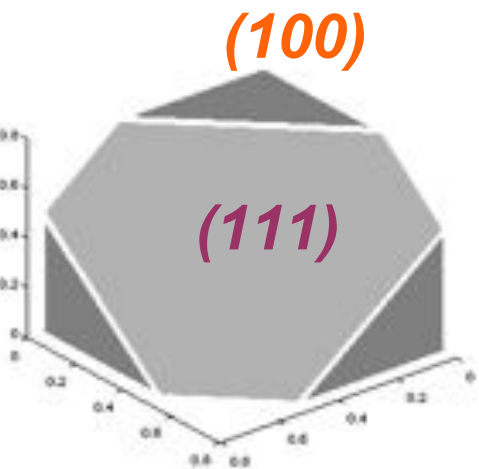
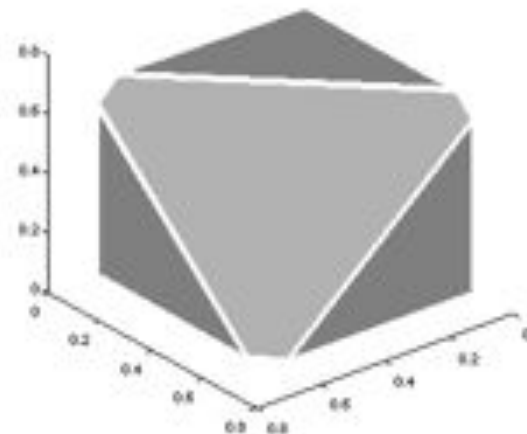


# FIRST-PRINCIPLES PREDICTIONS UNDER REALISTIC ELECTROCHEMICAL CONDITIONS

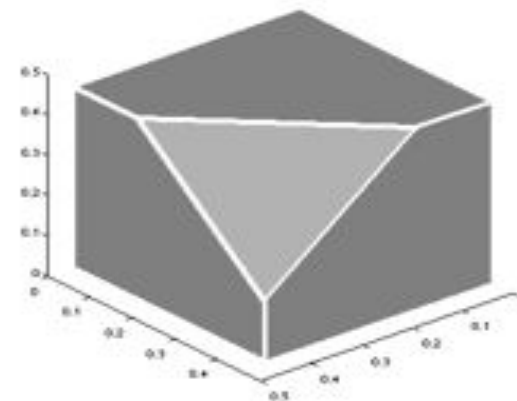
MARZARI, THEORY AND SIMULATION OF MATERIALS, E



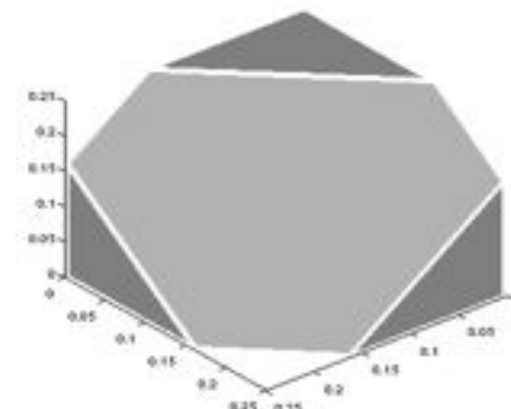
$V = 0.4 \text{ V/SHE}$



$V = 0.5 \text{ V/SHE}$



$V = 0.6 \text{ V/SHE}$



$V = 1.0 \text{ V/SHE}$



- **Damian Scherlis (University of Buenos Aires)**
- **Oliviero Andreussi (University of Pisa)**
- **Celine Dupont (Université Bourgogne)**
- **Matteo Cococcioni (EPFL)**

**Ismaila Dabo (Penn State)**

**Nicephore Bonnet (AIST Tsukuba)**



# First principles simulations in realistic electrochemical environments

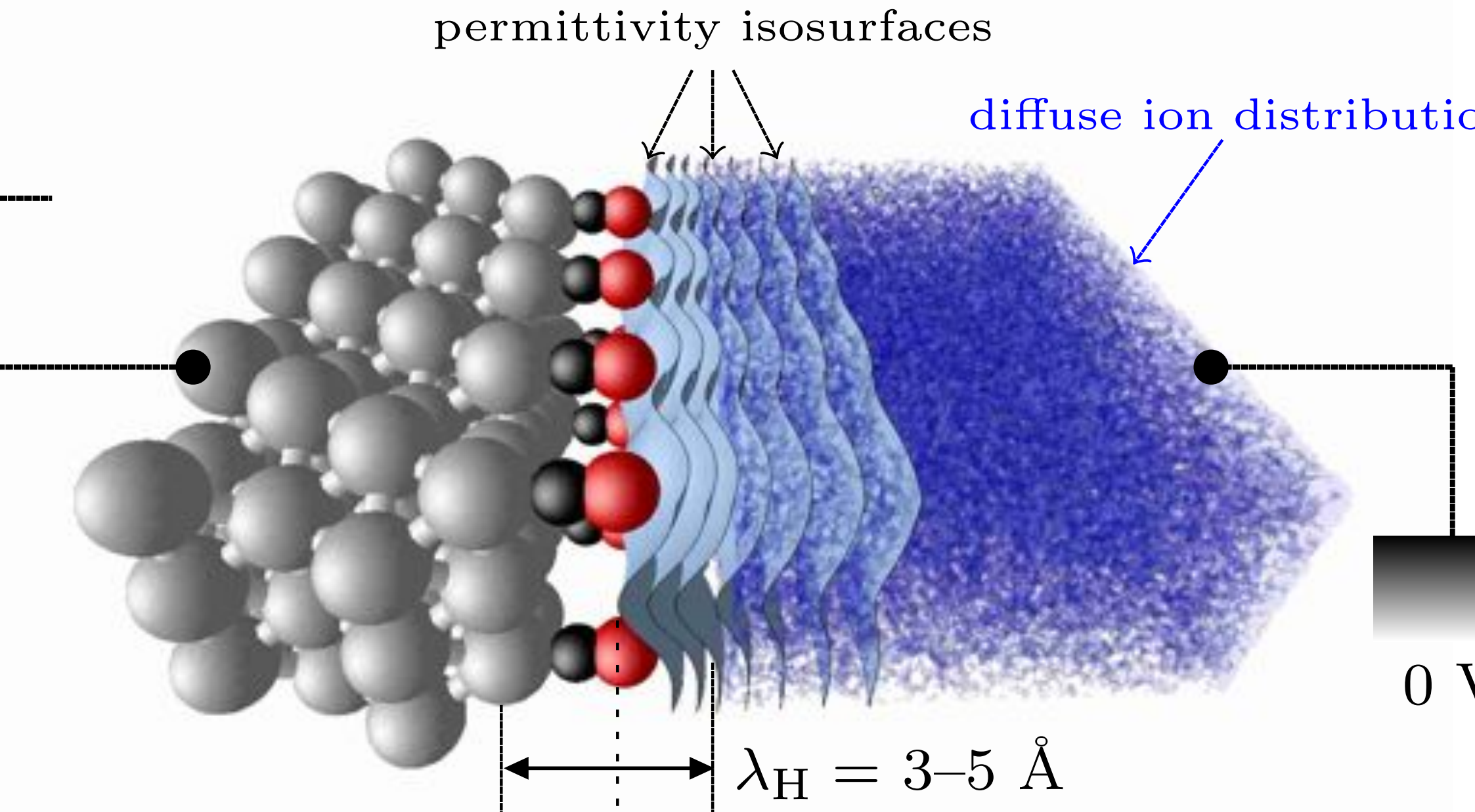
- **Biology:** Many processes take place in salty, watery environments
- **Technology:** Key industrial reactions take place in aqueous solutions or solvents
- **Synthesis:** Growth of nanoparticles and crystals by wet chemistry is strongly influenced by the solvent

# first principles simulations in realistic electrochemical environments

- **Energy:** Electrified solid-liquid interfaces are key to harvesting, storing, and converting energy:
  - Photocatalysis in a dye-sensitized solar cell
  - Electrolyte chemistry in a lithium-ion battery
  - Fuel-into-electricity in a fuel cell



# first principles simulations in realistic electrochemical environments



Water and solvation

# What's wrong with water?

It's a liquid! (need long ab-initio md)

Even its structure is challenging in DFT

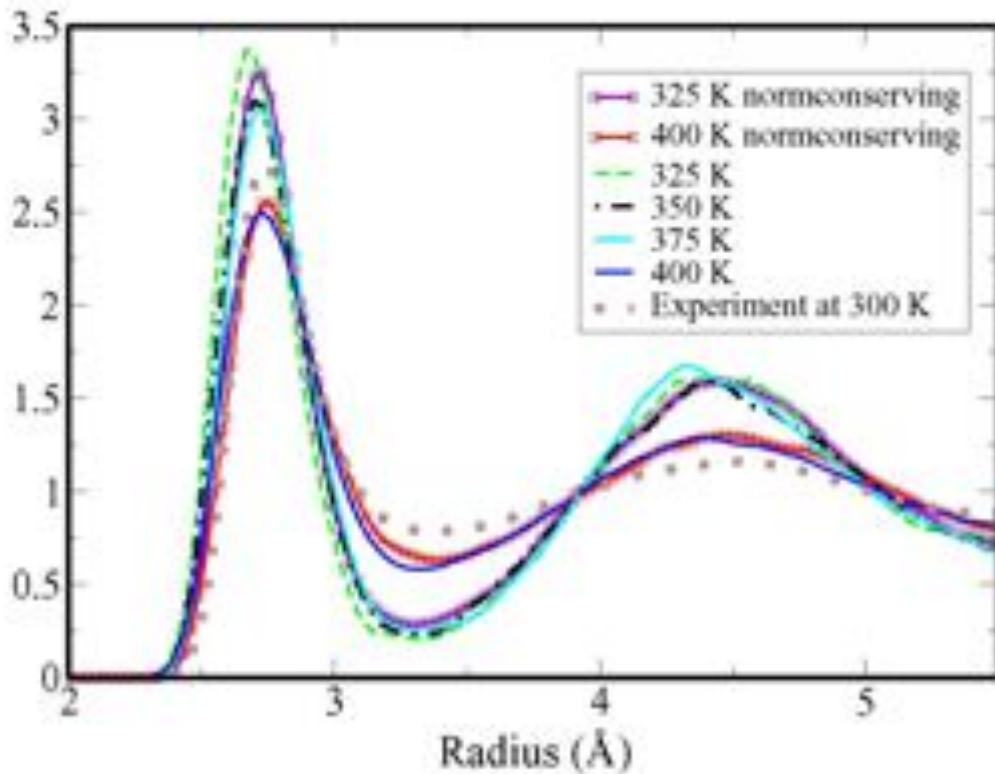
At what temperature does it melt/freeze?

What is its dielectric constant?

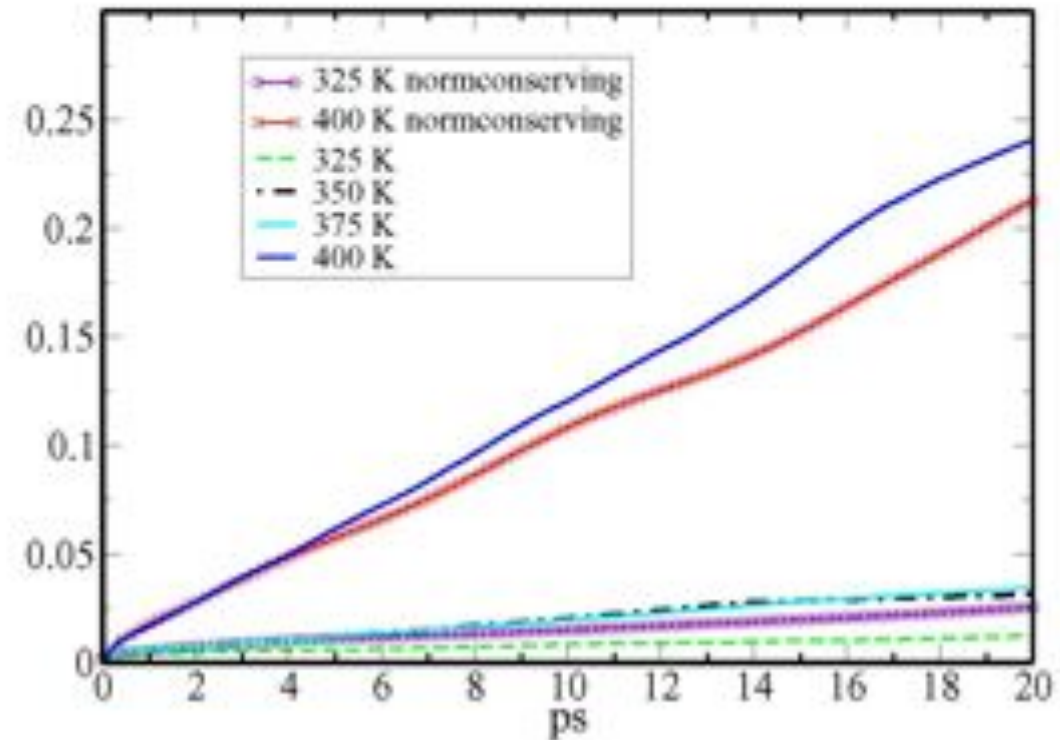
H is light - tunnelling, Bose-Einstein sta



# Water, ice, or glass?



**BE water is overstructured  
(Galli's group, JCP 2004, 2005)**



**It melts at 400K... (Sit and  
Marzari, JCP 2005)**

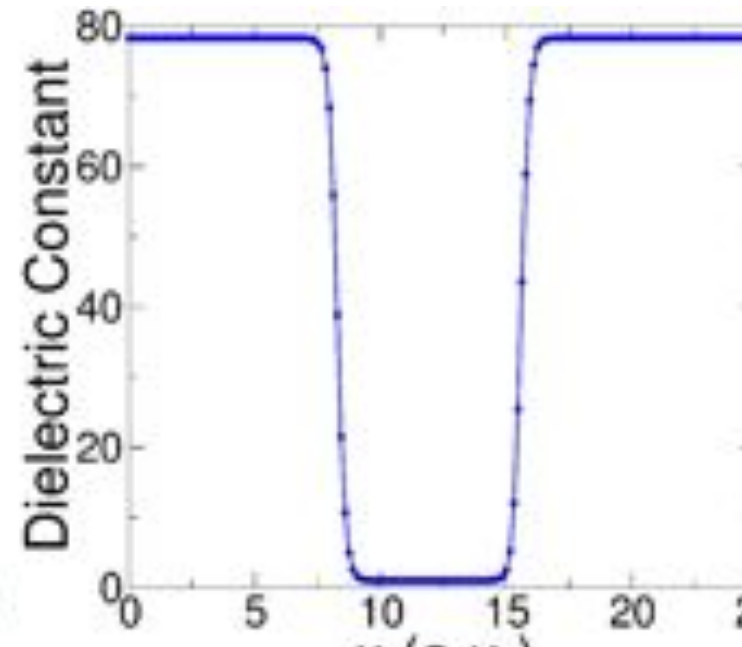
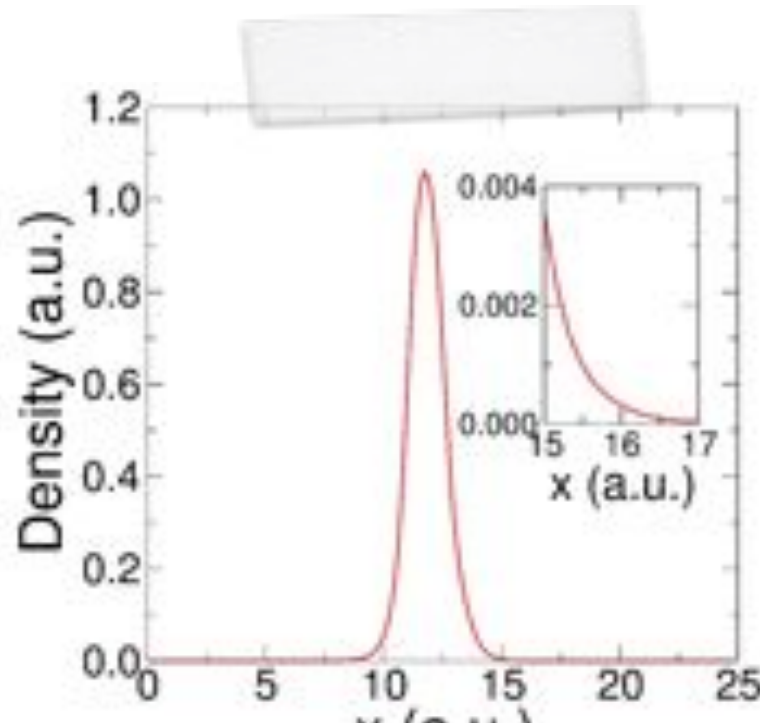
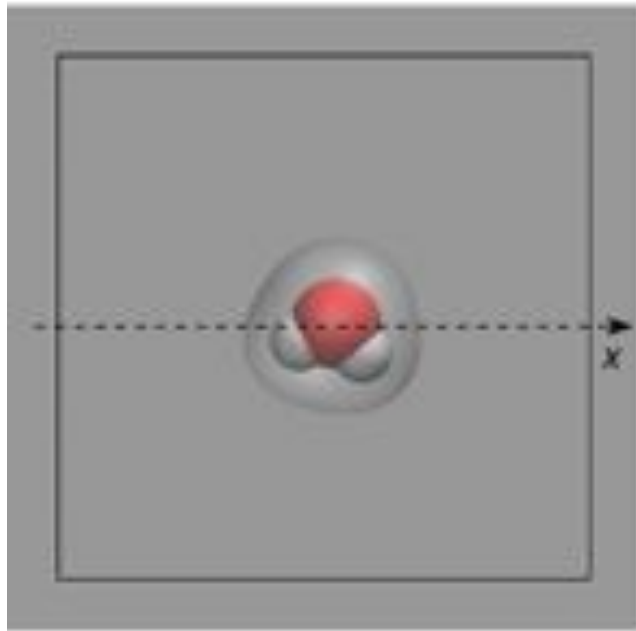

$$V_{\text{quantum}} = \int \vartheta(\rho(\vec{r}) - \alpha) d\vec{r}$$

$$V_{\text{quantum}} = \int d\vec{r} \left[ \vartheta\left(\rho(\vec{r}) - \left(\alpha - \frac{\Delta}{2}\right)\right) - \vartheta\left(\rho(\vec{r}) - \left(\alpha + \frac{\Delta}{2}\right)\right) \right] \frac{|\vec{\nabla}\rho(\vec{r})|}{\Delta}$$

# Electrostatics: Poisson equation in a dielectric medium

$$\nabla^2 V(\vec{r}) = -4\pi\rho(\vec{r}) \quad \rightarrow \quad \vec{\nabla} \cdot \left( \epsilon[\rho(\vec{r})] \vec{\nabla} V(\vec{r}) \right) = -4\pi\rho(\vec{r})$$

J.-L. Fattebert and F. Gygi, *Int. J. Quantum Chem.* 93, 139 (2003)



## Electrostatics: Poisson equation in a dielectric medium

$$\nabla^2 V(\vec{r}) = -4\pi\rho(\vec{r}) \quad \rightarrow \quad \vec{\nabla} \cdot \left( \epsilon[\rho(\vec{r})] \vec{\nabla} V(\vec{r}) \right) = -4\pi\rho(\vec{r})$$

J.-L. Fattebert and F. Gygi, Int. J. Quantum Chem. 93, 139 (2003)

**Non-electrostatics**  
(cavitation, etc...)

$$E \rightarrow E + \alpha S_{\text{quantum}}[\rho(\vec{r})] + \beta V_{\text{quantum}}[\rho(\vec{r})]$$


D.A. Scherlis, J.-L. Fattebert, F. Gygi, M. Cococcioni, and N. Marzari JCP 124, 074103 (2006)

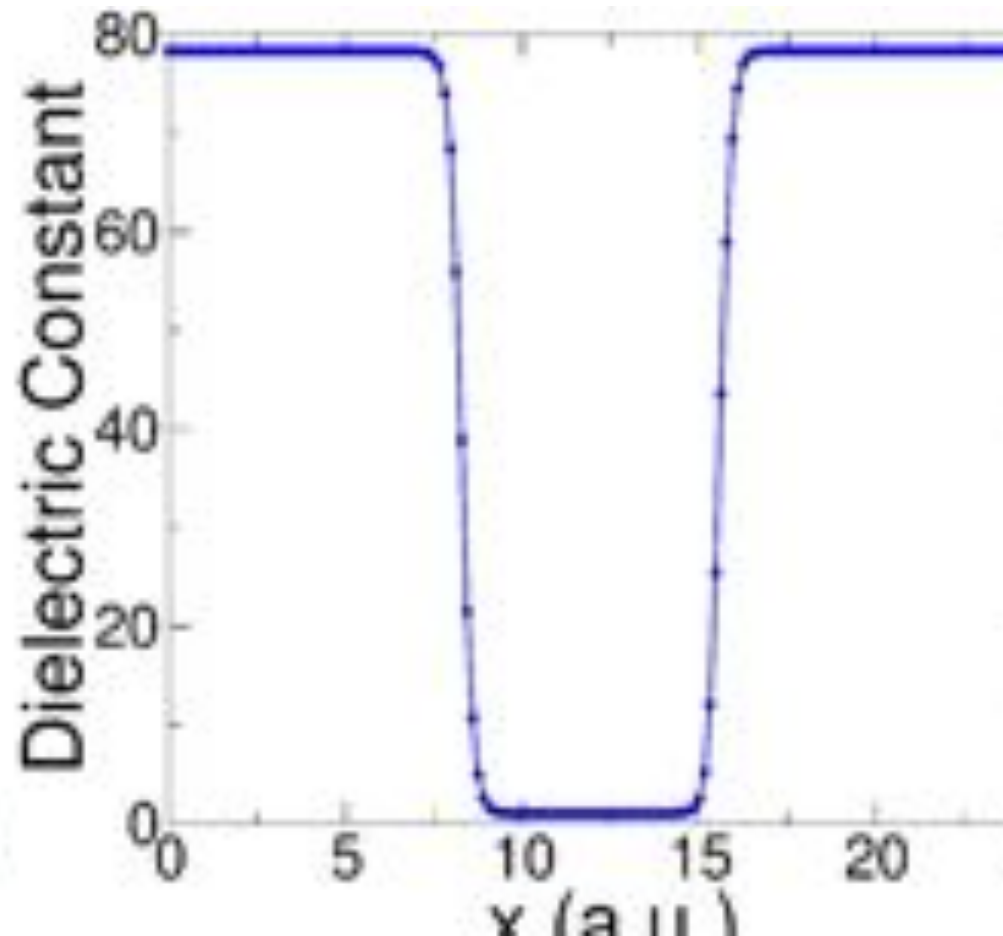
O. Andreussi, I. Dabo, and N. Marzari, JCP 136, 064102 (2012)

# Parameters in the model

$$E \rightarrow E[\varepsilon(\rho(\vec{r}))] + \alpha S_{\text{quantum}}[\rho(\vec{r})] + \beta V_{\text{quantum}}[\rho(\vec{r})]$$

Free/four parameters:

- 2 parameters for **dielectric function** 
- 1 or 2 parameters for non-electrostatic terms (proportional to quantum volume and quantum surface)





linearized Poisson equation,  
from multigrid to iterative

$$\nabla \cdot \epsilon(\rho^{elec}(\mathbf{r})) \nabla \phi^{tot}(\mathbf{r}) = -4\pi \rho^{solute}(\mathbf{r})$$

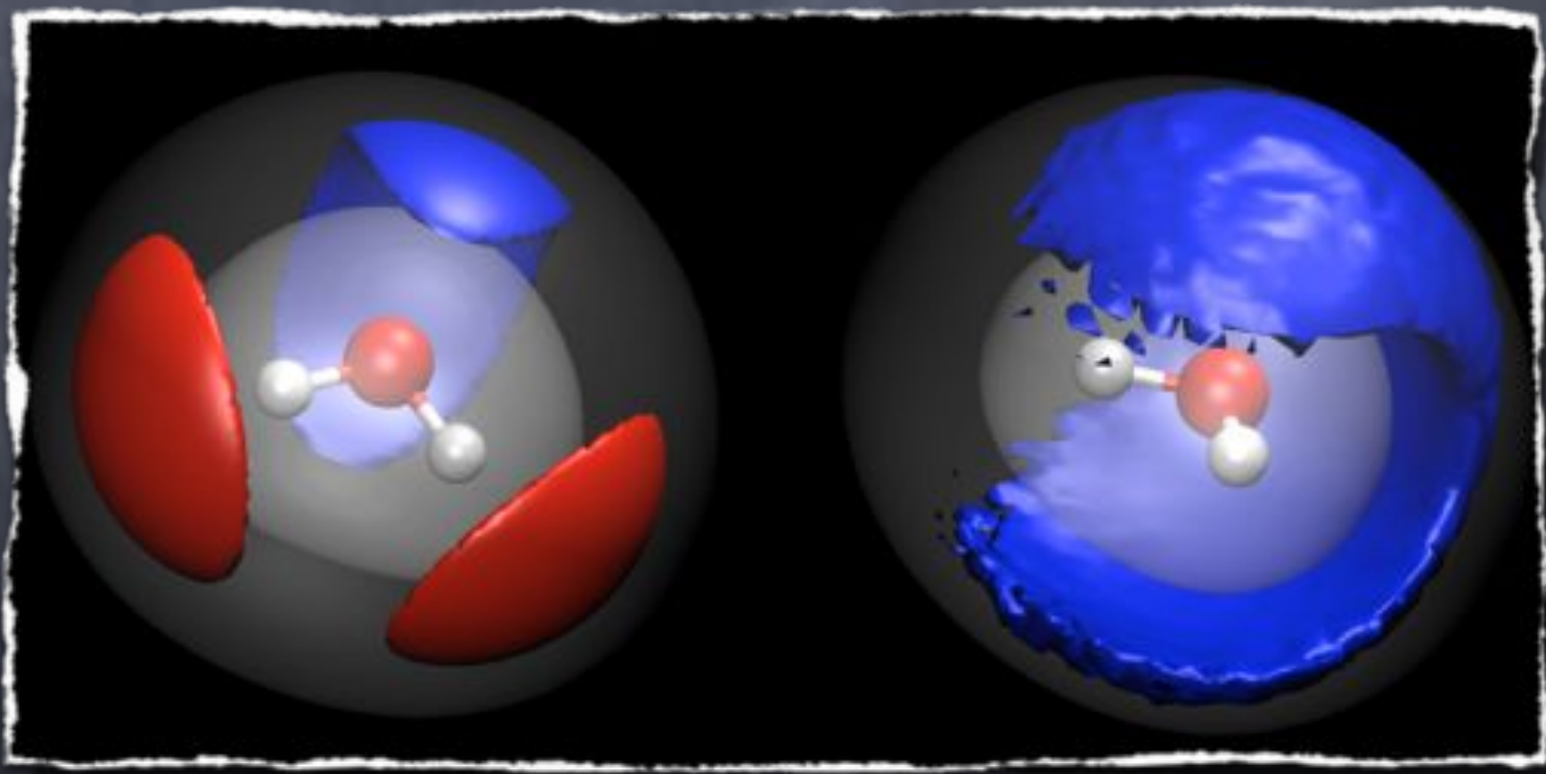
$$\rho^{pol}(\mathbf{r}) \equiv -\nabla \cdot \mathbf{P}(\mathbf{r}) = \nabla \cdot \left( \frac{\epsilon(\rho^{elec}(\mathbf{r})) - 1}{4\pi} \nabla \phi^{tot}(\mathbf{r}) \right)$$

$$\nabla^2 \phi^{tot}(\mathbf{r}) = -4\pi (\rho^{solute}(\mathbf{r}) + \rho^{pol}(\mathbf{r}))$$

# Polarization charges

two contributions

$$\rho^{pol}(\mathbf{r}) = \frac{1}{4\pi} \nabla \ln \epsilon(\rho^{elec}(\mathbf{r})) \cdot \nabla \phi^{tot}(\mathbf{r}) - \frac{\epsilon(\rho^{elec}(\mathbf{r})) - 1}{\epsilon(\rho^{elec}(\mathbf{r}))} \rho^{solute}(\mathbf{r})$$



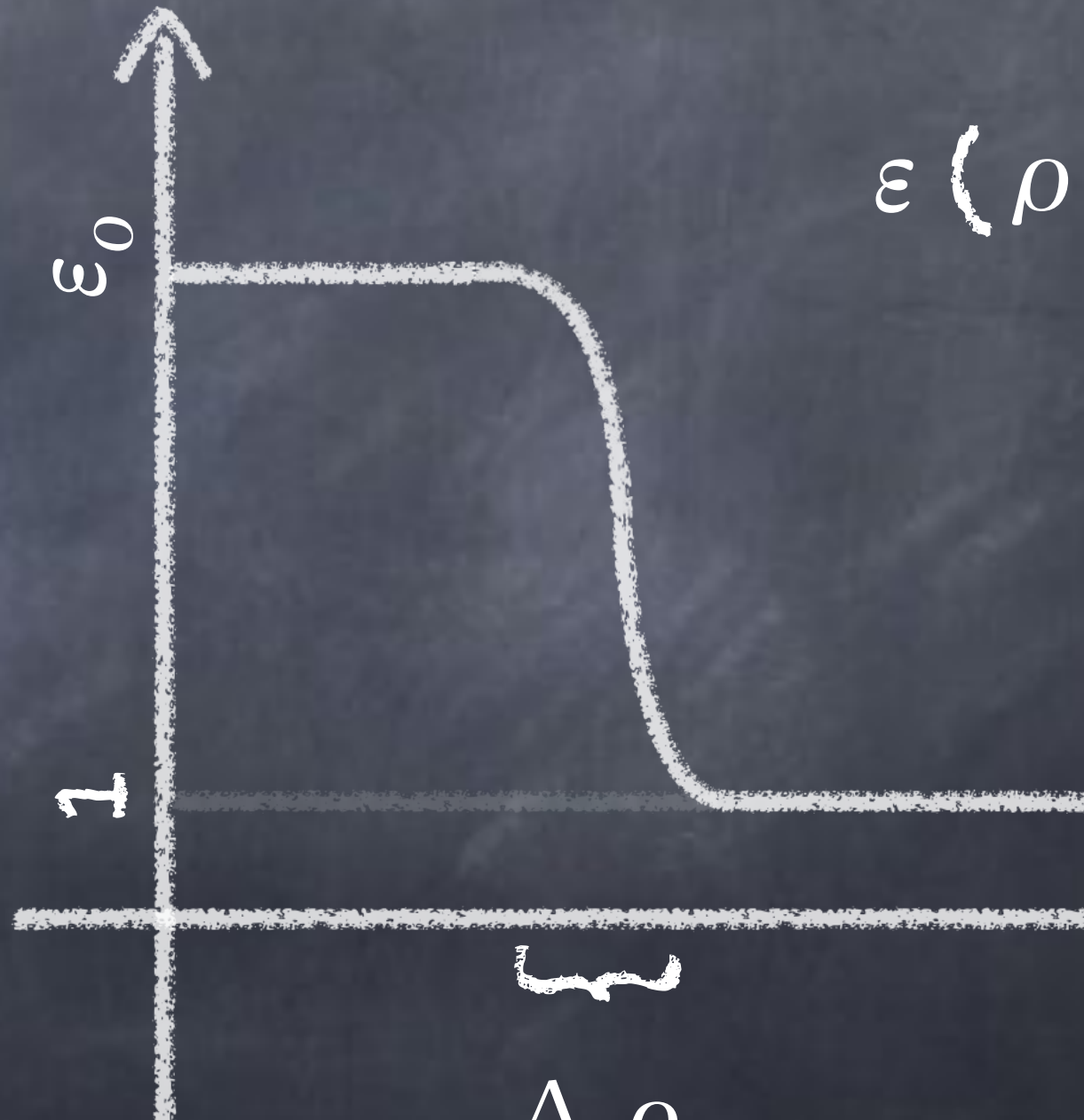
# Which dielectric function?

Extrema:  $1, \epsilon_0$

Flat in the  
solute

Flat in the bulk  
dielectric

Smooth



# Avoid numerical instabilities

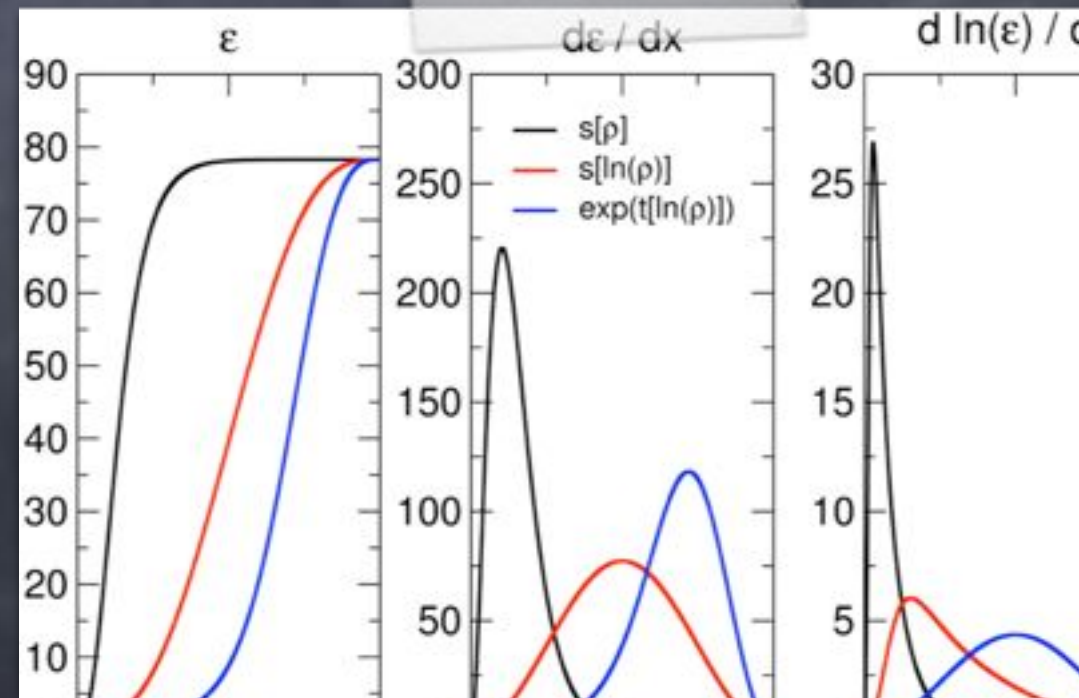
smooth piece-wise definition

$$\epsilon_{\epsilon_0, \rho_{min}, \rho_{max}}(\rho^{elec}) = \begin{cases} 1 & \rho^{elec} > \rho_{max} \\ \exp(t(\ln \rho^{elec})) & \rho_{min} < \rho^{elec} < \rho_{max} \\ \epsilon_0 & \rho^{elec} < \rho_{min} \end{cases}$$

But: Electronic density decays exponentially

$$t(x) = \frac{\ln \epsilon_0}{2\pi} \left[ 2\pi \frac{(\ln \rho_{max} - x)}{(\ln \rho_{max} - \ln \rho_{min})} - \sin \left( 2\pi \frac{(\ln \rho_{max} - x)}{(\ln \rho_{max} - \ln \rho_{min})} \right) \right]$$

Polarization charge is a function of the gradient of the logarithm of epsilon

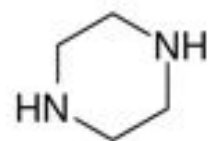




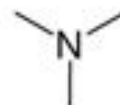
# Parameter fitting

Cavity parameters to reproduce electrostatic solvation energy of PCM

Non-electrostatic parameters to reproduce total solvation free energies



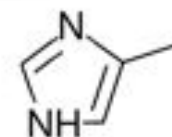
mol 013



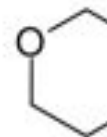
mol 016



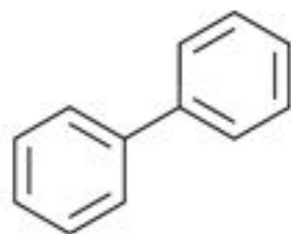
mol 036



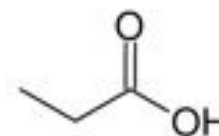
mol 069



mol 010



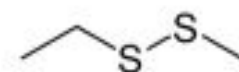
mol 079



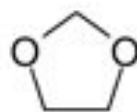
mol 117



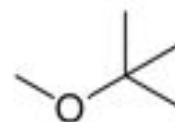
mol 140



mol 142



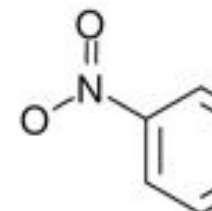
mol 160



mol 163



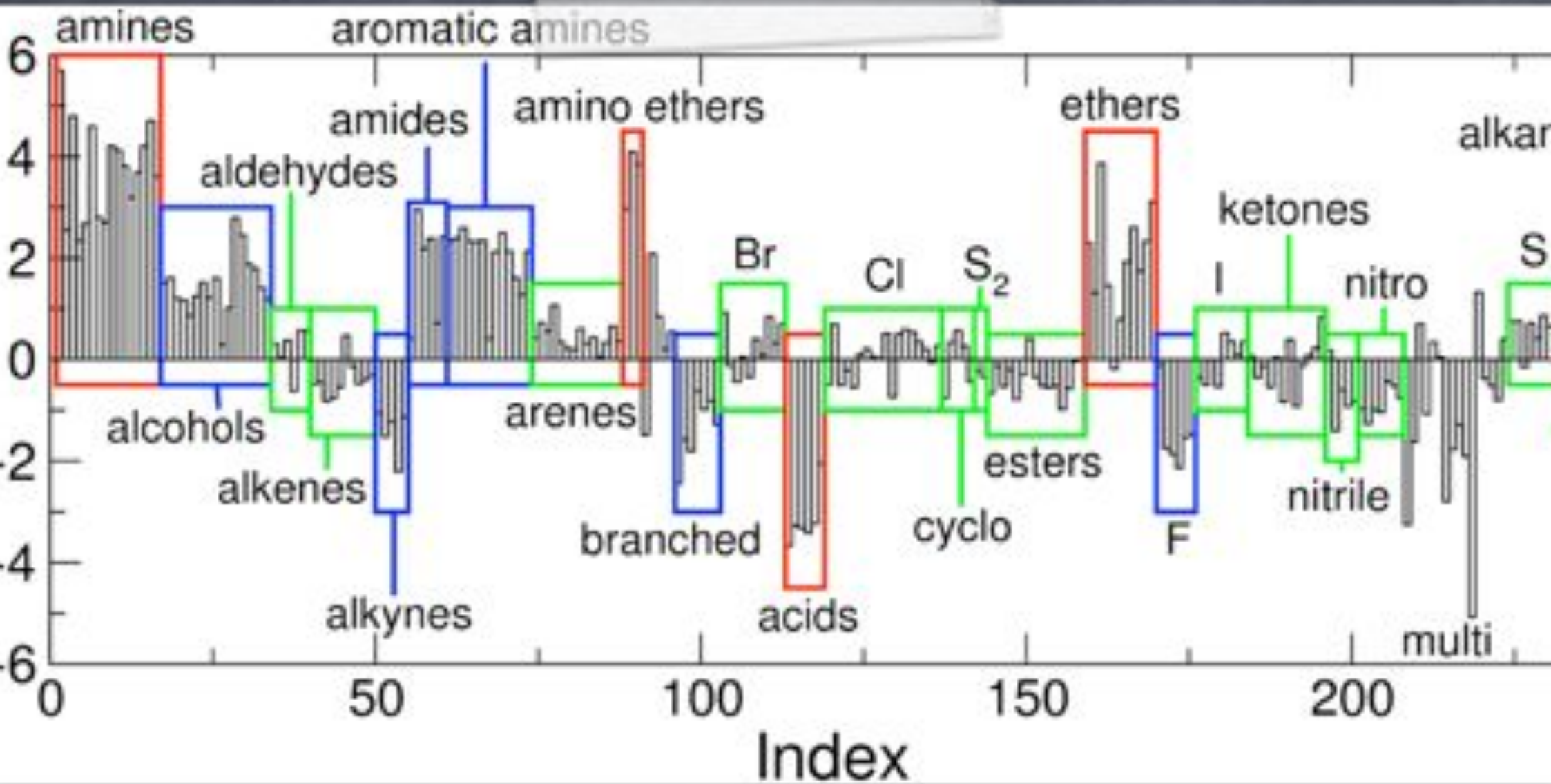
mol 200



mol 206



on 240 solvation energies)



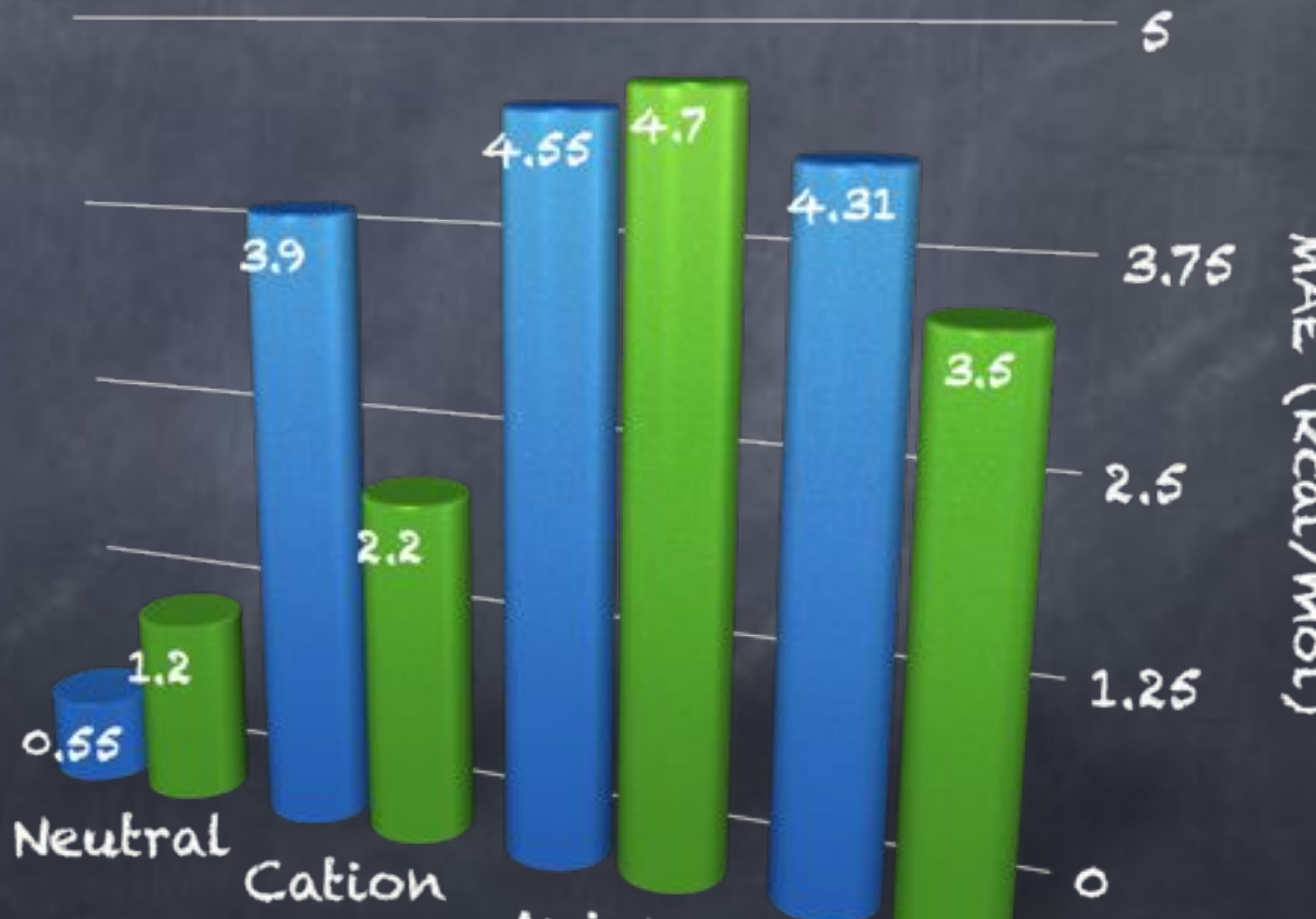
# charged systems

SM8

SCCS

excellent results  
for cations (MAE  
2.2 kcal/mol)

very good results  
for anion, with  
reparametrization  
(MAE ~4.7 kcal/  
mol)

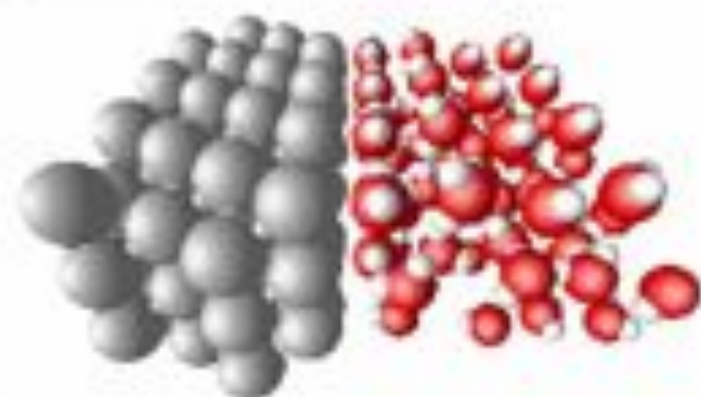


Multiscale  
electrochemical  
model

(a) Work function  $\Phi$



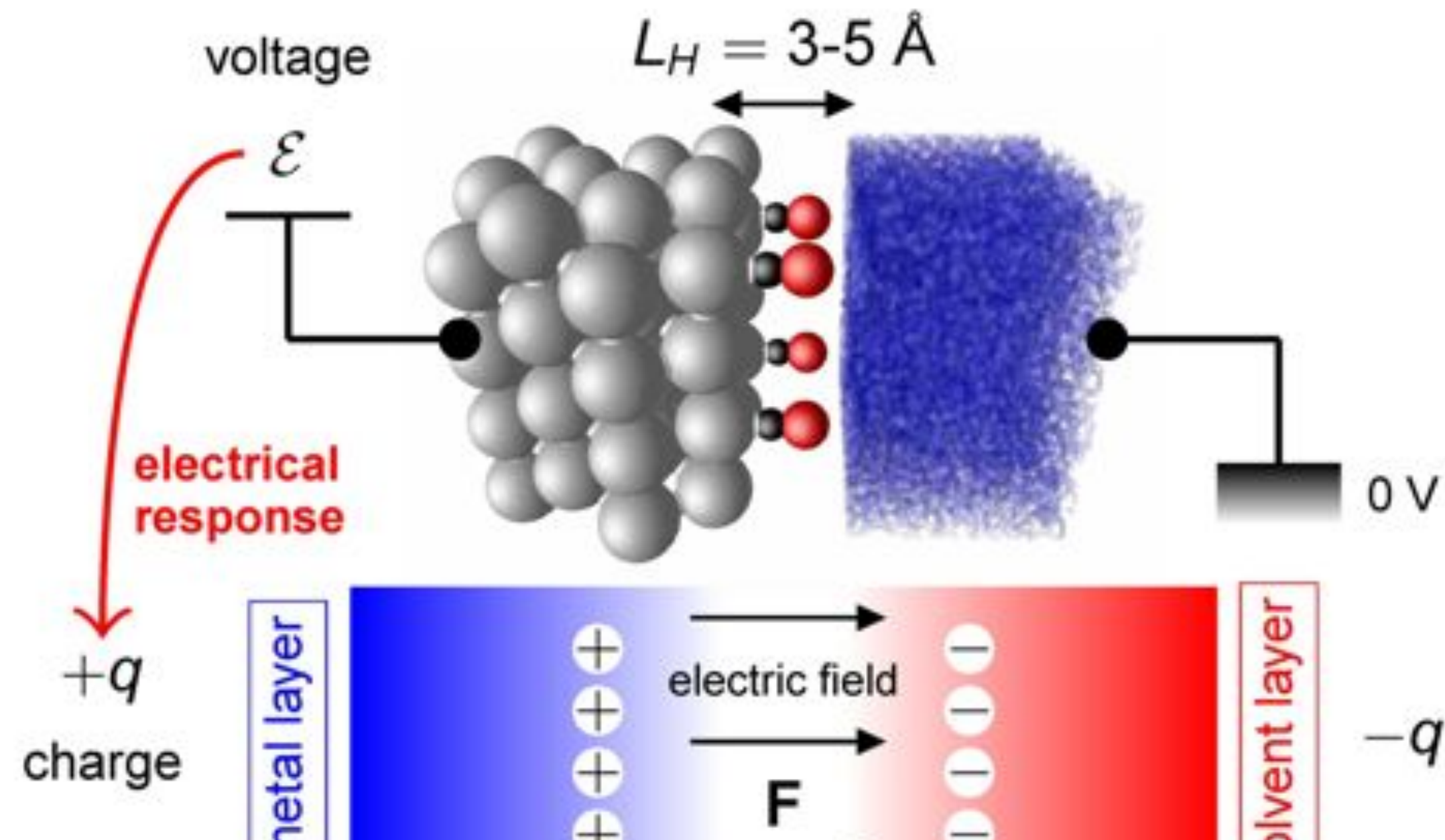
(b) Electrode potential  $\mathcal{E}$



- 1 Work Function:** Difference between the Fermi energy and the vacuum reference energy ( $q = 0$  only)
- 2 Electrode Potential:** Difference between the Fermi energy and



The electrode potential is measured from the screened response to charging coming from the quantum, solvent, and counterion fields (also the opposite could be done – at fixed potential

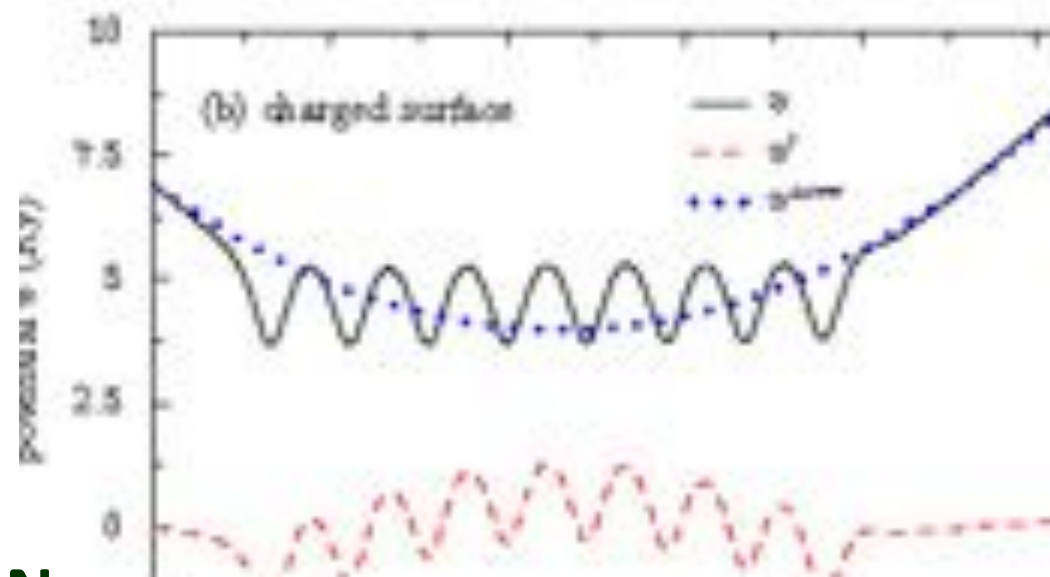
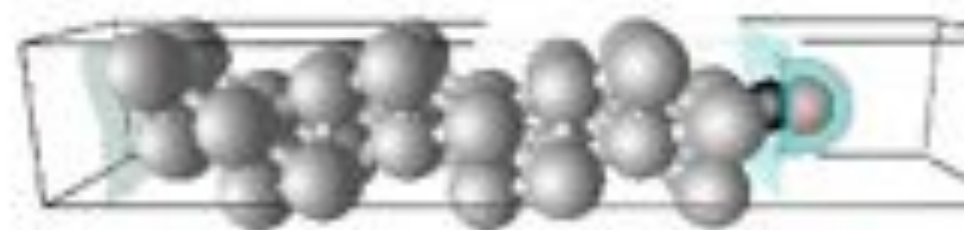
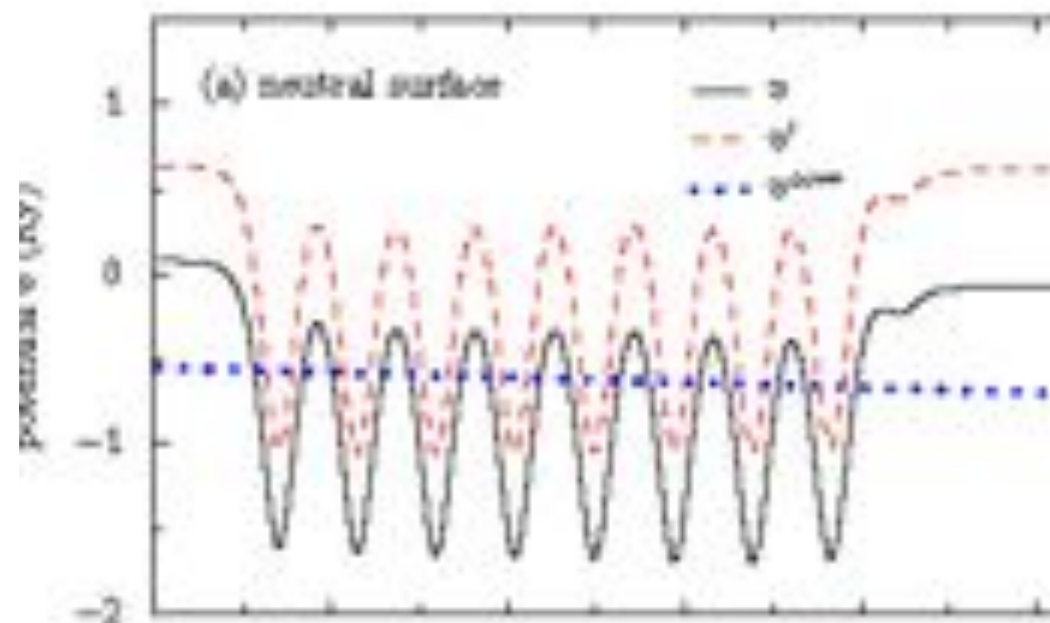


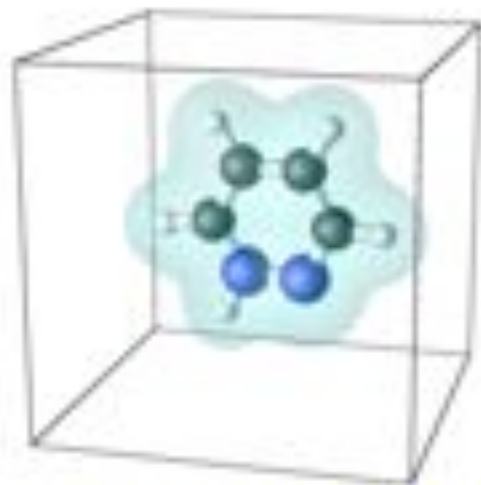


$$d^2v/dz^2 = -4\pi\rho$$

$$d^2v'/dz^2 = -4\pi(\rho - \langle\rho\rangle)$$

$$d^2v^{corr}/dz^2 = -4\pi\langle\rho\rangle$$

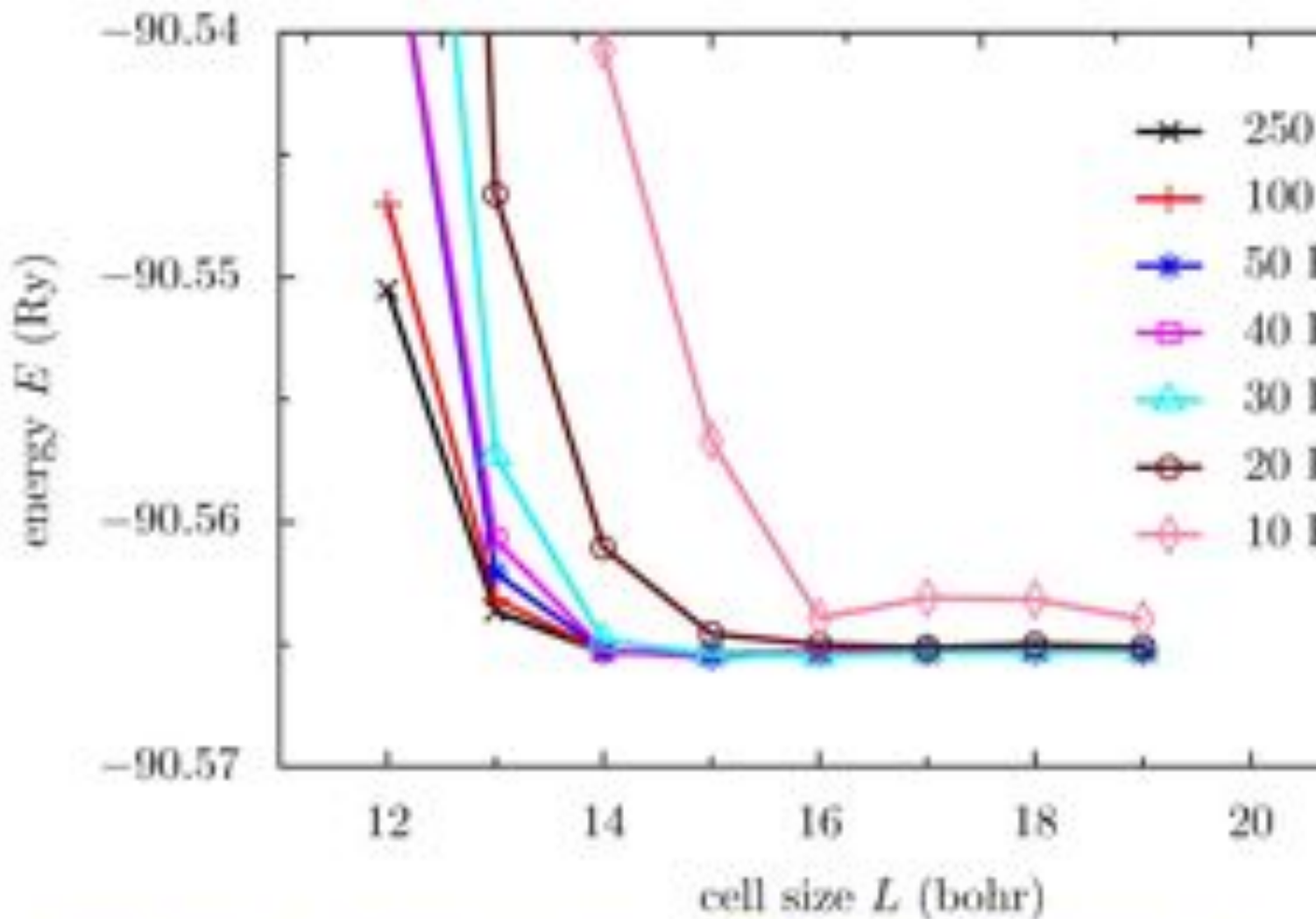
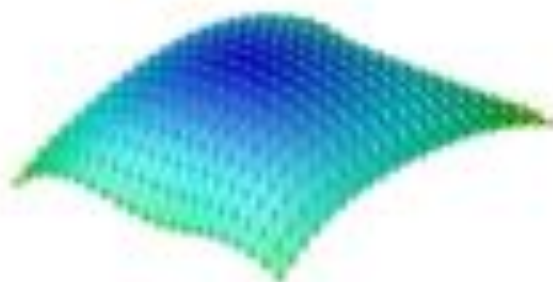




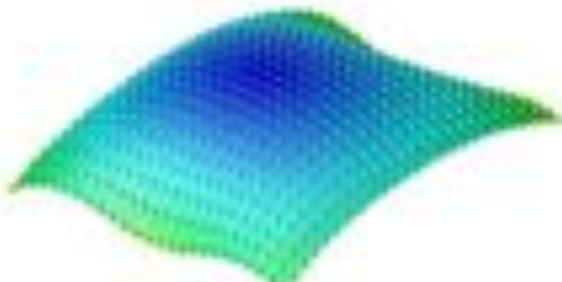
$E^{\text{corr}} = 10 \text{ Ry } (13 \times 13 \times 13)$



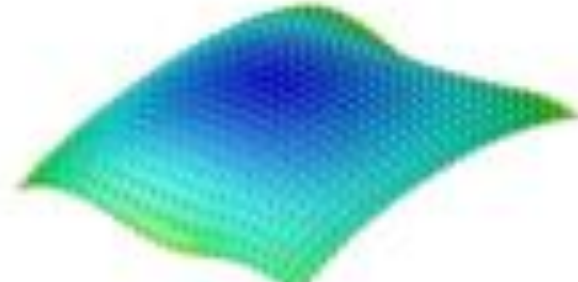
$E^{\text{corr}} = 20 \text{ Ry } (21 \times 21 \times 21)$



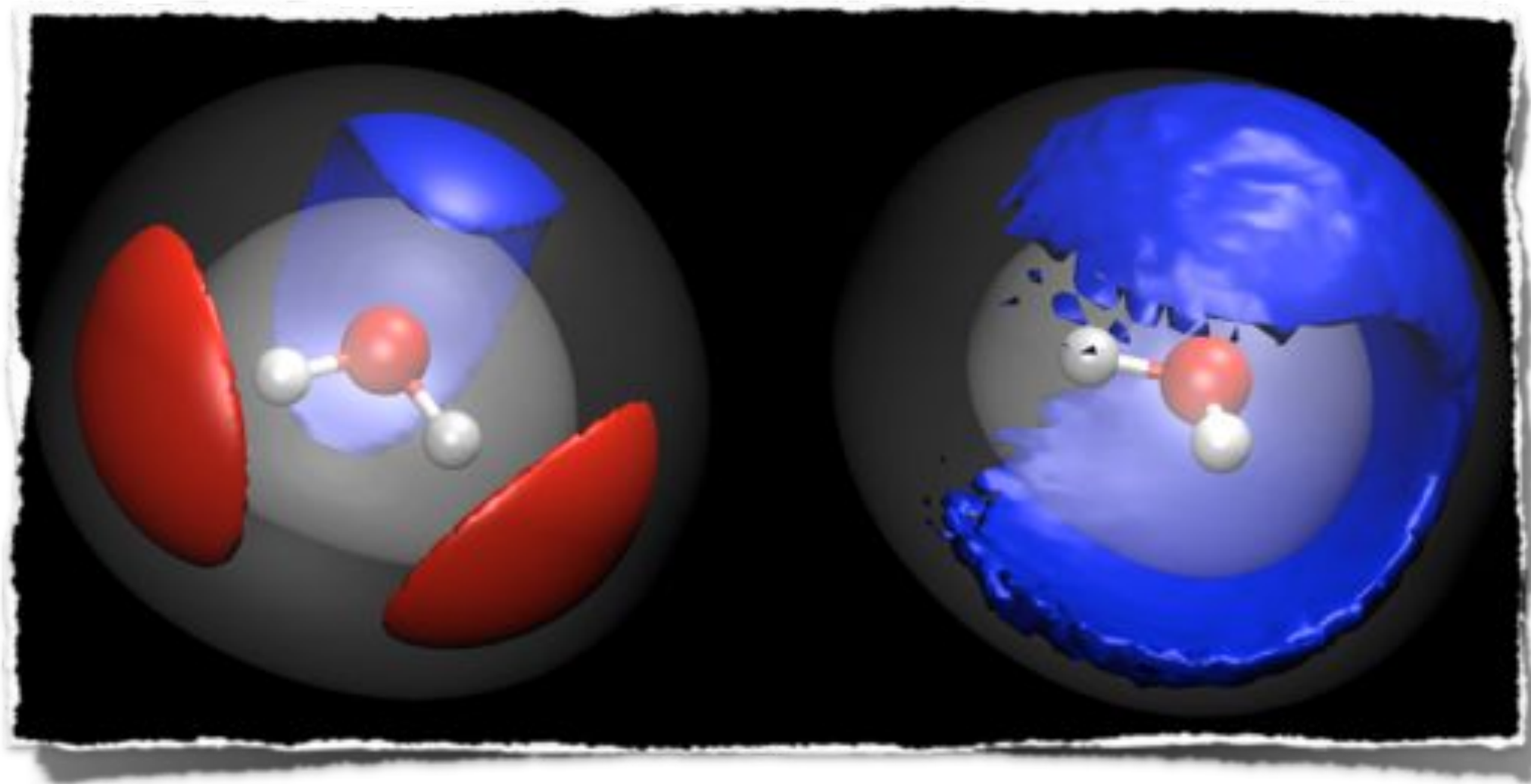
$E^{\text{corr}} = 30 \text{ Ry } (25 \times 25 \times 25)$



$E^{\text{corr}} = 40 \text{ Ry } (29 \times 29 \times 29)$



# Second ingredient: SCCS (self-consistent continuum solvation)



# (Guoy-Chapmann-Stern)

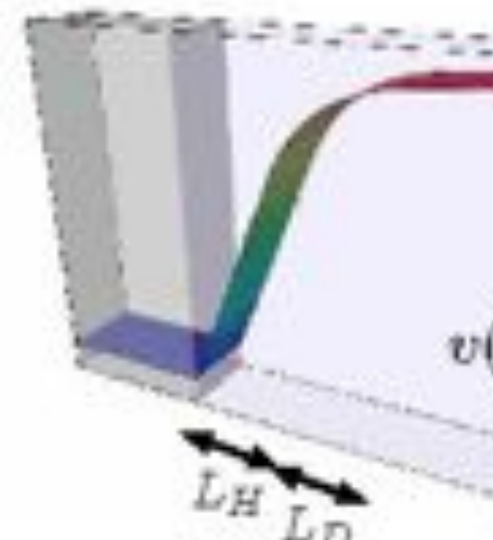
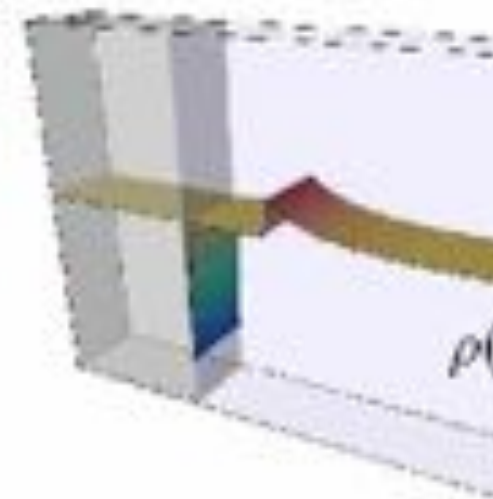
$$\nabla \cdot \epsilon \nabla V^{corr} = -4\pi(\langle \rho \rangle + \rho'_p + \rho_d)$$

$$\rho'_p = \nabla \cdot \chi \nabla V'$$

$$\rho_d = z_d c_d \left( e^{-\frac{z_d V}{k_B T}} - e^{+\frac{z_d V}{k_B T}} \right) \text{ if } \rho < \rho_1$$

⇒ ionic solvent reaction field

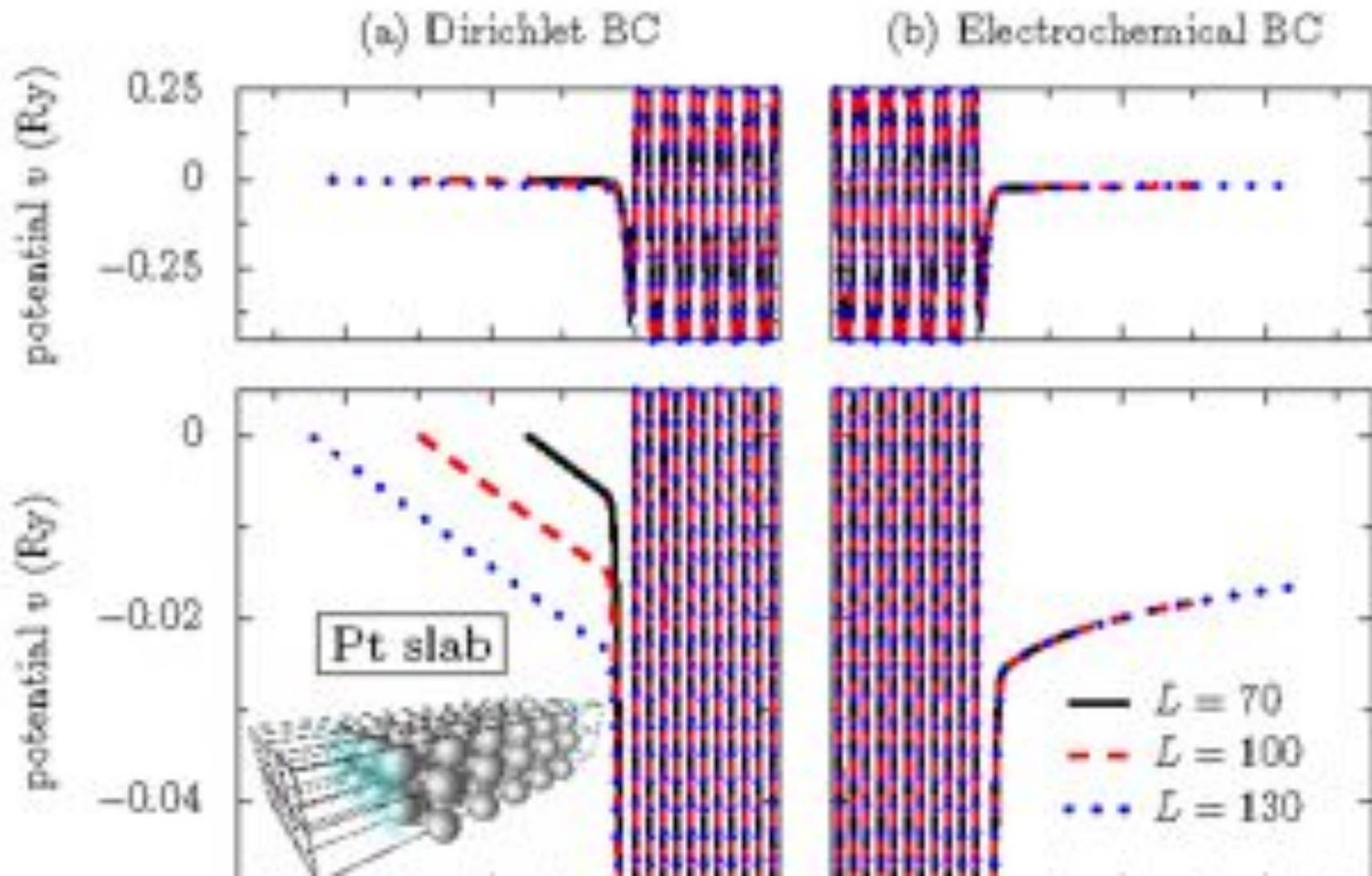
(c) Stern



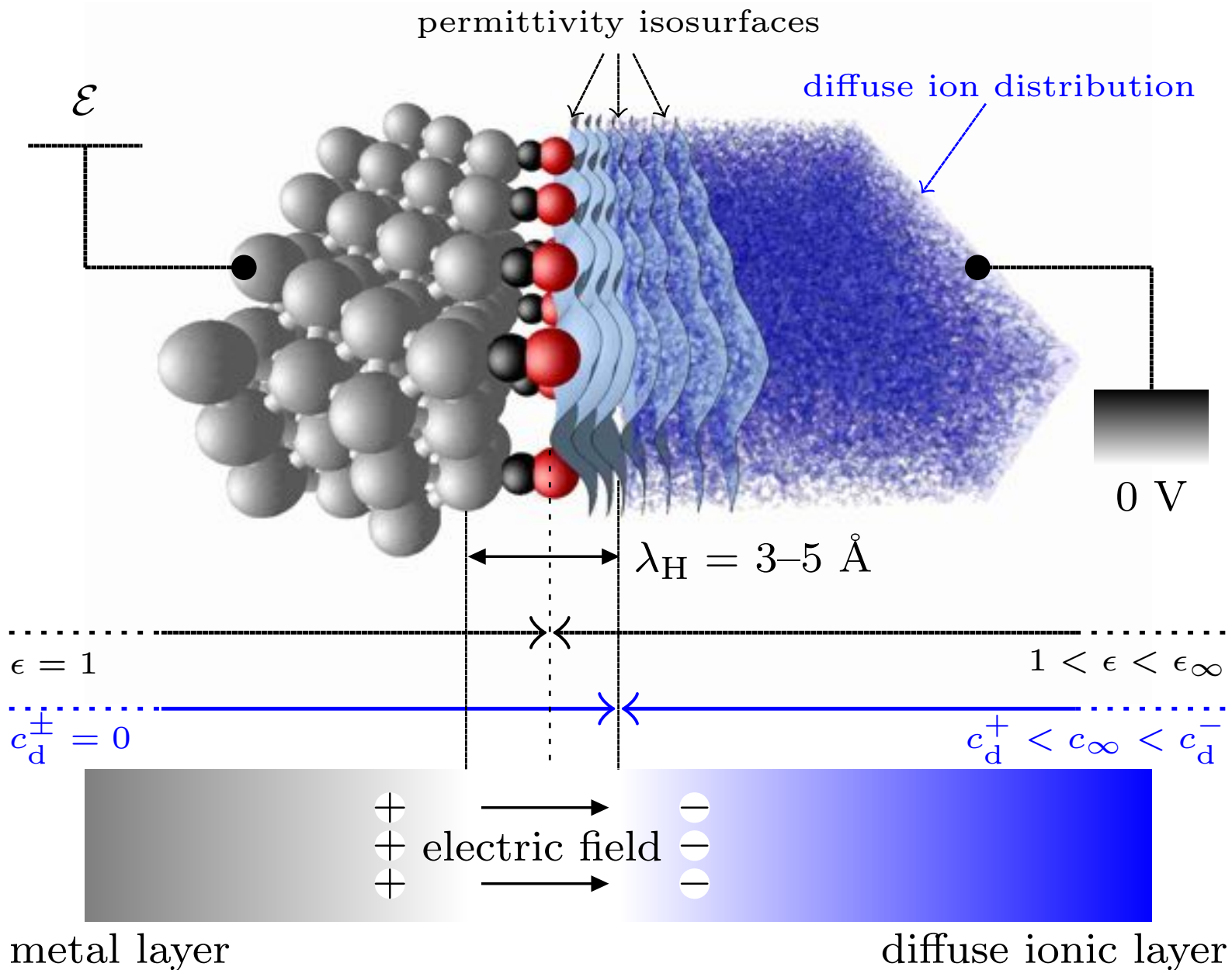


# Electrochemical Boundary Conditions

$$\frac{dv}{dz}(z) = - \left( \frac{36\pi c_d k_B T}{\epsilon_S} \right)^{\frac{1}{2}} \sinh \frac{z_d V(z)}{2k_B T} \text{ at } z = \pm L/2$$



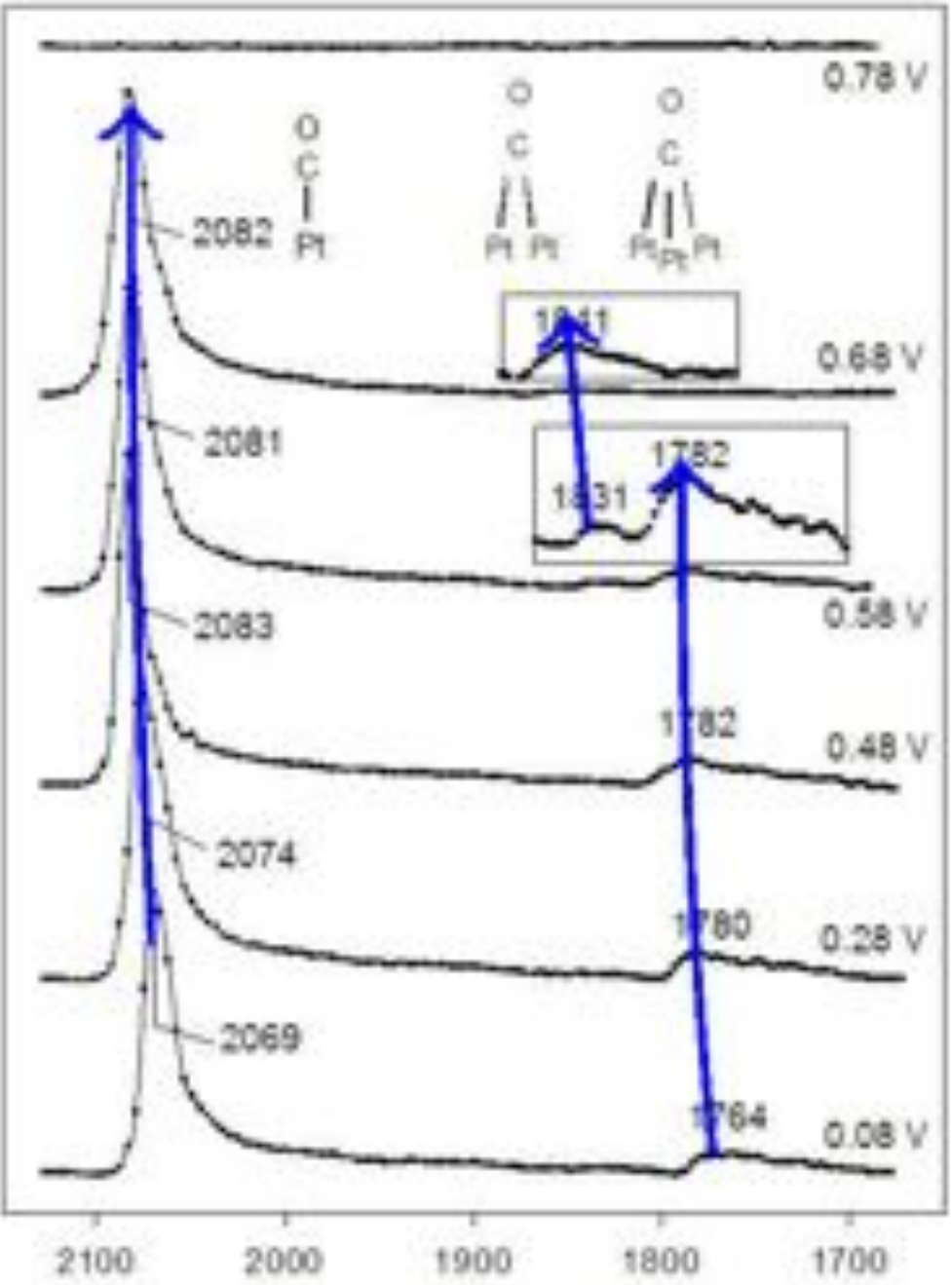




I. Dabo, PhD, MIT (2007)

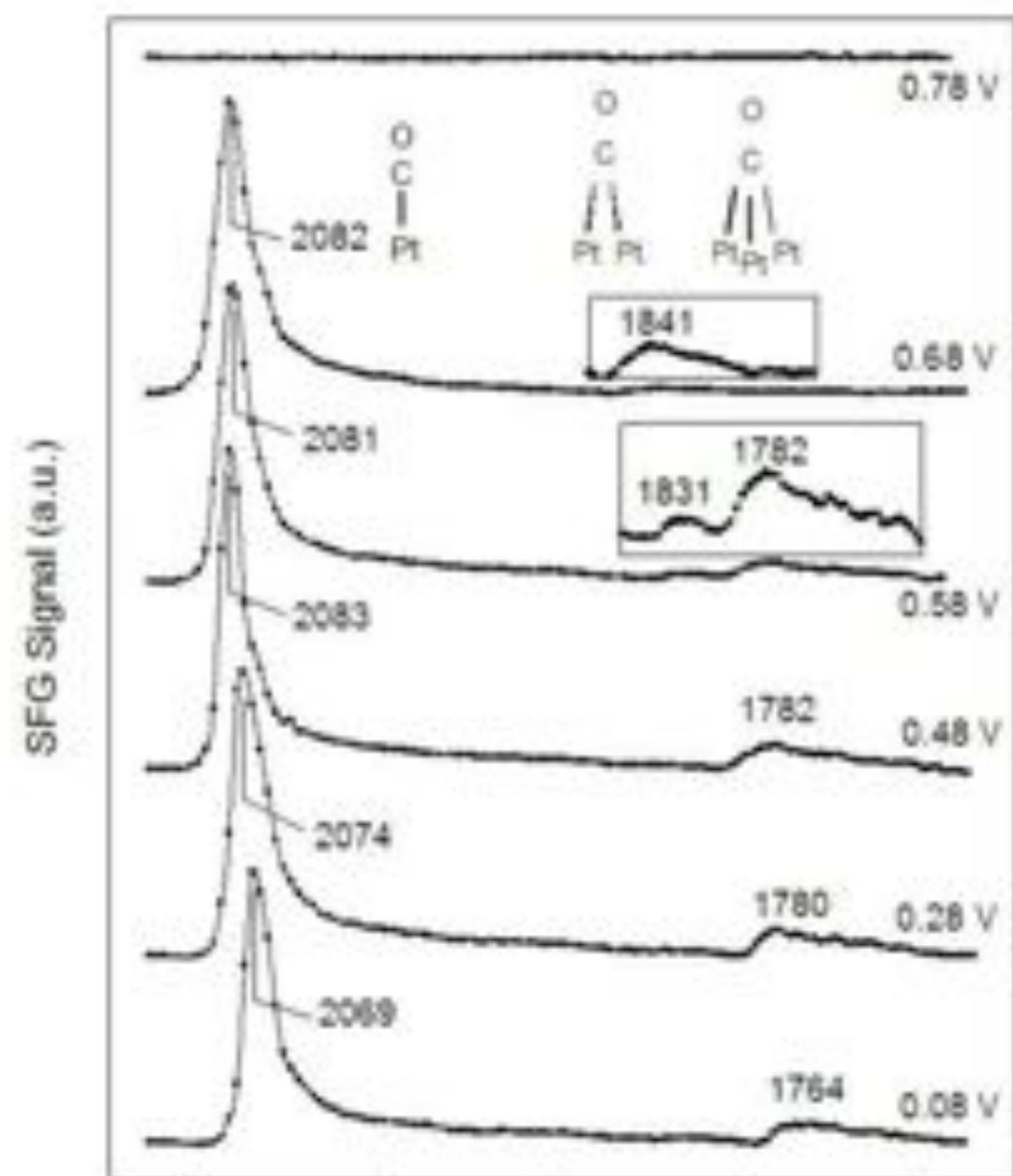
I. Dabo, E. Cancès, Y. L. Li, and N. Marzari, arXiv:0901.0096v2 (2009)

Application: Stark tuning



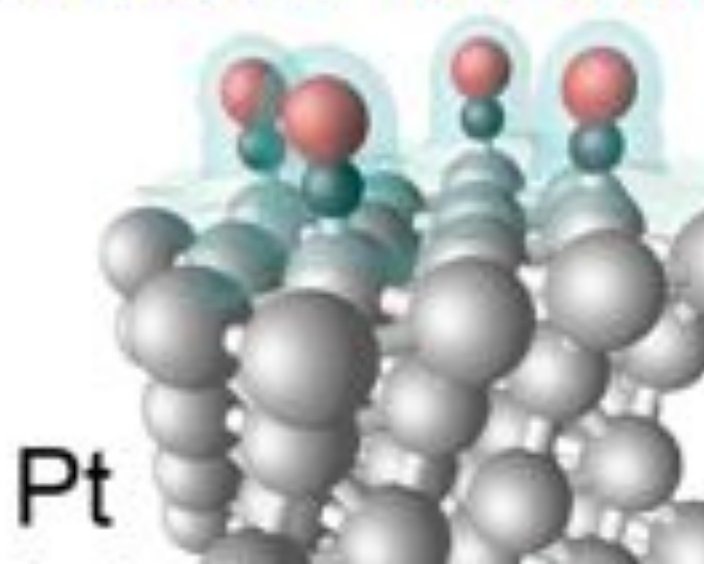
$$\frac{d\nu(\text{C-O})}{d\varepsilon} = 28\text{-}32 \text{ cm}^{-1} \cdot \text{m}^2$$

- Technologically important system (CO poisoning).
- Accurate experimental data.
- Highly sensitive to electrochemical conditions.
- No comprehensive first-principles model.



$$\nu(\text{C} - \text{O})$$

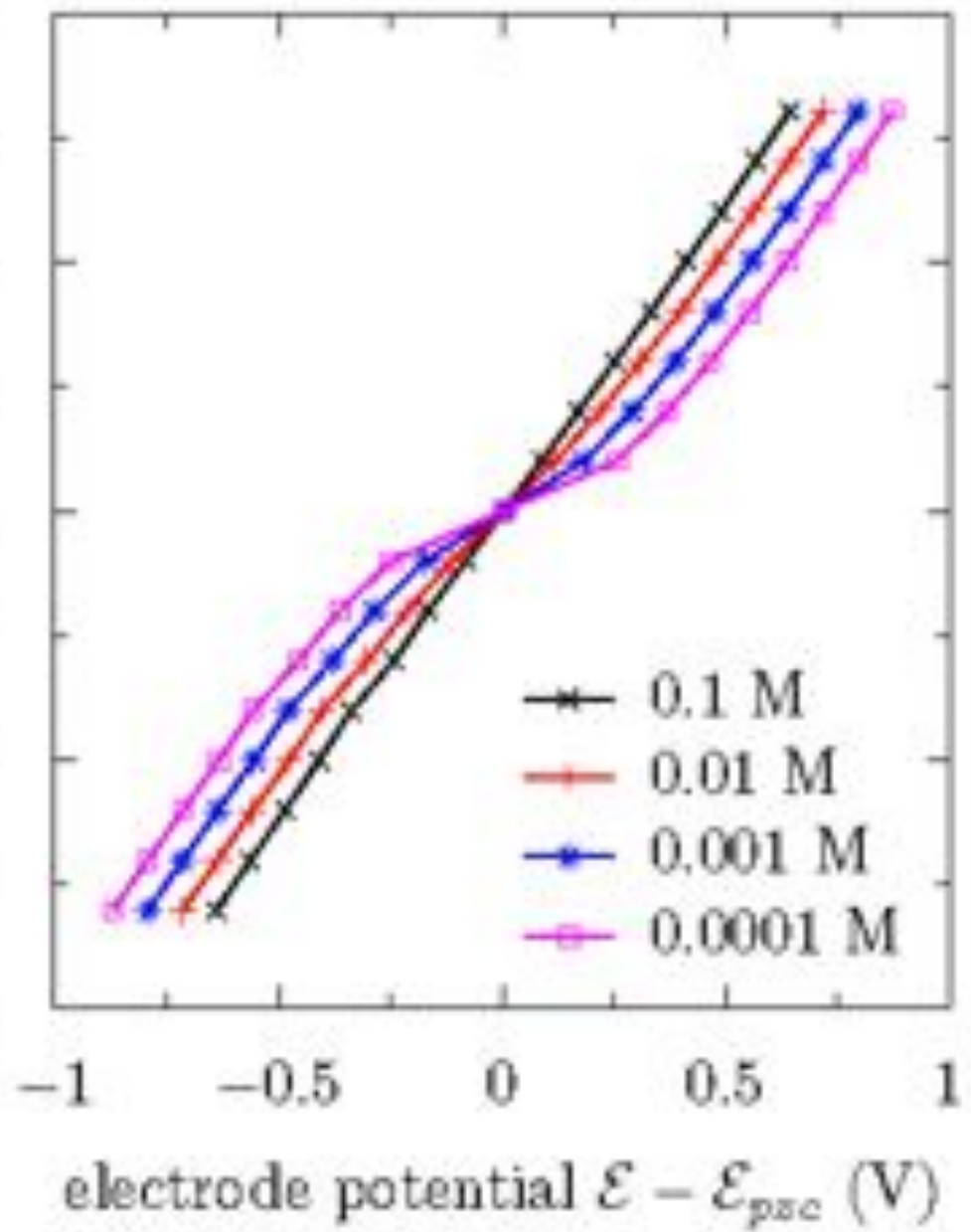
	DFT	(Exp.)
atop	2050 $\text{cm}^{-1}$	(2070 $\text{cm}^{-1}$ )
bridge	1845 $\text{cm}^{-1}$	(1830 $\text{cm}^{-1}$ )
hcp	1752 $\text{cm}^{-1}$	(1760 $\text{cm}^{-1}$ )
fcc	1743 $\text{cm}^{-1}$	(1760 $\text{cm}^{-1}$ )



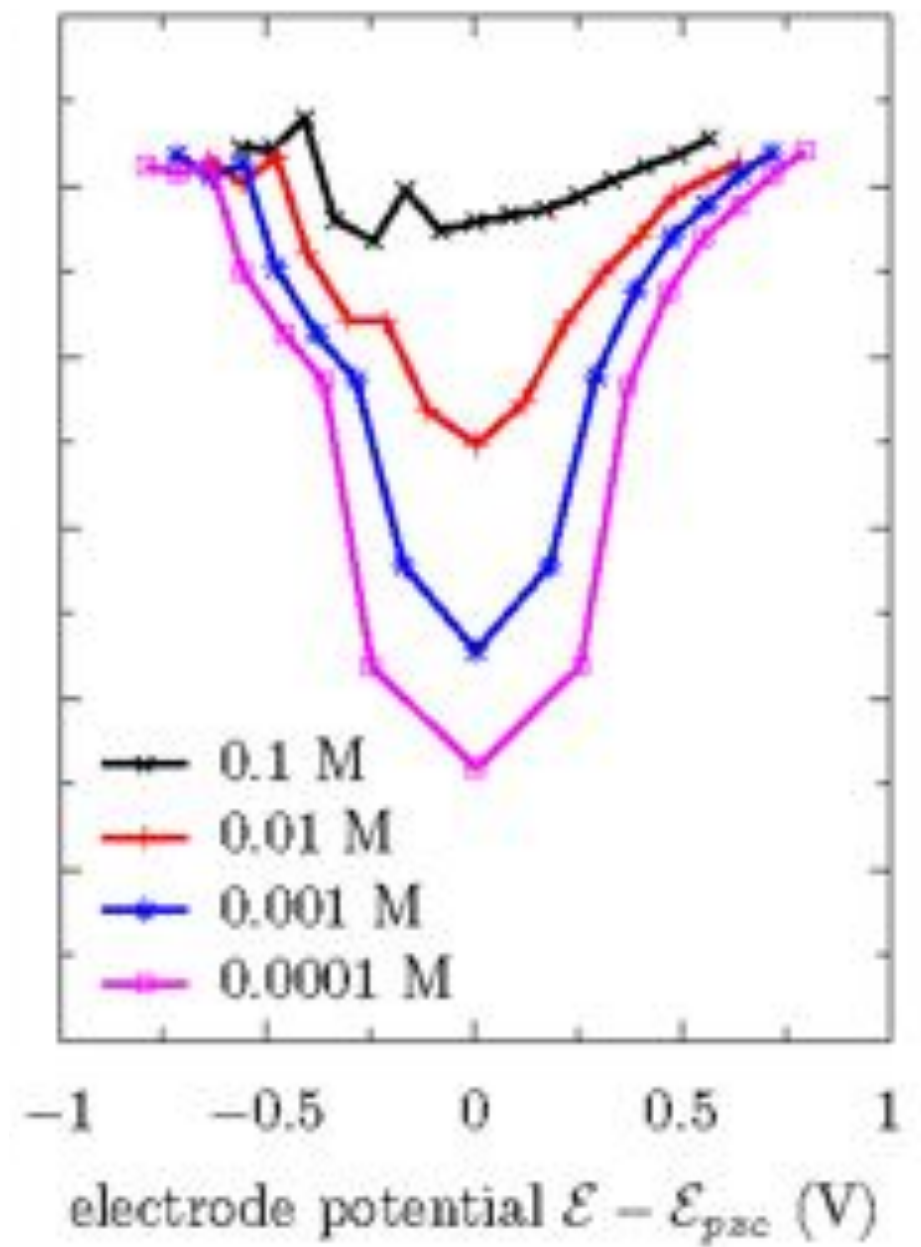


# Charge and capacitance as a function of potential

## Surface charge



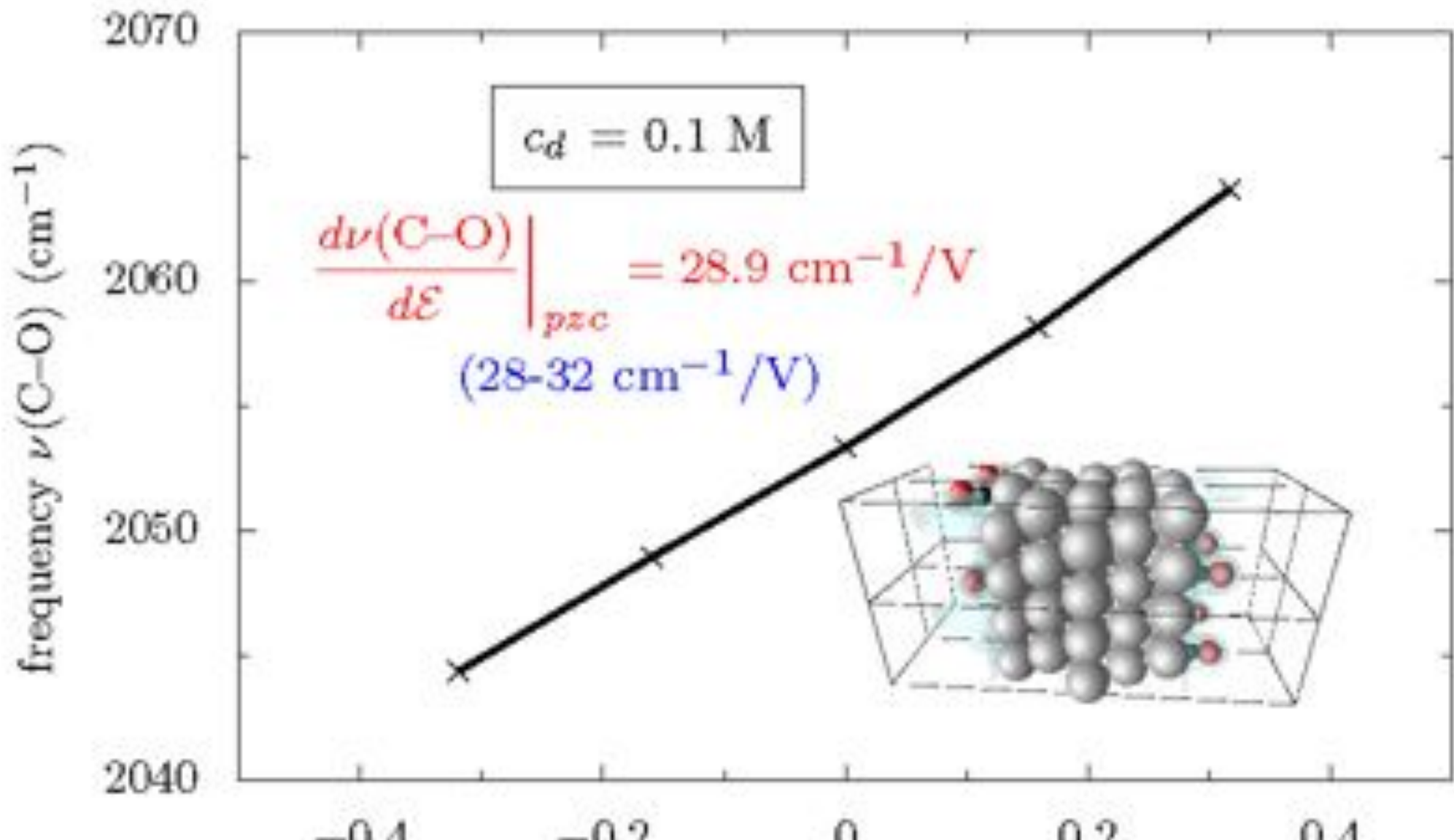
## Capacitance





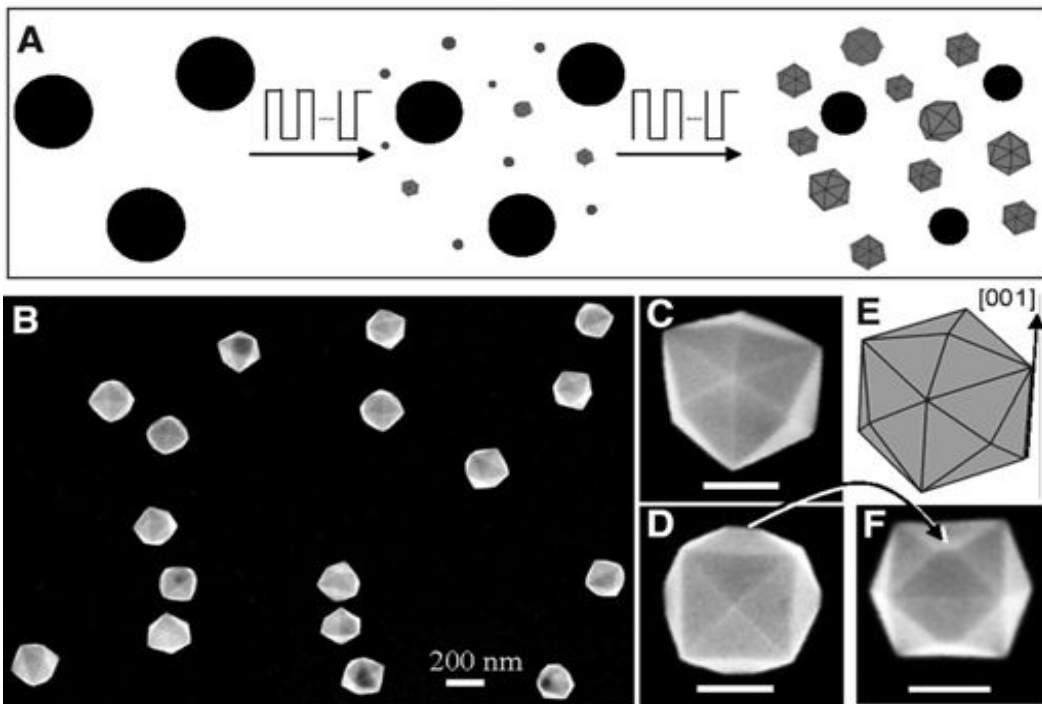
# Electrochemical vibrational Stark effect

## Vibrational frequency



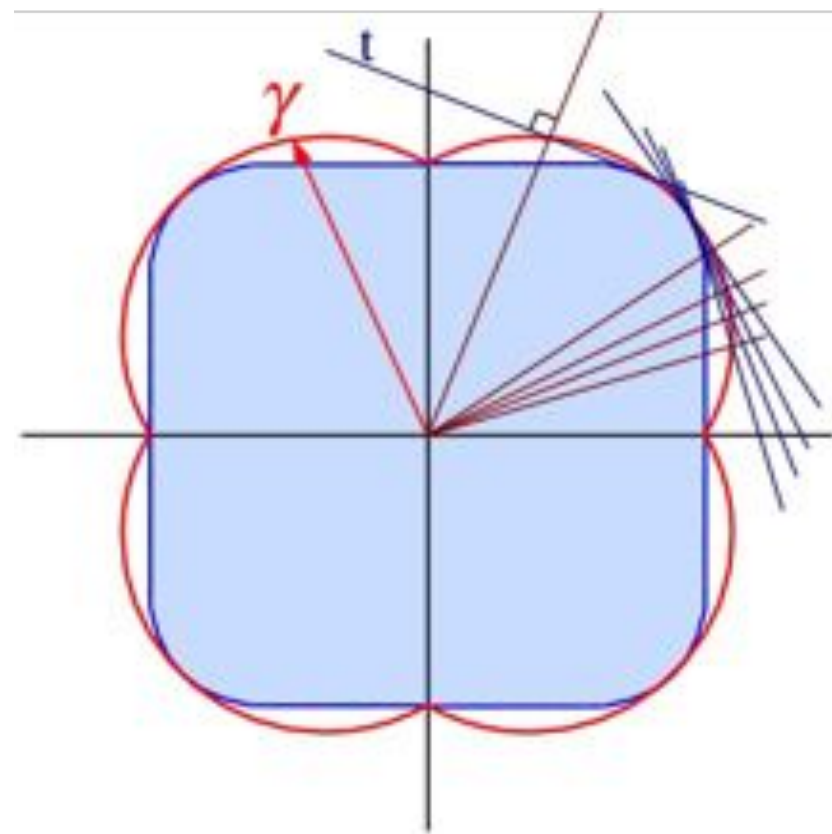
Application:  
Equilibrium shapes of  
nanoparticles (potential, pH)

## Possible potential-shape relationship evidence



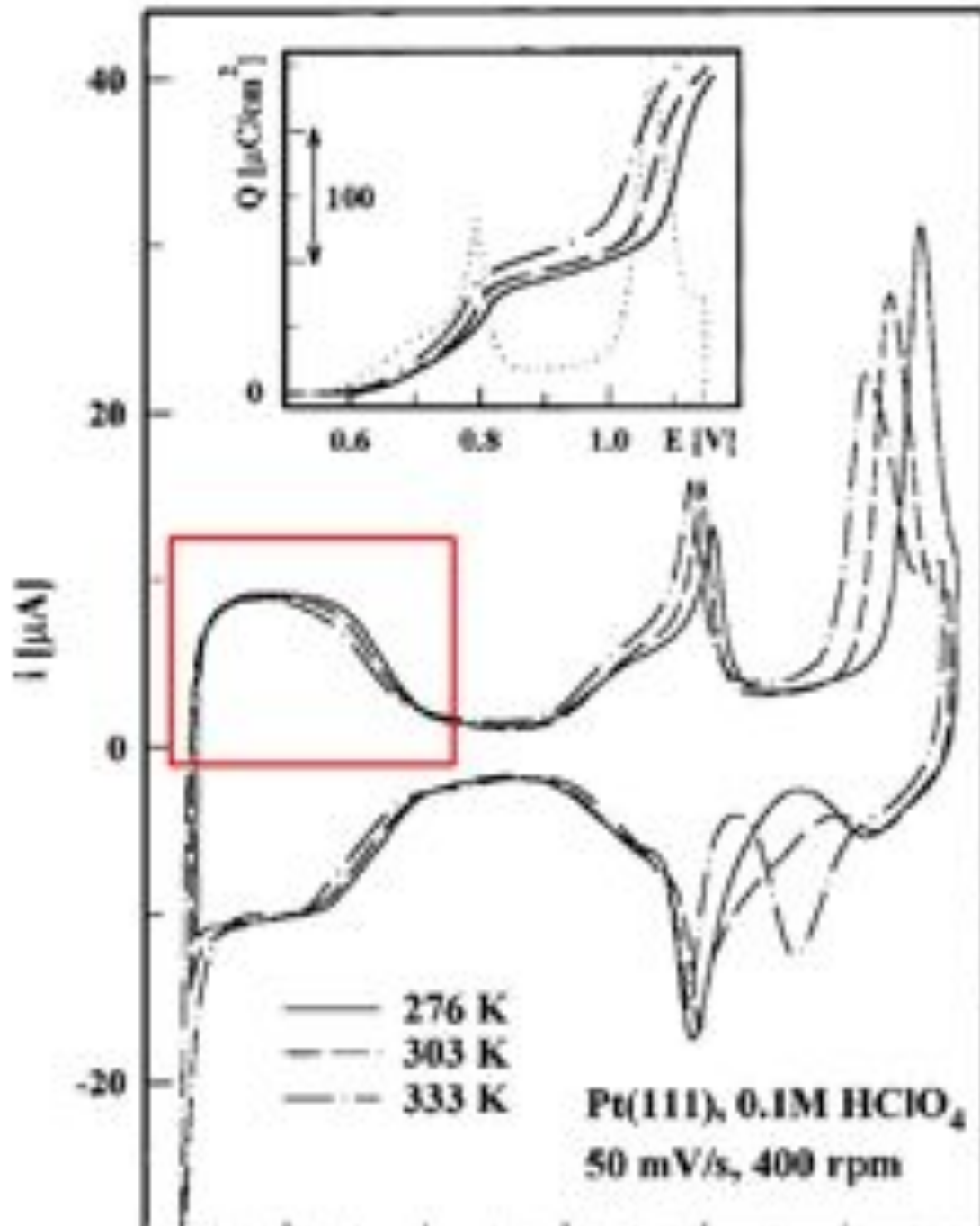
[Tian, Science 2007]

## The Wulff construction



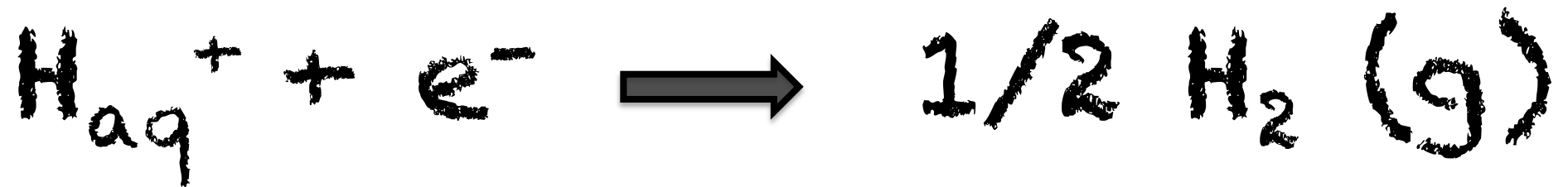
$$\gamma \leftrightarrow V$$

# Hydrogen underpotential deposition





# Electrosorption of a proton (Norskov et al.)



(at equilibrium for the RHE)



# Electrosorption of a proton (Norskov et al.)

At a potential  $U$  measured  
with respect to RHE:

$$\Delta G_{\text{tot}} = eU + \Delta G(\theta) + kT \ln(\theta/(1-\theta))$$

$$\Delta G(\theta) = \Delta E + \text{ZPE} + 0.20\text{eV}$$

# Effect of pH

standard vs reference hydrogen electrode

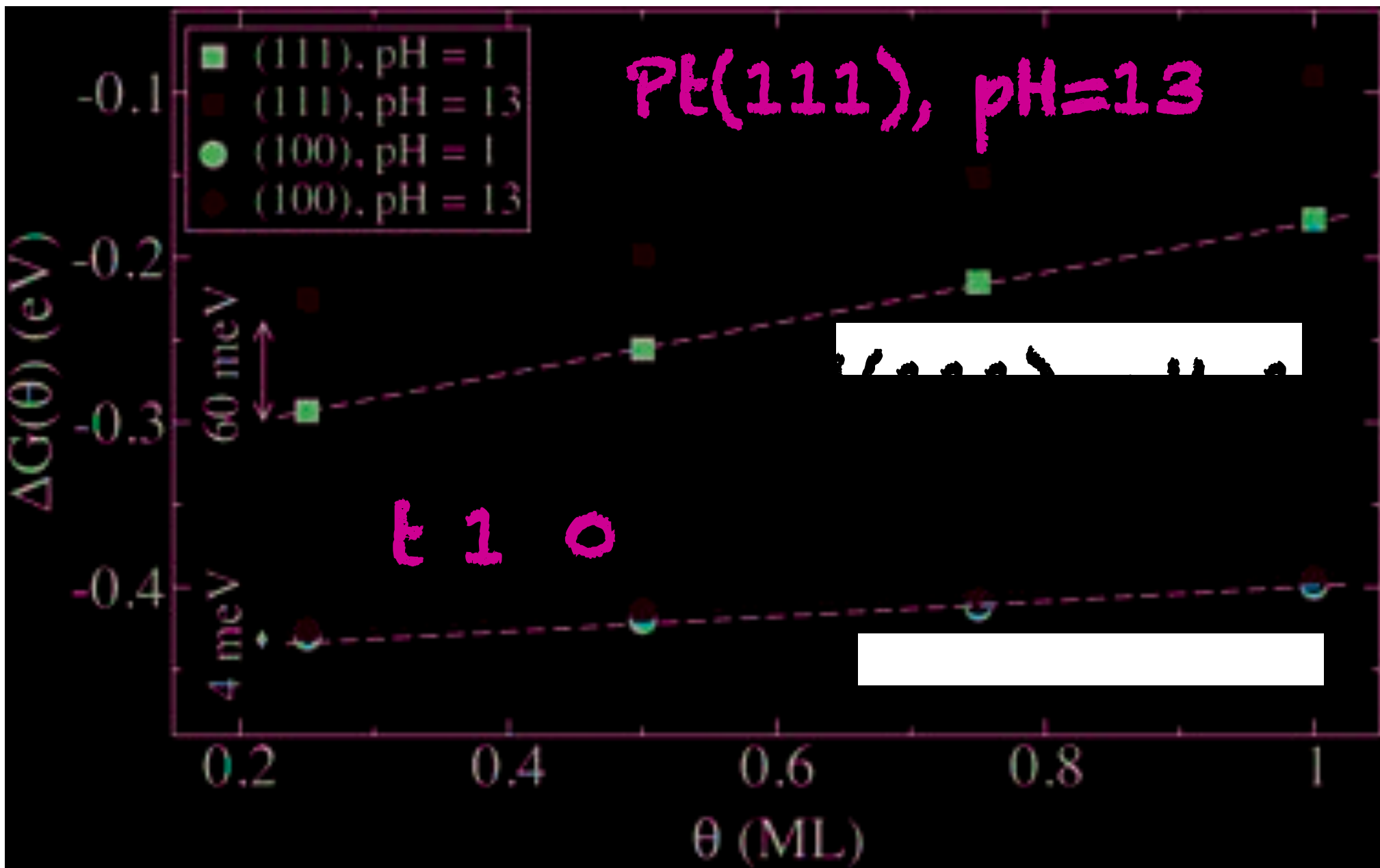
$$E_{\text{RHE}} = \Phi_{\text{SHE}} + kT \ln [\text{H}^+] = \Phi_{\text{SHE}} - 0,059 \times \text{pH}$$

Assumption from expts:  
PZC at 0 pH is 0,3V/RHE

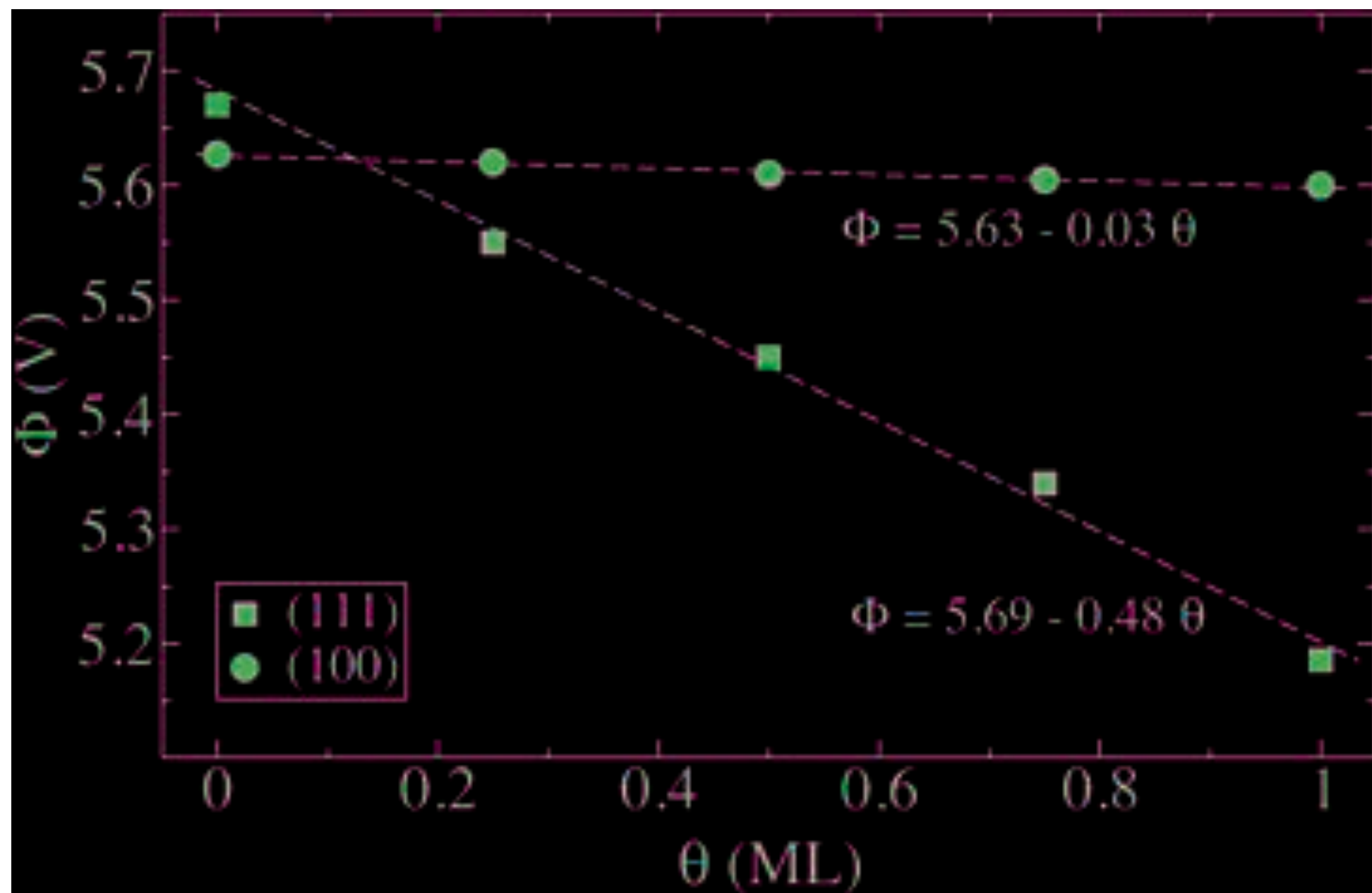
at any other pH the charge on the surface

$$\sigma = - 0,059 \times \text{pH} \times c_{\text{dl}}$$

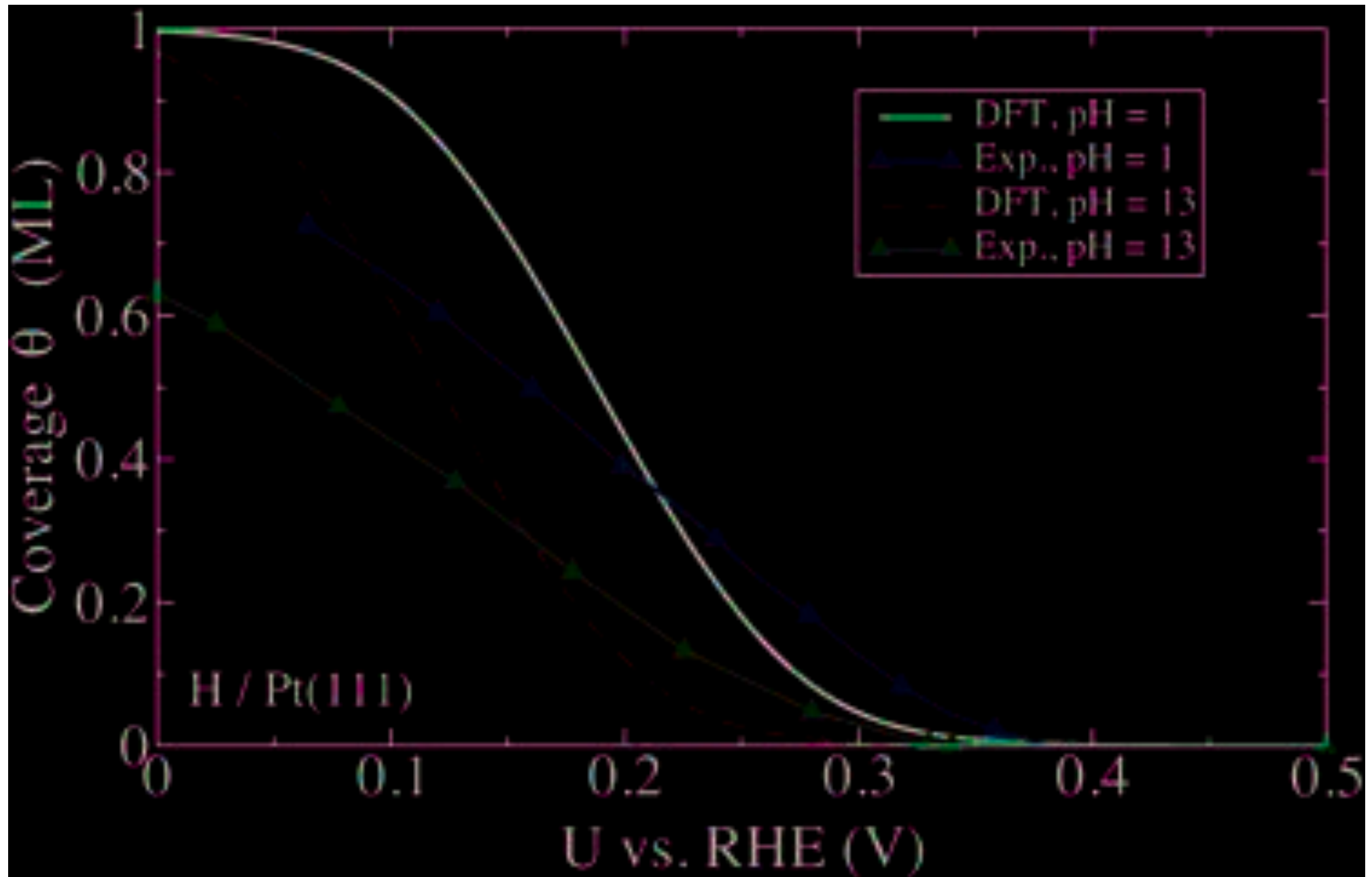
Assumption from expts:



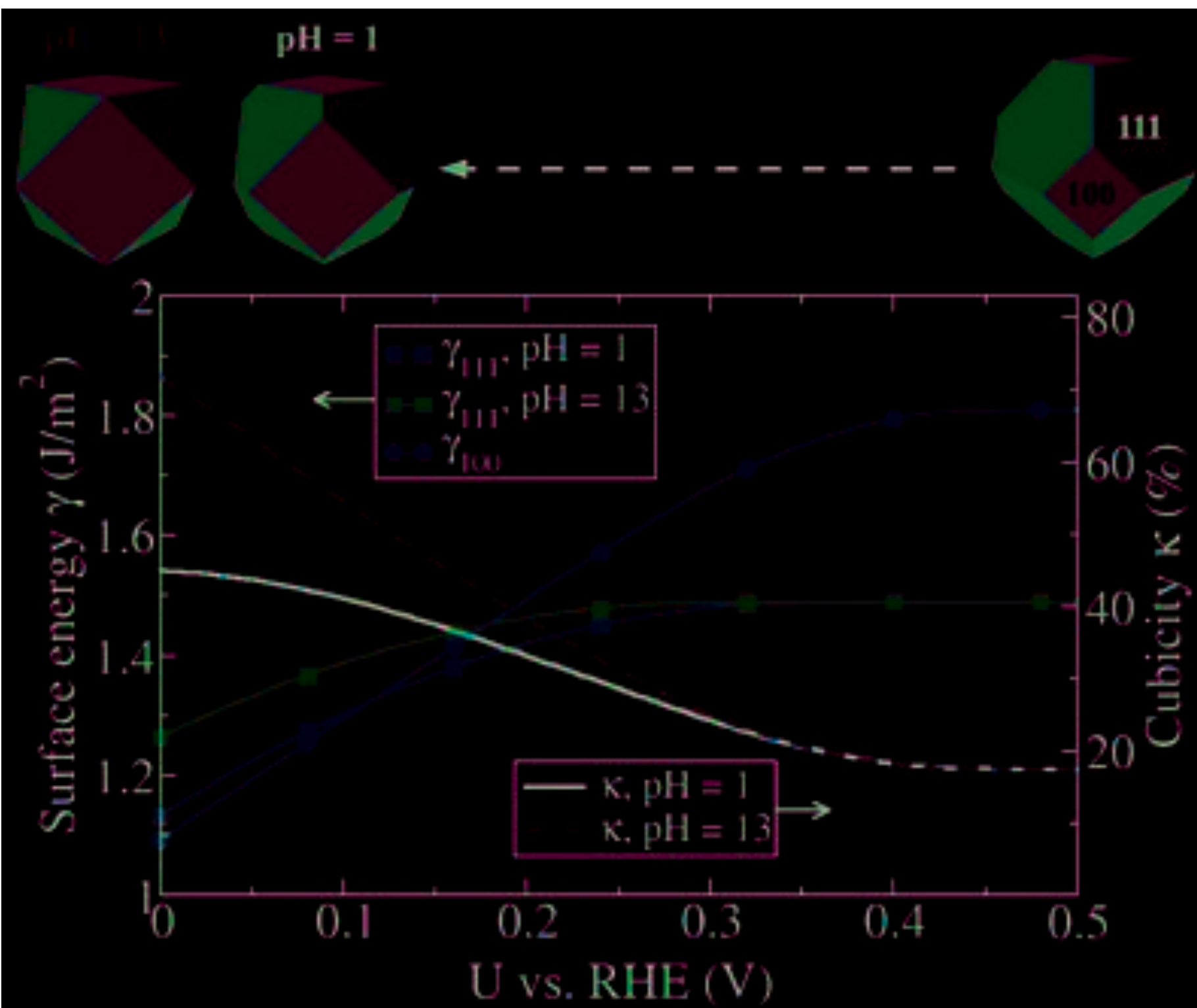




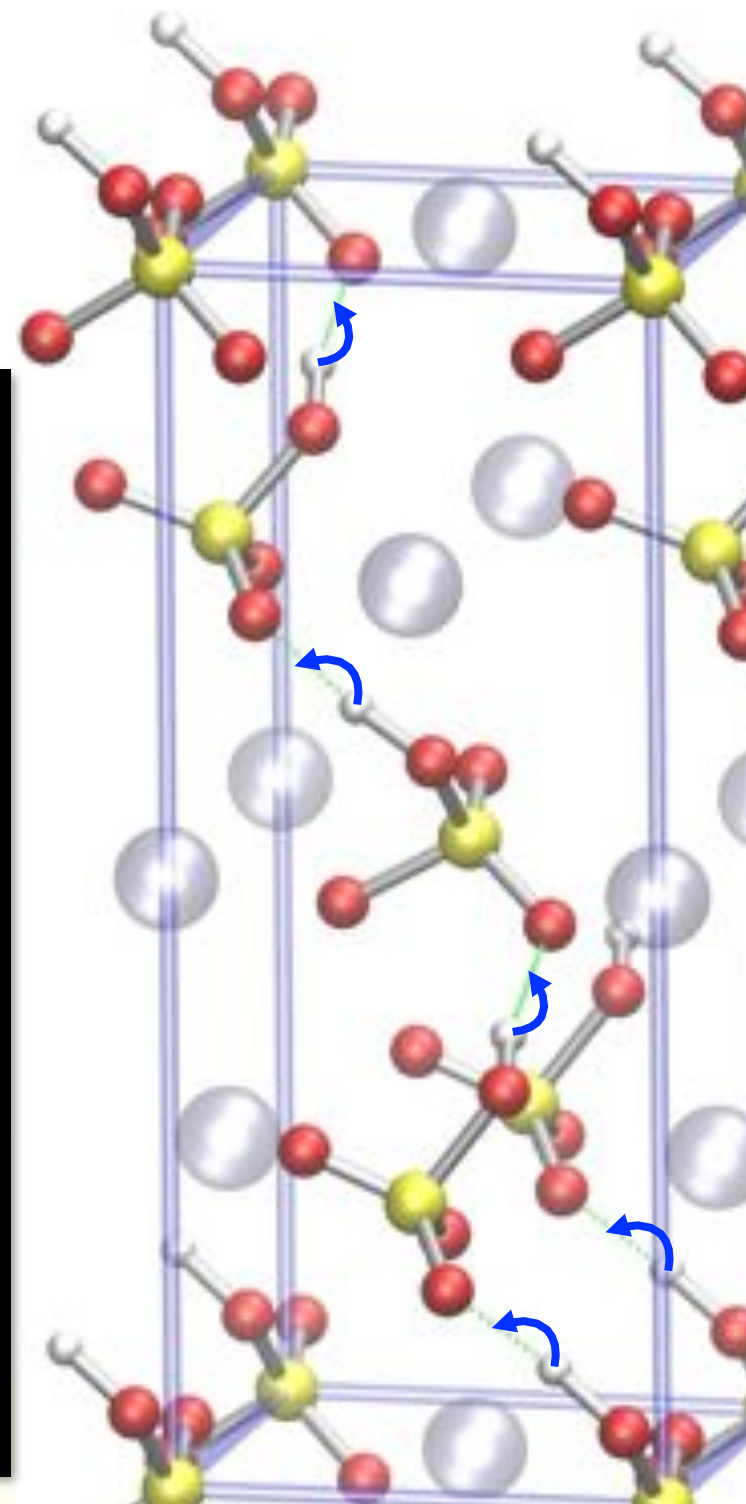
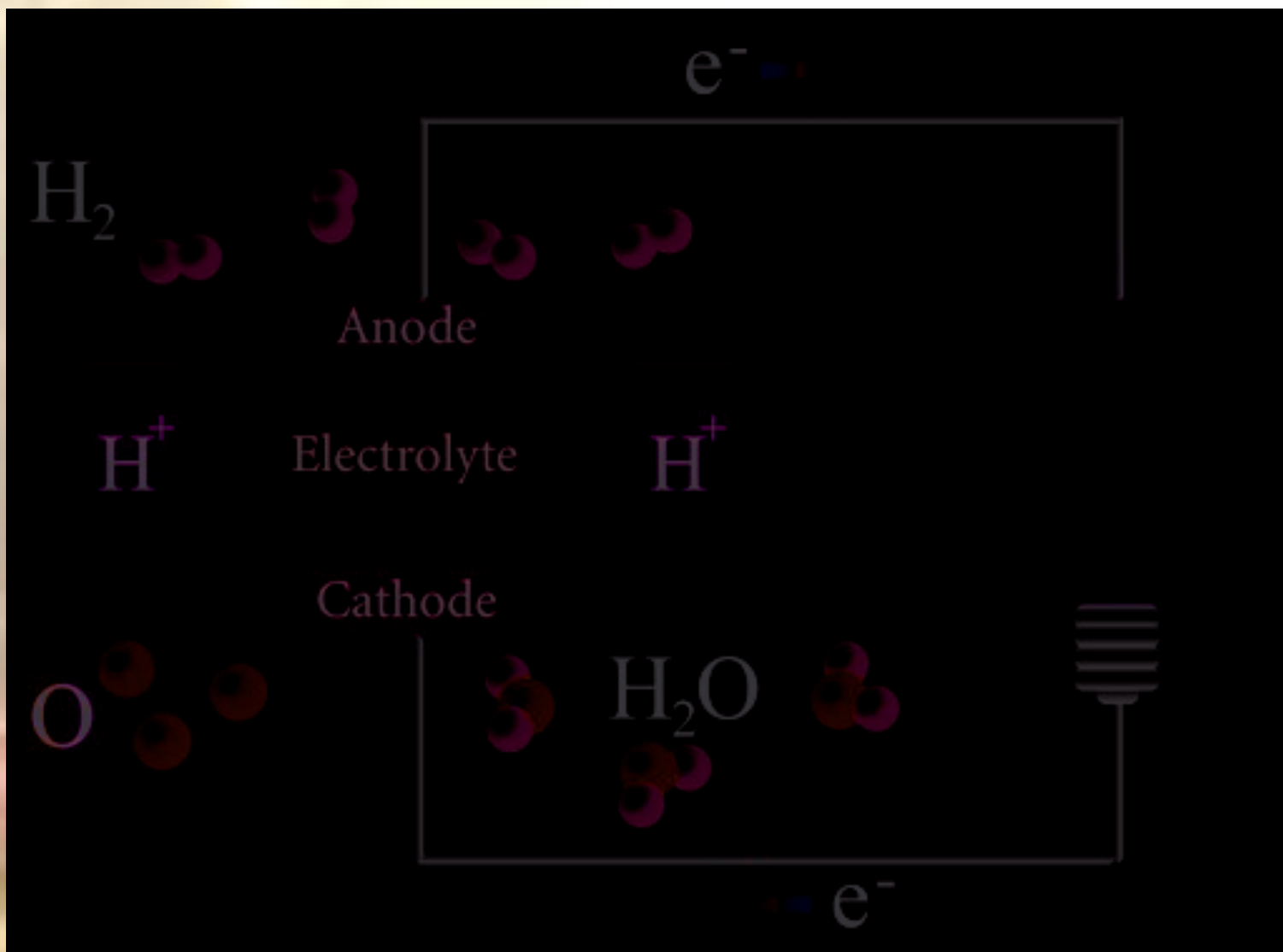
# Hydrogen deposition curves: $\Delta G(\text{pH}, U) = 0$



# Effect of electrolyte pH on the surface structure of Pt



Haile et al., *Nature* **410**, 910 (2001)



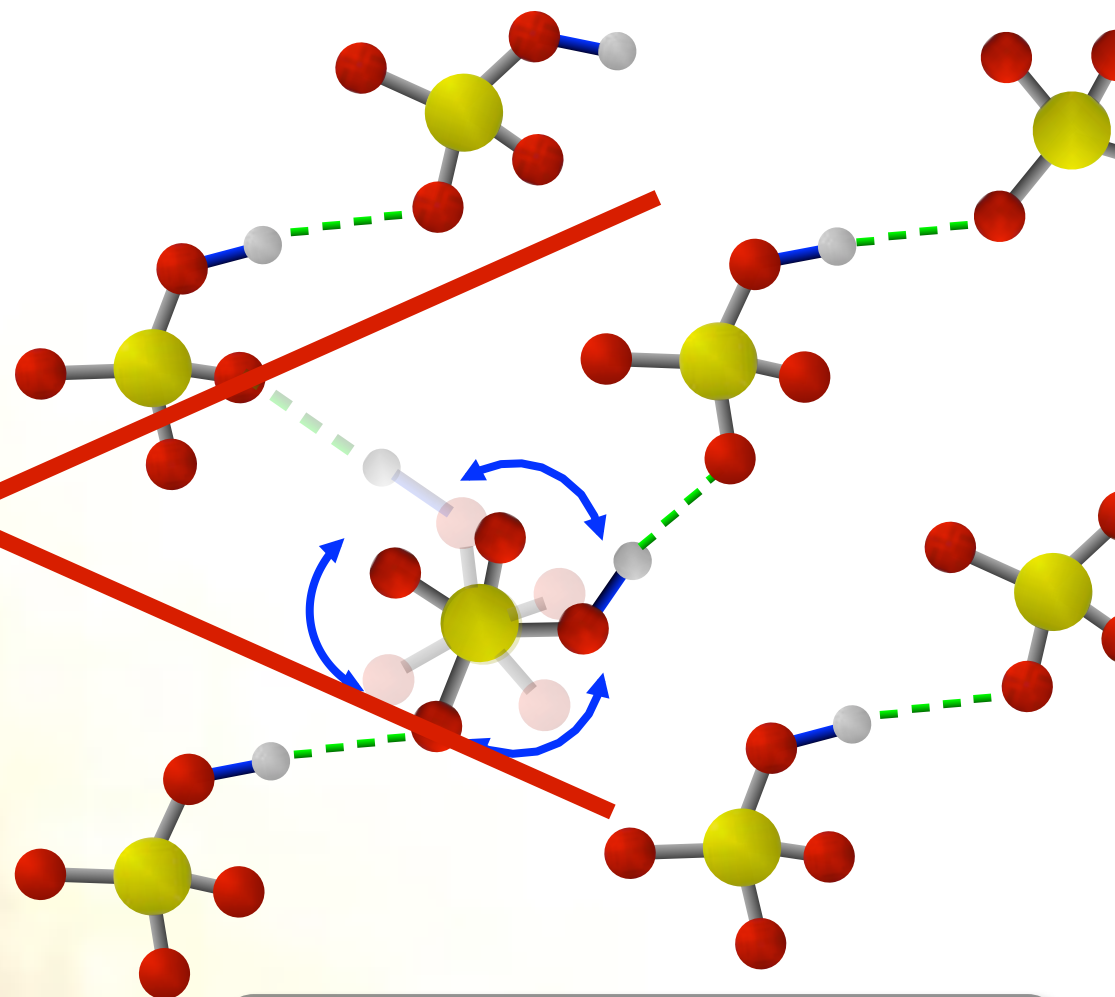
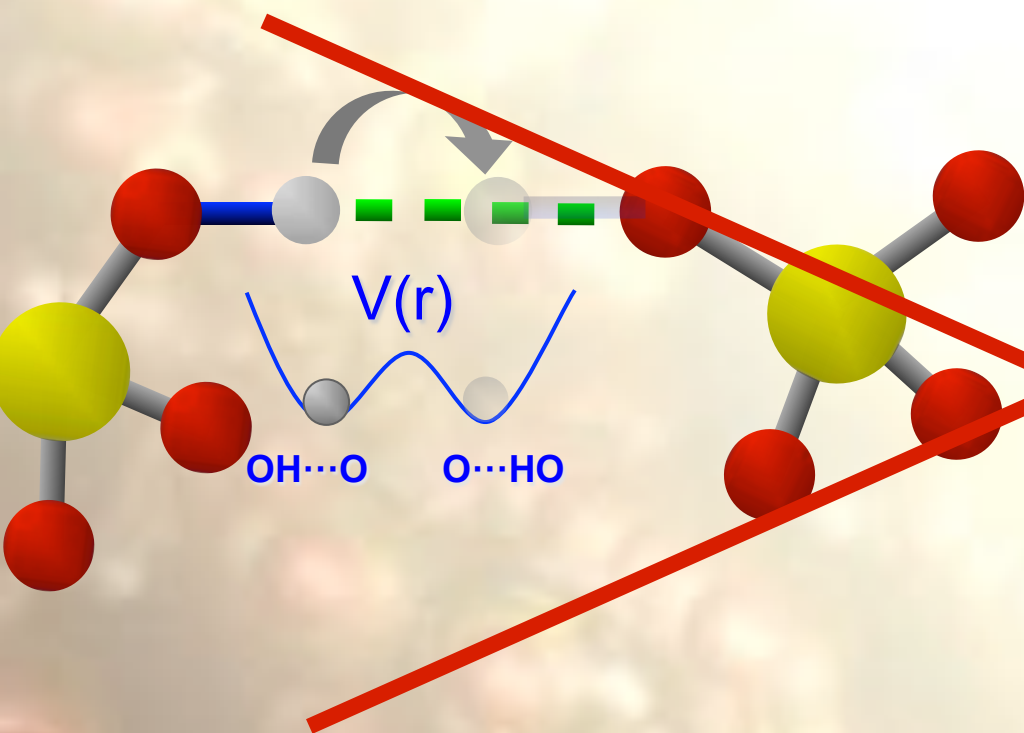


# Two independent processes

Proton hopping

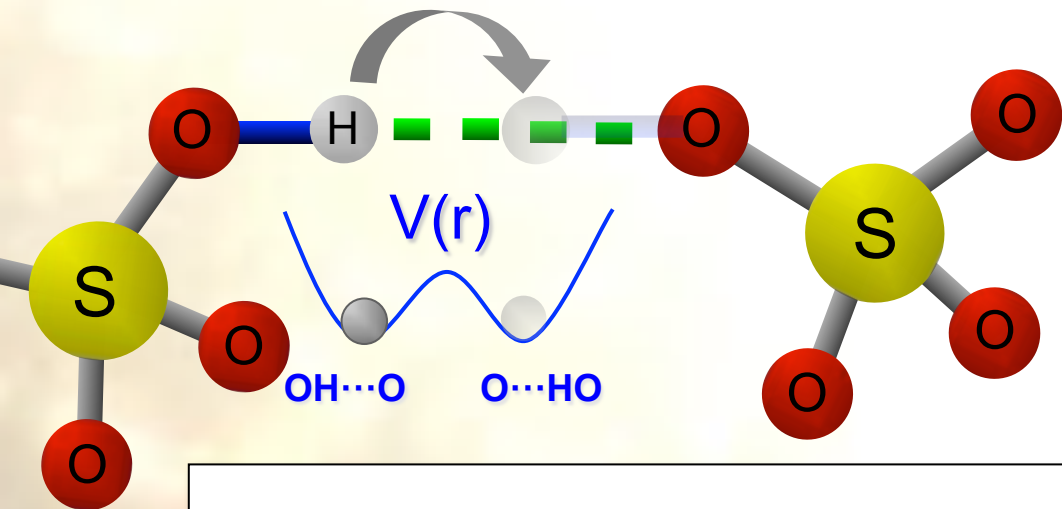
?

SO<sub>4</sub> rotation

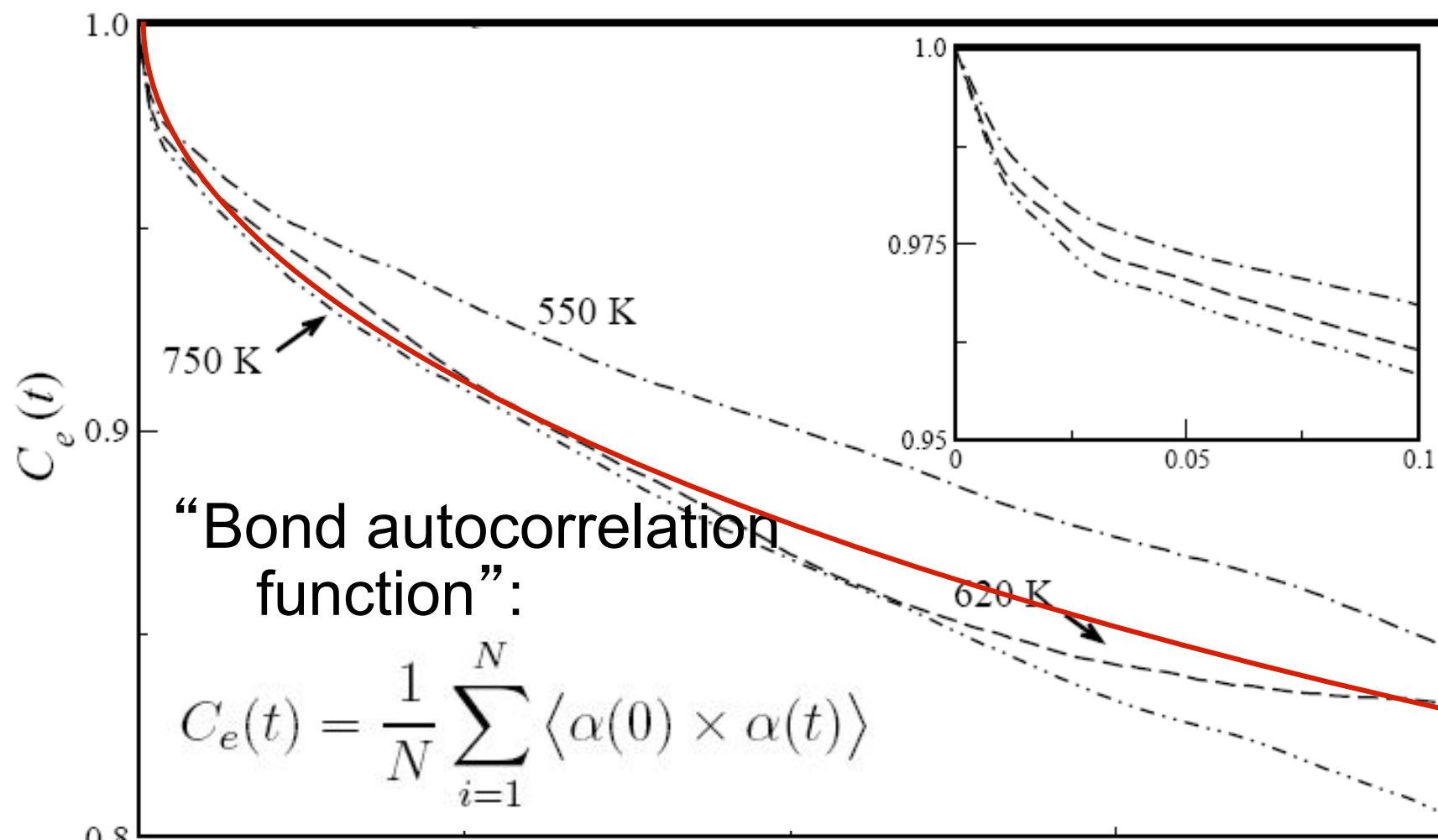


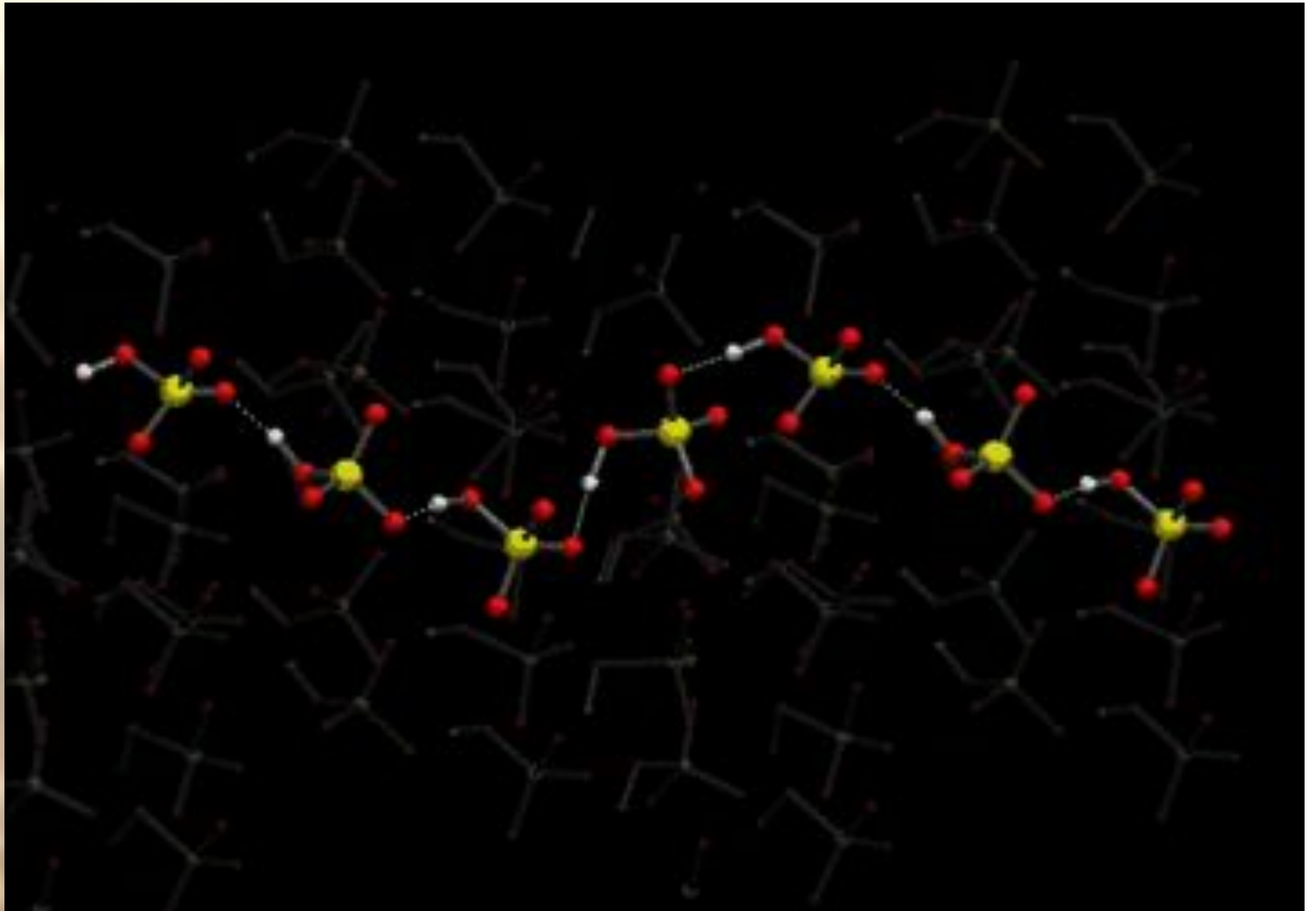
Slow ( $10^9 \text{ s}^{-1}$ )?

Fast ( $10^{11} \text{ s}^{-1}$ )?



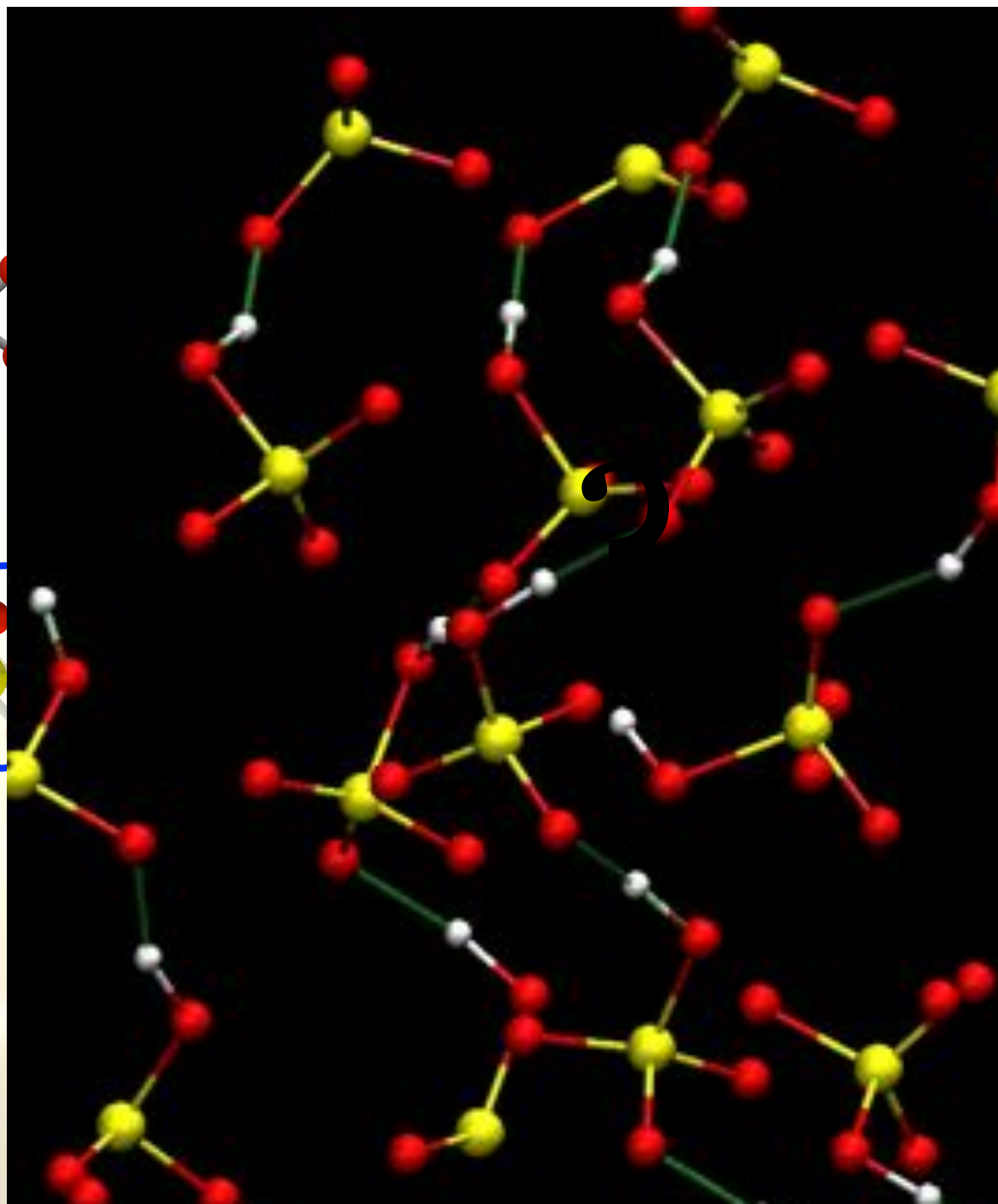
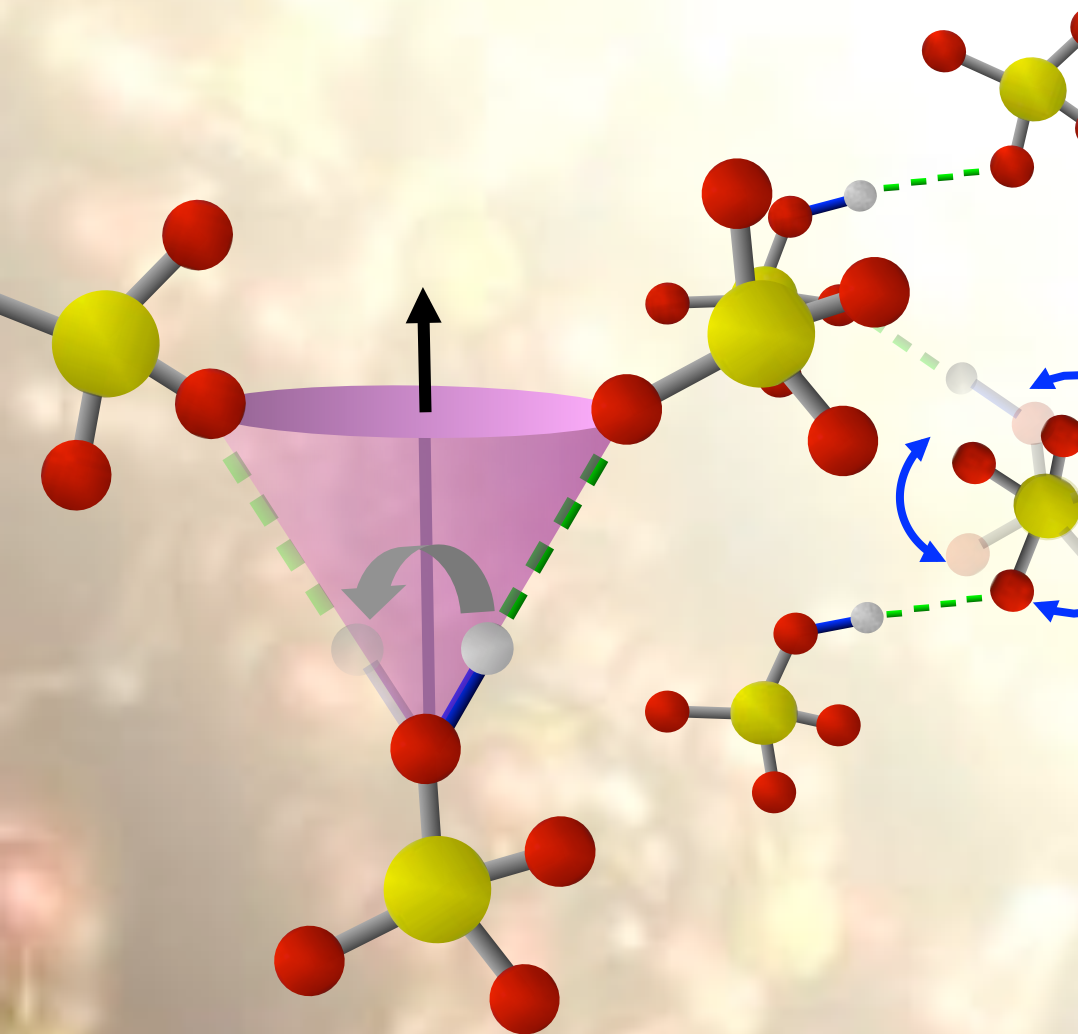
- *Frequent (every 1.1 – 1.7 p*
- *High (85%) reversal rate*



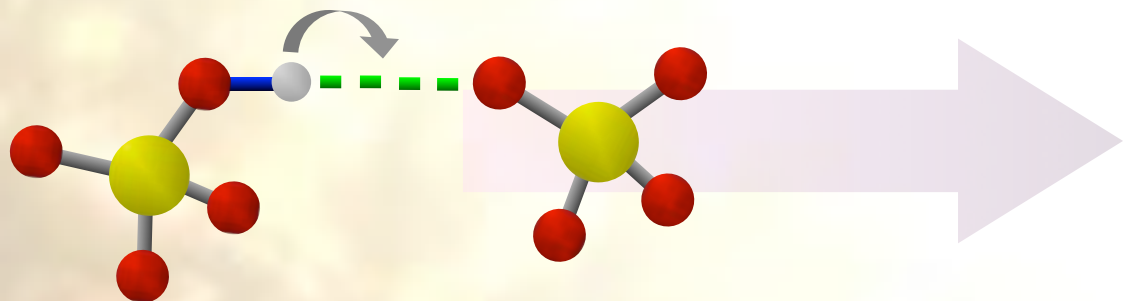


*frequent (every 0.25 – 1.0 ps!)*

*40% reversal rate*



Chemical-bond dynamics



*Proposed*

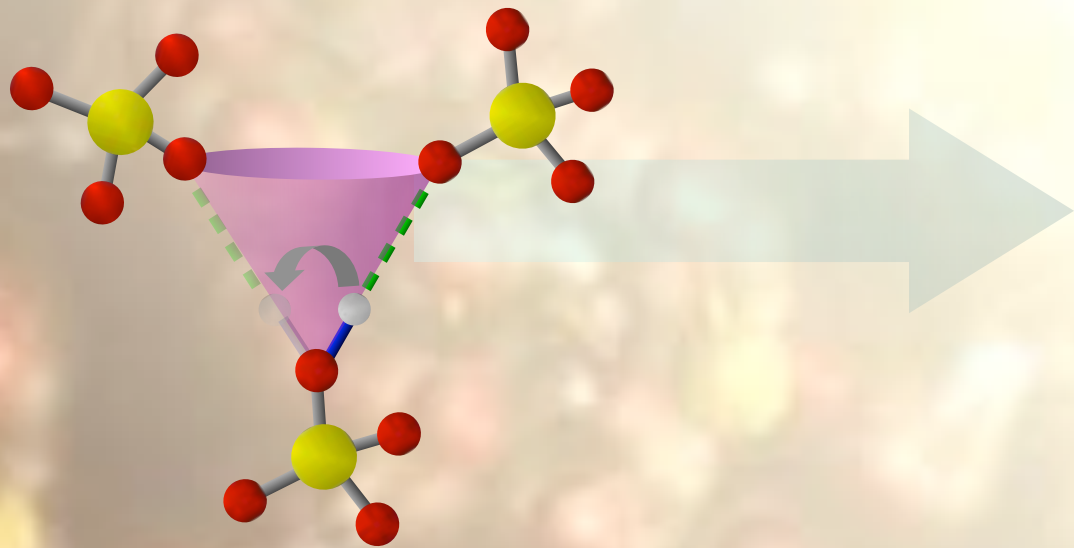
$$10^9 \text{ s}^{-1}$$

*This work*

$$10^{12} \text{ s}^{-1}$$

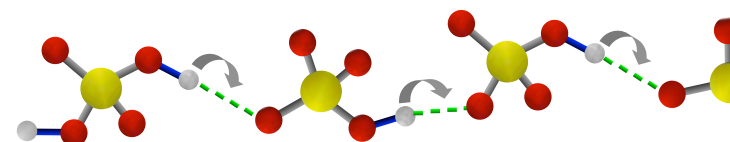
(limited by reversal  
to  $10^{11} \text{ s}^{-1}$ )\*

Hydrogen-bond dynamics



$$10^{11} \text{ s}^{-1}$$

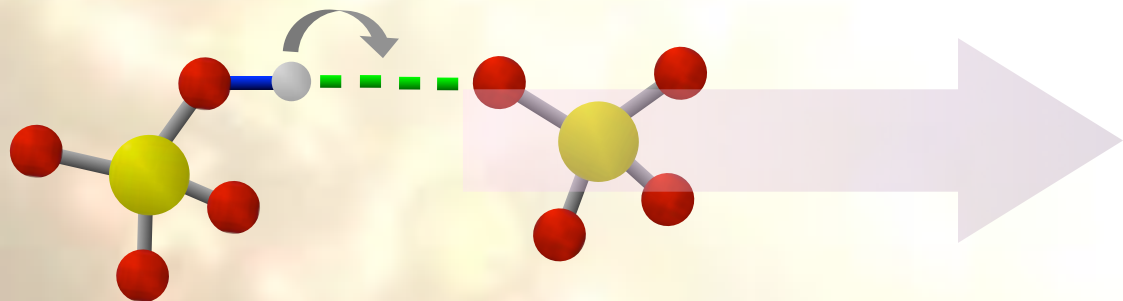
$$10^{12} \text{ s}^{-1}$$





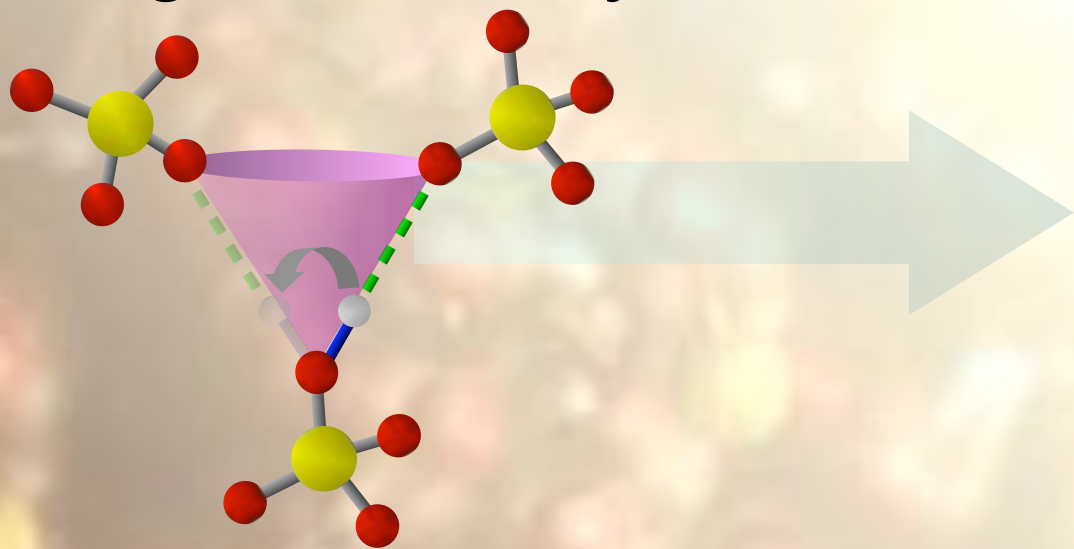
# *No significant CsHSO<sub>4</sub> / CsDSO<sub>4</sub> isotope effect*

Chemical-bond dynamics



SO<sub>4</sub> controls attempt frequency

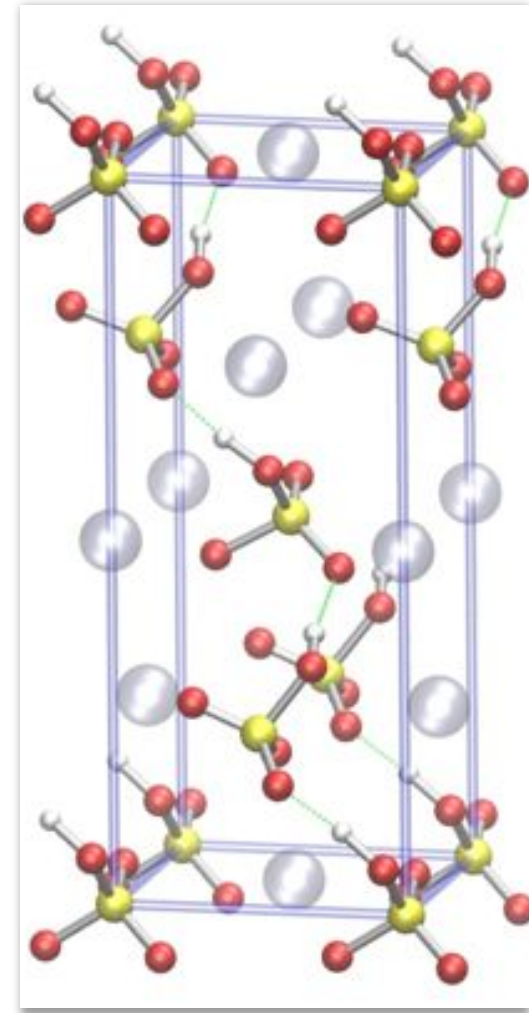
Hydrogen-bond dynamics

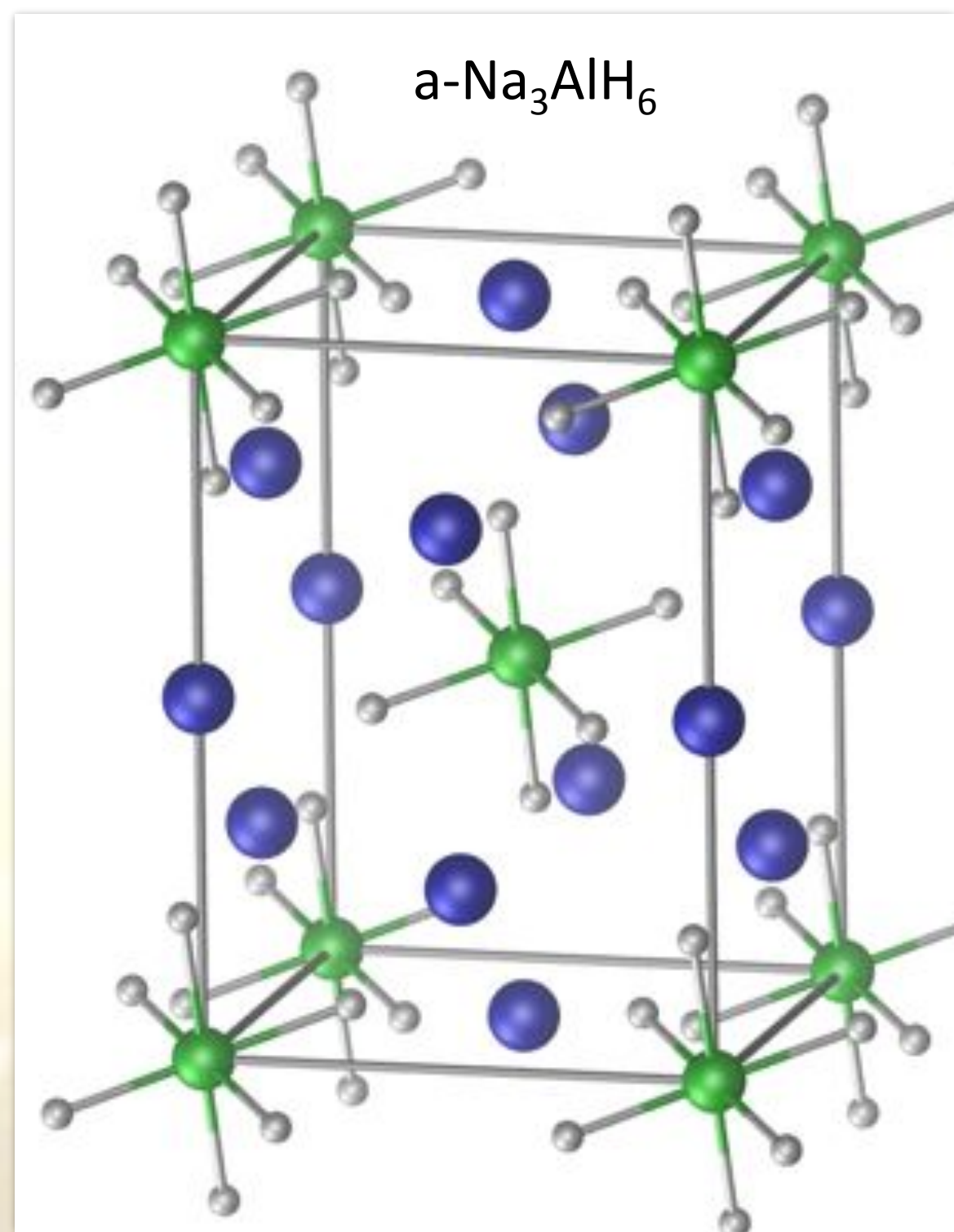
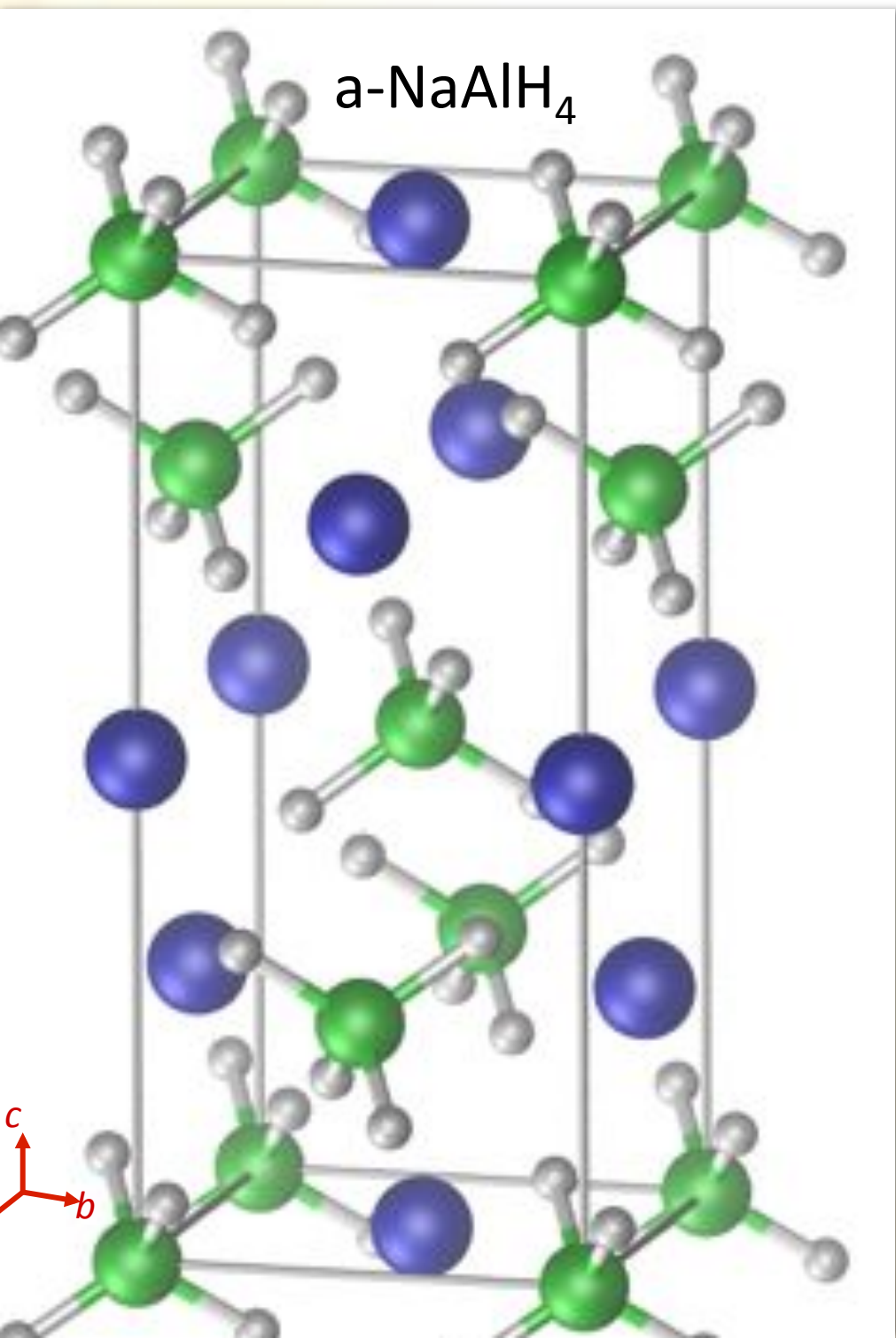


SO<sub>4</sub> controls reversal rate

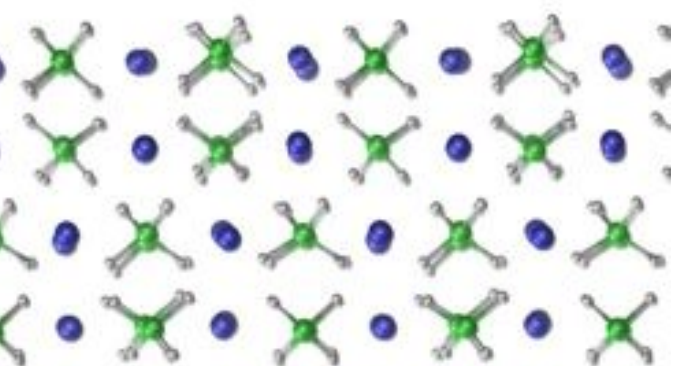
sHSO<sub>4</sub>:

- ✓ New picture of hydrogen bond dynamics
- ✓ SO<sub>4</sub> rotation controls attempt frequency of chemical bond dynamics and reversal rate of hydrogen bond dynamics
- ✓ SO<sub>4</sub> rotation (not chemical bond dynamics!) is rate limiting
- ✓ Topological analysis shows chains increase jump likelihood

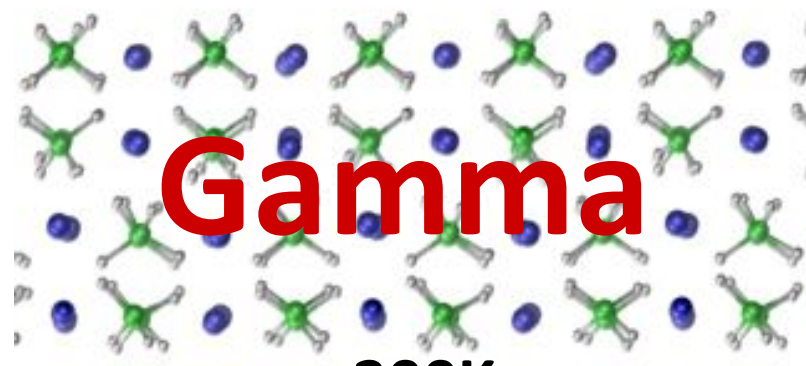






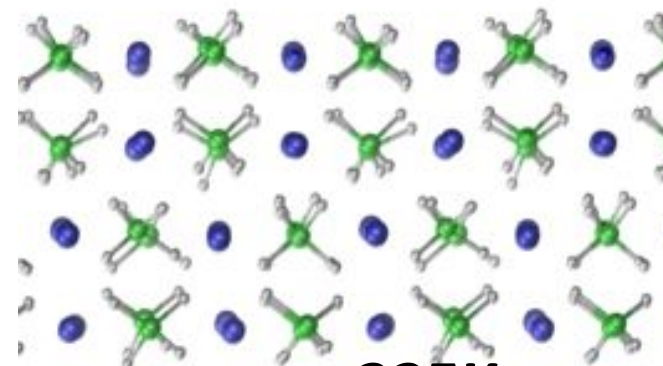


150K

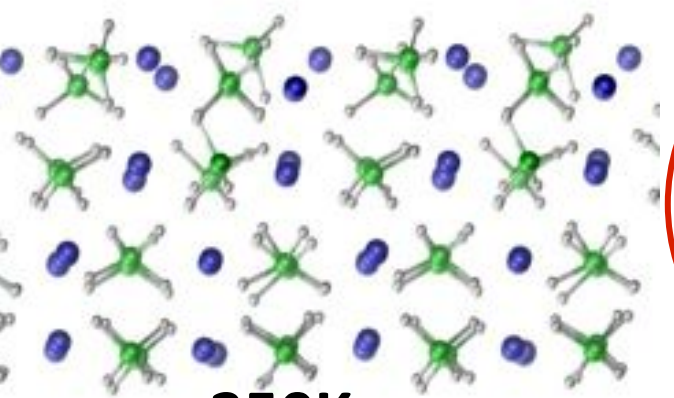


Gamma

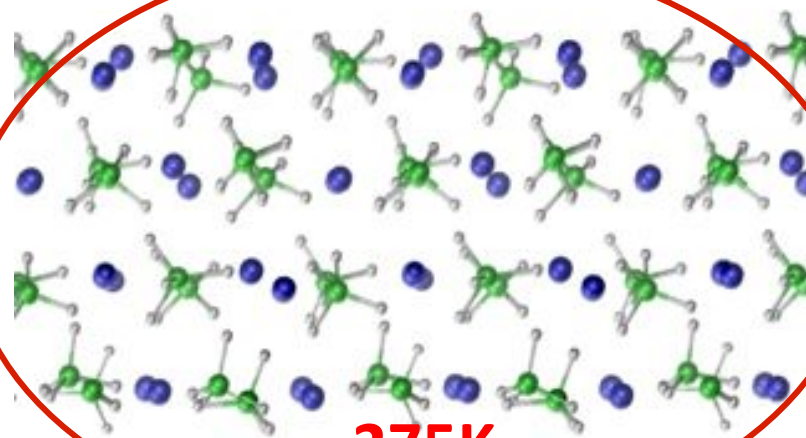
200K



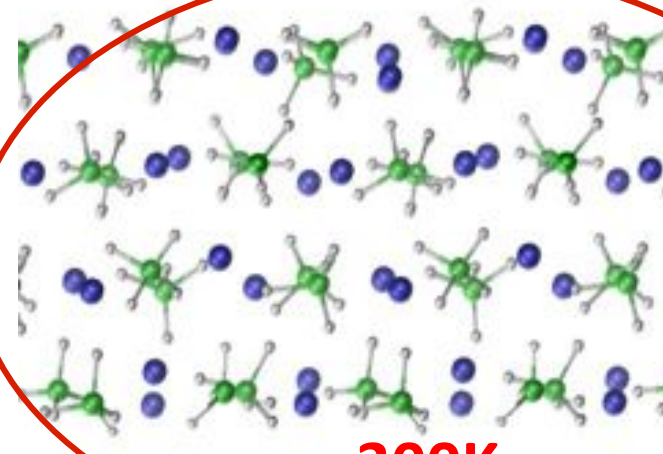
225K



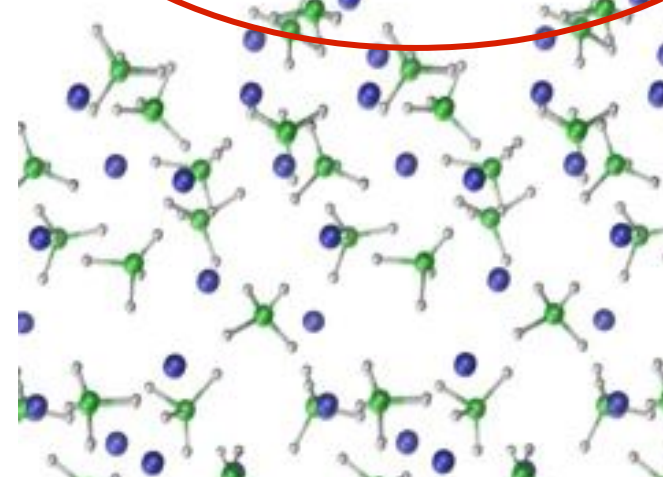
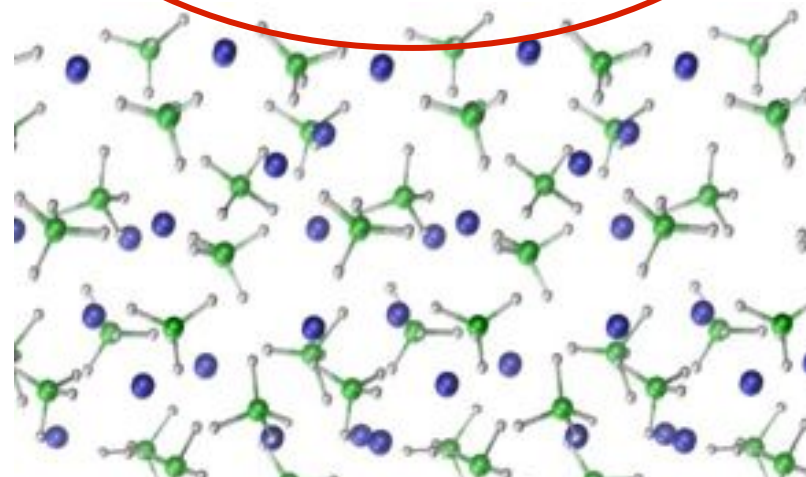
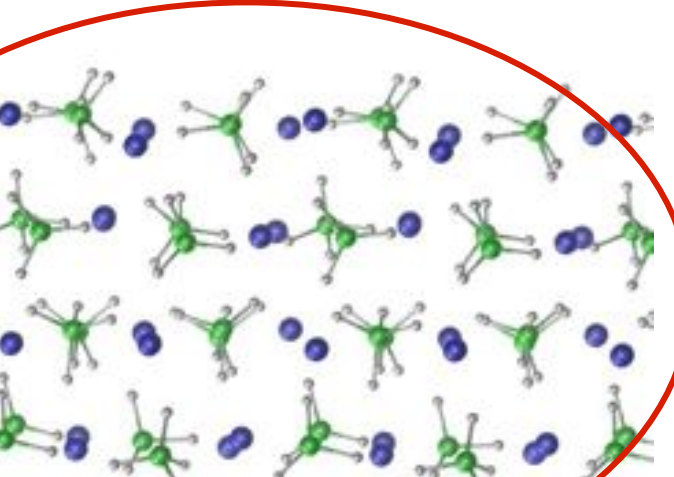
250K

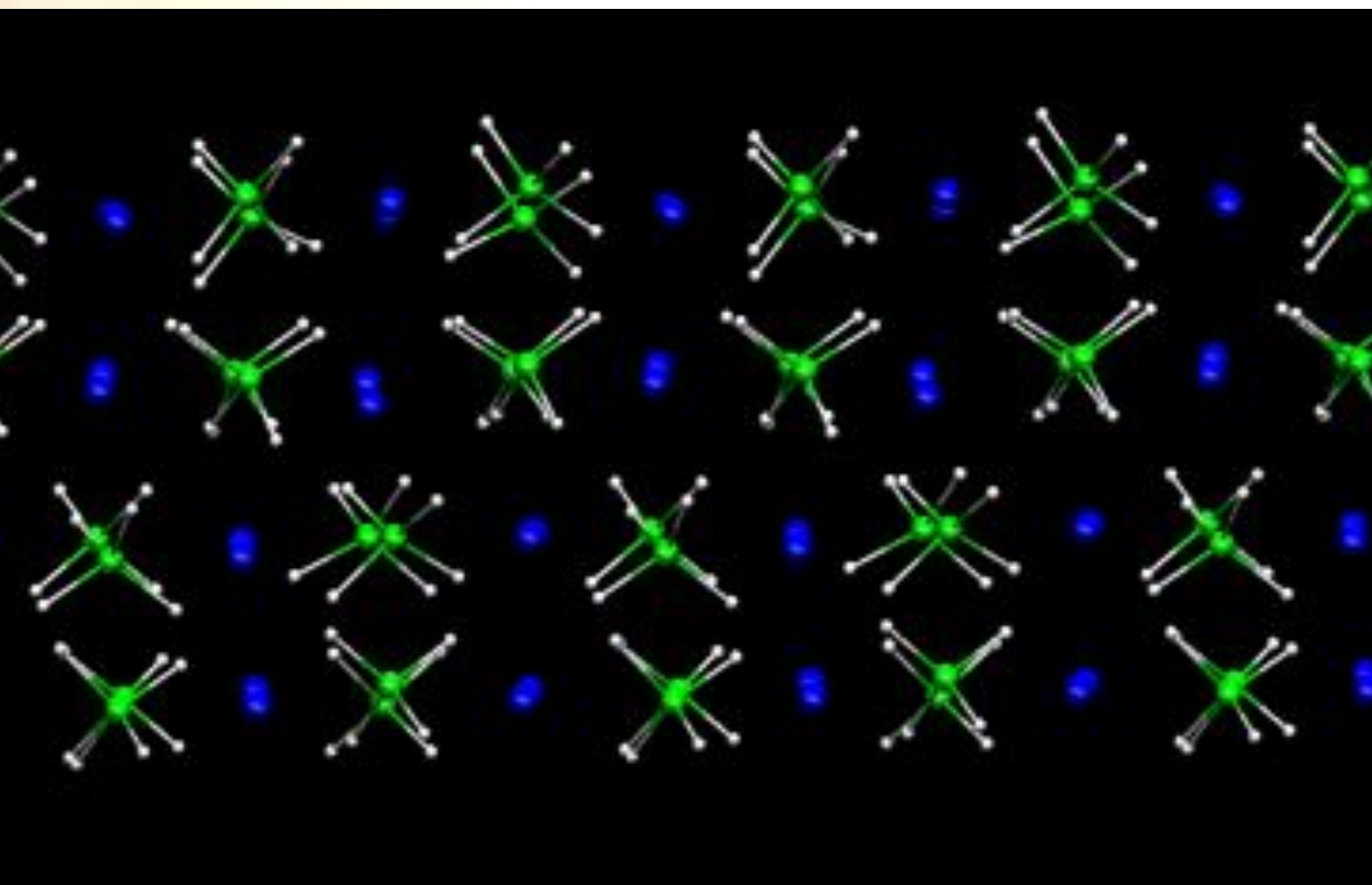


275K



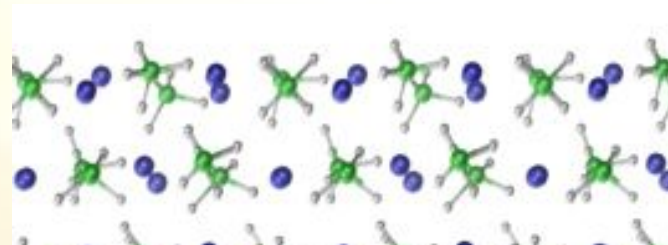
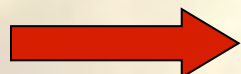
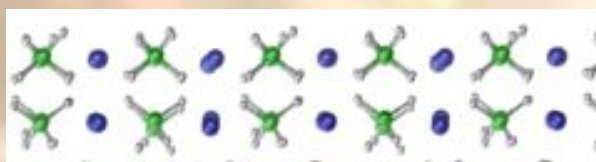
300K



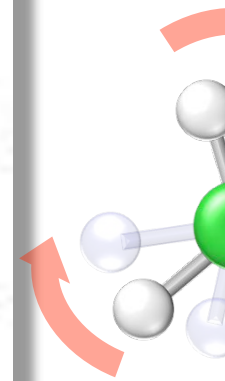
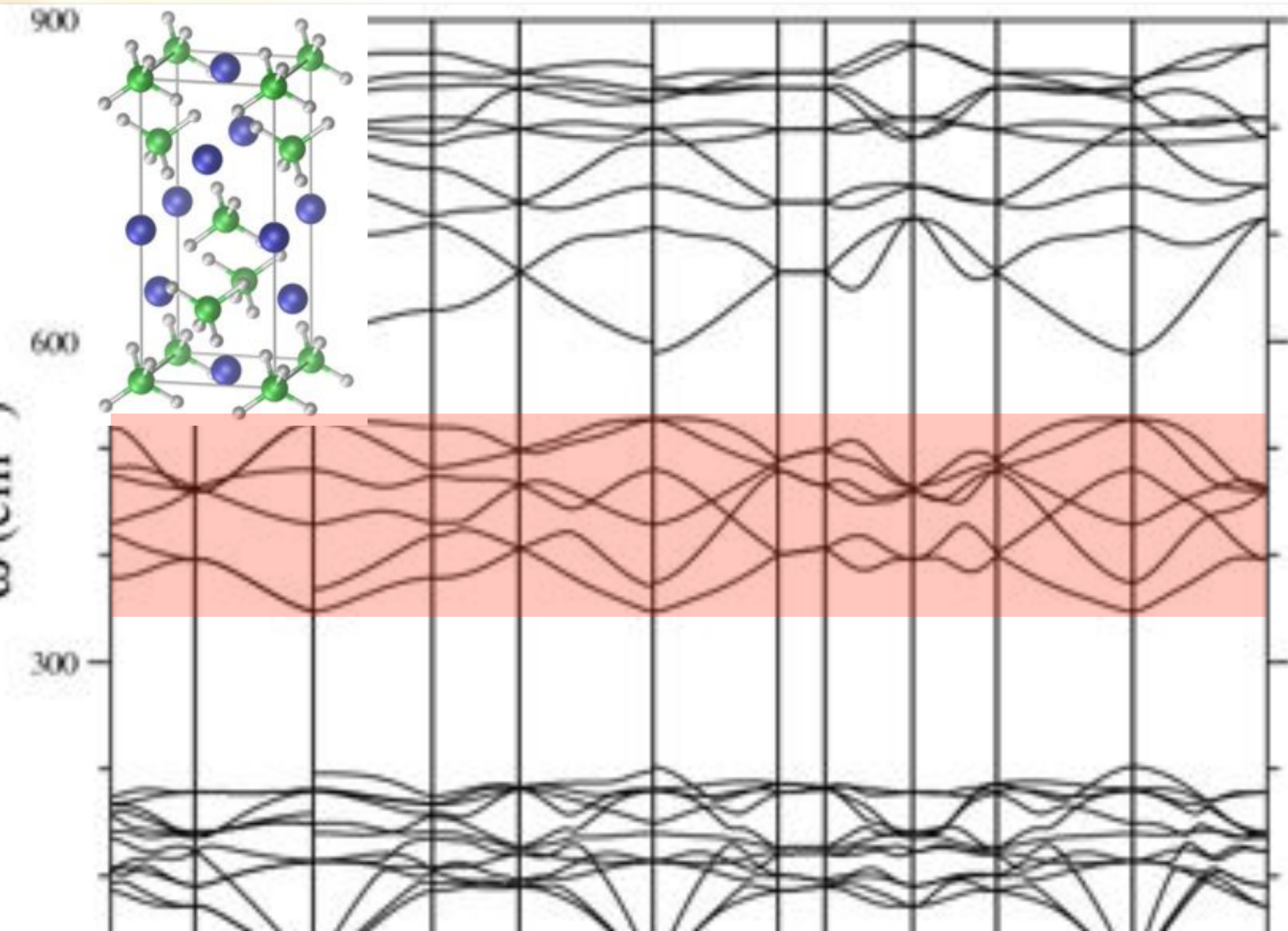


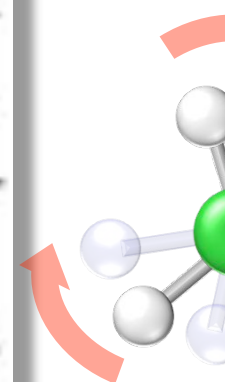
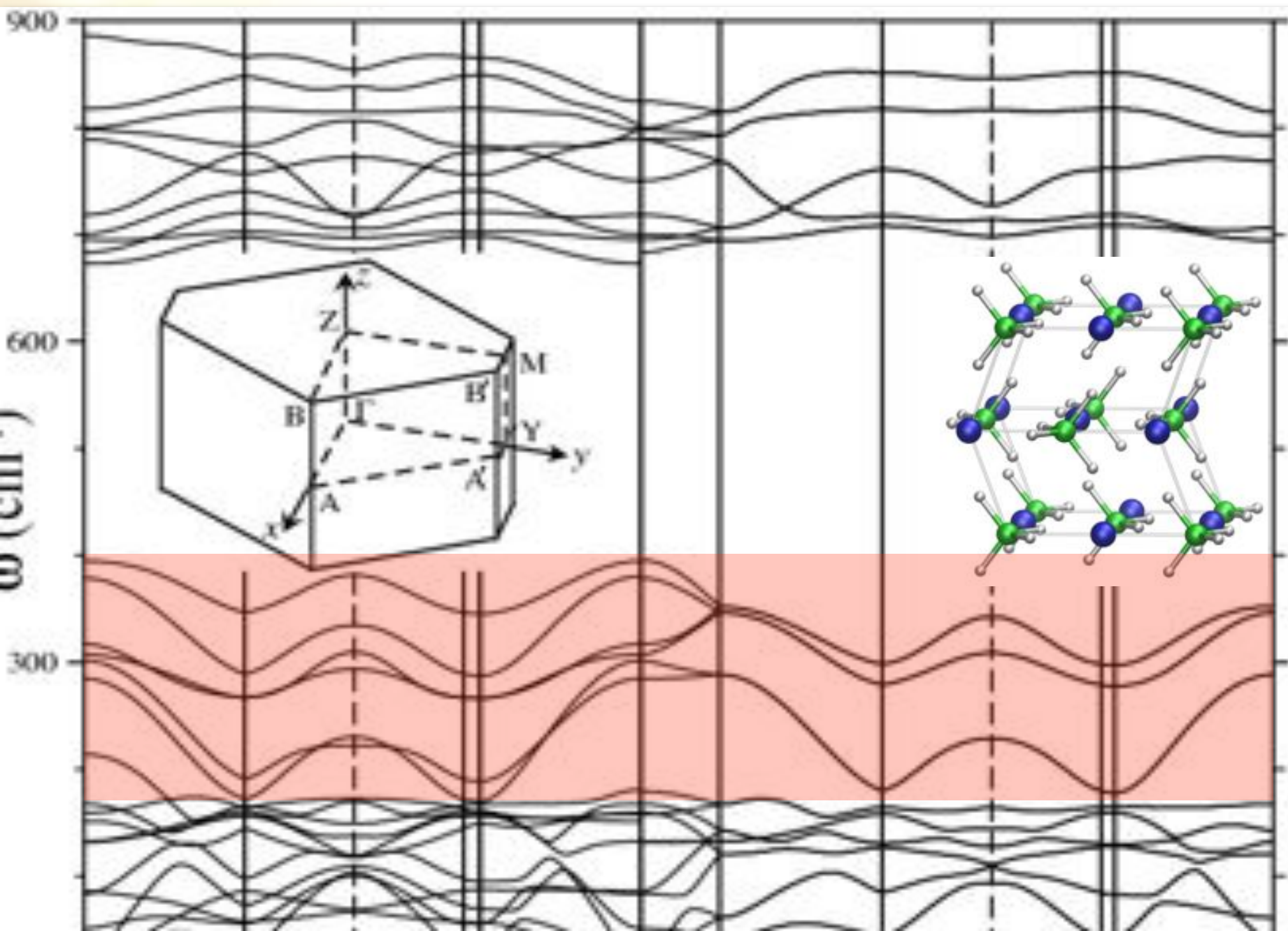
1. Rotation of AlH<sub>4</sub> tetrahedra at surface
2. Expansion along lattice parameter
3. Shear of surface planes

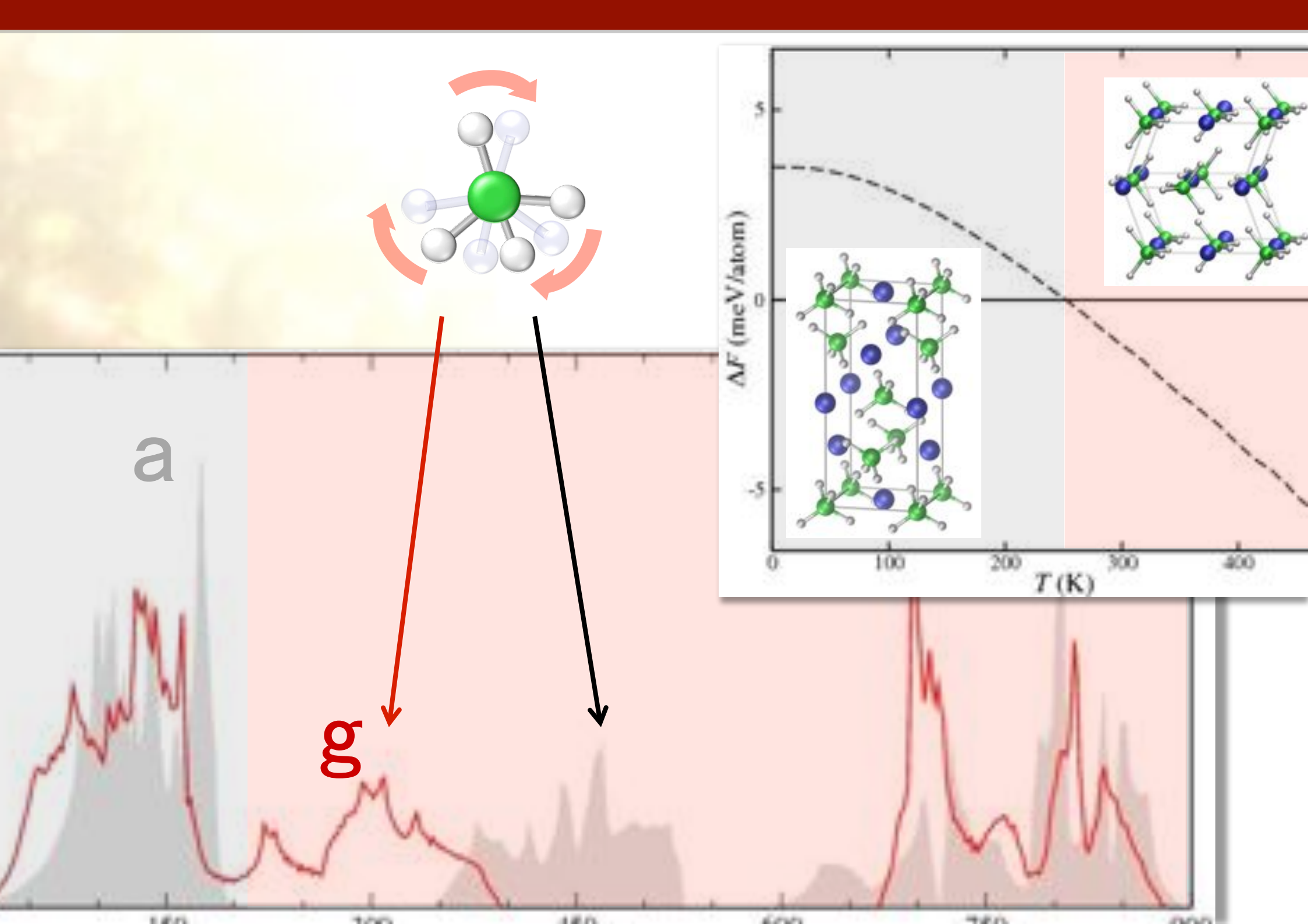
← (001) Surface slab @ 275K



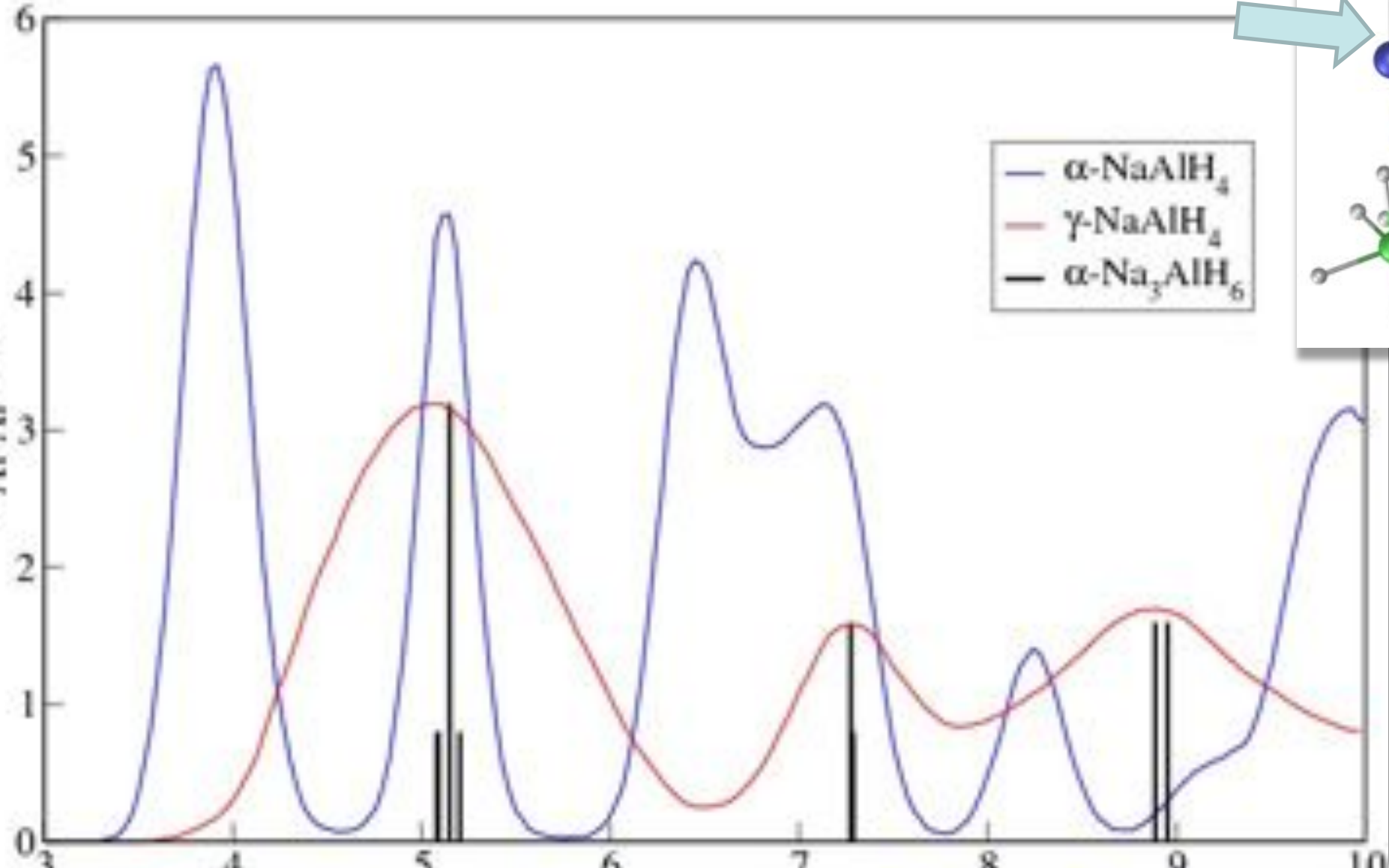
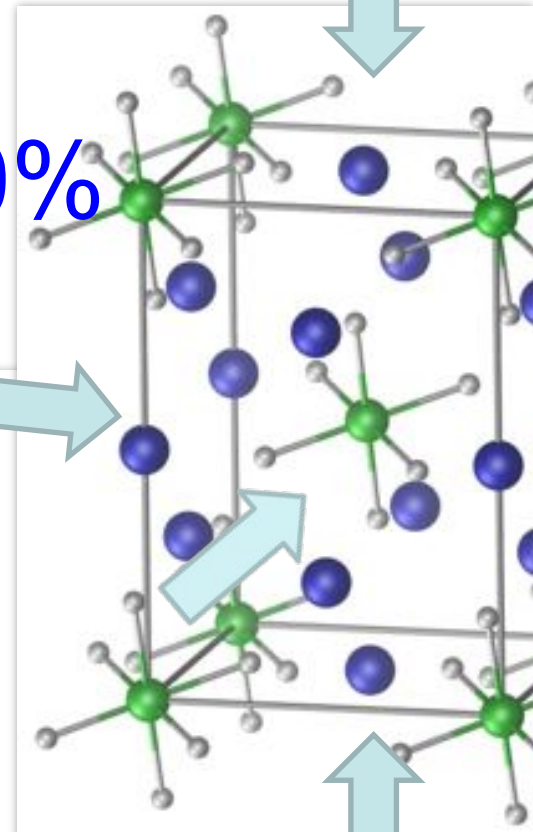
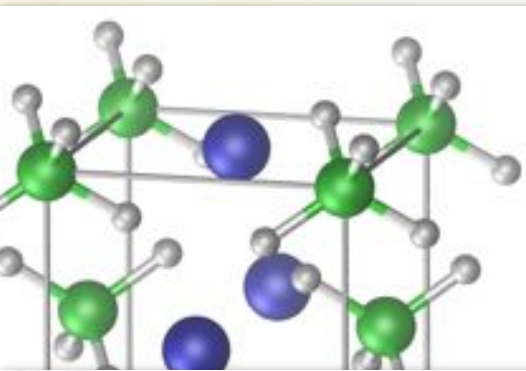








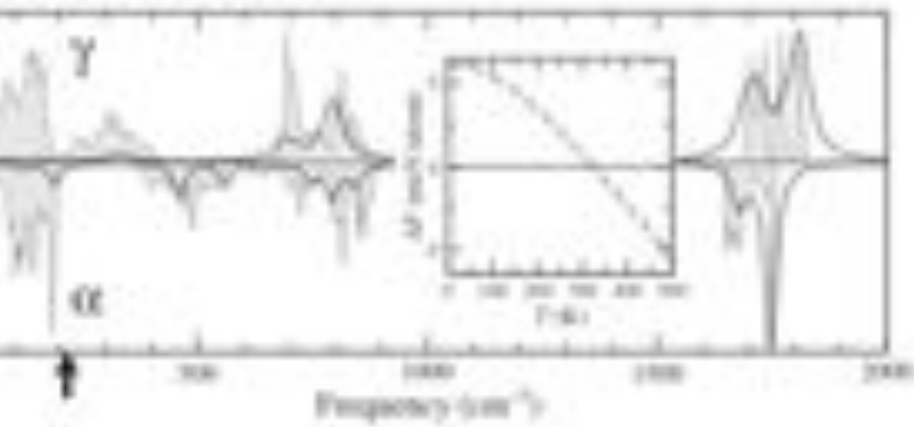




$\alpha$ - $\text{Na}_3\text{AlH}_6$

103, 185901 (2009)

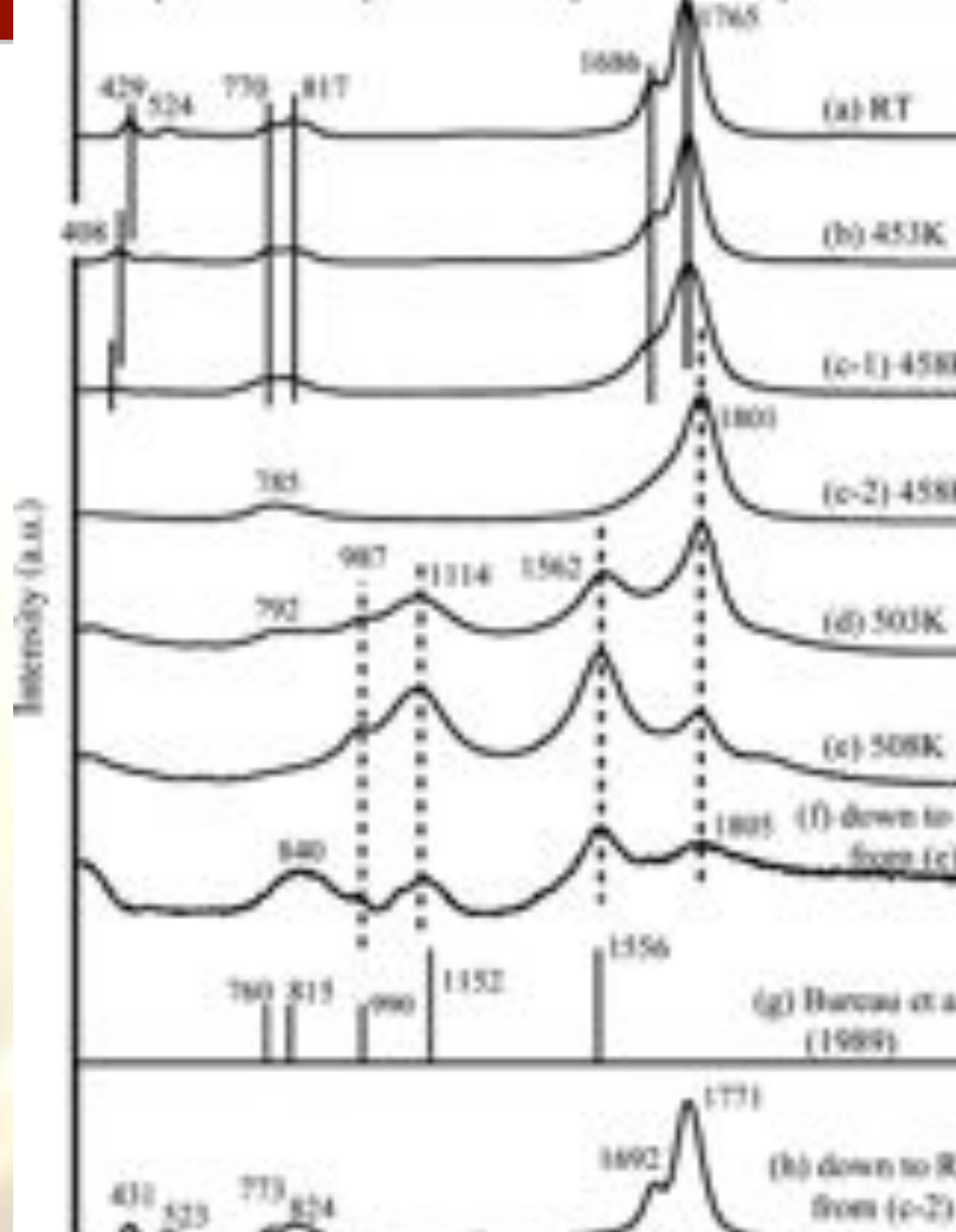
PHYSICAL REVIEW



*Yukawa et al., J. Alloys Comp.*  
**46&447, 242 (2007):**

- Stable at room T
- Intact AlH<sub>4</sub> units with little constraint from lattice
- Appearance of new vibrational peak at 1800 cm<sup>-1</sup>

*Anton, J. Alloys Comp.* **356&357, 400 (2003):**





# Conclusions

- First-principles electrochemistry is a novel challenge for our field – we need to understand the accuracy of our predictions, but especially to find novel ways to calculate experimentally relevant properties
- If we succeed, we can leverage the power of quantum simulations for characterization and design of novel materials/processes/devices.

Thank you for listening!

