



# ***Ab Initio Thermodynamics and Heterogeneous Catalysis***

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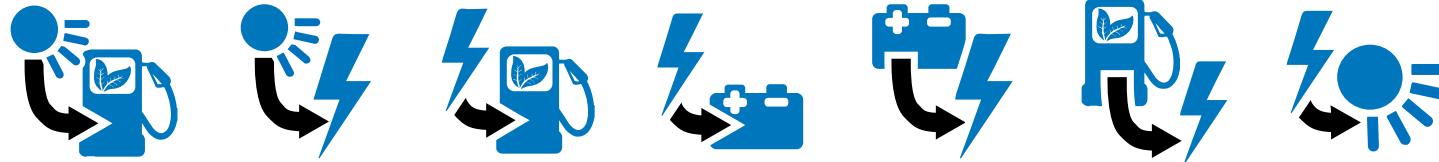
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## **I. Motivation:**

### **The need to extend the predictive realm of quantum chemistry**



## Sustainable Energy Conversion Strategies



**Human  
Energy  
Demands**

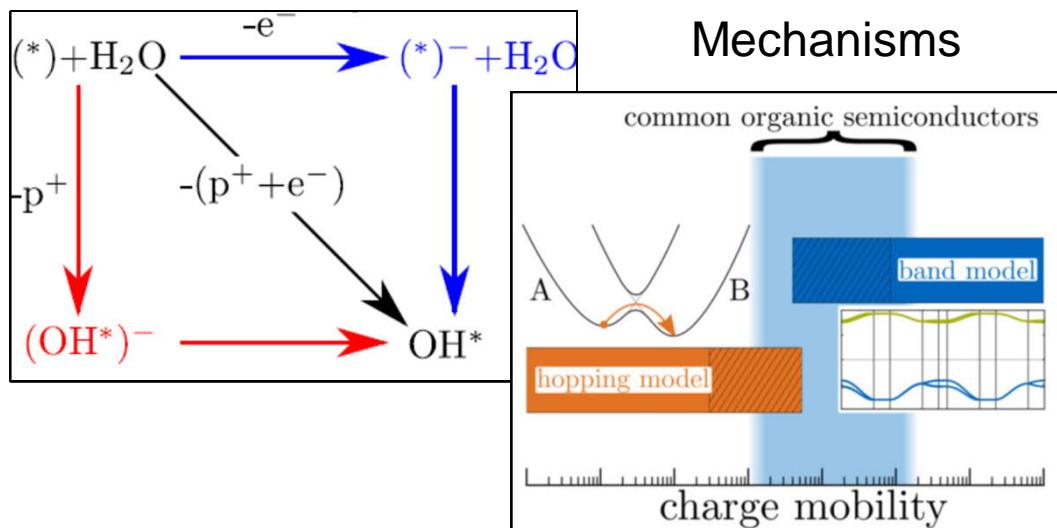
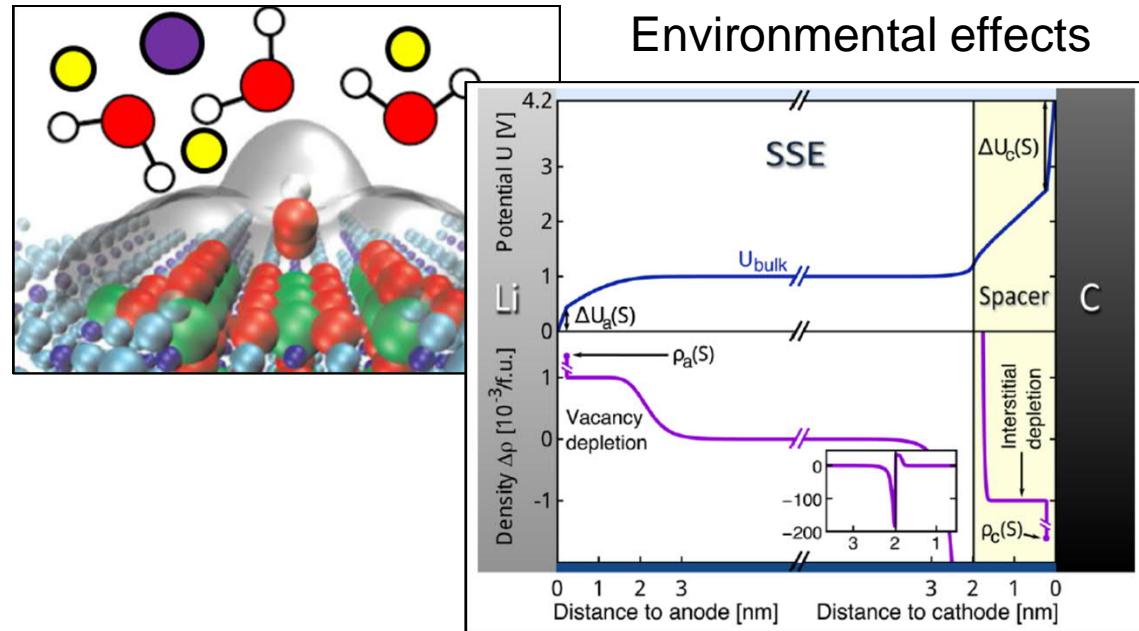
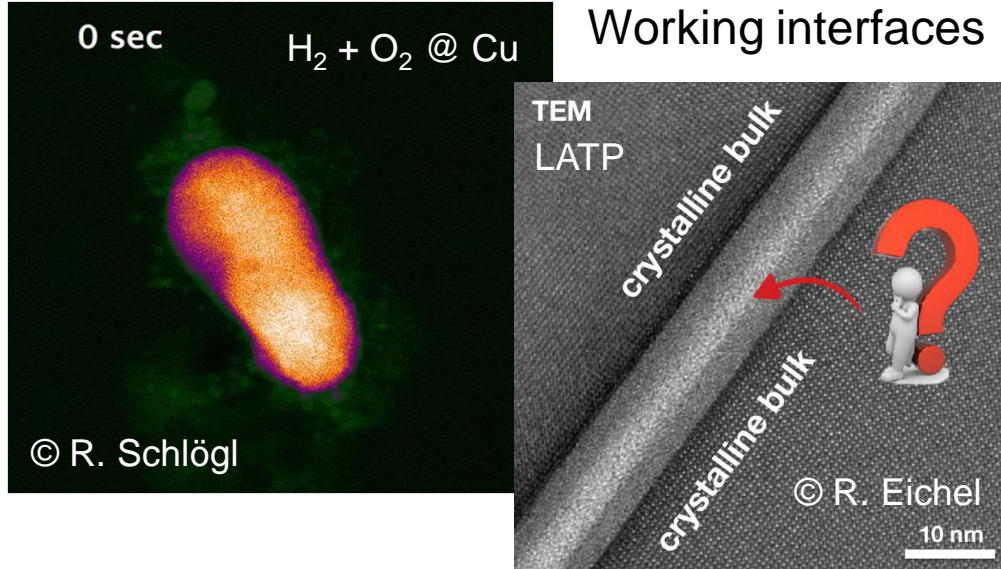
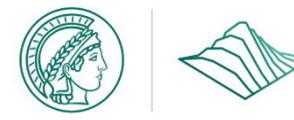


mobile  
stationary  
**Scalability**  
to global demand  
decentralized  
large-scale  
in-doors  
out-doors  
transparent  
flexible  
**Energy security**  
through complementarity  
**Adaptability**  
to application requirement

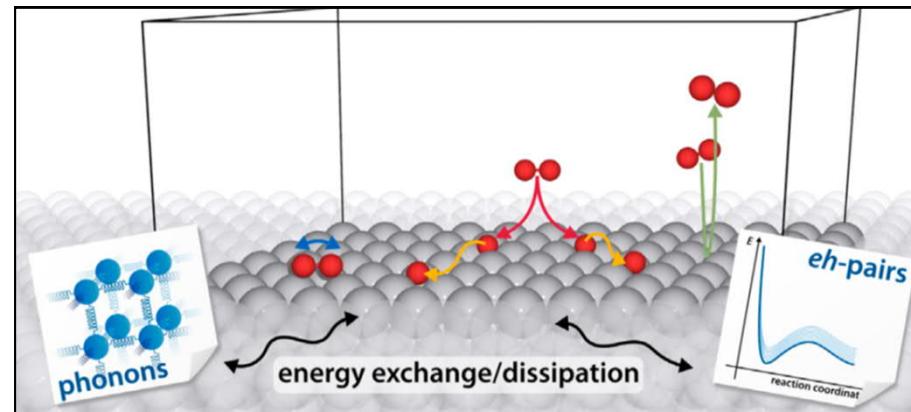
high capacity  
efficiency  
stability  
continuous  
earth abundance  
high power  
cycling  
intermittent  
energy return on investment

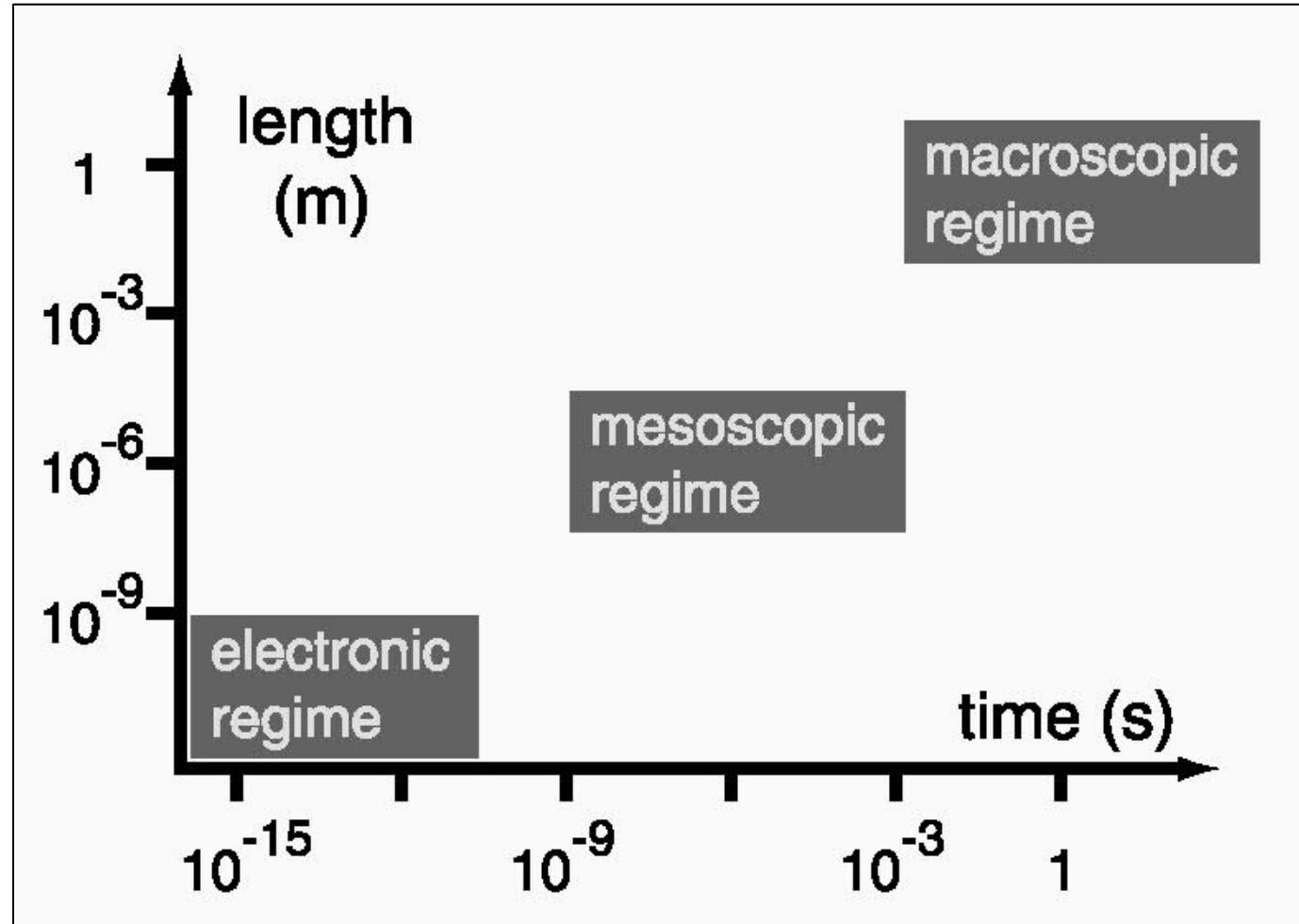
Diversified Solutions           Diversified Energy Research

# Interfacial Complexities



## Degree of adiabaticity



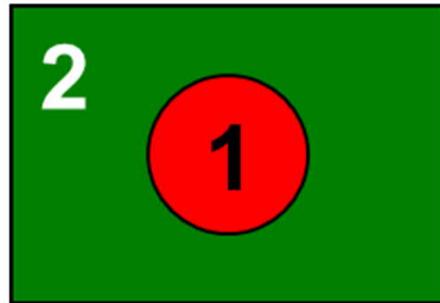




## Linking approaches

concurrent (embedding)

sequential/hierarchical (hand-shaking)



## Coarse-graining

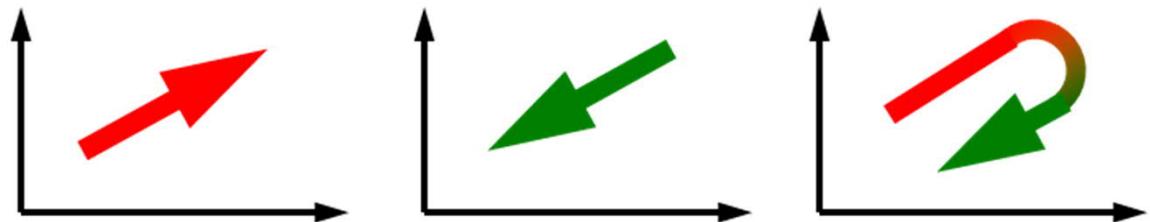
information overflow

typical: electronic → molecular → pseudo-particle/lattice → continuum

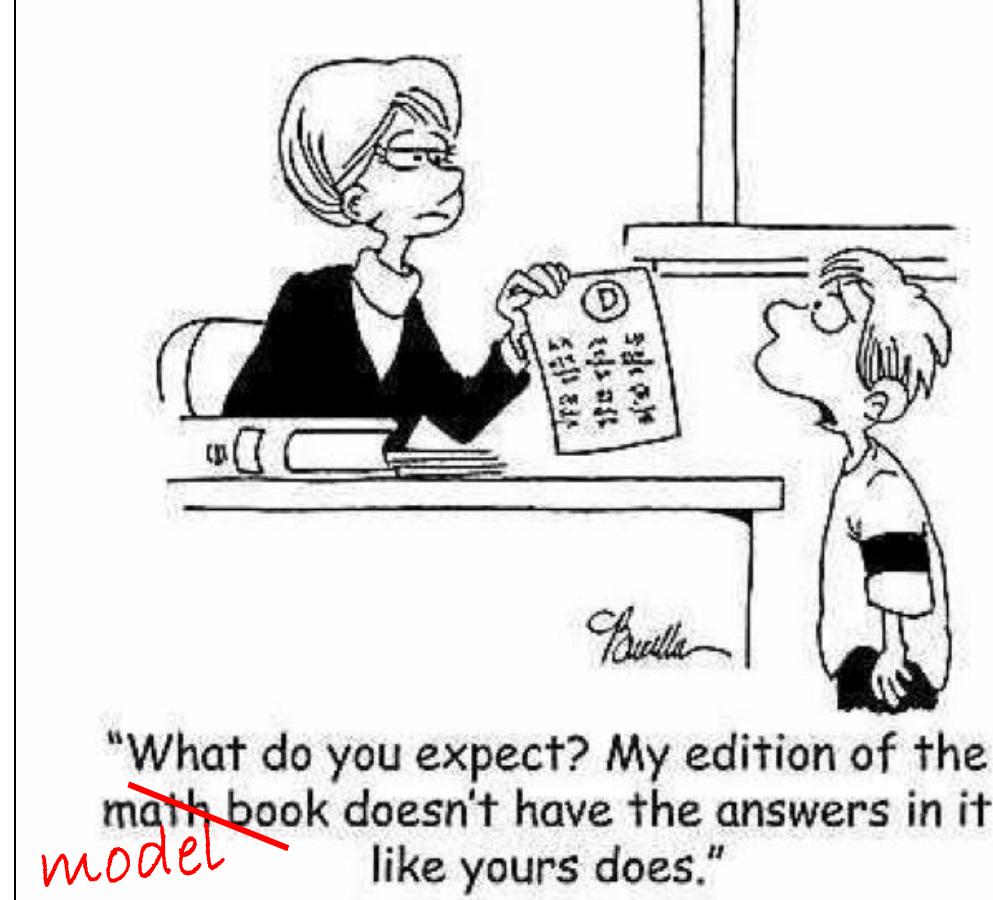
## Reverse-mapping capability

bottom-up vs. top-down

predictive-quality vs. empirical modeling



# Phenomenological vs. Predictive Theory





Potential energy  
for fixed nuclear  
positions  $\{\mathbf{R}_I\}$ :

$$E_0 (\{\mathbf{R}_I\}) = \text{Min}_{\Psi} \langle \Psi | H^e \{\mathbf{R}_I\} | \Psi \rangle$$

## 1. Wavefunction based methods („Quantum Chemistry“)

Ansatz for  $\Psi$ : Hartree-Fock, post-HF (MP2, CI, CC,...)

## 2. Density-functional theory $\Psi = \Psi[n(\mathbf{r})]$ (Hohenberg-Kohn, 1964)

$$\Rightarrow E_0 (\{\mathbf{R}_I\}) = \text{Min}_{n(\mathbf{r})} E_{\{\mathbf{R}_I\}}[n]$$

$$E_{\{\mathbf{R}_I\}}[n] = T_s[n] + \int d^3r v_{\{\mathbf{R}_I\}}^{\text{nuc}}(\mathbf{r})n(\mathbf{r})$$

$$+ \frac{1}{2} \int \int d^3r d^3r' \frac{n(\mathbf{r})n(\mathbf{r}')}{|\mathbf{r} - \mathbf{r}'|} + E^{\text{xc}}[n]$$

(Kohn-Sham, 1965)

$$E_{LDA}^{\text{xc}}[n] = \int d^3r n(r) \varepsilon^{\text{xc}}(n_o) \Big|_{n_o=n(r)}$$

$$E_{GGA}^{\text{xc}}[n] = \int d^3r n(r) \varepsilon^{\text{xc}}(n_o, \nabla n_o) \Big|_{n_o=n(r)}$$



## Motivation (Scheffler, ~1980s):

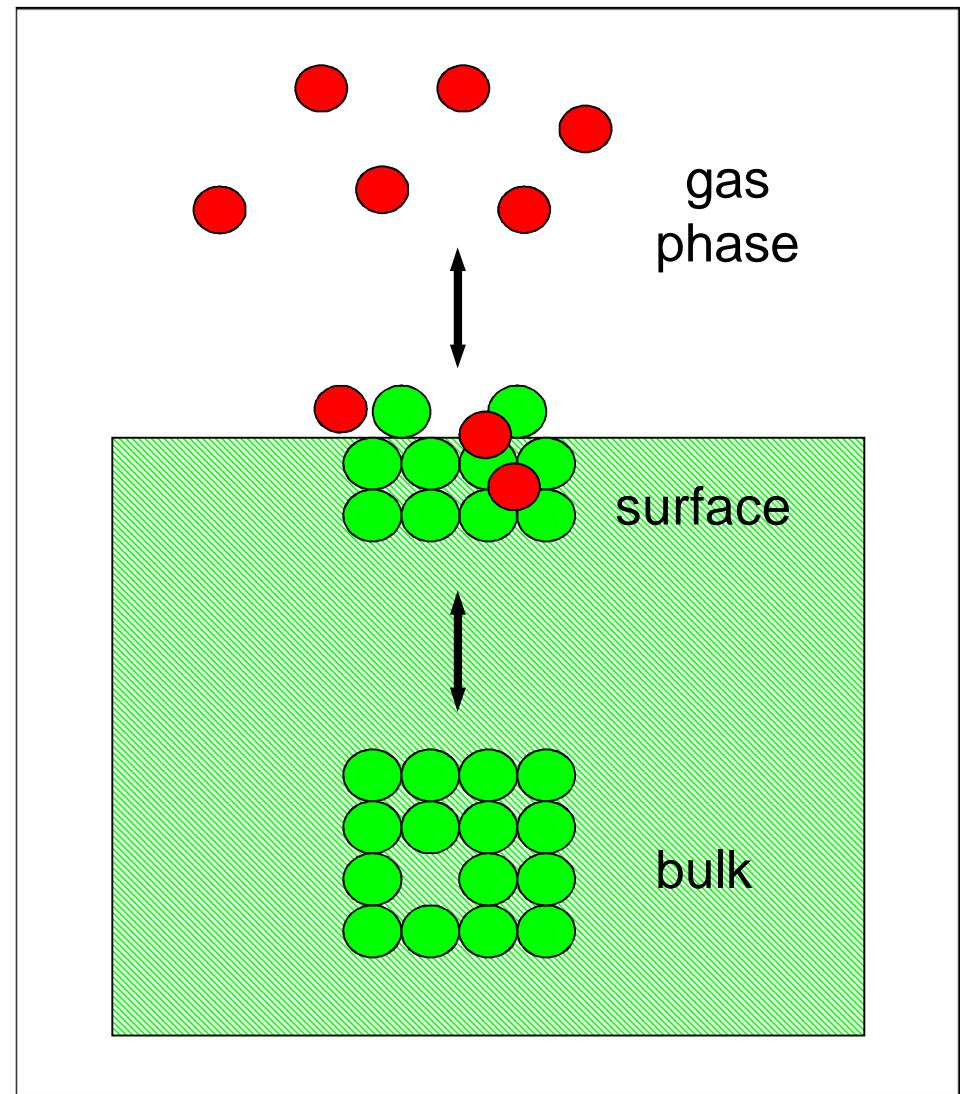
- extend length scale
- consider finite temperature effects

## Approach:

- separate system into sub-systems  
(exploit idea of infinite (homogeneous) reservoirs!)
- calculate properties of sub-systems  
separately (cheaper...)
- connect by implying equilibrium  
between sub-systems

## Drawback:

- no temporal information  
("system properties after infinite time")
- equilibrium assumption



J. Rogal and K. Reuter, *Ab initio atomistic thermodynamics for surfaces: A primer*.

In: Experiment, Modeling and Simulation of Gas-Surface Interactions for Reactive Flows in Hypersonic Flights. Educational Notes RTO-EN-AVT-142, Neuilly-sur-Seine (2007).



## II. Recap:

# **Essential thermodynamics and statistical mechanics**



Internal energy (U)  
 Enthalpy  
 (Helmholtz) free energy  
 Gibbs free energy

$$\begin{aligned} E(S,V) \\ H(S,p) &= E + pV \\ F(T,V) &= E - TS \\ G(T,p) &= E - TS + pV \end{aligned}$$

Potential functions

- Equilibrium state of system minimizes corresponding potential function
- In its set of variables the total derivative of each potential function is simple  
 (derive from 1<sup>st</sup> law of ThD:  $dE^{\text{tot}} = dQ + dW$ ,  $dW = -pdV$ ,  $dQ = TdS$ )

$$dE = TdS - pdV$$

$$dH = TdS + Vdp$$

$$dF = -SdT - pdV$$

$$dG = -SdT + Vdp$$

⇒ These expressions open the gate to  
 a whole set of general relations like:

$$S = -(\partial F / \partial T)_V, \quad p = -(\partial F / \partial V)_T$$

$$E^{\text{tot}} = -T^2 (\partial / \partial T)_V (F/T) \quad \text{Gibbs-Helmholtz eq.}$$

$$(\partial T / \partial V)_S = -(\partial p / \partial S)_V \text{ etc. Maxwell relations}$$

- Chemical potential  $\mu = (\partial G / \partial n)_{T,p}$  is the cost to remove a particle from the system

Homogeneous system:  $\mu = G/N (= g)$   
 i.e. Gibbs free energy per particle



A many-particle system will flow through its huge phase space, fluctuating through all microscopic states consistent with the constraints imposed on the system. For an isolated system with fixed energy  $E$  and fixed size  $V, N$  (microcanonical ensemble) these microscopic states are all equally likely at thermodynamic equilibrium (i.e. equilibrium is the most random situation).

- Partition function  $Z = Z(T, V) = \sum_i \exp(-E_i / k_B T)$   $\Rightarrow$  Boltzmann-weighted sum over all possible system states  
 $\Rightarrow F = -k_B T \ln(Z)$

- If groups of degrees of freedom are decoupled from each other (i.e. if the energetic states of one group do not depend on the state within the other group), then

$$Z_{\text{total}} = \left( \sum_i \exp(-E_i^A / k_B T) \right) \left( \sum_i \exp(-E_i^B / k_B T) \right) = Z^A Z^B$$

$$\Rightarrow F_{\text{total}} = F^A + F^B$$

e.g. electronic  $\leftrightarrow$  nuclear (Born-Oppenheimer)  
rotational  $\leftrightarrow$  vibrational

-  $N$  indistinguishable, independent particles:  $Z_{\text{total}} = 1/N! \left( Z_{\text{one particle}} \right)^N$

# Computation of Free Energies: Ideal Gas



$$Z = 1/N! \left( \cancel{Z_{\text{ncl}}} Z_{\text{el}} Z_{\text{trans}} \cancel{Z_{\text{rot}}} \cancel{Z_{\text{vib}}} \right)^N$$

$$\Rightarrow \mu(T,p) = G / N = (F + pV) / N = (-k_B T \ln(Z) + pV) / N$$

i) Electr. free energy  $Z_{\text{el}} = \sum_i \exp(-E_i^{\text{el}} / k_B T)$  Typical excitation energies eV  $\gg k_B T$ ,  
 $\Rightarrow F_{\text{el}} \approx E^{\text{tot}} - k_B T \ln(I_{\text{spin}})$  only (possibly degenerate) ground state contributes significantly

Required input: Internal energy  $E$   
(molecule vs. mole! ZPE!)  
Ground state spin degeneracy  $I_{\text{spin}}$

ii) Transl. free energy  $Z_{\text{trans}} = \sum_k \exp(-\hbar k^2 / 2mk_B T)$  Particle in a box of length  $L = V^{1/3}$   
( $L \rightarrow \infty$ )  $\Rightarrow Z_{\text{trans}} \approx V (2\pi mk_B T / \hbar^2)^{3/2}$

Required input: Particle mass  $m$

# Computation of Free Energies: Ideal Gas (cont'd)



## iii) Rotational free energy

$$Z_{\text{rot}} = \sum_J (2J+1) \exp(-J(J+1)B_o / k_B T)$$

Rigid rotator

(Diatom)  $\Rightarrow Z_{\text{rot}} \approx -k_B T \ln(k_B T / \sigma B_o)$

$\sigma = 2$  (homonucl.),  $= 1$  (heteronucl.)

$$B_o \sim md^2 \quad (d = \text{bond length})$$

Required input: Rotational constant  $B_o$   
(exp: tabulated microwave data)

## iv) Vibrational free energy

$$Z_{\text{vib}} = \sum_{i=1}^M \sum_n \exp(-(n + \frac{1}{2})\hbar\omega_i / k_B T)$$

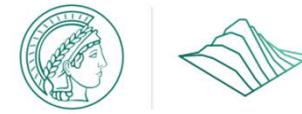
Harmonic oscillator

$$\Rightarrow \mu_{\text{vib}}(T) = \sum_{i=1}^M \frac{1}{2} \hbar\omega_i + k_B T \ln(1 - \exp(-\hbar\omega_i/k_B T))$$

Required input: M fundamental vibr. modes  $\omega_i$

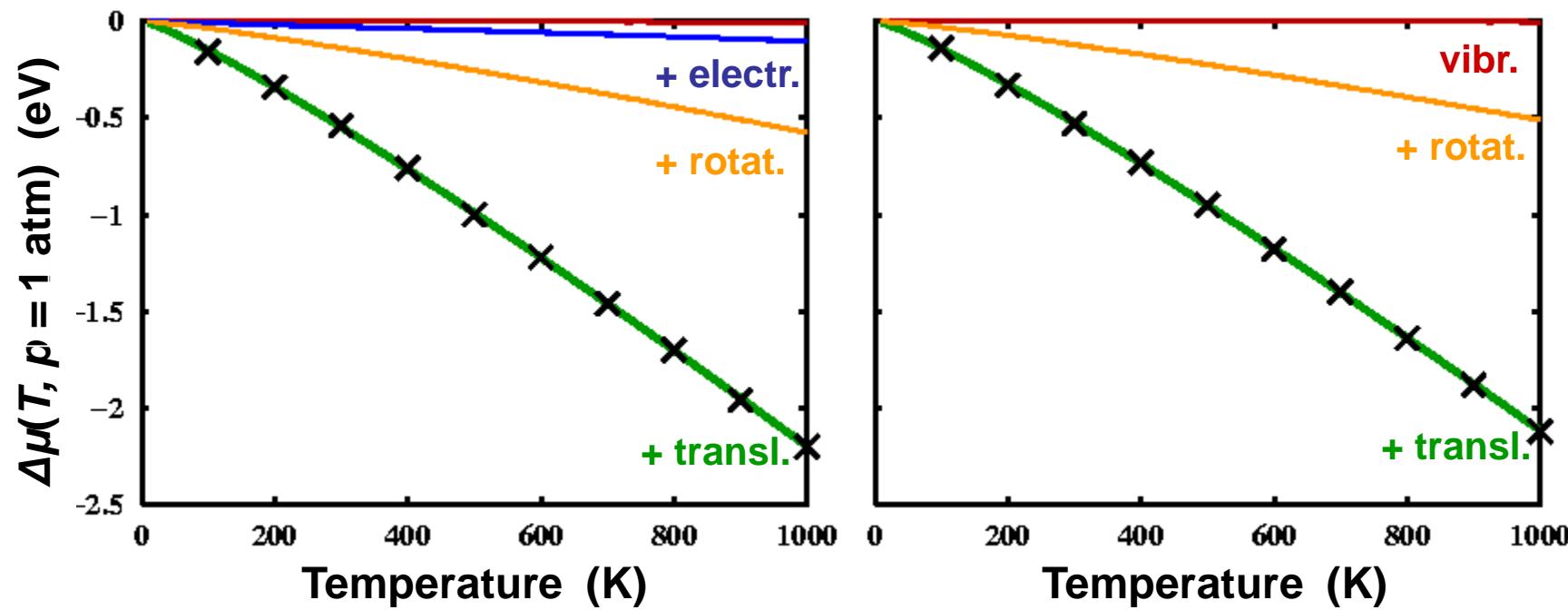
Calculate dynamic matrix  $D_{ij} = (m_i m_j)^{-\frac{1}{2}} (\partial^2 E / \partial r_i \partial r_j)_{\text{eq}}$   
Solve eigenvalue problem  $\det(D - 1/\omega_i^2)$

# Computation of Free Energies: Ideal Gas (cont'd)



	O <sub>2</sub>	CO
<i>m</i>	32	28
$\nu_{\text{stretch}}$	196	269
$B_o$	0.18	0.24
$\sigma$	2	1
$I_{\text{spin}}$	3	1

$$\begin{aligned}\mu &= \mu(T, p) \\ &= E + \Delta\mu(T, p)\end{aligned}$$



Alternatively:

$$\Delta\mu(T, p) = \Delta\mu(T, p^o) + kT \ln(p/p^o)$$

and  $\Delta\mu(T, p^o = 1 \text{ atm})$  tabulated in thermochem. tables (e.g. JANAF)

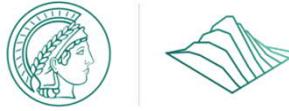
# Computation of Free Energies: Solids



$$G(T,p) = E + F^{\text{trans}} + F^{\text{rot}} + F^{\text{vib}} + F^{\text{conf}} + pV$$

$F^{\text{trans}}$	Translational free energy	$\left. \right\} \propto 1/M \rightarrow 0$
$F^{\text{rot}}$	Rotational free energy	
$pV$	$V = V(T,p)$ from equation of state, varies little	$\rightarrow 0$ for $p < 100$ atm
$F^{\text{conf}}$	Configurational free energy	$\rightarrow$ Trouble maker...
$E$	Internal energy	$\rightarrow$ DFT (periodic supercell!!)
$F^{\text{vib}}$	Vibrational free energy	$\rightarrow$ phonon band structure
$E, F^{\text{vib}}$	use differences use simple models to approx. $F^{\text{vib}}$ (Debye, Einstein)	
$\Rightarrow$ Solids (low $T$ ):		$\Delta G(T,p) \sim \Delta E + \Delta F^{\text{conf}}$

# Toy Example: Concentration of Point Defects



On entropic grounds there will always be a finite concentration of defects at finite temperature, even though the creation of a defect costs energy ( $E_D > 0$ ).

How large is it?

Internal energy:

$$E = n E_D$$

Config. entropy:

$$F^{\text{conf}} = k_B T \ln Z(n)$$

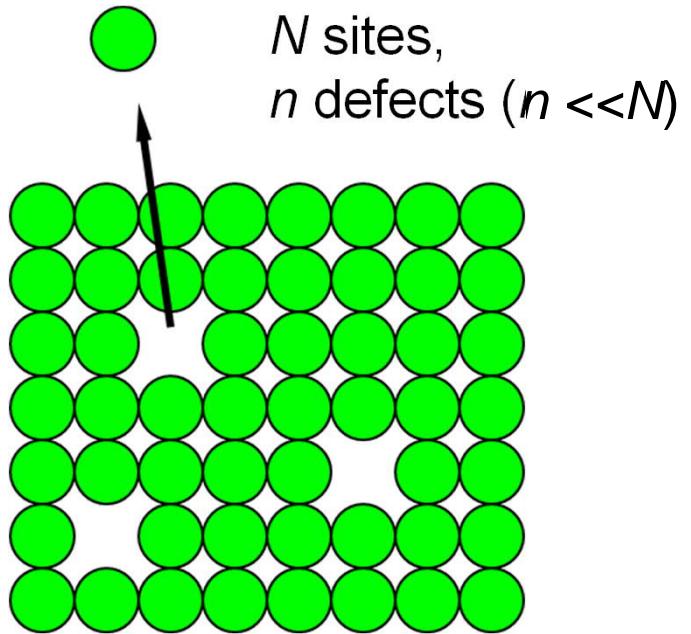
with  $Z = \frac{N(N-1) \dots (N-n+1)}{1 \cdot 2 \cdot \dots \cdot n} = \frac{N!}{(N-n)!n!}$

Minimize free energy:

$$(\partial G / \partial n)_{T,p} = \partial / \partial n_{T,p} (E - F^{\text{conf}} + pV) = 0$$

Forget  $pV$ , use Stirling:  $\ln N! \approx N(\ln N - 1) \Rightarrow$

$$n/N = \exp(-E_D/k_B T)$$



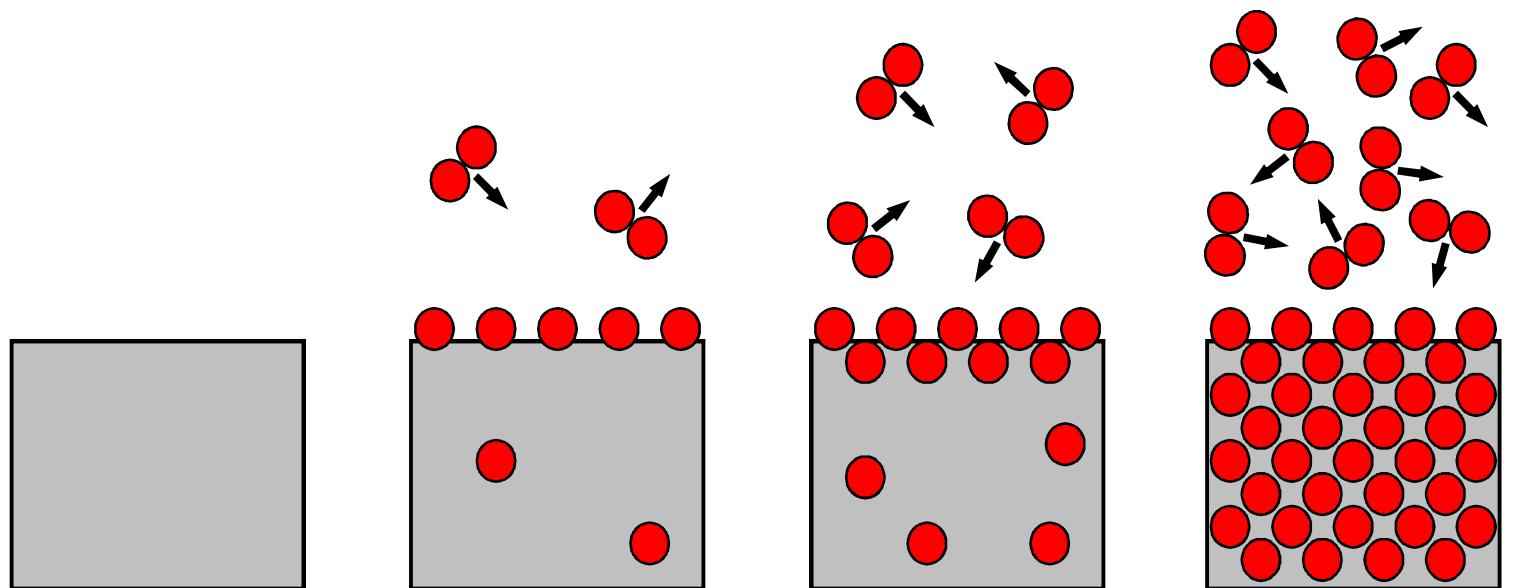
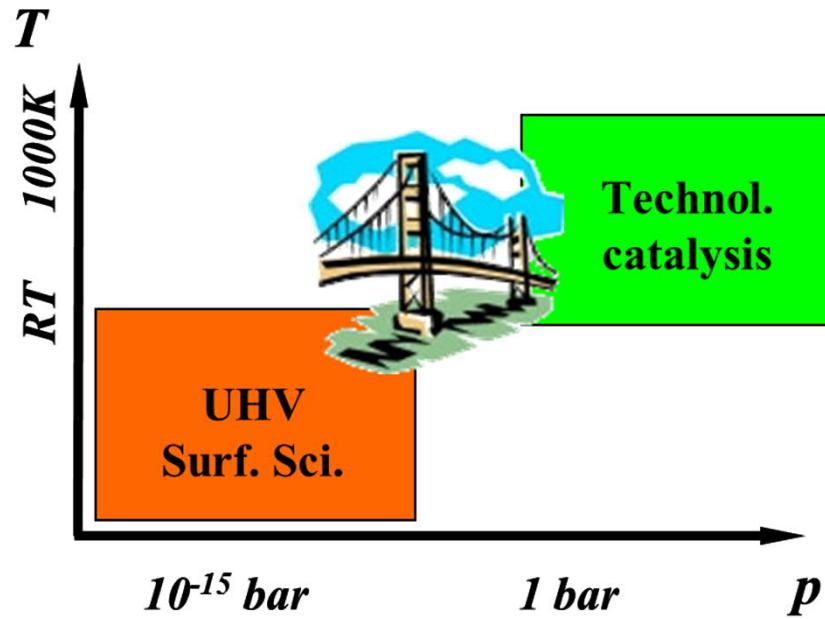


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### **III. Towards Surfaces:**

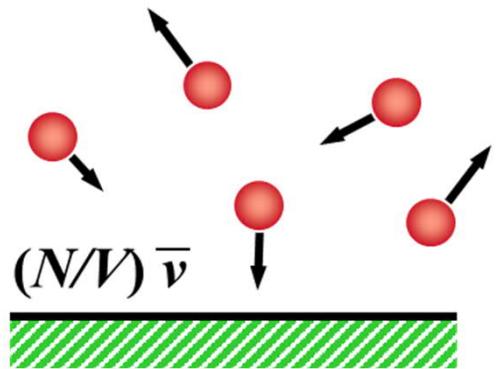
## ***Ab initio* thermodynamics for oxide formation**

# Oxidation Catalysis and the Pressure Gap: Metal, Oxide, Both, ... ?!



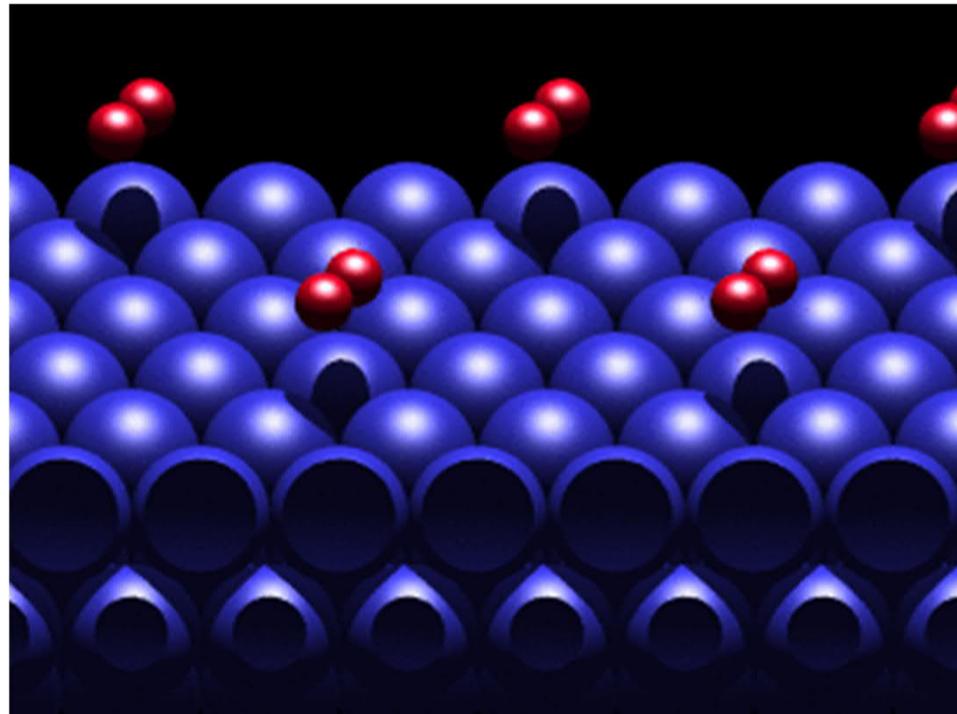
*Nanometer and sub-nanometer thin oxide films at surfaces of late transition metals,*  
K. Reuter, in “Nanocatalysis”, U. Heiz, U. Landman (Eds.), Springer, Berlin (2006).  
ISBN 978-3-540-32645-8.

# Keeping Everything: Expensive, Limited Time Scale



$$Z = \frac{p}{(2\pi mkT)^{1/2}}$$

$10^{15}$  sites/cm<sup>2</sup>,  $T = 300$  K,  
 $p = 1$  atm:  $Z \sim 10^8$  site<sup>-1</sup> s<sup>-1</sup> !!



Example:

O<sub>2</sub> dissociation at Al(111)

Total time of trajectory: 0.5 ps  
Time step: 2.5 fs (200 steps)

CPU cost: 45 days on 1 Compaq  
(2005)      ES45 processor

J. Behler *et al.*, Phys. Rev. Lett. 94, 036104 (2005)



## Motivation (Scheffler, ~1980s):

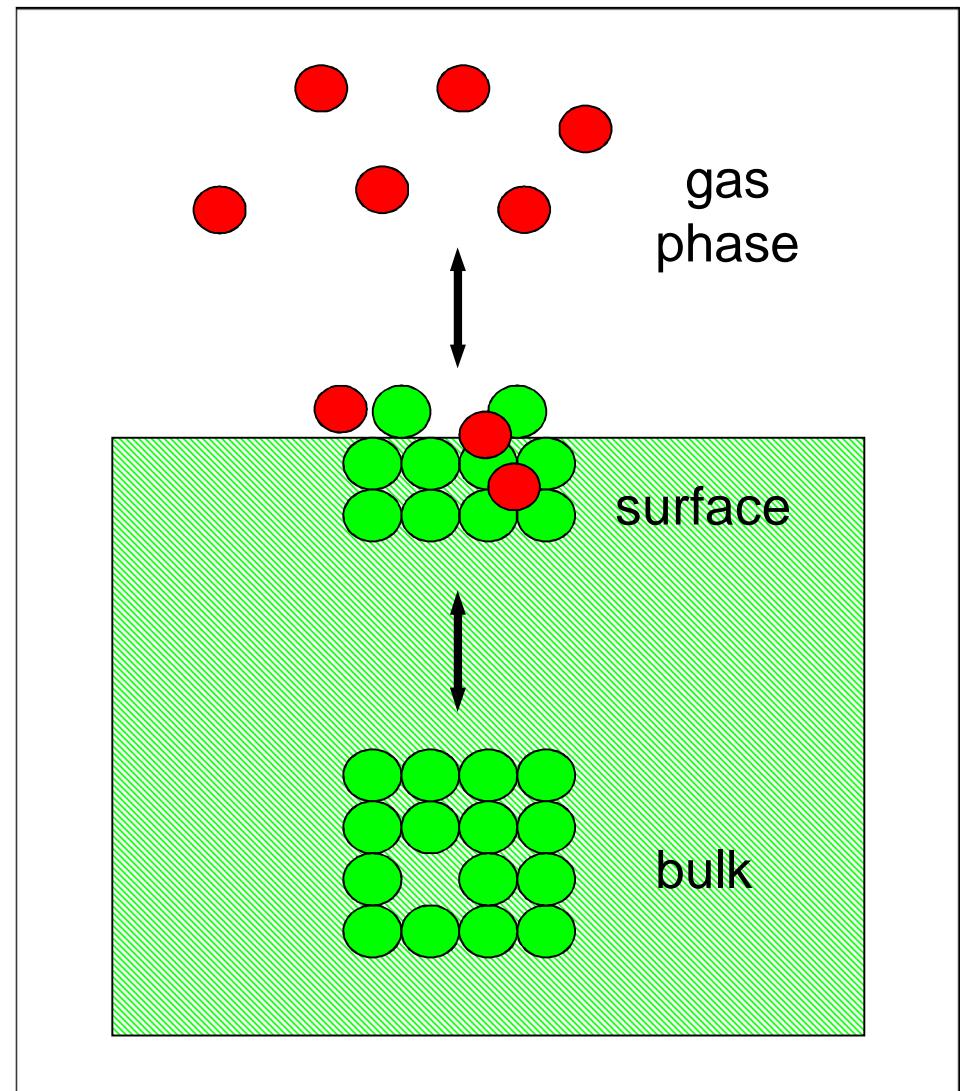
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## Approach:

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(exploit idea of infinite (homogeneous) reservoirs!)
- calculate properties of sub-systems  
separately (cheaper...)
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## Drawback:

- no temporal information  
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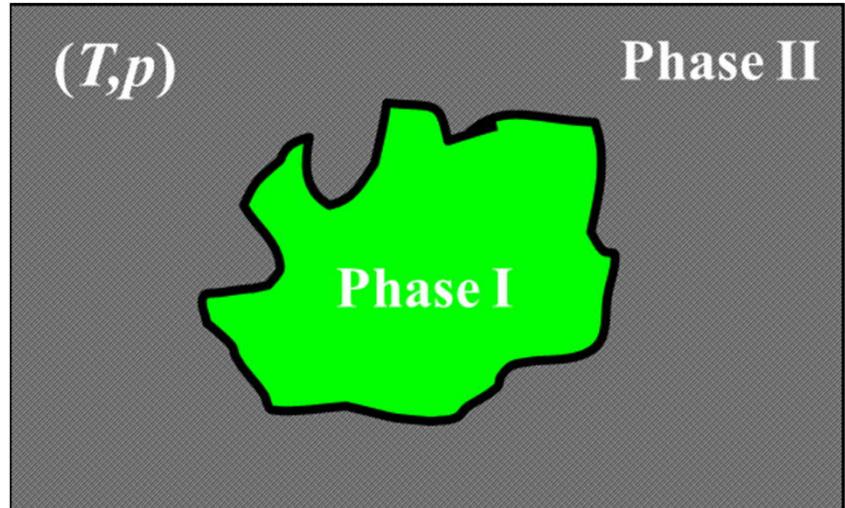
# Surface Thermodynamics



A surface can never be alone:  
there are always  
“two sides” to it !!!

solid – gas  
solid – liquid  
solid – solid (“interface”)

...



Phase I / phase II alone (bulk):

$$G_I = N_I \mu_I$$
$$G_{II} = N_{II} \mu_{II}$$

Total system (with surface):

$$G_{I+II} = G_I + G_{II} + \Delta G_{surf}$$

$$\gamma = 1/A \left( G_{I+II} - \sum_i N_i \mu_i \right)$$

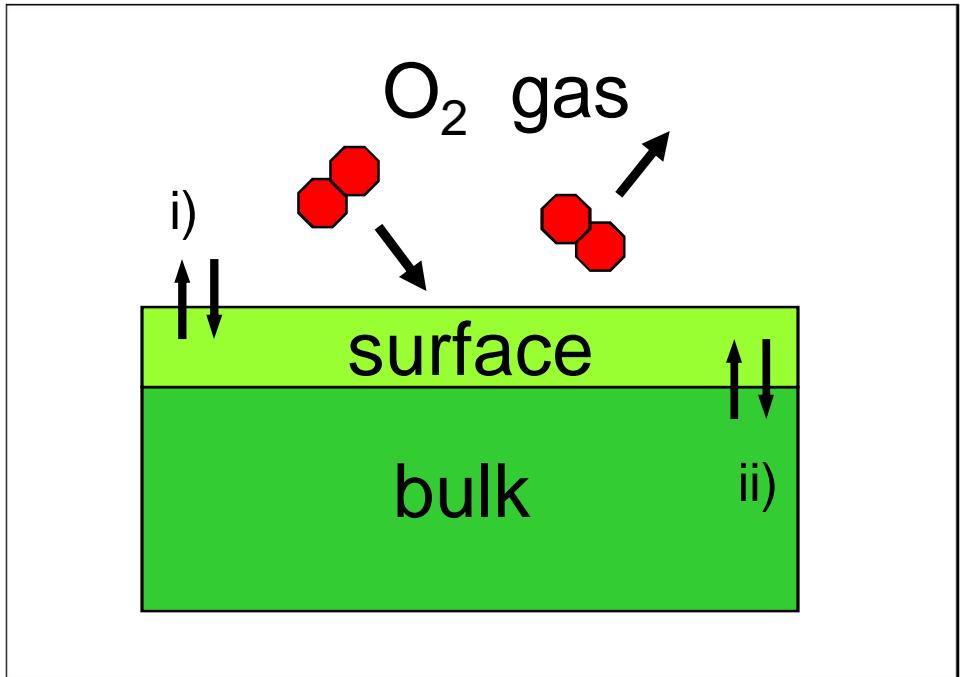
Surface tension  
(free energy per area)

$$\gamma A$$

# Surface in Contact with an Oxygen Gas Phase



$$\gamma_{\text{surf.}} = 1/A [ G_{\text{surf.}}(N_O, N_M) - N_O \mu_O - N_M \mu_M ]$$



Use reservoirs:

i)  $\mu_O$  from ideal gas

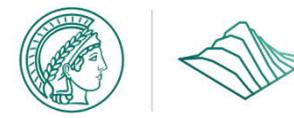
ii)  $\mu_M = g_M^{\text{bulk}}$

$$G(T, p) = E + F^{\text{vib}} + F^{\text{conf}} + pV$$

Forget about  $F^{\text{vib}}$  and  $F^{\text{conf}}$  for the moment,  $pV$  is negligible:

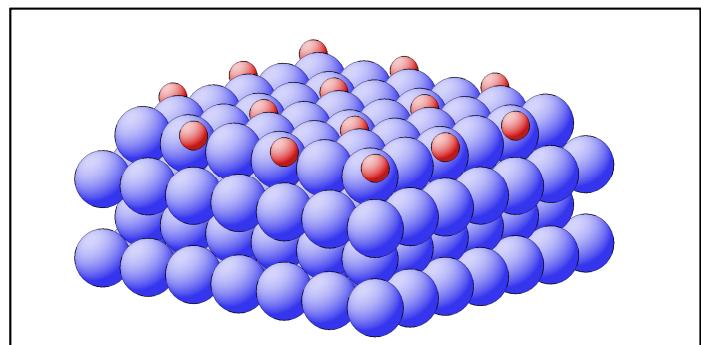
$$\gamma(T, p) \approx (E_{\text{surf.}}^{(\text{slab})} - N_M E_M^{\text{bulk}})/A - N_O \mu_O(T, p)/A$$

# Oxide Formation on Pd(100)

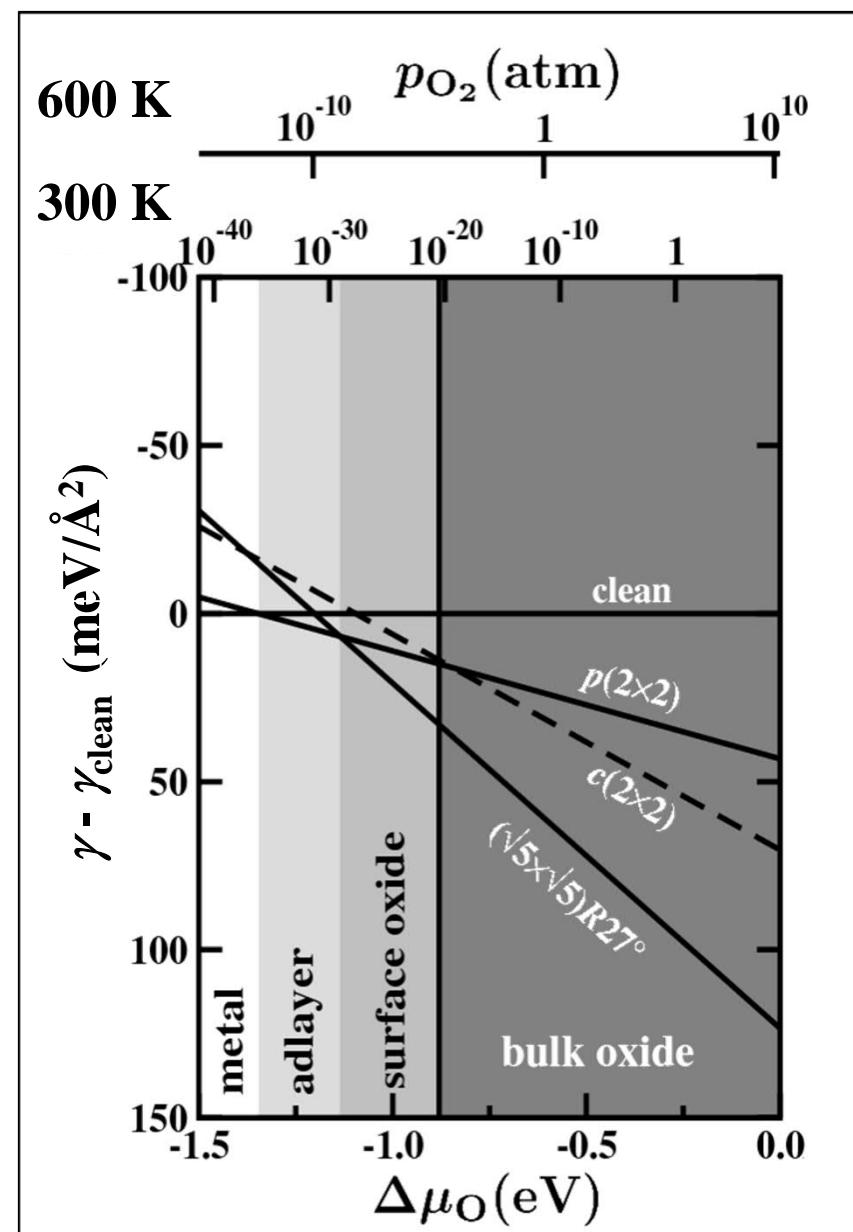
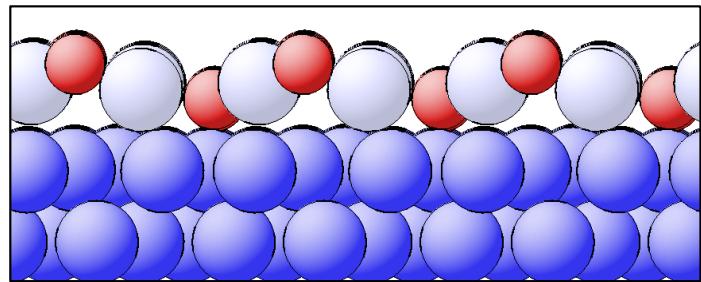


$$\gamma \approx (E_{\text{surf.}}^{(\text{slab})} - N_M E_M^{\text{bulk}})/A - N_O \mu_O/A$$

$p(2\times 2)$  O/Pd(100)



$(\sqrt{5} \times \sqrt{5})R27^\circ$  PdO(101)/Pd(100)



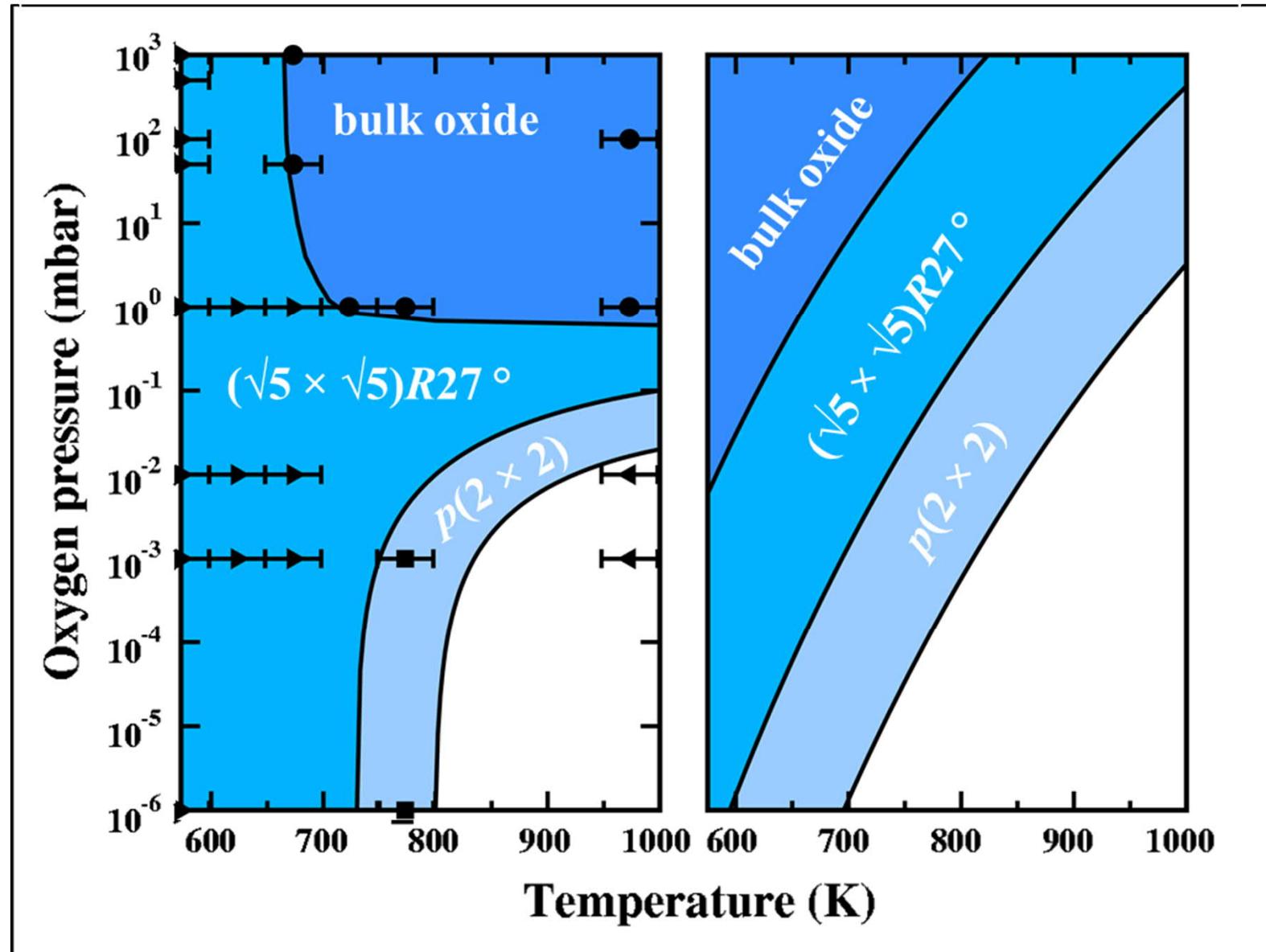
# Comparing with Experiment: Kinetic Effects



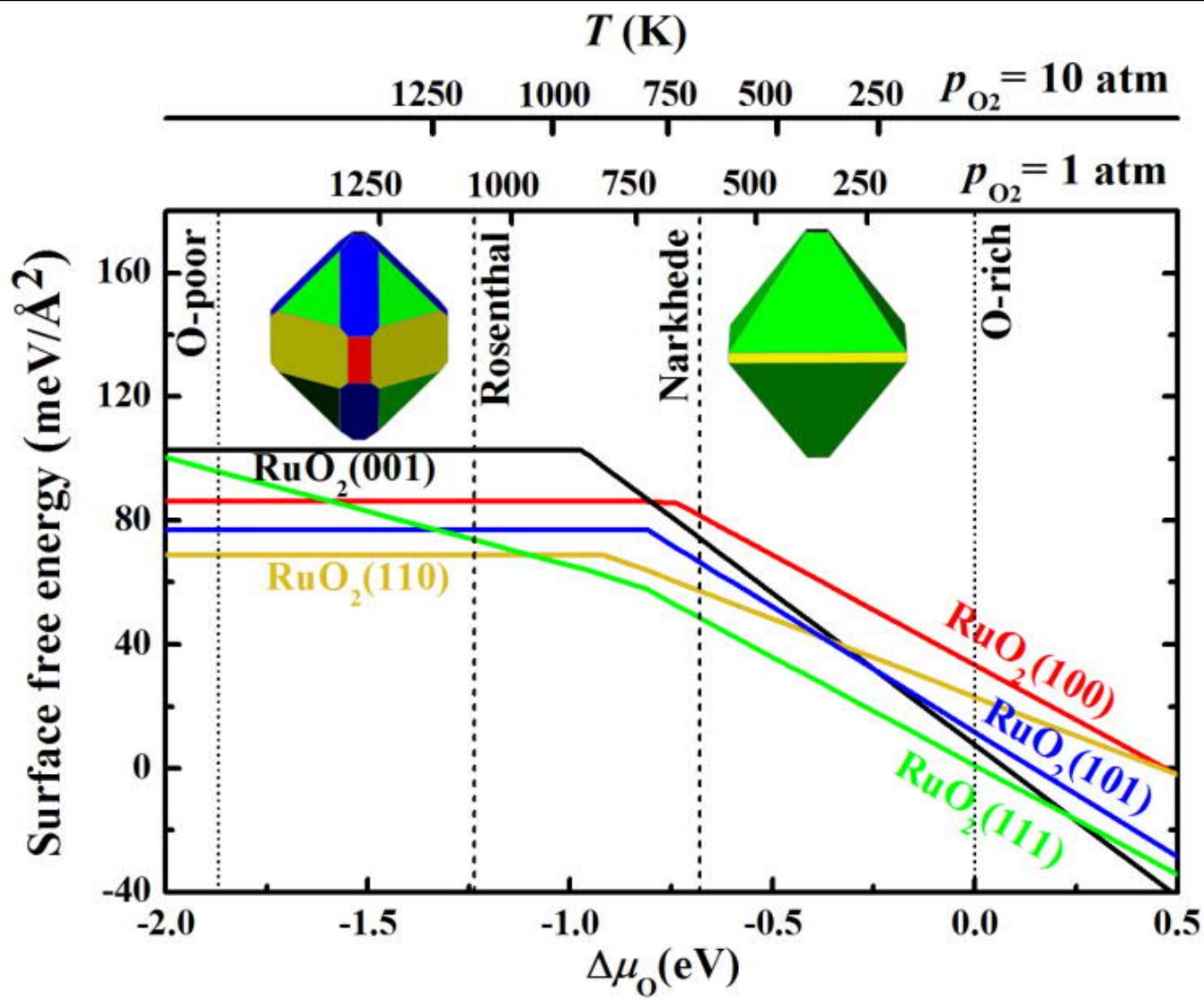
Experiment:  
E. Lundgren (U Lund)  
A. Stierle (MPG Stuttgart)

Heterogeneous Catalysis  
 $\mu = \mu(T, p_i)$ : Phase diagrams

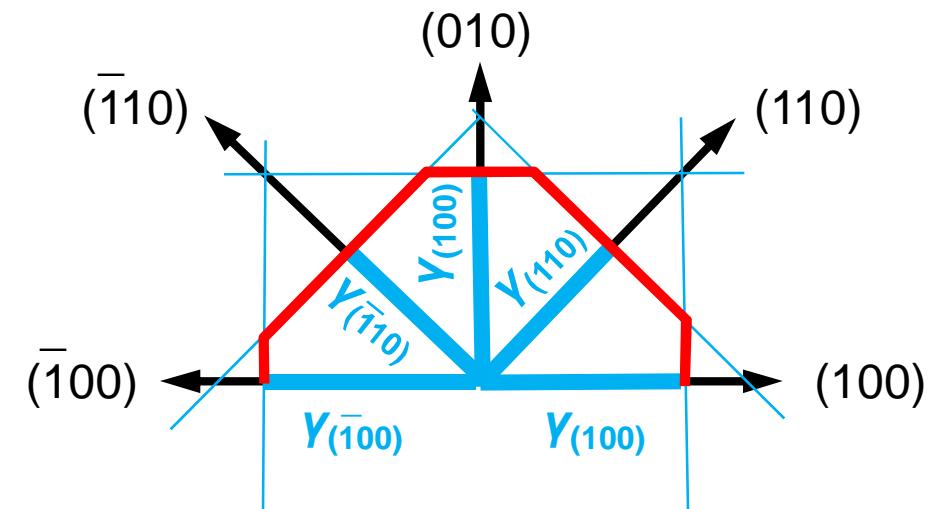
Electrocatalysis  
 $\mu = \mu(U, \text{pH})$ : Pourbaix diagrams



# Particle Shapes: Wulff Constructions



Equilibrium shape will minimize  $\int dA \gamma$



Wulff construction:  
Shape of free nanoparticle

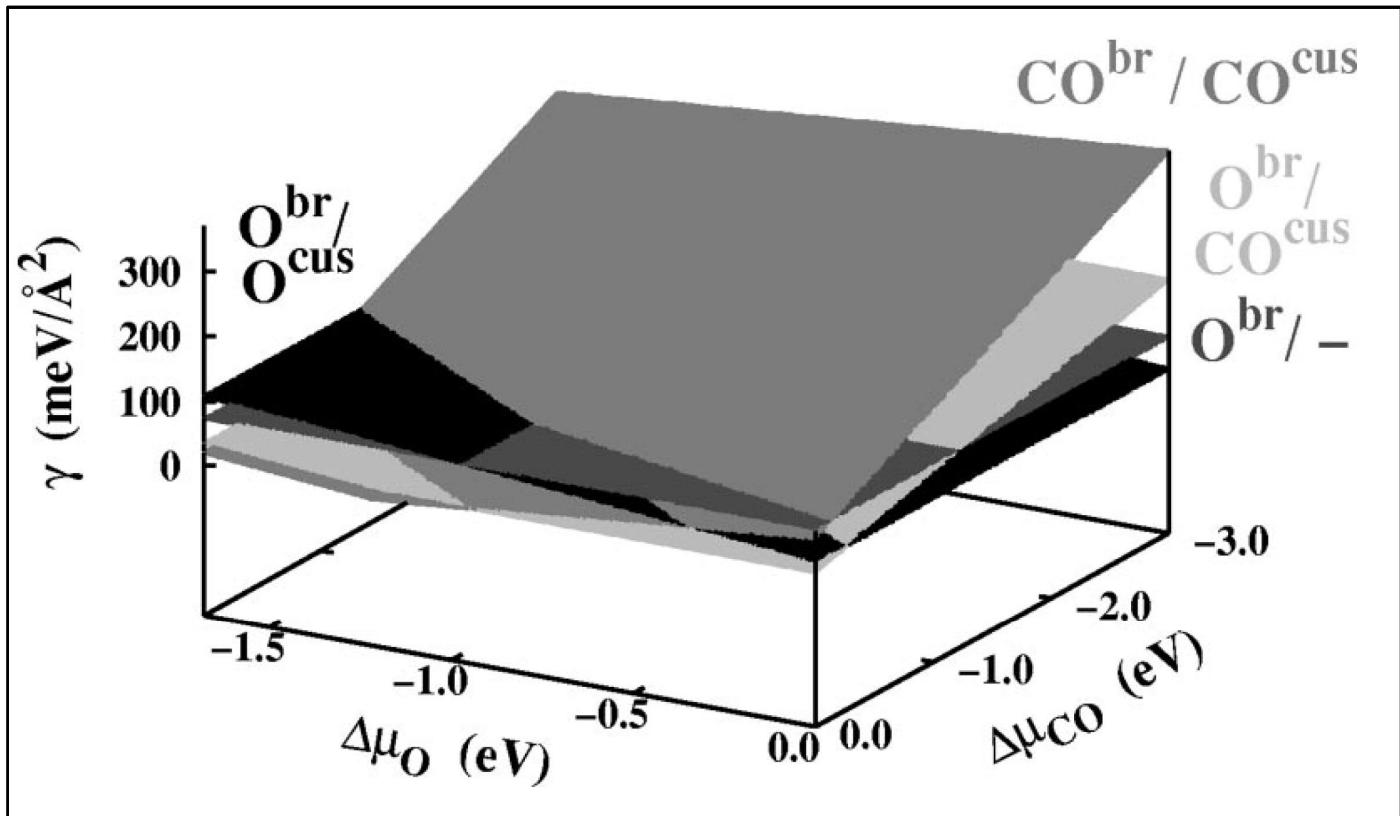
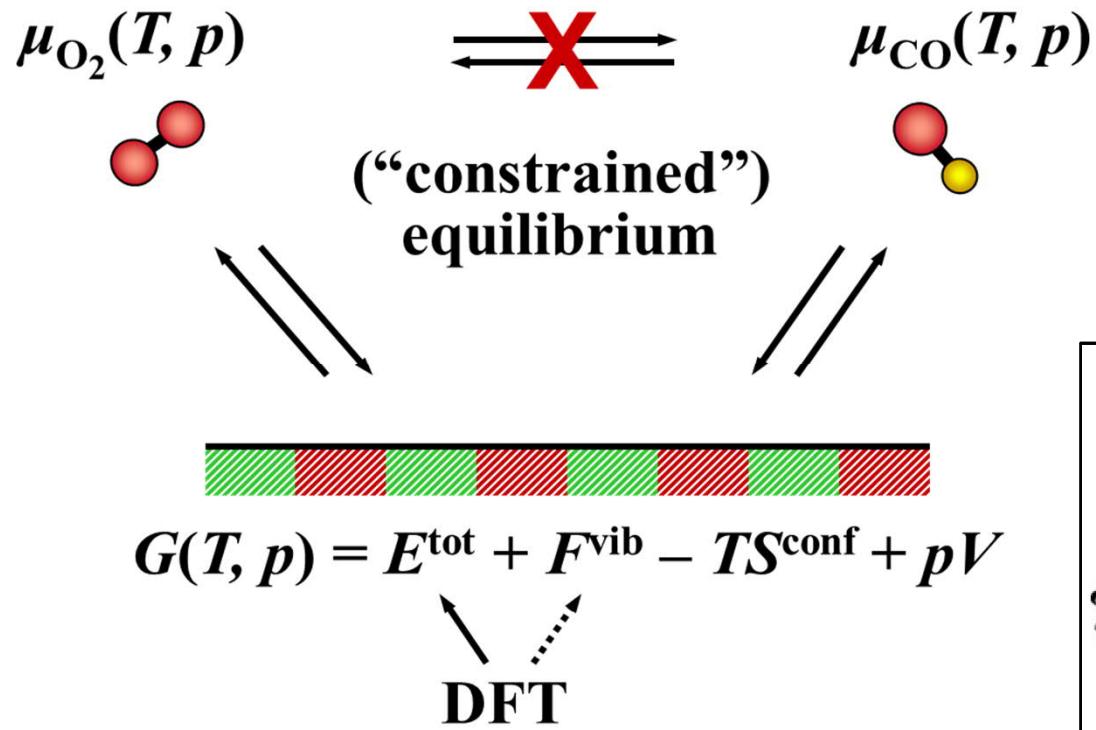
Wulff-Kaichew construction:  
Shape of supported nanoparticle  
(contact angle)



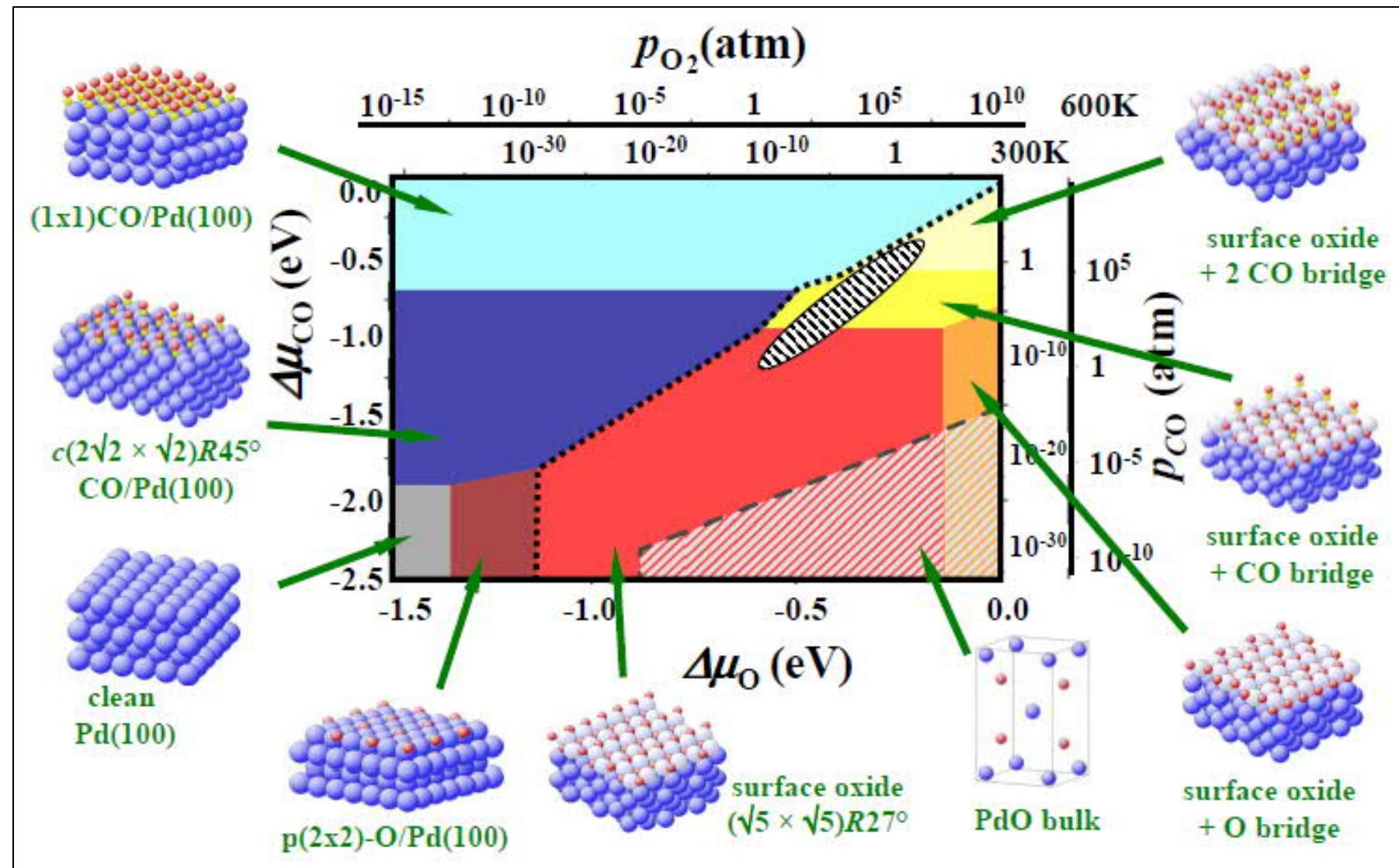
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## **IV. *Ab initio* Thermodynamics goes Catalysis: „Constrained“ equilibria and configurational entropy**

# So, Catalysis is all about Kinetics, isn't it?



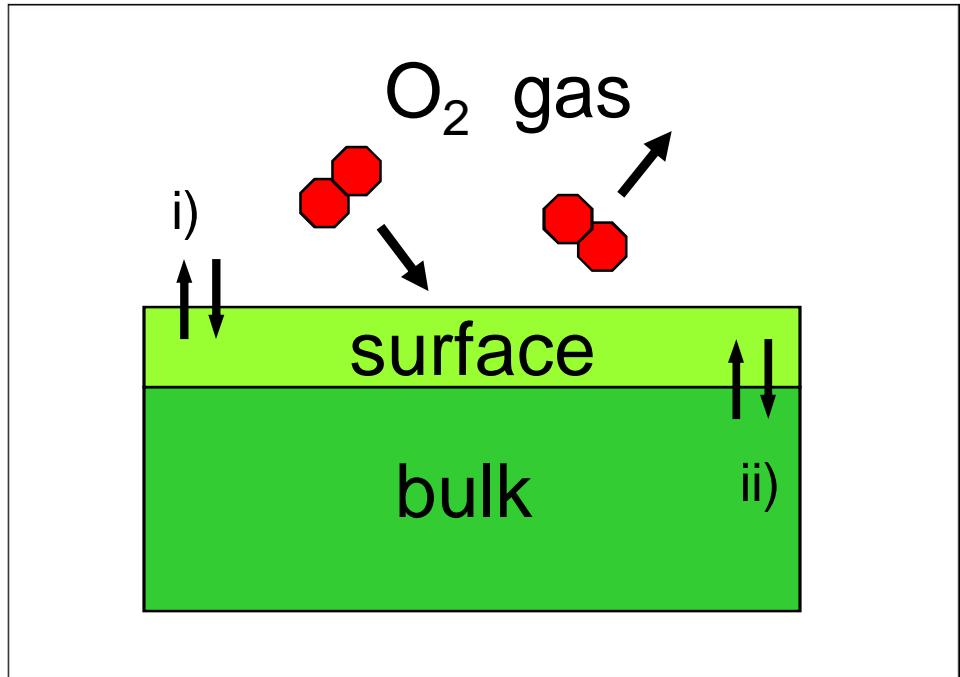
# Surface Oxide Formation in CO Oxidation at Pd(100)



# Remember: Surface in Contact with an Oxygen Gas Phase



$$\gamma_{\text{surf.}} = 1/A [ G_{\text{surf.}}(N_O, N_M) - N_O \mu_O - N_M \mu_M ]$$



Use reservoirs:

i)  $\mu_O$  from ideal gas

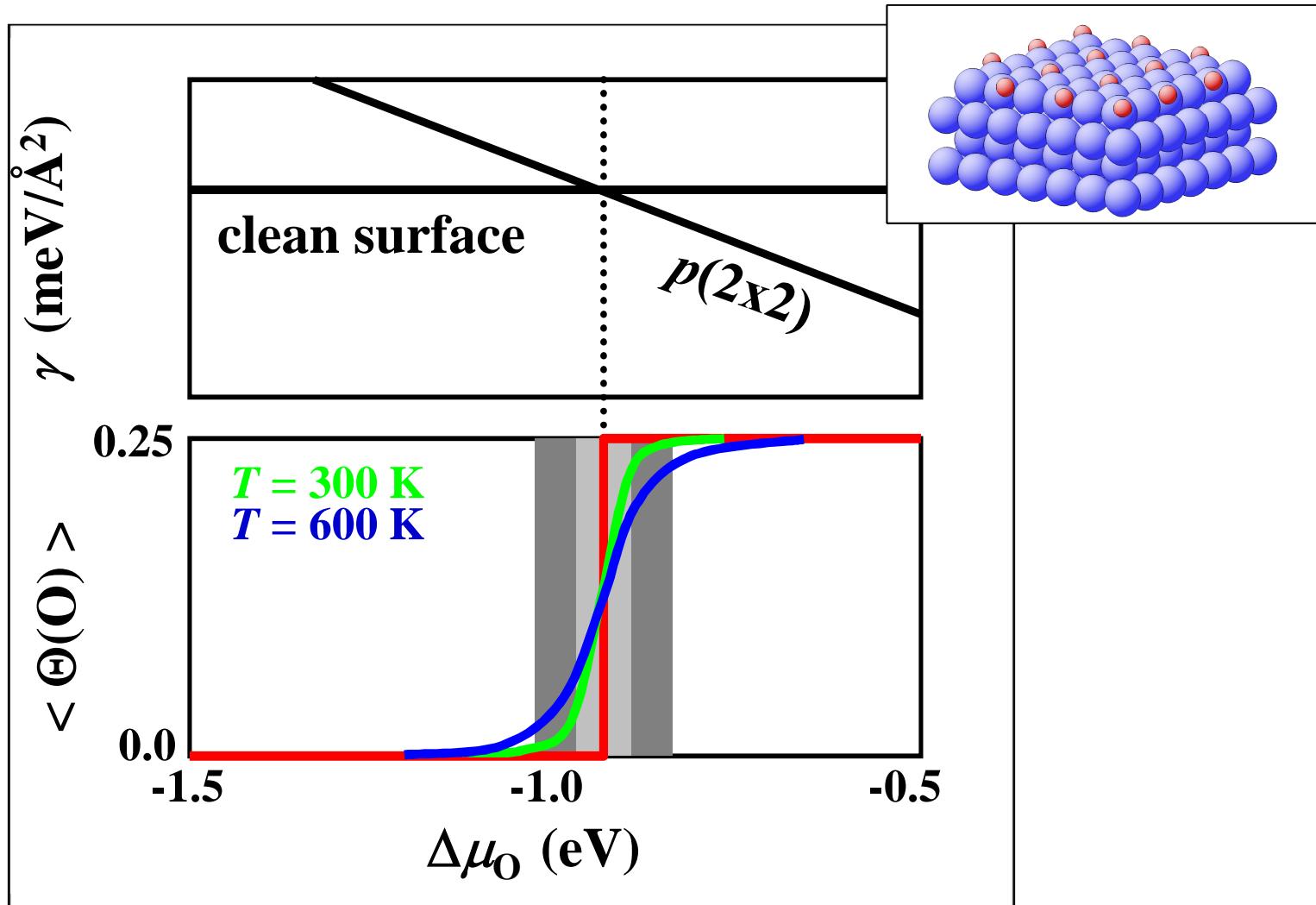
ii)  $\mu_M = g_M^{\text{bulk}}$

$$G(T, p) = E + F^{\text{vib}} + F^{\text{conf}} + pV$$

**Forget about  $F^{\text{vib}}$  and  $F^{\text{conf}}$  for the moment,  $pV$  is negligible:**

$$\gamma(T, p) \approx (E_{\text{surf.}}^{(\text{slab})} - N_M E_M^{\text{bulk}})/A - N_O \mu_O(T, p)/A$$

# Configurational Entropy and Phase Transitions



No lateral interactions:

$$F^{\text{conf}} = k_B T \ln (N+n)! / (N! n!)$$

Langmuir adsorption-isotherm

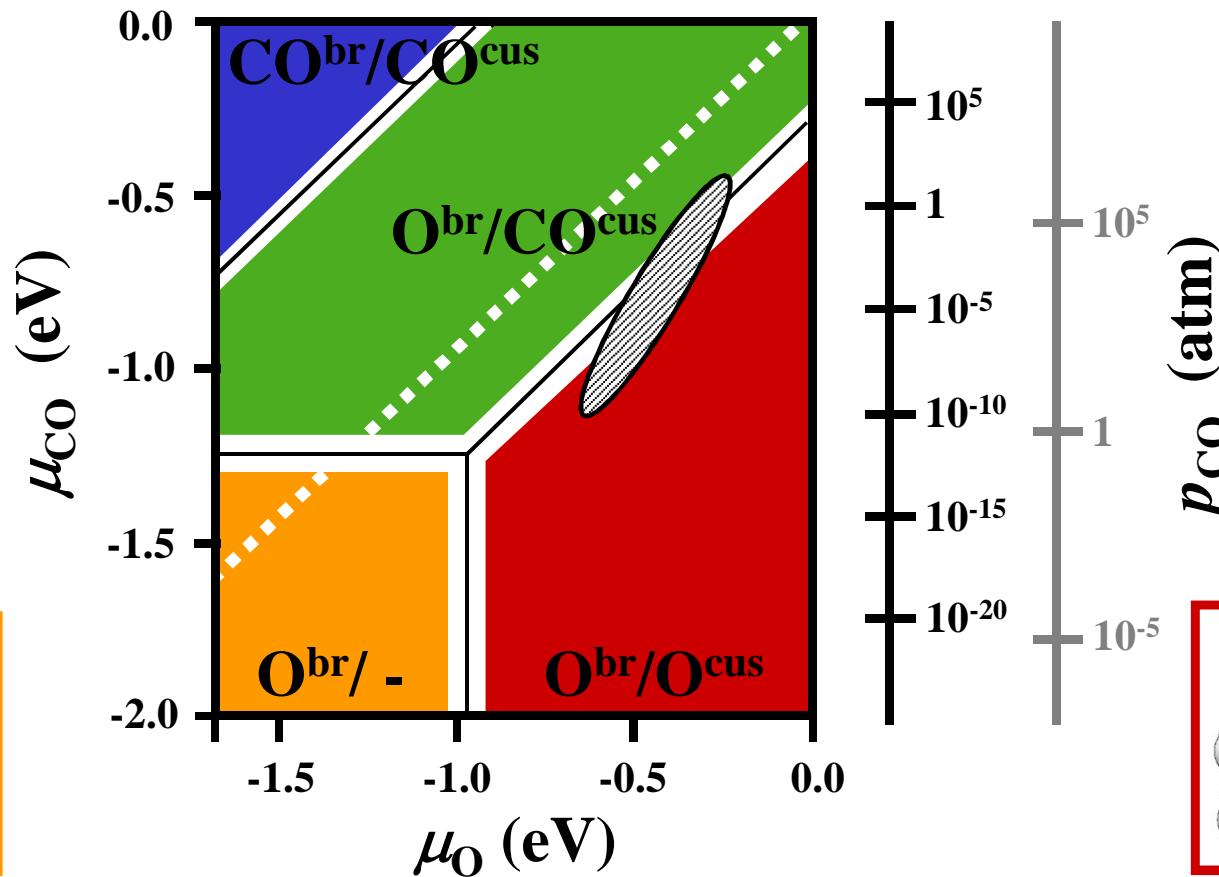
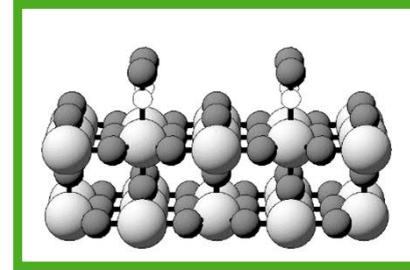
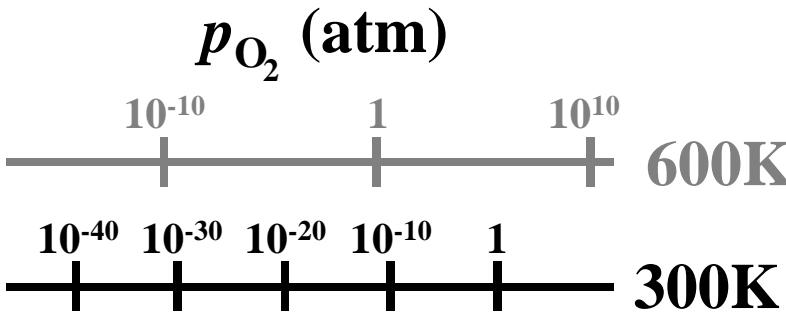
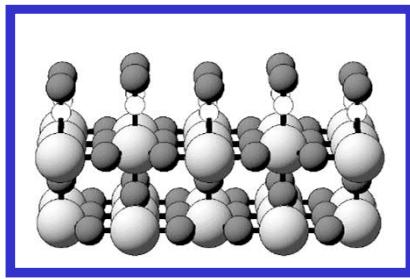
$$\langle \theta(O^{\text{cus}}) \rangle = \frac{1}{1 + \exp((E^{\text{ad}} - \Delta\mu_O)/k_B T)}$$

Configurational entropy smears out phase transitions

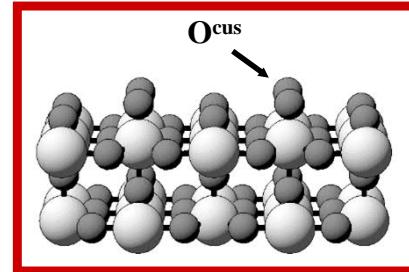
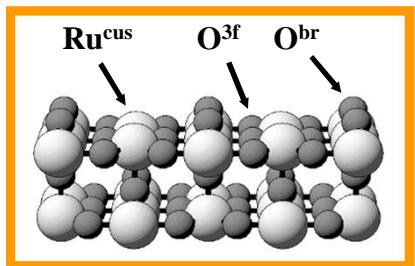
# Catalysis as a Phase Transition Phenomenon



K. Reuter and M. Scheffler,  
Phys. Rev. B 68, 045407 (2003);  
Phys. Rev. Lett. 90, 046103 (2003)



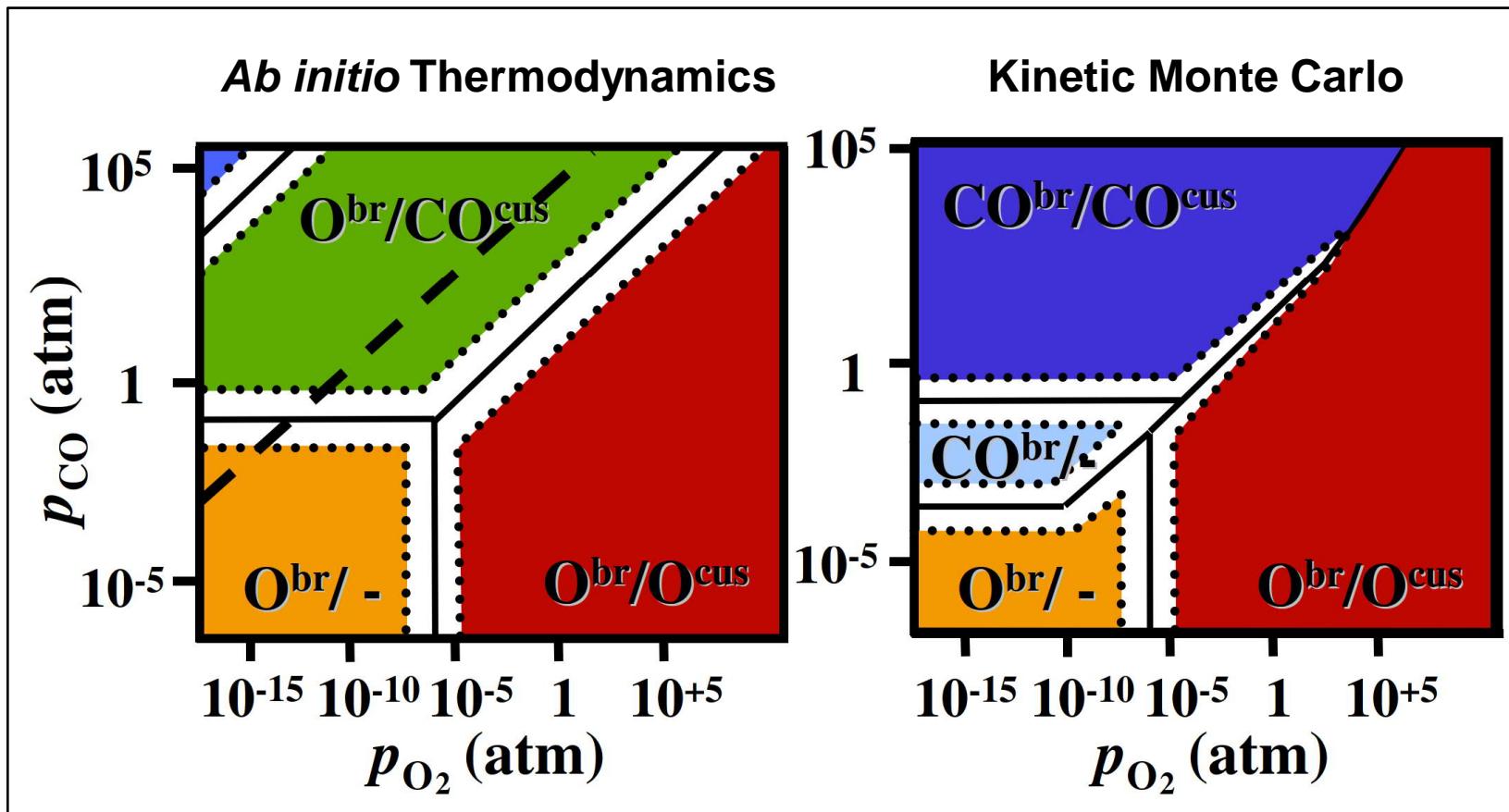
CO Oxidation  
at  $RuO_2(110)$



# Beware: Kinetic Effects



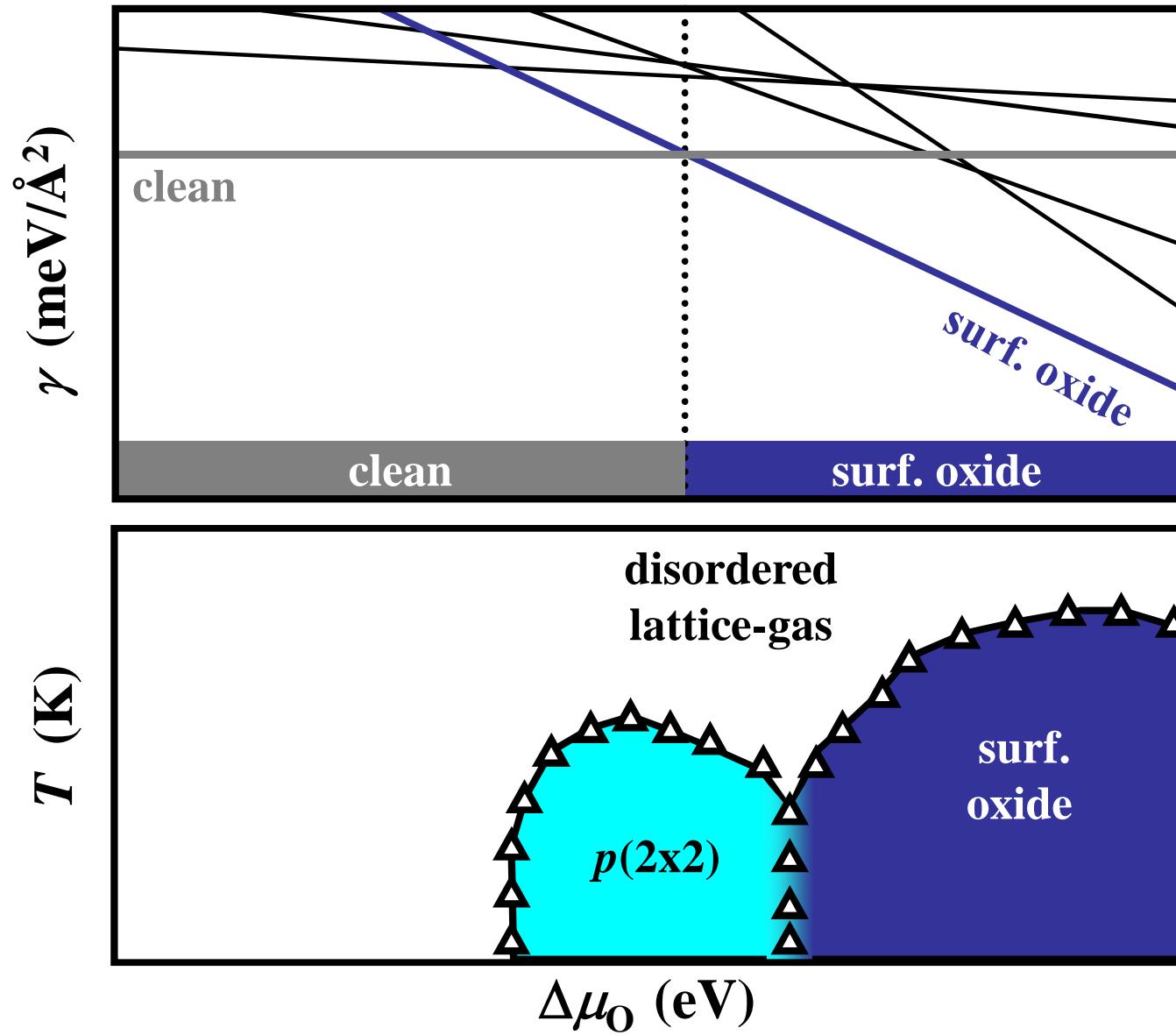
CO Oxidation  
at RuO<sub>2</sub>(110)



Reaction consumes O<sup>br</sup> population faster than can be replenished from the gas phase

K. Reuter, in "Modelling and Simulation of Heterogeneous Catalytic Reactions: From the Molecular Process to the Technical System", O. Deutschmann (Ed.), Wiley-VCH, Weinheim (2011)

# Beware: Configurational Sampling and Configurational Entropy



Any *ab initio* thermodynamics phase diagram is only as good as the structures that were sampled!



## Motivation (Scheffler, ~1980s):

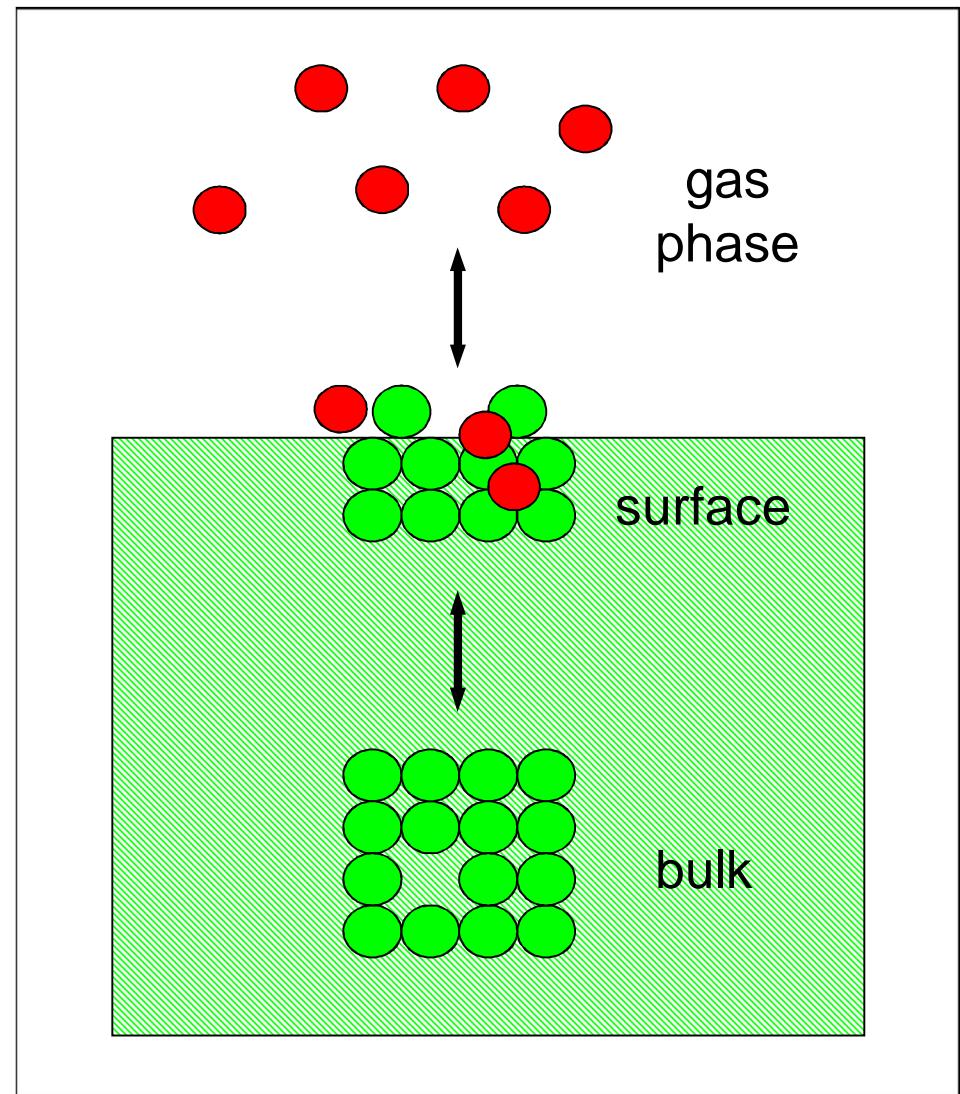
- extend length scale
- consider finite temperature effects

## Approach:

- separate system into sub-systems  
(exploit idea of infinite (homogeneous) reservoirs!)
- calculate properties of sub-systems  
separately (cheaper...)
- connect by implying equilibrium  
between sub-systems

## Drawback:

- no temporal information  
("system properties after infinite time")
- equilibrium assumption



J. Rogal and K. Reuter, *Ab initio atomistic thermodynamics for surfaces: A primer*.

In: Experiment, Modeling and Simulation of Gas-Surface Interactions for Reactive Flows in Hypersonic Flights. Educational Notes RTO-EN-AVT-142, Neuilly-sur-Seine (2007).