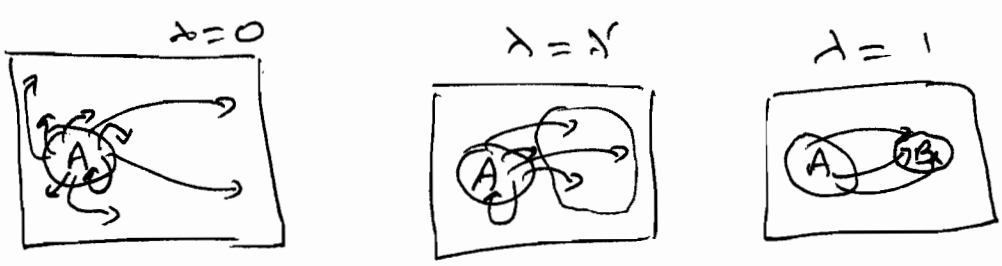
(Δu is for momenta change)

The "densities of states"  $N(n)$ ,  $N(o)$  for the new and old trajectories depend on the dynamical evolution rule and the initial and final configurations (see Bolhuis's review)

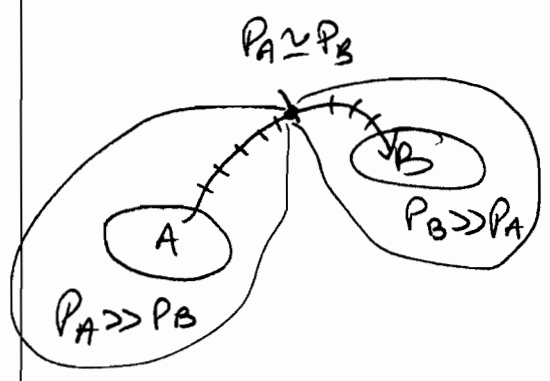
Trajectory 3 (generated from perturbation of trajectory 2) is rejected because it starts + ends in A.

### Initial Trajectory

The generation of a plausible initial configuration can be done by use of a step-wise process to narrow down the area in configuration space:



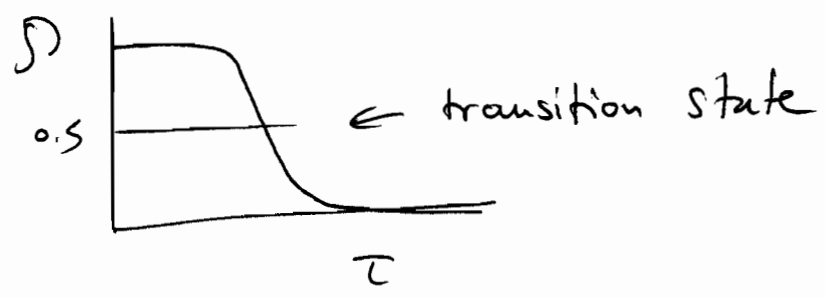
Constructing transition States Surface



Along trajectory from  $A \rightarrow B$

"Committer" function

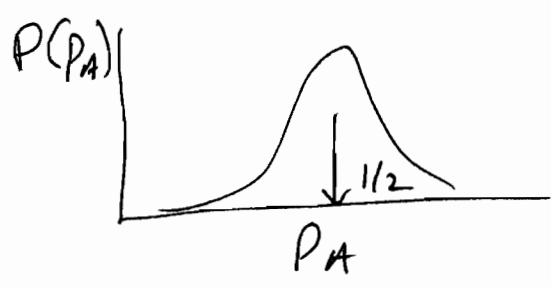
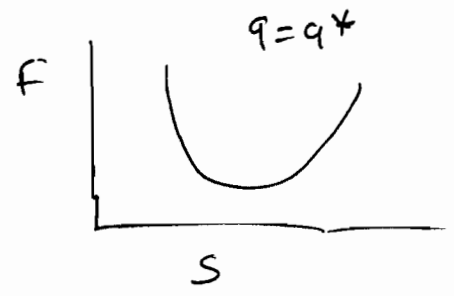
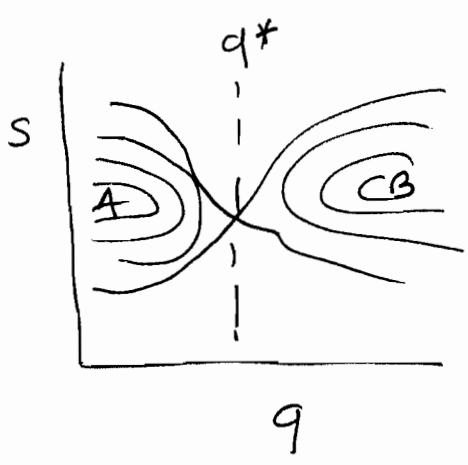
$\mathcal{D}$  gives probability of perturbed trajectories to return to A



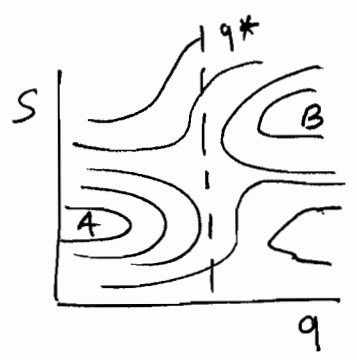
Order parameters vs reaction Coordinates

Even with transition path sampling, it is not easy to identify "good" reaction coordinates - but at least one can diagnose situations with "bad" choices / a mismatch between the chosen order parameter to split states into A and B and the true (relevant)

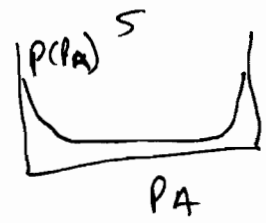
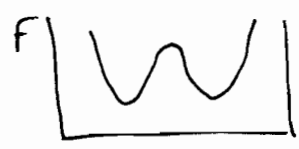
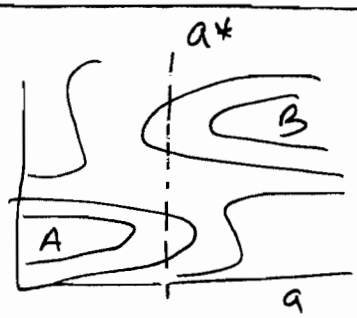
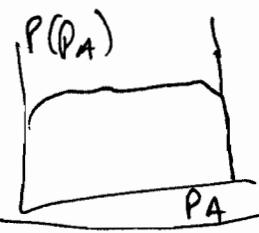
reaction coordinates.



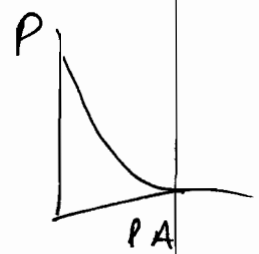
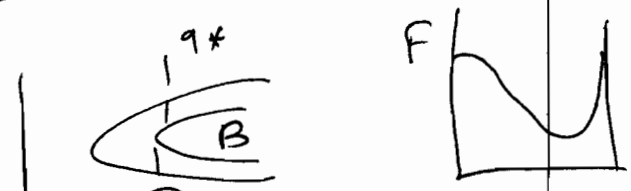
Ideal case - single free energy minimum  
 $q$  good rxn coordinate -  $P(P_A)$  histogram peaks at  $1/2$



$S$  also important,  
 $q$  dominant



barrier in  $F(S)$   
 Bimodal in  $P_A$



$q$  not a good coordinate