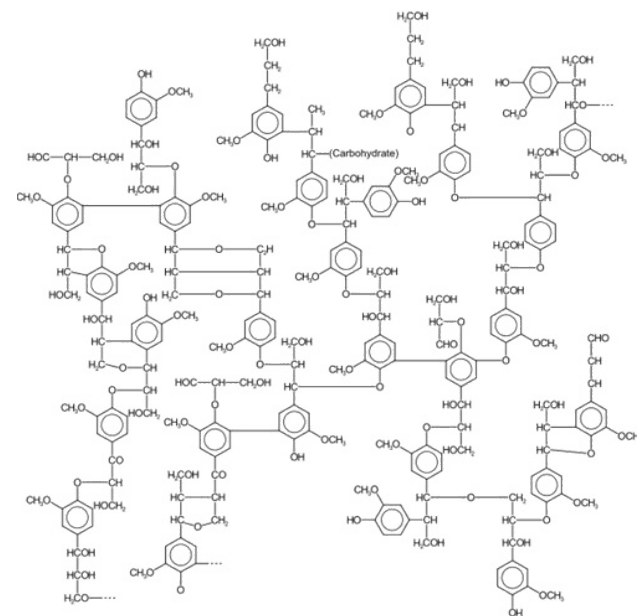


Designing catalysts for chemical production by density functional theory modeling

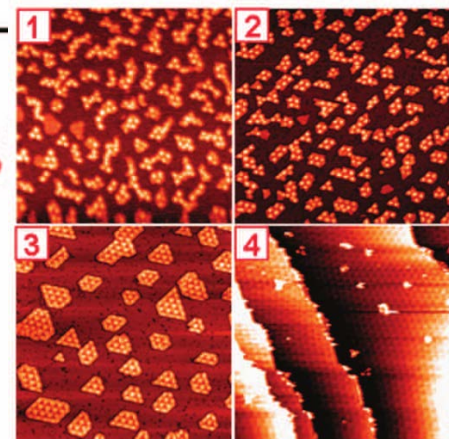
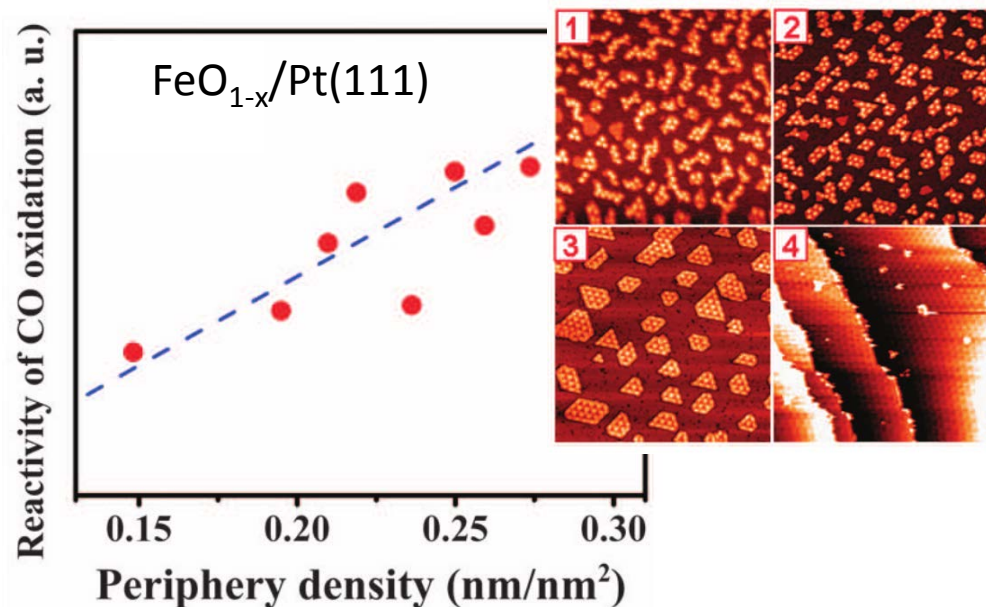
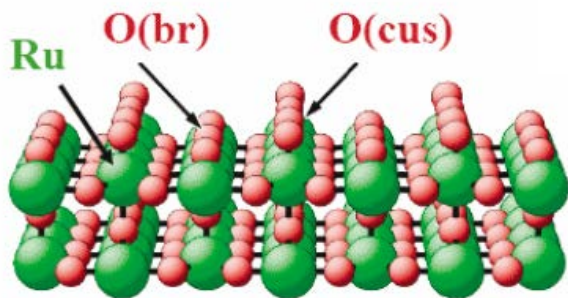
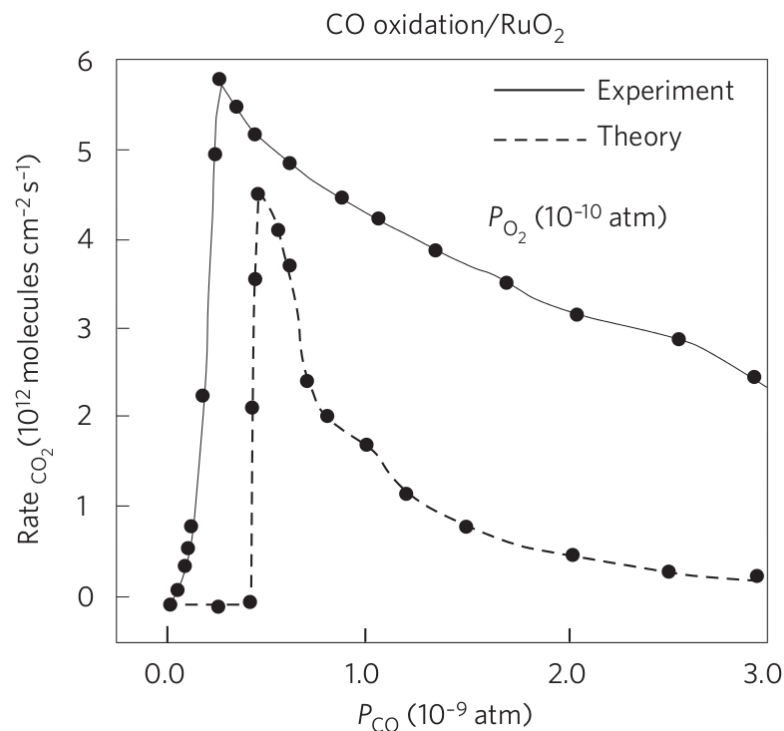
Bryan R. Goldsmith



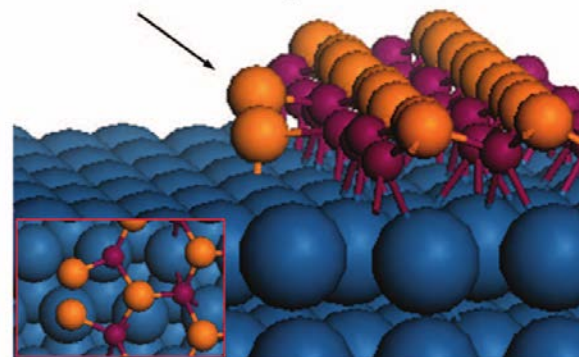
Catalysts make the world go round



Computational modeling can be used to understand and design catalysts



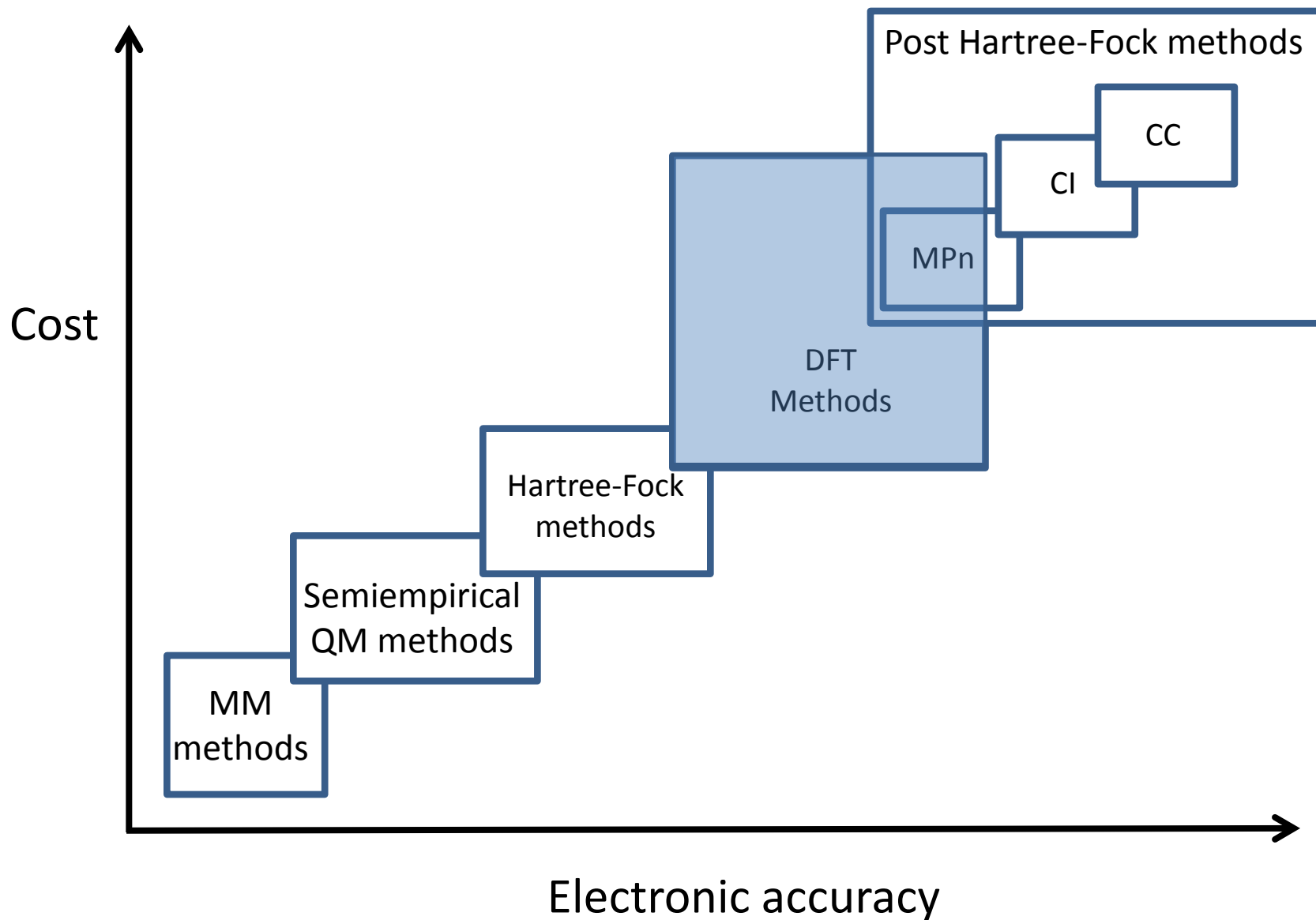
CUF sites and O_2 Diss.



Reuter, K., Frenkel, D. & Scheffler, M. *Phys. Rev. Lett.* **93**, 116105 (2004).

Qiang Fu et. al.
Science **328**, 1141 (2010)

Accuracy vs. cost of modeling approaches



DFT is extremely popular and successful: See most cited papers in APS (from 1893)

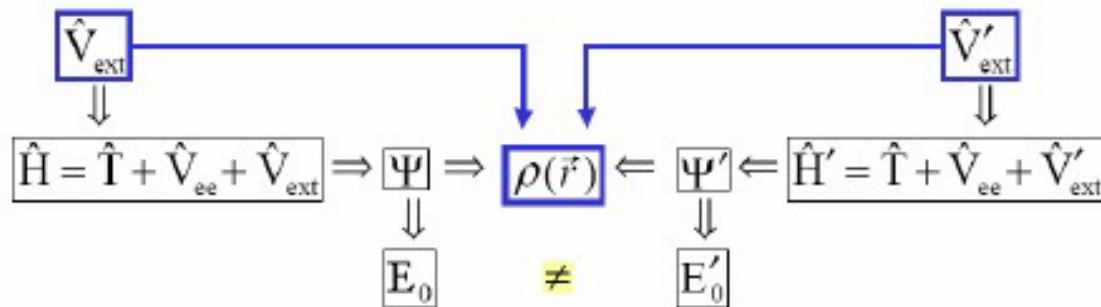
	Journal	# cites	Title	Author(s)
1	PRB (1988)	39190	Development of the Colle-Salvetti Correlation-Energy ...	Lee, Yang, Parr
2	PRL (1996)	25452	Generalized Gradient Approximation Made Simple	Perdew, Burke, Ernzerhof
3	PRA (1988)	22904	Density-Functional Exchange-Energy Approximation ...	Becke
4	PR (1965)	20142	Self-Consistent Equations Including Exchange and Correlation ...	Kohn and Sham
5	PRB (1996)	13731	Efficient Iterative Schemes for Ab Initio Total-Energy ...	Kresse and Furthmüller
6	PRB (1976)	13160	Special Points for Brillouin-Zone Integrations	Monkhorst and Pack
7	PRB (1992)	10876	Accurate and Simple Analytic Representation of the Electron ...	Perdew and Wang
8	PRB (1999)	10007	From Ultrasoft Pseudopotentials to the Projector Augmented ...	Kresse and Joubert
9	PRB (1990)	9840	Soft Self-Consistent Pseudopotentials in a Generalized ...	Vanderbilt
10	PR (1964)	9789	Inhomogeneous Electron Gas	Hohenberg and Kohn
11	PRB (1981)	9787	Self-Interaction Correction to Density-Functional Approx. ...	Perdew and Zunger
12	PRB (1992)	9786	Atoms, Molecules, Solids, and Surfaces - Applications of the ...	Perdew, Chevary, ...
13	PRB (1986)	9313	Density-Functional Approx. for the Correlation-Energy ...	Perdew
14	PR (1934)	9271	Note on an Approximation Treatment for Many-Electron Systems	Möller and Plesset
15	PRB (1994)	9100	Projector Augmented-Wave Method	Bloch
16	PRL (1980)	7751	Ground-State of the Electron-Gas by a Stochastic Method	Ceperley and Alder
17	PRL (1987)	7663	Inhibited Spontaneous Emission in Solid-State Physics ...	Yablonovitch
18	PRL (1986)	7589	Atomic Force Microscope	Binnig, Quate, Gerber
19	PRB (1991)	7425	Efficient Pseudopotentials for Plane-Wave Calculations	Troullier and Martins
20	PRB (1993)	6925	Ab initio Molecular Dynamics for Liquid Meta	
21	PR (1961)	6467	Effects of Configuration Interaction on Intens	
22	PR (1957)	6260	Theory of Superconductivity	

Most cited
physicists

Name: (Last, First)	Sum of Times Cited
Perdew, John P.	65,757
Smalley, Richard E.	63,354
Becke, Axel Dieter	62,581
Witten, Edward	59,157
Heeger, Alan J.	56,364

Hohenberg-Kohn Theorem (1964)

Assume two different external potentials give same electron density, $\rho(\vec{r}) = N \int \cdots \int |\Psi(\vec{x}_1, \vec{x}_2, \dots, \vec{x}_N)|^2 d\vec{x}_1 d\vec{x}_2 \dots d\vec{x}_N$



Impossible

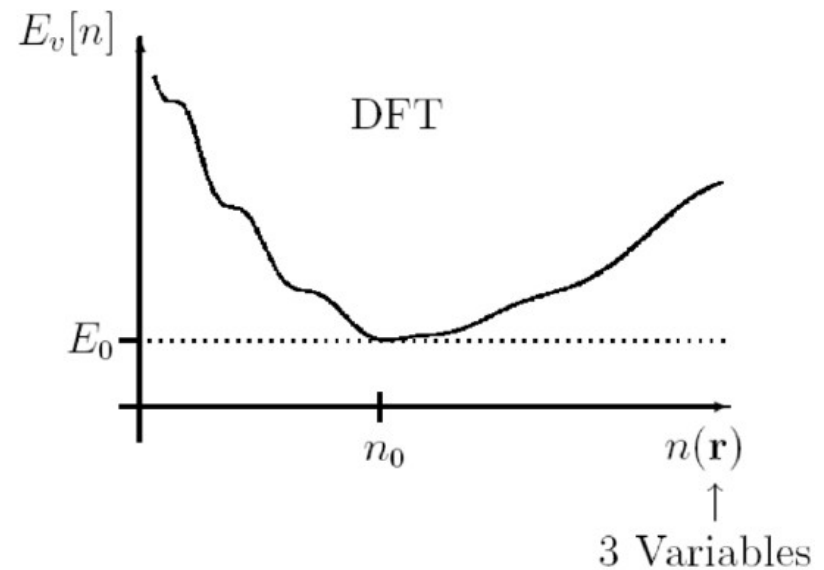
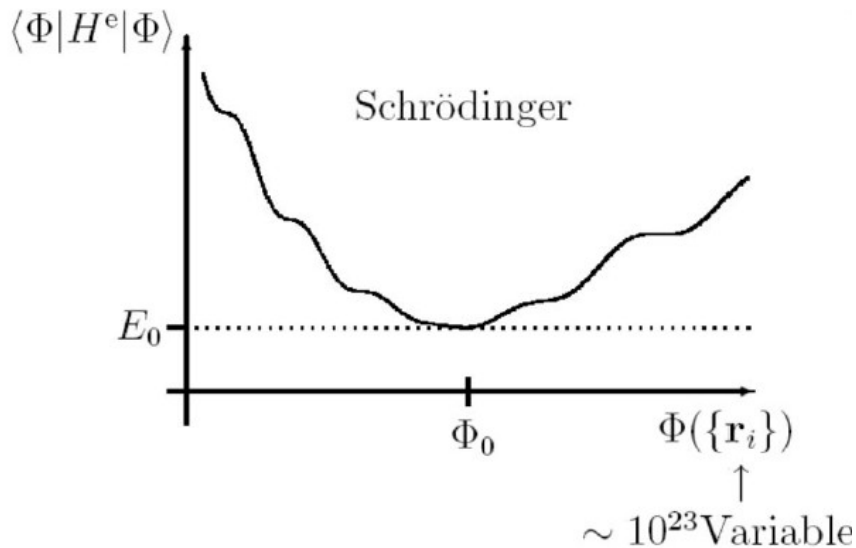
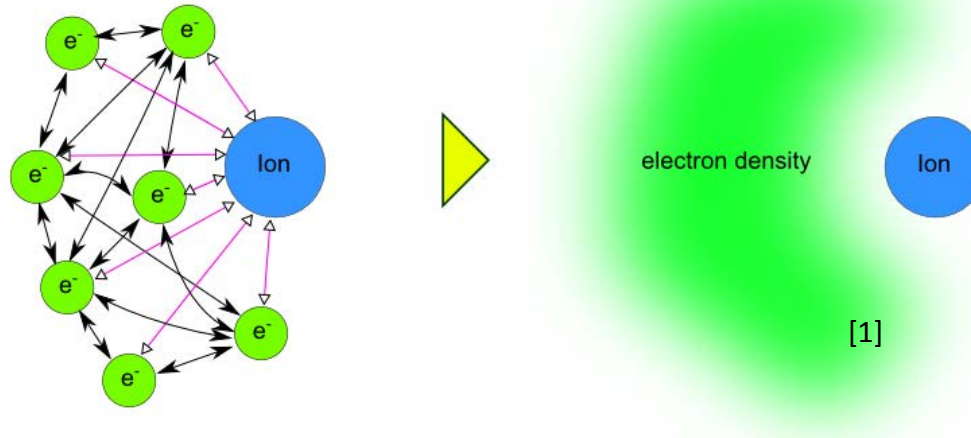
$$\longrightarrow E_0 + E'_0 < E'_0 + E_0 \text{ or } 0 < 0.$$

\therefore The ground state density uniquely specifies the external potential

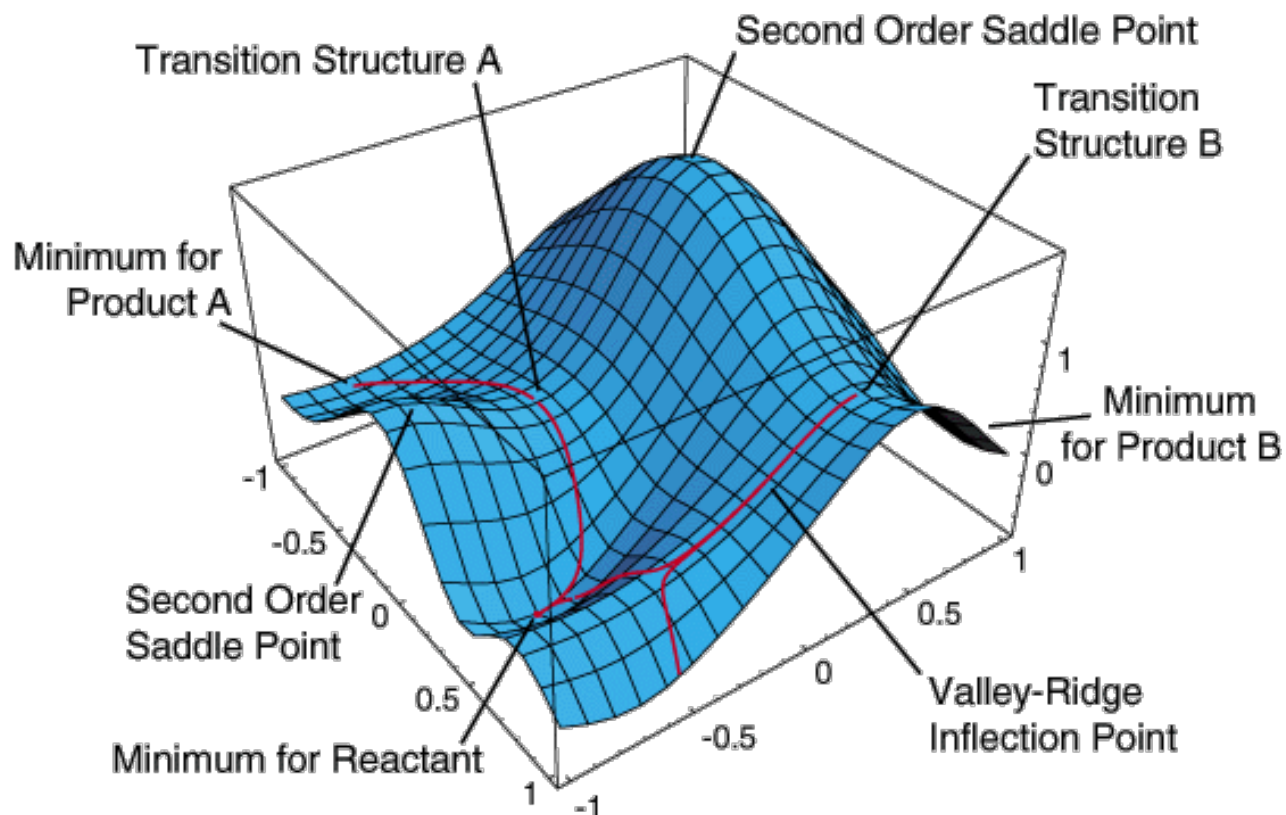
$$\rho_0 \Rightarrow \{N, Z_A, R_A\} \Rightarrow \hat{H} \Rightarrow \Psi_0 \Rightarrow E_0 \text{ (and all other properties).}$$



The electron density contains all the information and is more tractable than using the wave function



Exploring the potential energy surface is critical to compute system properties

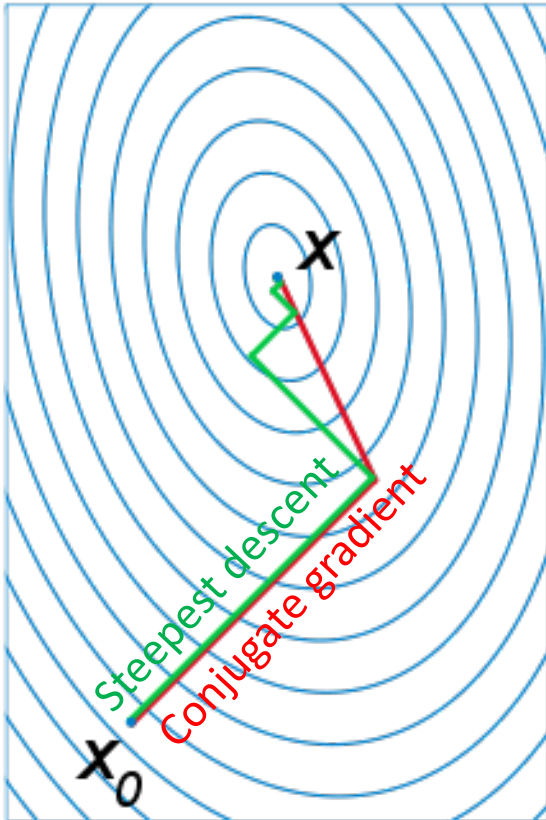


Common energy minimization algorithms

Gradient only methods

Example: Conjugate gradient

$$\mathbf{x}_{k+1} = \mathbf{x}_k + \alpha \mathbf{p}_k$$



Second derivative based-methods

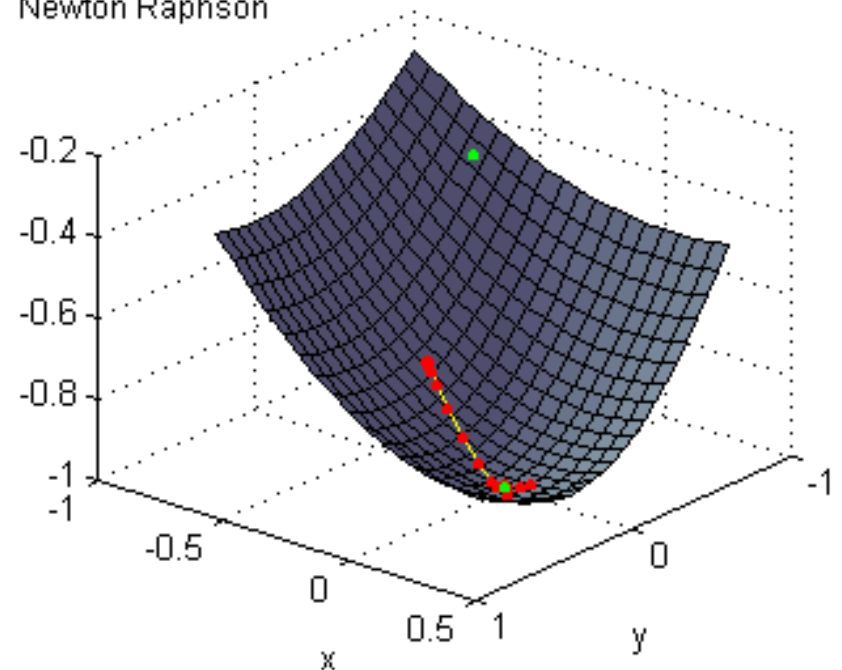
Example: Newton-Raphson

$$\Delta \varepsilon = E - E_o = \mathbf{g}^t \Delta \mathbf{x} + 1/2 \Delta \mathbf{x}^t \mathbf{H} \Delta \mathbf{x}$$

$$\partial \Delta \varepsilon / \partial \Delta \mathbf{x} = \mathbf{g} + \mathbf{H} \Delta \mathbf{x} = 0$$

$$\Delta \mathbf{x} = -\mathbf{H}^{-1} \mathbf{g}$$

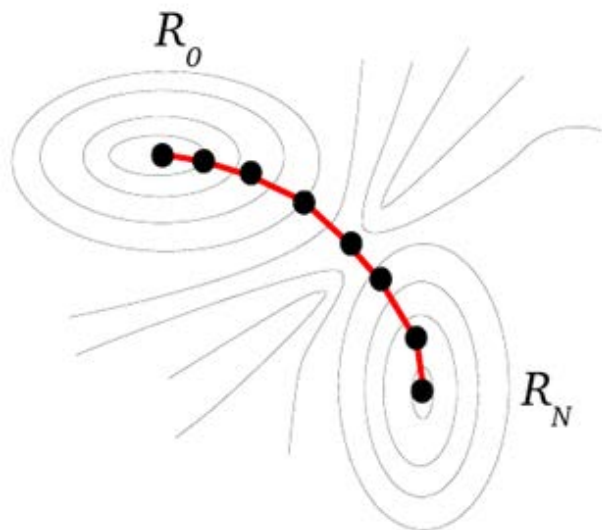
Newton Raphson



Common transition state search methods

“Doubled-ended” searches

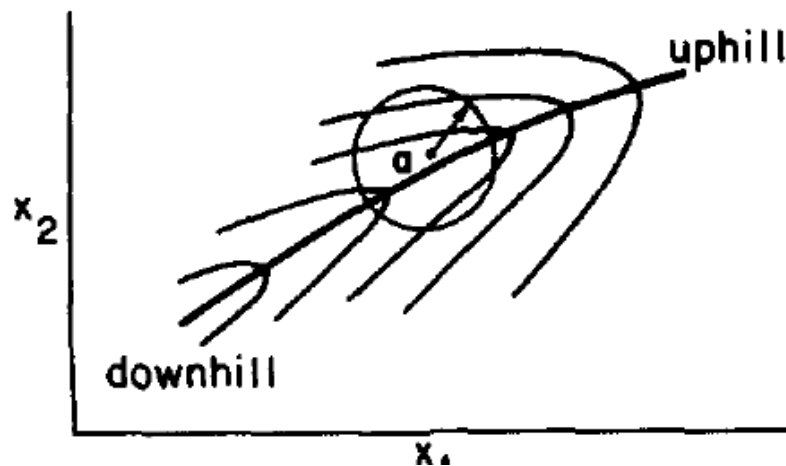
Example: Nudged elastic band



“Single-ended” searches

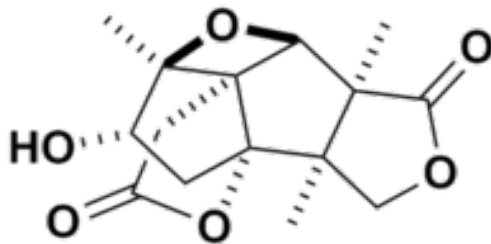
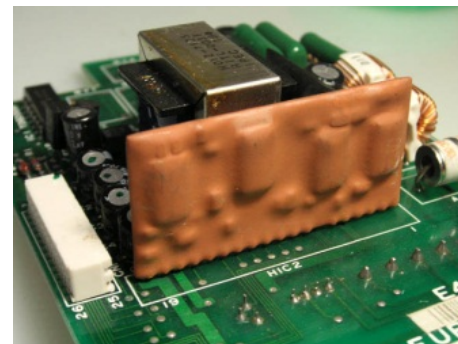
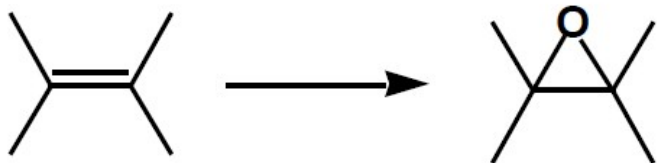
Example: min-mode following

$$\mathbf{X} = (\mathbf{A} - \mathbf{H})^{-1} \mathbf{g}$$

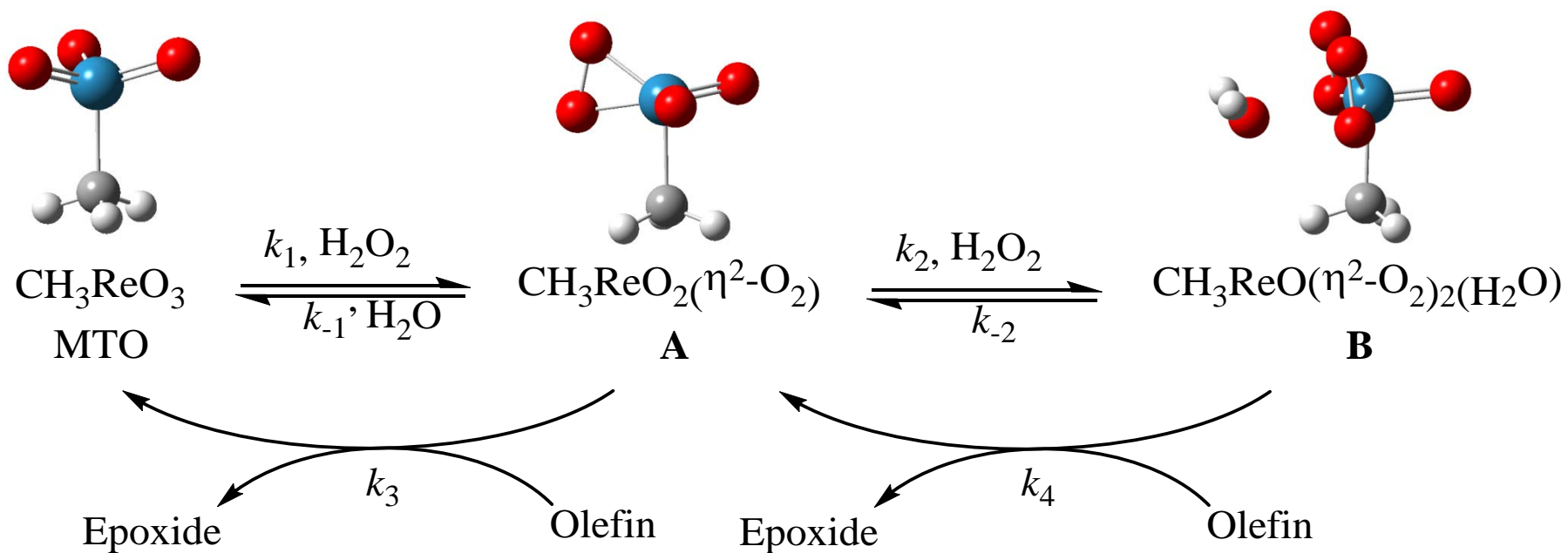


Applications of DFT to understand catalysts

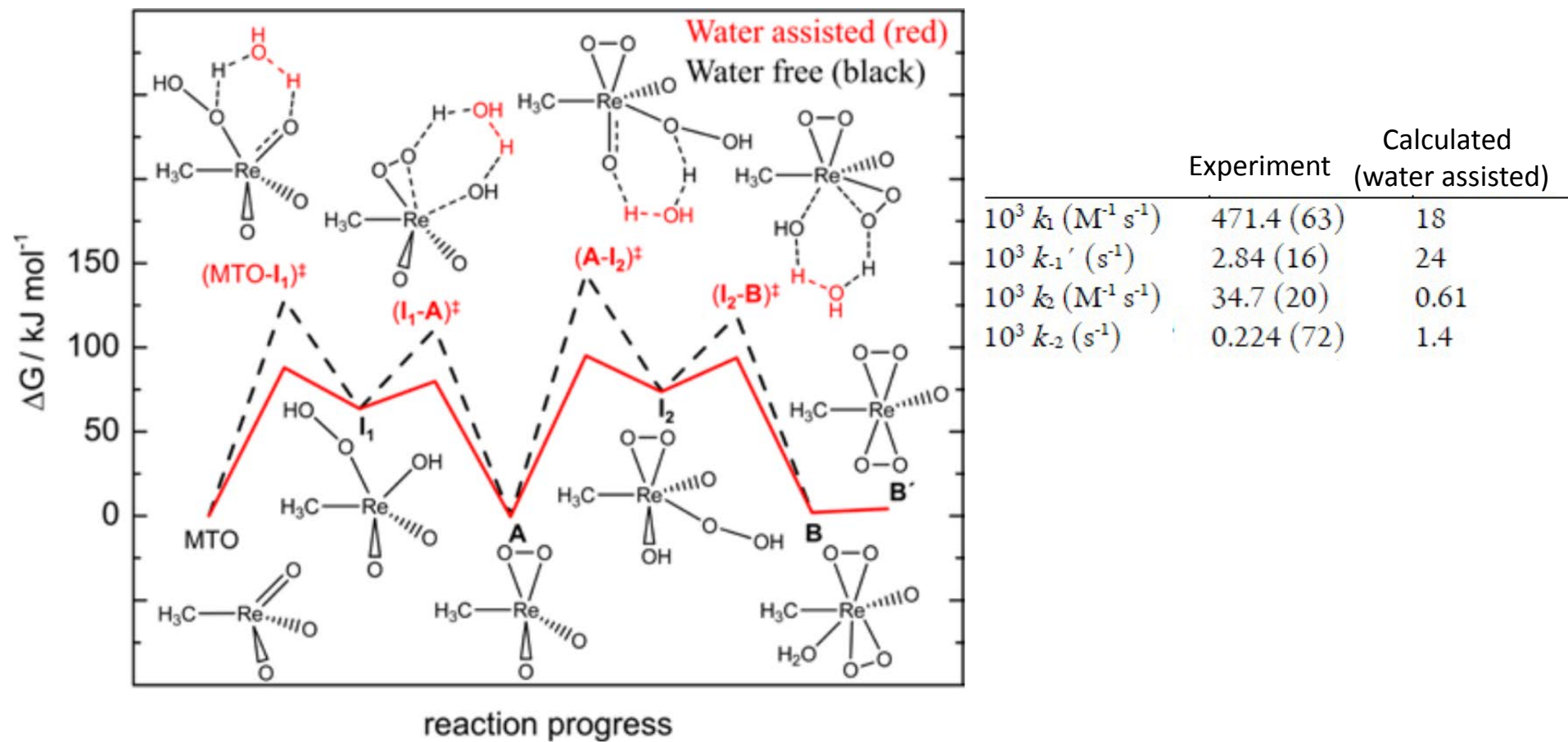
Olefin epoxidation plays a key role in chemical industry



Methyltrioxorhenium is an active olefin epoxidation catalyst

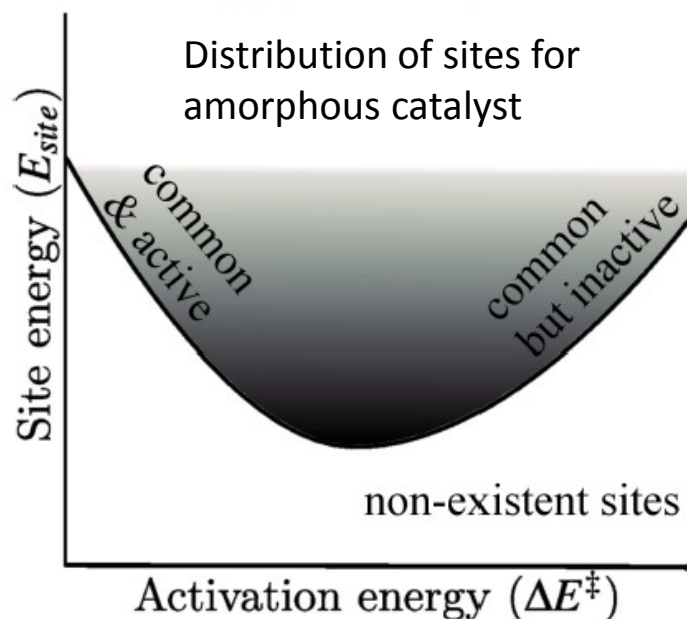


Water-catalyzed activation of H_2O_2 by CH_3ReO_3 in aqueous acetonitrile



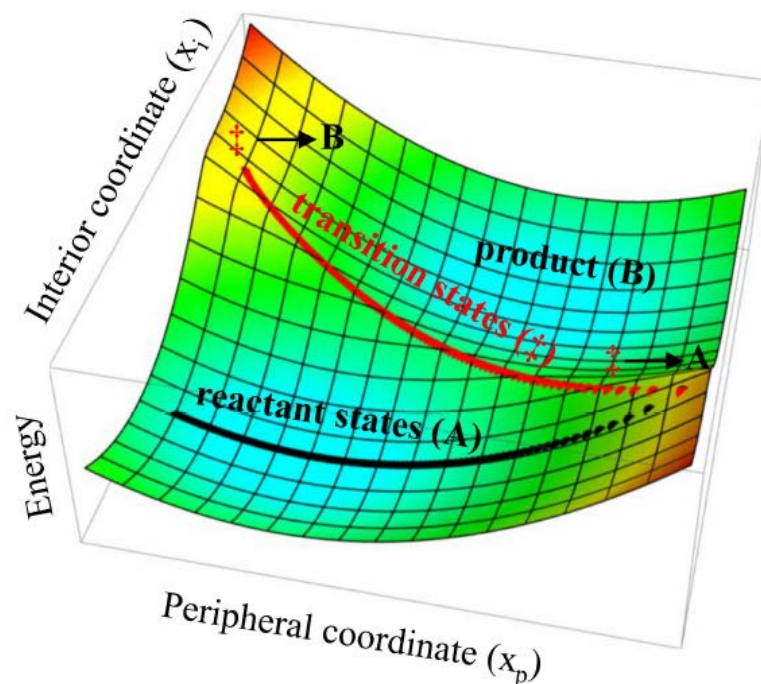
Structure-property relationships in *amorphous* catalysts

Amorphous catalysts are extremely difficult to model



Our approach

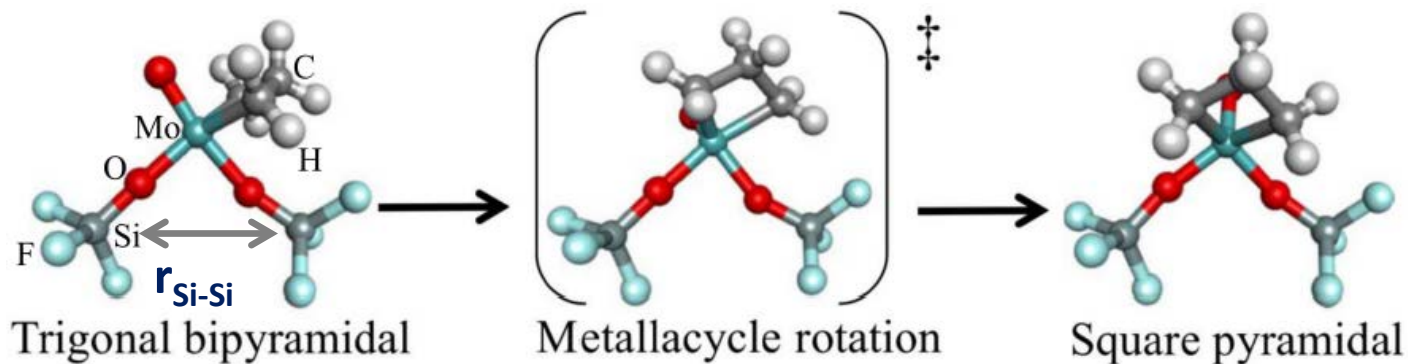
$$\min_{\mathbf{x}_p} E_{\text{red}}^A(\mathbf{x}_p) \quad \text{subject to} \quad \Delta E^\ddagger(\mathbf{x}_p) = \Delta E^\ddagger$$



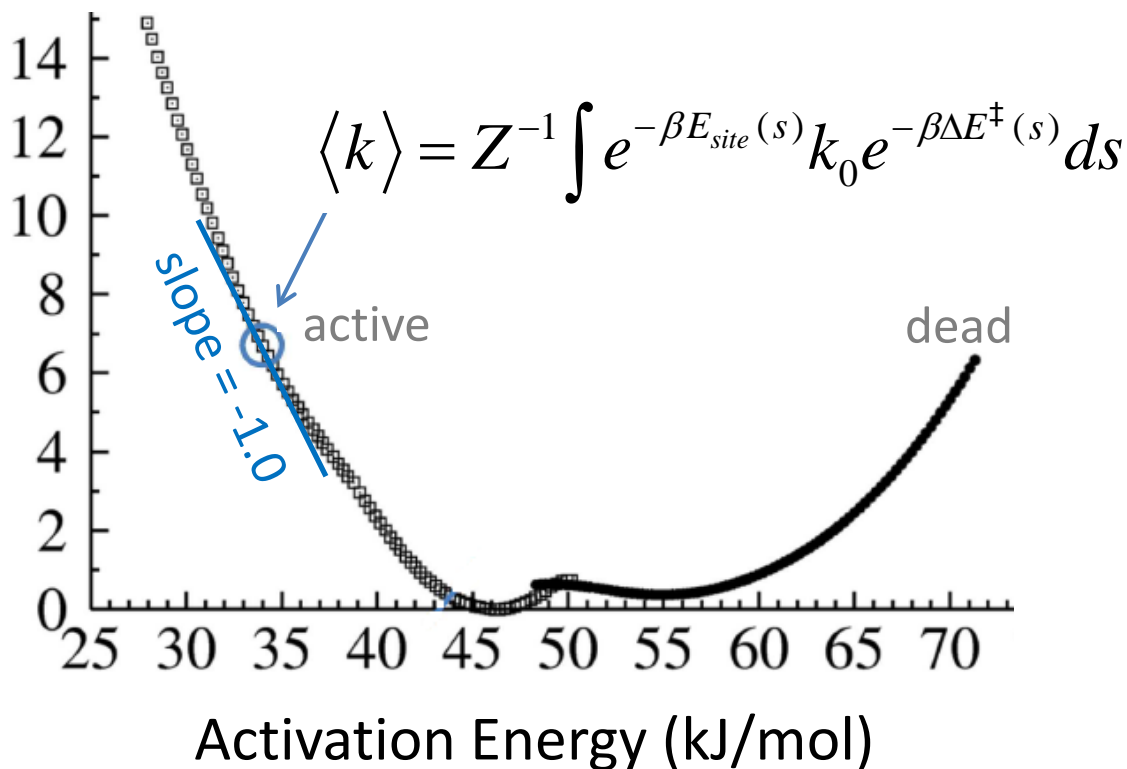
B. R. Goldsmith, E. D. Sanderson, D. Bean, B. Peters,
J. Chem. Phys. 138, 204105 (2013).

B. R. Goldsmith, A. Fong, and B. Peters (2013). *Reaction Rate Constant Computations*, Royal Society Chemistry.

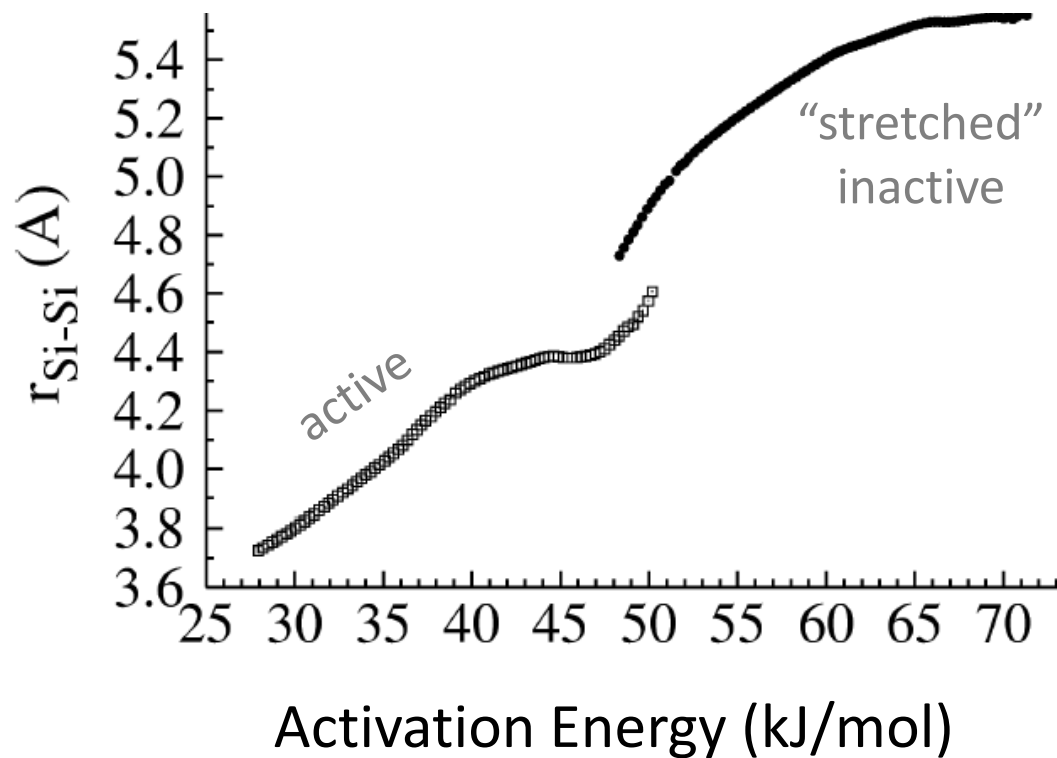
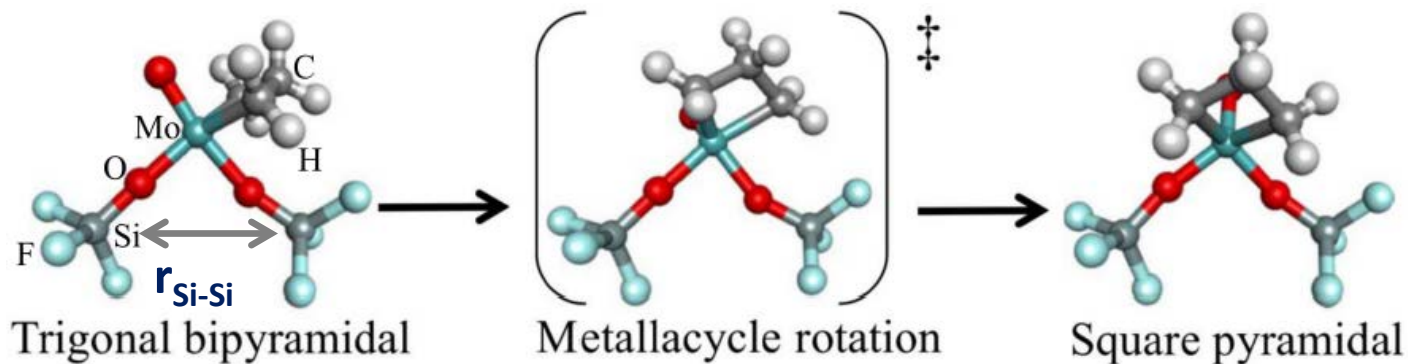
Molybdenum/amorphous $\text{SiO}_2 + \text{C}_2\text{H}_4$



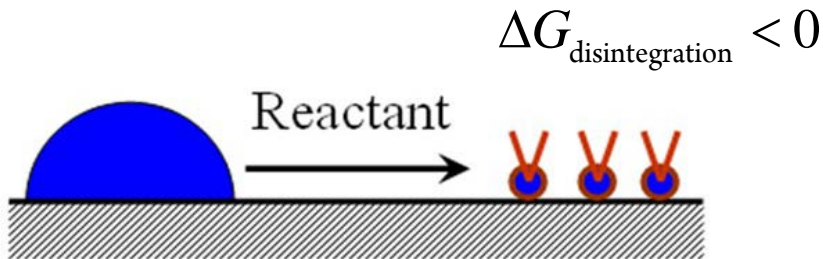
Site formation
energy (kJ/mol)



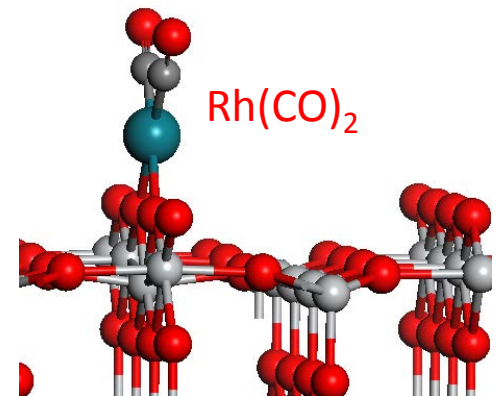
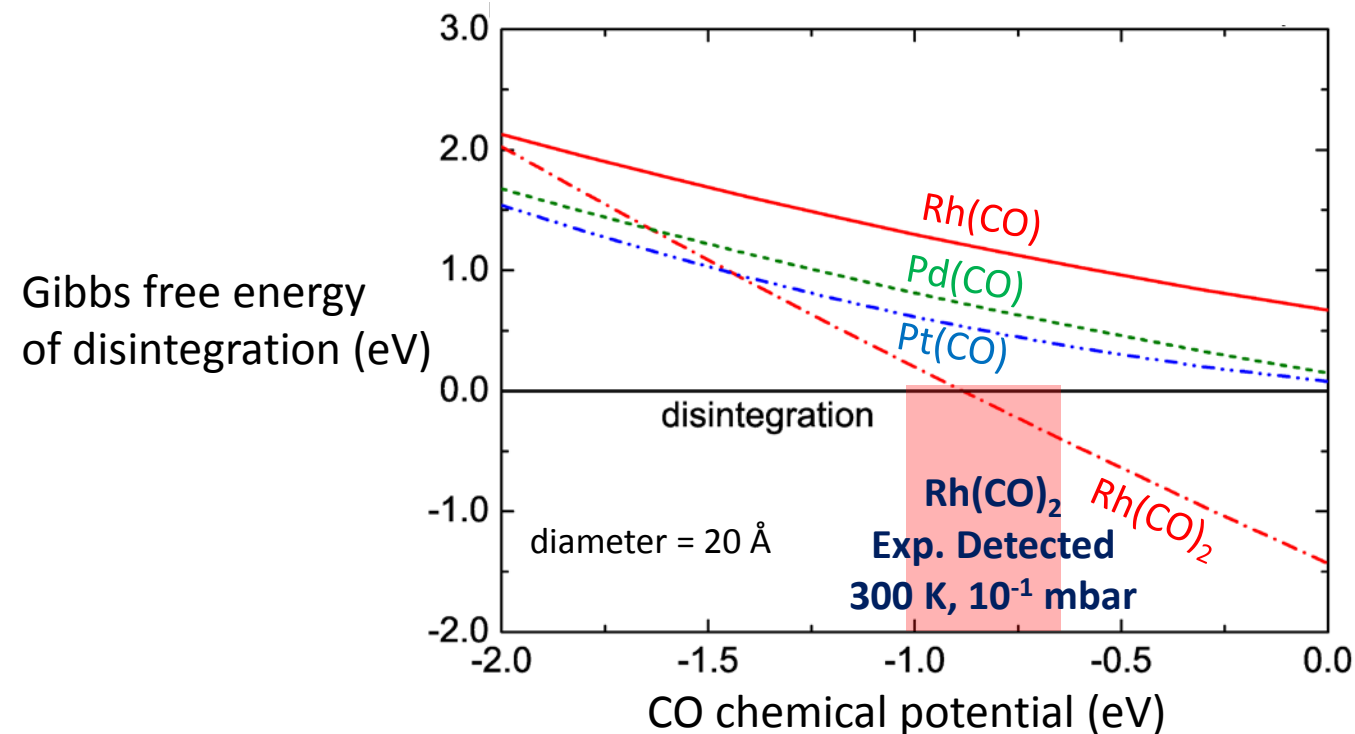
Molybdenum/amorphous SiO_2 + C_2H_4



Predicting nanoparticle disintegration

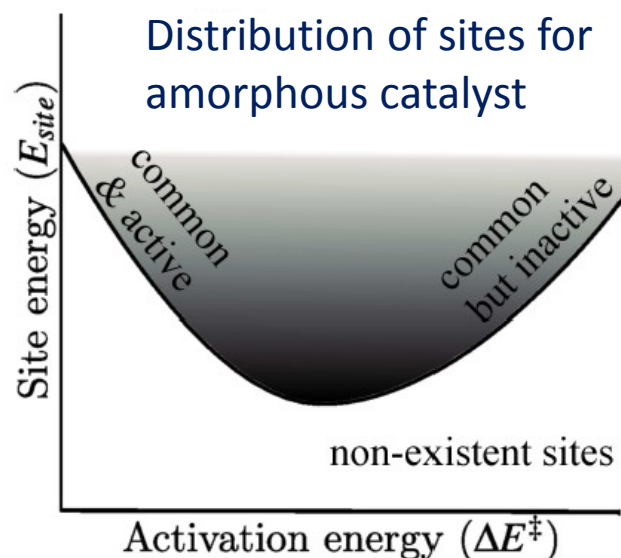


Rh, Pd, or Pt nanoparticles supported on $\text{TiO}_2(110)$ In the presence of CO



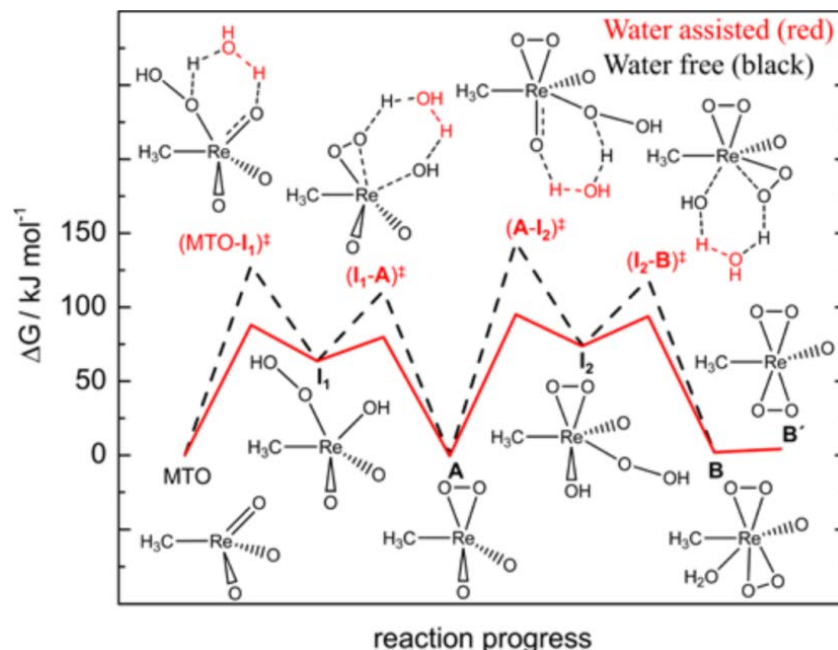
Density functional theory is a powerful method for helping to design new catalysts

Compute reaction mechanisms
Structure-property relationships
Understand synthesis of catalysts

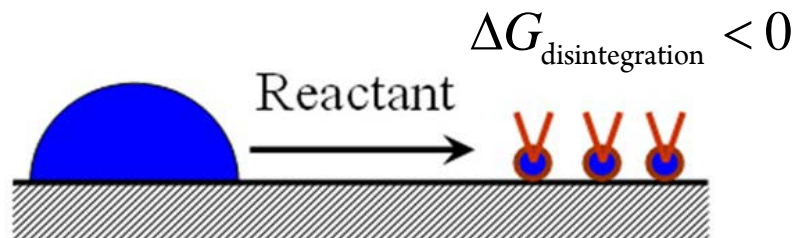


$$\min_{\mathbf{x}_p} E_{\text{red}}^A(\mathbf{x}_p) \quad \text{subject to} \quad \Delta E^\ddagger(\mathbf{x}_p) = \Delta E^\ddagger$$

Reactions in solution



Nanoparticle stability



Questions?

Acknowledgements

Prof. Baron Peters

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Chris Yuan

The Peters Group

