## Simulating Rare Events in Chemistry

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#### Rare Events (1)

#### Mountain climbing of molecular/extended systems!



• Climbing through the minimum energy pathway



• Time scale to overcome depends on the height exponentially

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#### Rare Events (2)

$$1/ au pprox m{k} pprox rac{m{k}_{
m B}T}{h} \exp\left(-\Delta F^{\ddagger}/m{k}_{
m B}T
ight)$$

At room	temperature:
$\Delta F^{\dagger}$ (kJ/mol)	au (approx)
2.5	0.1 ps
10	1 ps
20	0.1 ns
60	$1 \mathrm{ms}$
100	8 hr



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#### Rare Events & Computer Simulations (1)

• Classical dynamics of nuclei

$$H(\mathbf{R}^N,\mathbf{P}^N) = rac{1}{2}\sum_I^N M_I \dot{\mathbf{R}}_I^2 + U(\mathbf{R}^N)$$

• U from density functional theory  $Al_2O_3$  ( $Al_{48}O_{72}$ ) 1 MD step/1 fs $\rightarrow$  2200 CPU s

$\Delta F^{\dagger}$ (kJ/mol)	au	CPU time
2.5	0.1 ps	10 h
10	1 ps	1 month
20	0.1 ns	100 years
60	$1 \mathrm{ms}$	$1.9 \times 10^6$ years
100	8 hr	$10^{17}$ years

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#### **Rare Events & Computer Simulations (2)**

#### • Accelerating and sampling rare events

Thermodynamic Integration

Ciccotti et al. CPL (1989)

#### Umbrella Sampling

Valleau et al. JCP (1975)

#### Adaptive Force Bias

Rodriguez-Gomez et al. JCP (2004)

**Conformational Flooding** 

H. Grubmüller, PRE (1995)

**Transition Path Sampling** 

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Chandler et al. JCP (1998)

Parallel Tempering

Wenzel et al. CPL (2002)

#### **Metadynamics**

Laio & Parrinello, PNAS (2002)

#### Minimum Free Energy Path

Ciccotti et al. JCP (2006)

- Dimensionality reduction: a set of collective coordinates is selected
  - Distance, angle, coordination number, cell vectors, RMSD, pathways etc.
- Biasing: history dependent replusive potential is slowly grown along the trajectory of the collective coordinates

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- Configurational sampling (no guess for minima)
- No guess of "true" reaction coordinate
- System moves along minimum free energy path
- System explores new and unpredicted minima
- Underlying free energy surface can be constructed

$$F(S) = -\lim_{t o \infty} V^{\mathsf{blas}}(S,t) + \mathsf{constant}$$

- Need a set of *n* collective coordinates
- Have to fill the volume using Gaussians
- Practically n is less than 4



## Wacker Reaction: Mechanistic investigations (1)



#### Let us focus on step **C**

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#### Wacker Reaction: Mechanistic investigations (2)

$$\begin{bmatrix} CI \\ I \\ -Pd & -OH_2 \\ CI \end{bmatrix} + H_2O \longrightarrow \begin{bmatrix} OH_2 \\ I \\ -Pd & -OH_2 \\ CI \end{bmatrix} + CI^{-1}$$

CPMD, Planewave–DFT, USPP, 30 Ry Cutoff,  $10 \times 10 \times 10$  Å<sup>3</sup> box



Collective coordinates:

$$c(\mathrm{A}-\mathrm{B}) = \sum_{I}^{N_\mathrm{A}} \sum_{J}^{N_\mathrm{B}} rac{1-ig(R_{IJ}/R_\mathrm{A-B}^0ig)^p}{1-ig(R_{IJ}/R_\mathrm{A-B}^0ig)^{p+q}}$$

- Pd to all water oxygen coordination number
- Pd to all Cl atom coordination number



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$$\begin{bmatrix} CI \\ I \\ -Pd - OH_2 \\ CI \end{bmatrix} + H_2O \longrightarrow \begin{bmatrix} OH_2 \\ I \\ -Pd - OH_2 \\ I \\ CI \end{bmatrix}^+ + CI^-$$

CPMD, Planewave–DFT, USPP, 30 Ry Cutoff,  $10 \times 10 \times 10$  Å<sup>3</sup> box







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## Diffusion of Vacancies in TiO<sub>2</sub> Rutile



Calculations using MSINDO (semiempirical method)

K. Jug, N. N. Nair, and T. Bredow, PCCP, 7, 2616-2621 (2005).

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# Peptide Synthesis on Pyrite Surface at Extreme Conditions (1)



free energy barriers in  $k_{\rm B}T$  (ABW, HPW, PIW)

- Schreiner, Nair, Marx, JACS (2009)
- Nair, Schreiner, Marx, JACS (2008)
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# Peptide Synthesis on Pyrite Surface at Extreme Conditions (2)



Free energy barrier decreases from  $37k_{\rm B}T$  (HPW) to  $20k_{\rm B}T$  (ABW) Calculations using CPMD

N. N. Nair, E. Schreiner, D. Marx, in preparation

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#### Phase transition in Silicon



# Tight binding calculations, NPT (Parrinello–Rahman) collective coordinates: cell vectors, thus sampling $G(\mathbf{h})$

Matrŏnák, Laio, Parrinello, PRL (2003)

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## **Applications in Biomolecular Systems**

#### In combination with QM/MM techniques:



ATP hydrolysis reaction in ATP synthase (• Boero et al. JACS, 2006) Docking



#### **Collective coordiantes**

- Geometry based
- Coordination number based
- Cell parameters
- Energy
- Spin density
- Reaction paths
- Normal modes
- Protein–specific: helicity of backbone, dihedral correlation etc.

Laio and Gervasio, Rep. Prog. Phys. (2008)

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#### **Extended Lagrangian Metadynamics**



Iannuzzi, Laio & Parrinello, Phys. Rev. Lett., 90, 238302, 2003.

## **Parallel Tempering Metadynamics**

- If missed any slow coordinate?
- Combining parallel tempering with metadynamics
- Multiple replicas at different temperature
- Attempt exchange of replicas with nearest temperature
- Acceptance ratio accounts for different biasing potentials
   Parrinello et al. JACS (2006)



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#### **Multiple Walker Metadynamics**

- What if large number of CVs?
- Many walkers/replicas fill the same free energy surface
- $N_{\rm w}$  walkers reduces the total simulation time by  $1/N_{\rm w}$



- Raiteri et al. J. Phys. Chem. B 110, 3533 (2006)
- N. N. Nair, E. Schreiner, D. Marx, *inSiDE* 6, 30 (2008)
- N. N. Nair, E. Schreiner, D. Marx, *in preparation*

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#### **Bias Exchange Metadynamics**

- How to deal with large number of coordinates?
- *N*<sub>R</sub> replicas filling different but low dimensional CV space
- Biasing potentials are exchanged among *N*<sub>R</sub> replicas
- Construction of *N*<sub>R</sub> low–dimensional projection of free energy surface

Piana and Laio, JPCB (2007)



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#### **Conclusion & Outlook**

- Advantages:
  - + Becoming popular method
  - + Easy implementation, usage and error control
  - + New pathways and structure prediction
  - + Reconstruction of free energy surface
- Improved metadynamics procedures
- Dream of "virtual laboratory"
- Powerful computational tool for material design and properties

- Disadvantages:
  - Definition of CCs; chemical intuition!
  - Affordable number CCs is limited 3–5

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• Wacker Reaction: CHEMFIST computational lab Department of Chemistry, IIT Kanpur, India

www.iitk.ac.in/chcm

• Oxygen Vacancy: Prof. Karl Jug University of Hannover, Germany • Origin of Life: Prof. Dominik Marx Ruhr-Universität Bochum, Germany www.theochem.rub.de

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