

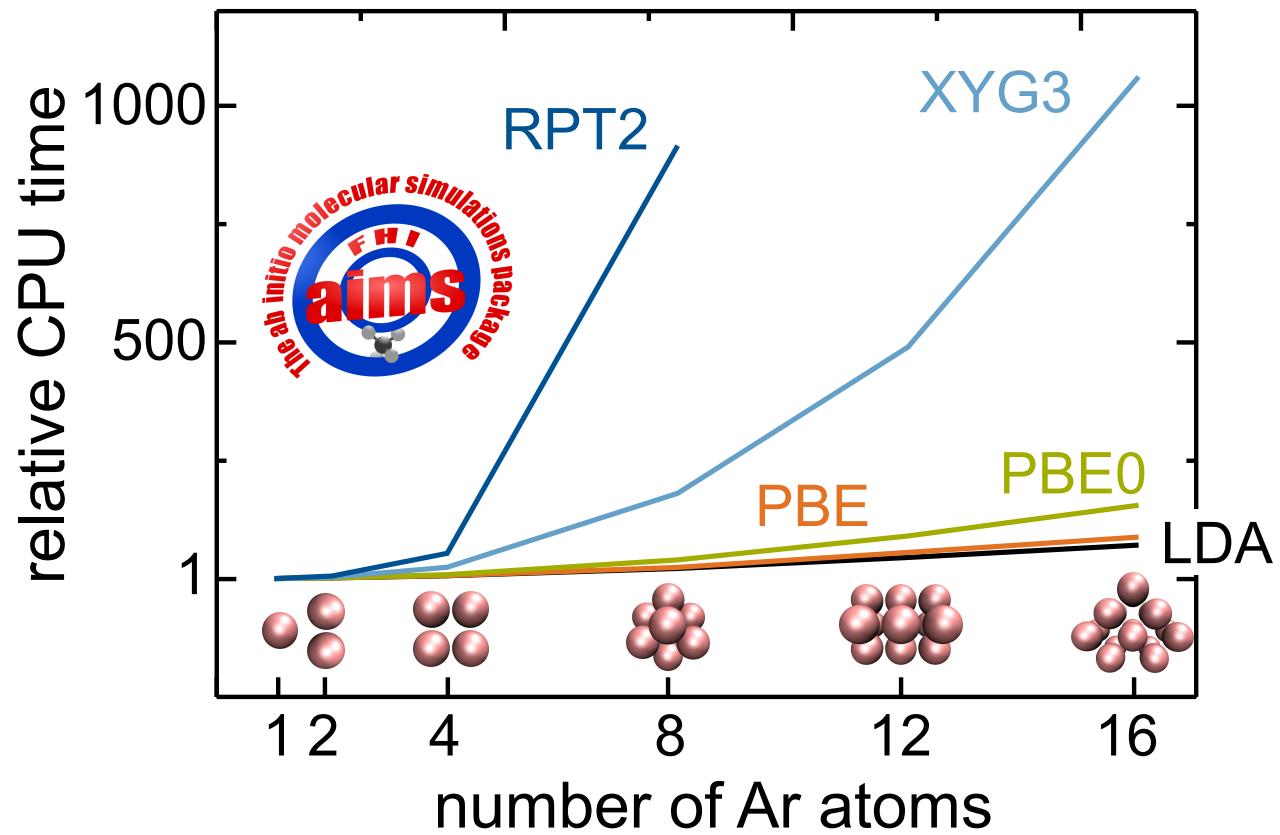
# Embedding Quantum Regions in Classical Environments

Harald Oberhofer

Chair for Theoretical Chemistry, TUM

# Why

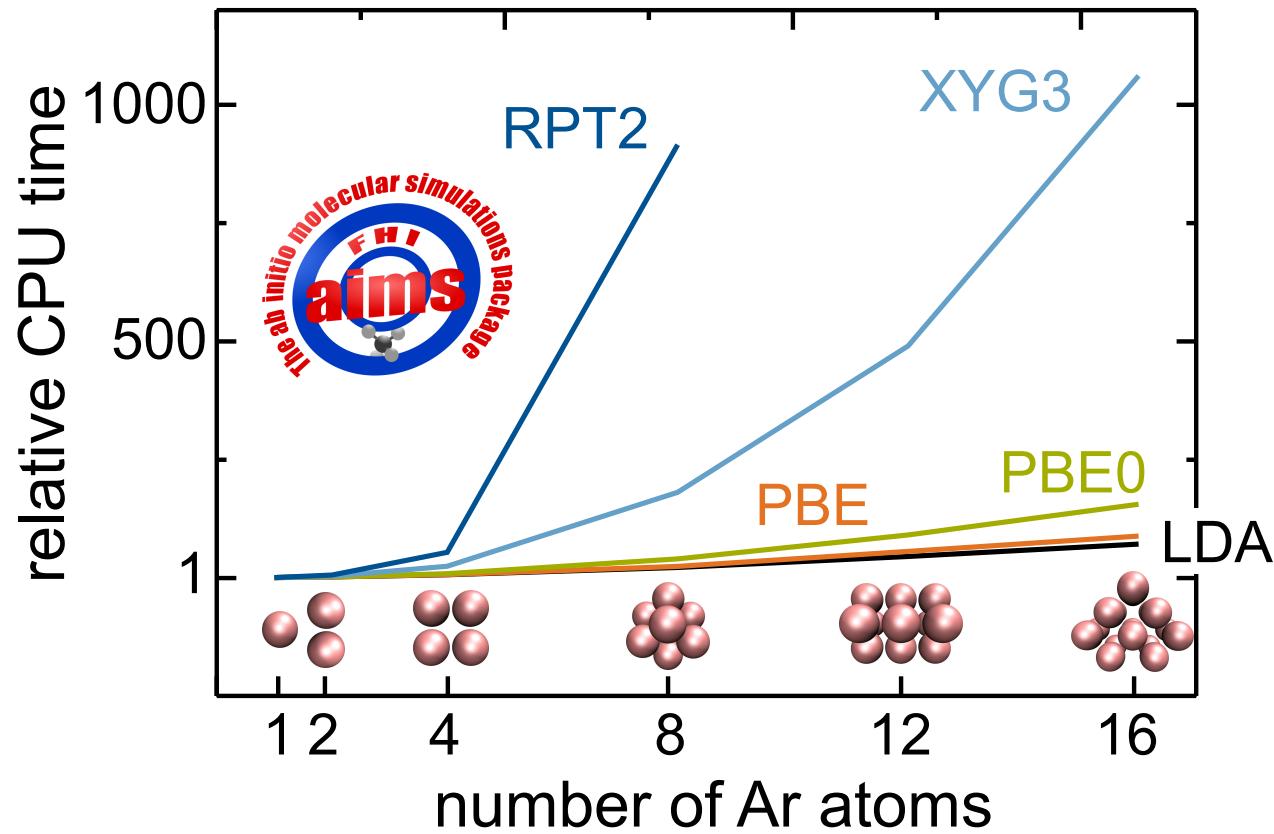
## scaling:



too expensive for large systems

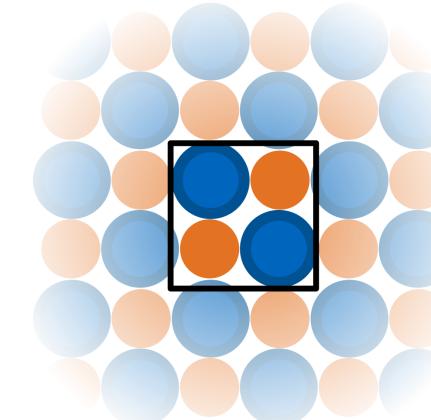
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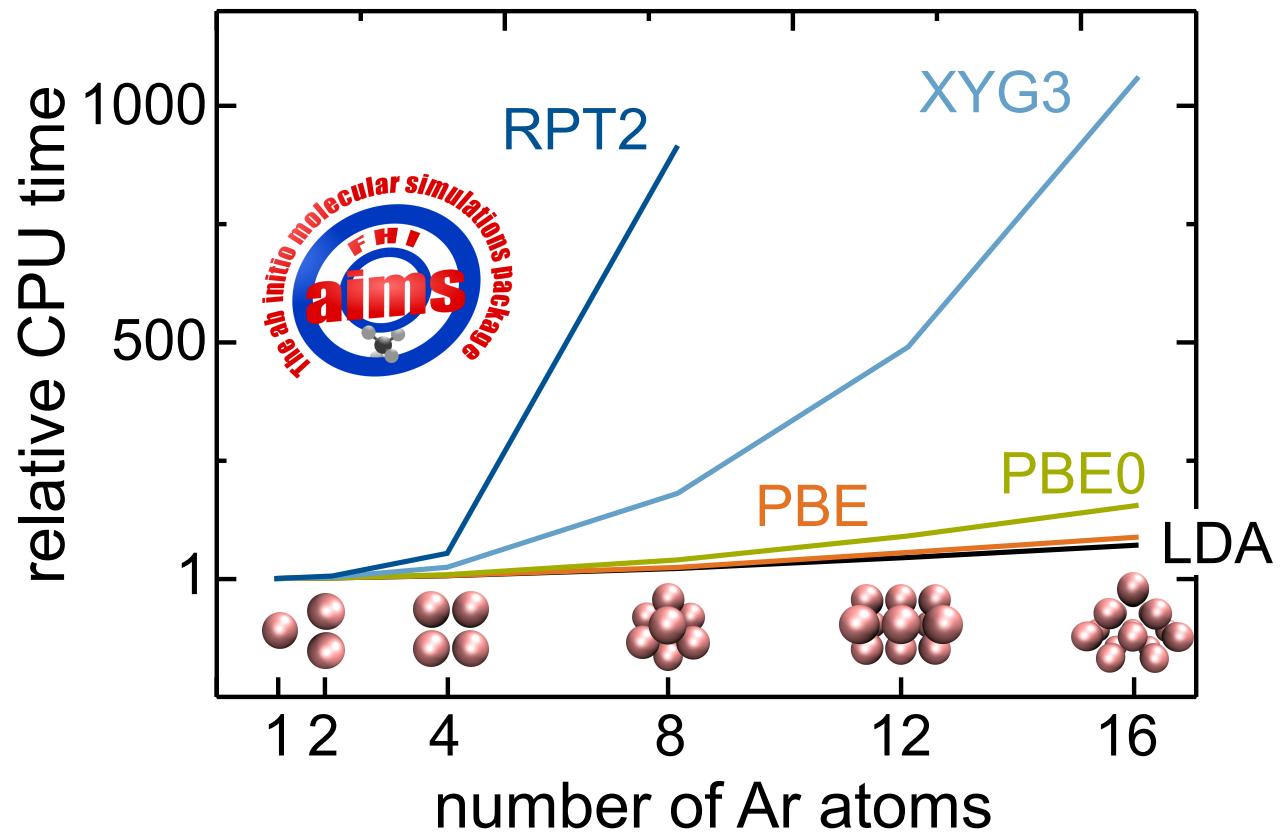
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charged systems:



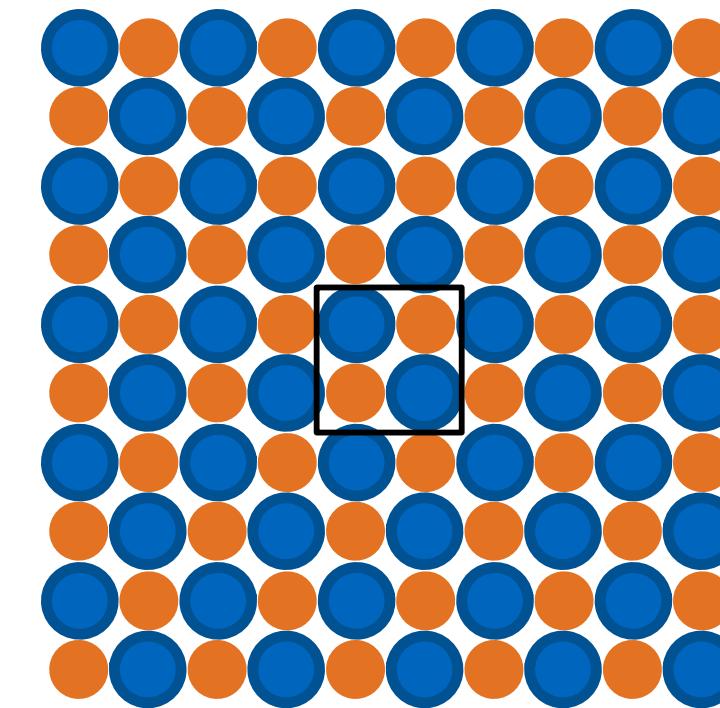
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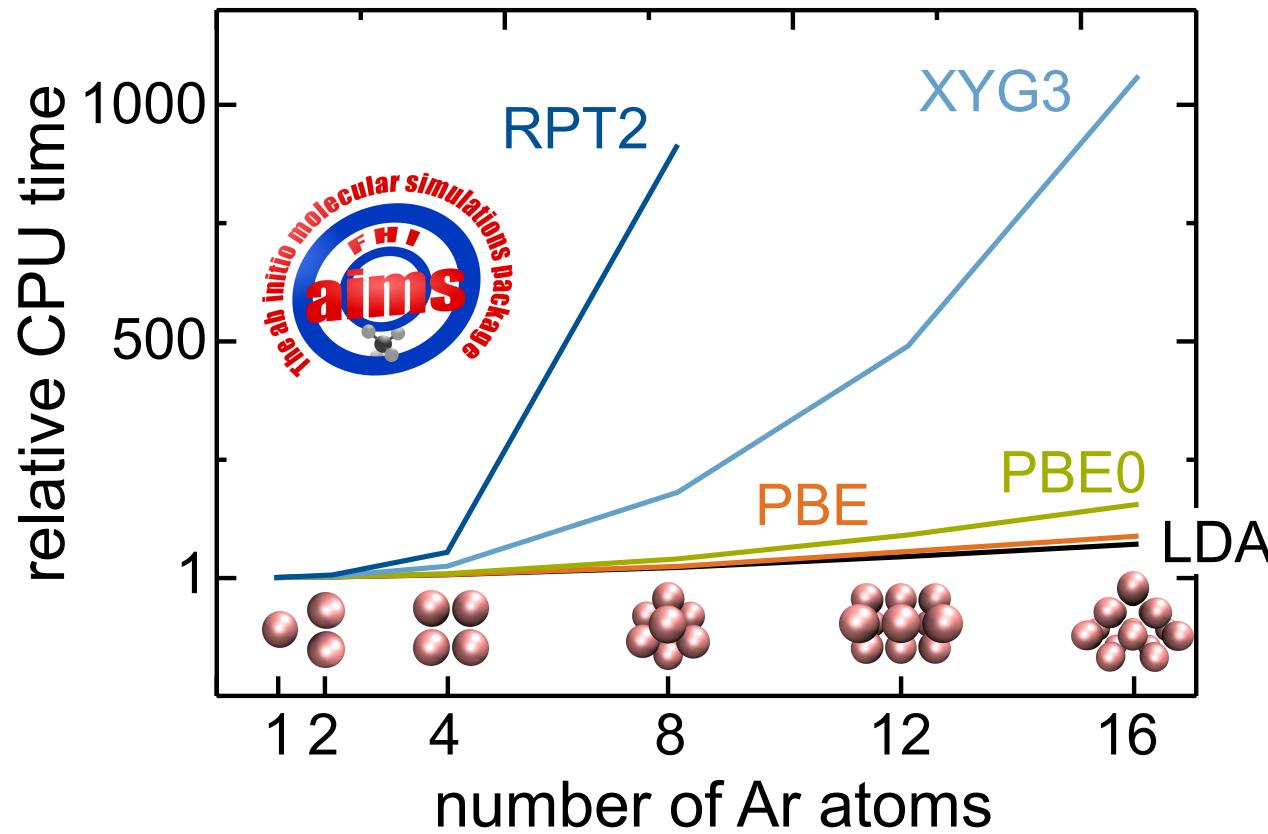
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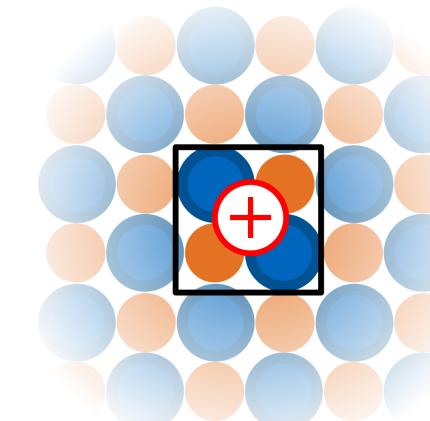
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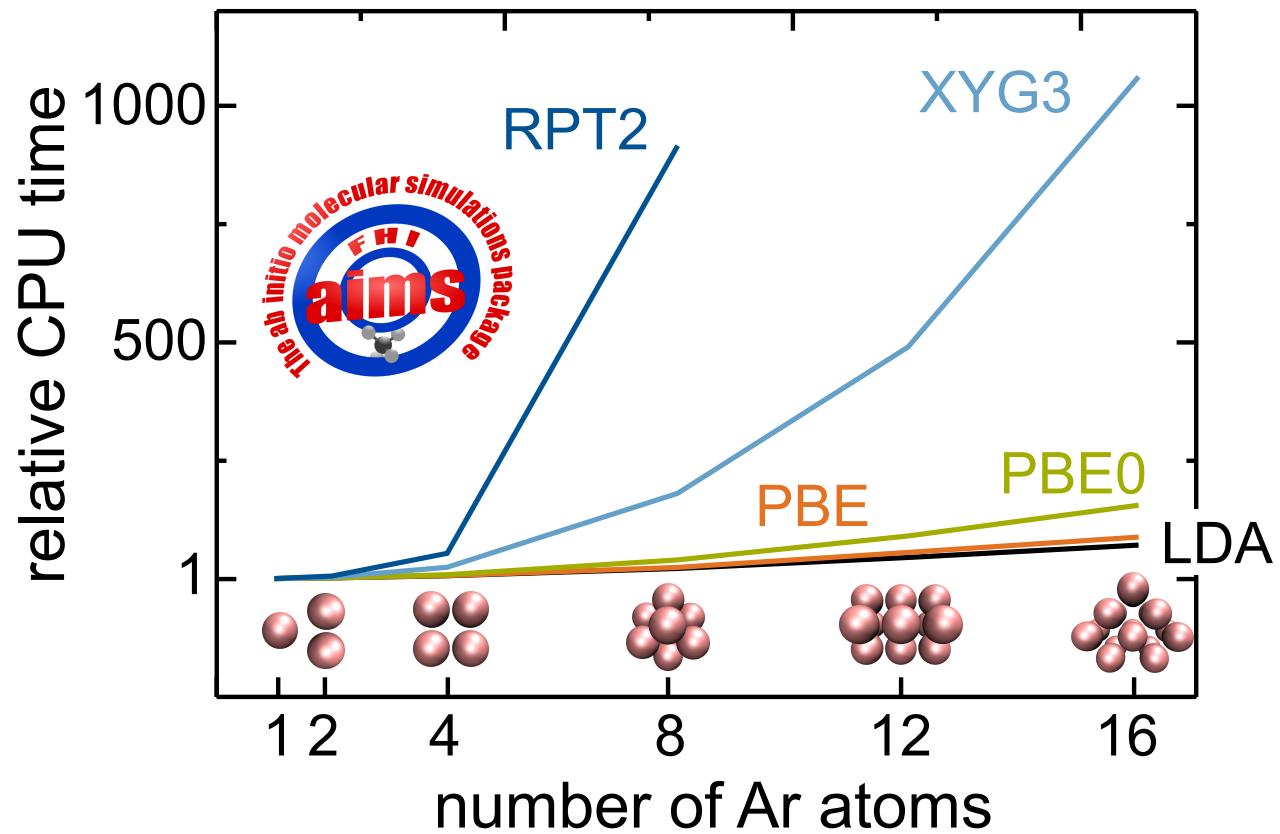
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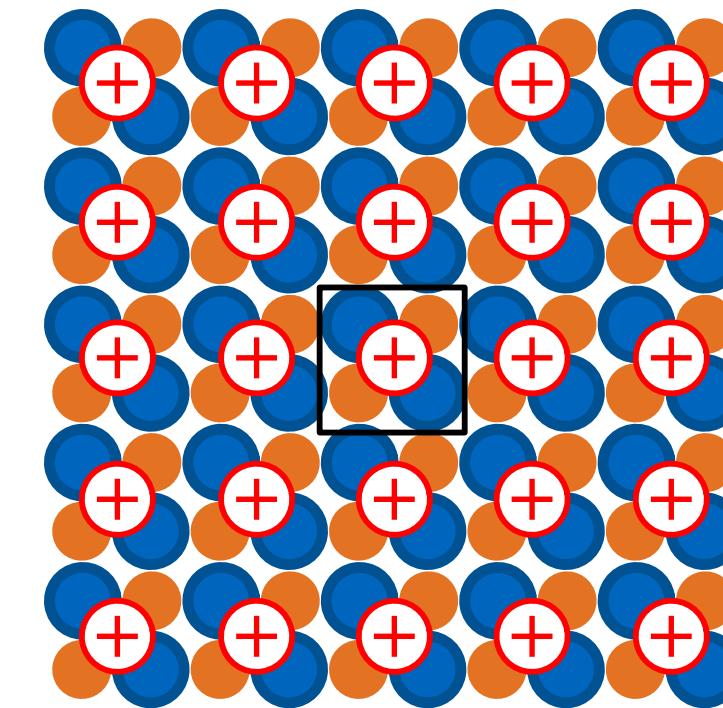
scaling:



too expensive for large systems

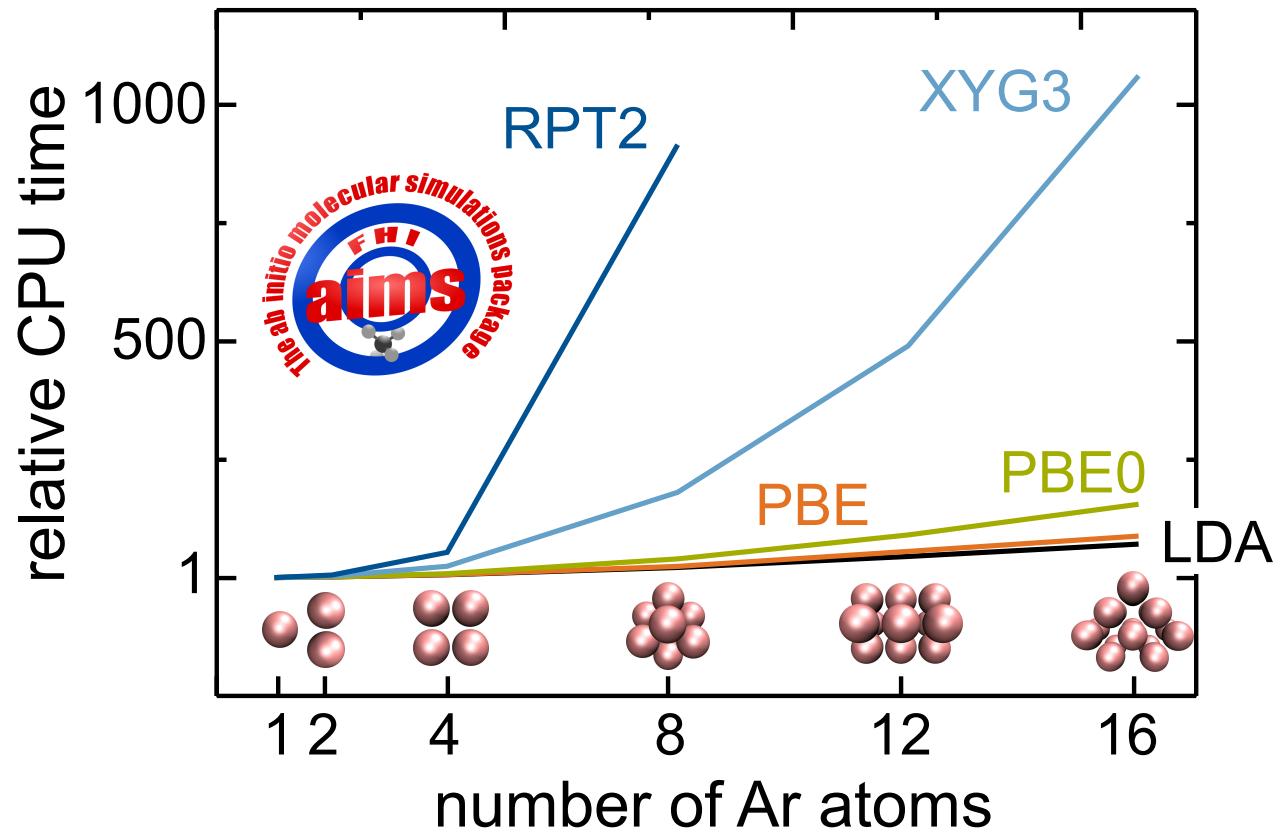
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charged systems:



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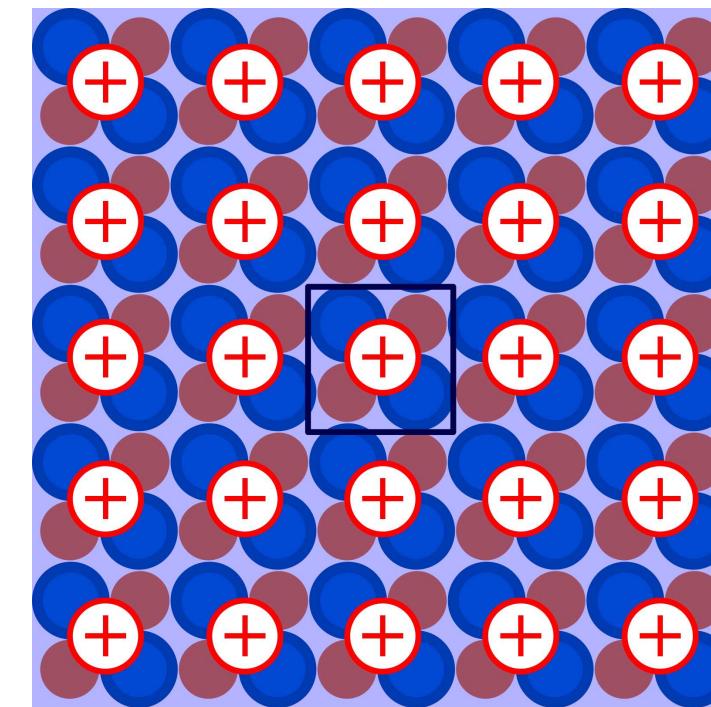
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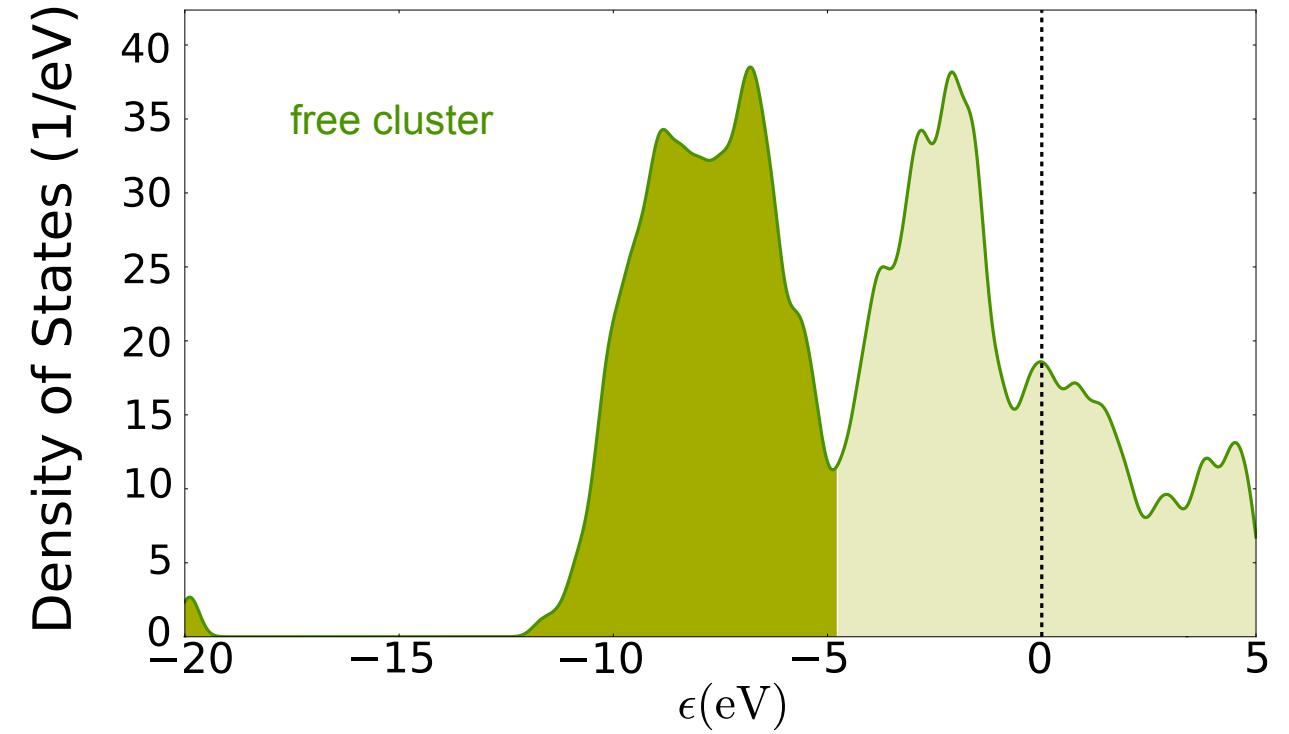
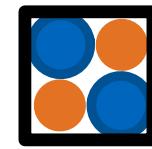


PBC charge correction  
⇒ finite size effects

# Levels of coarse graining

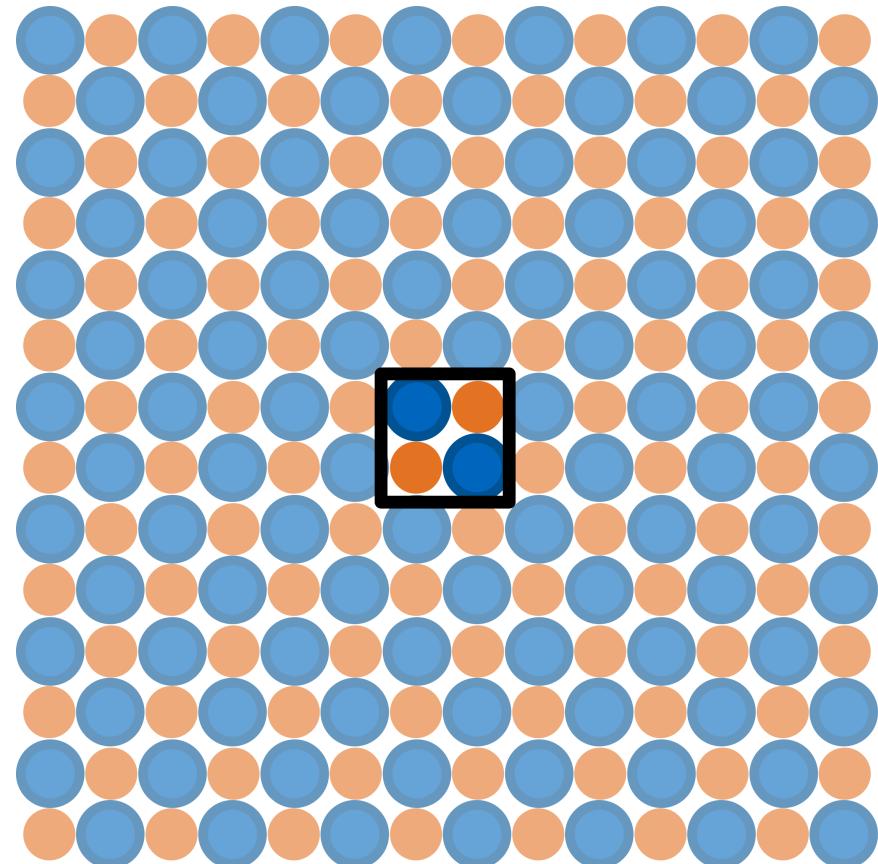


# Levels of coarse graining



Rutile  $\text{TiO}_2$  cluster w/o embedding  
no band-gap, wrong work function

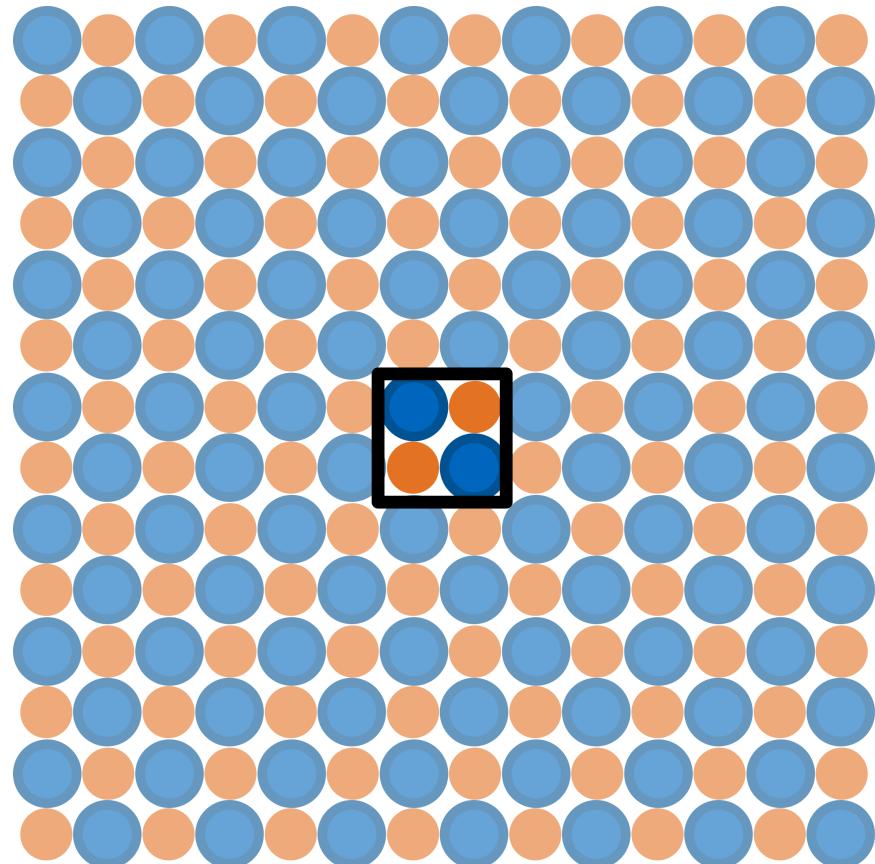
# Levels of coarse graining



**atomistic embedding**

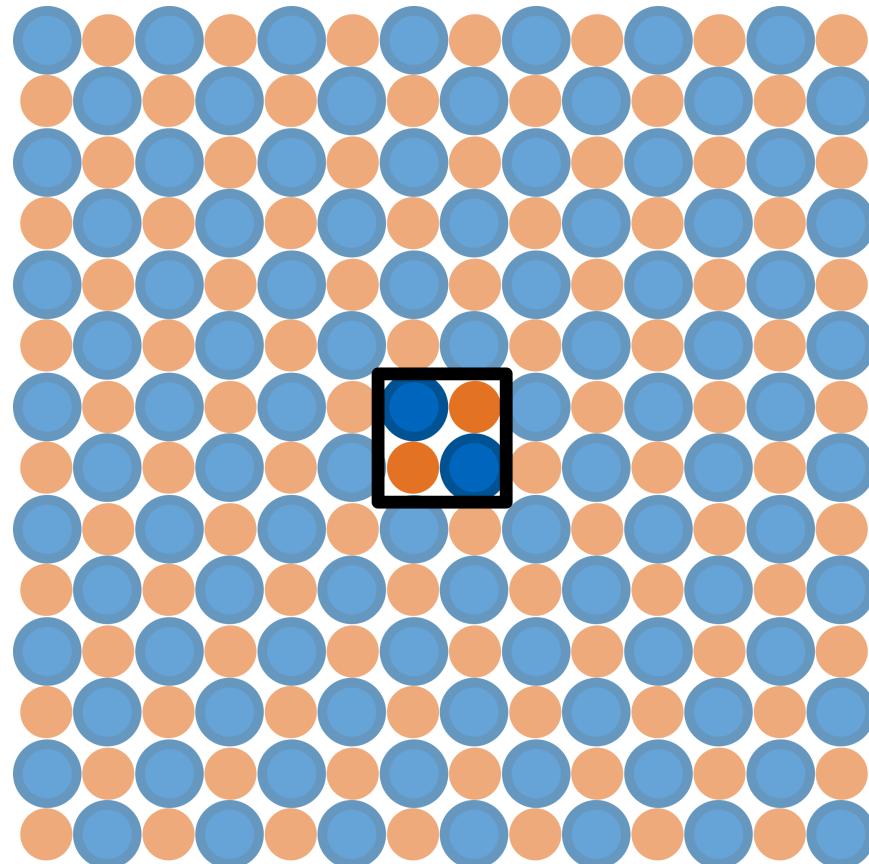
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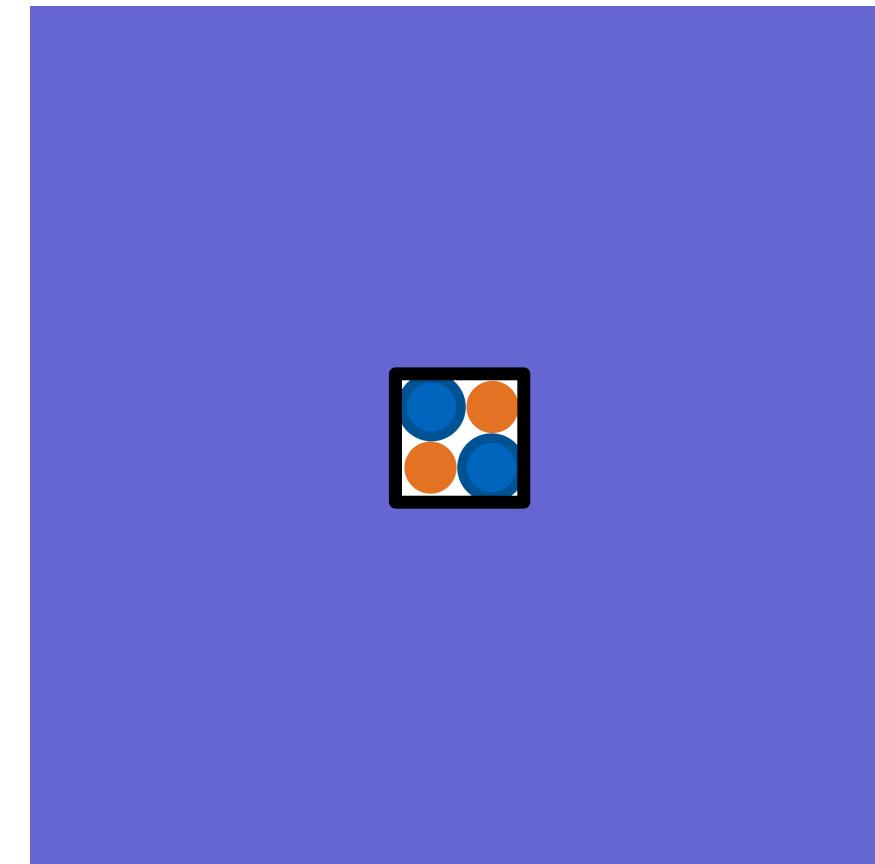
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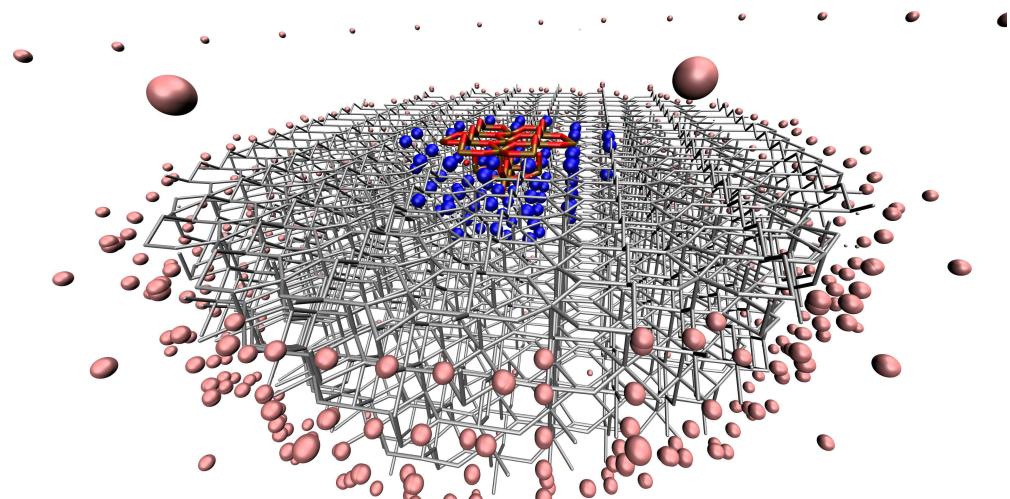
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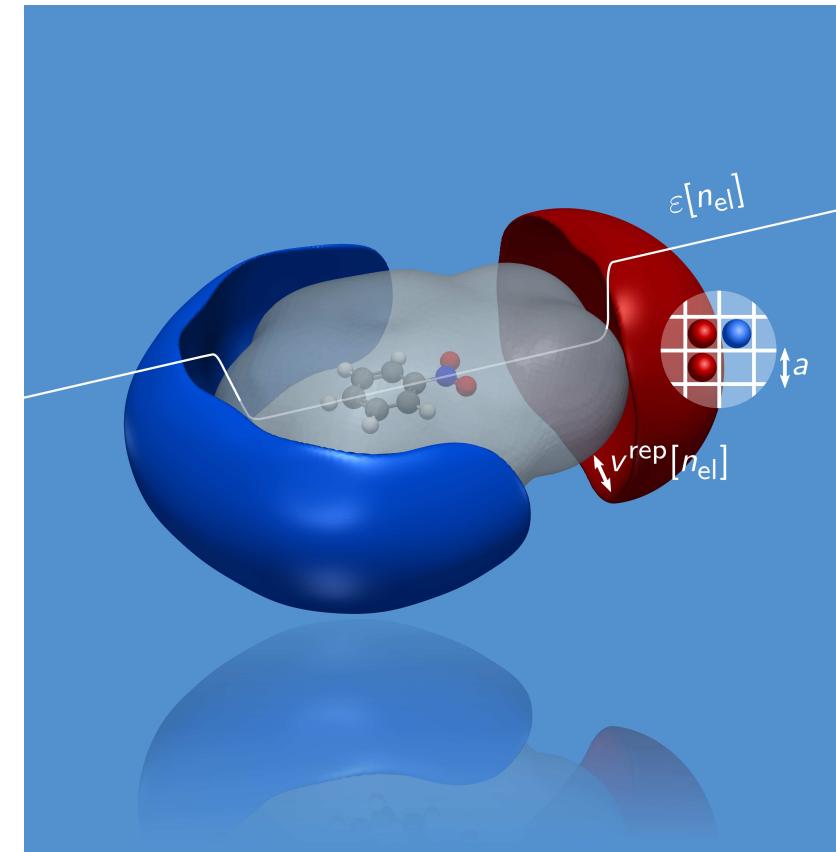
**continuum embedding**

# Levels of coarse graining



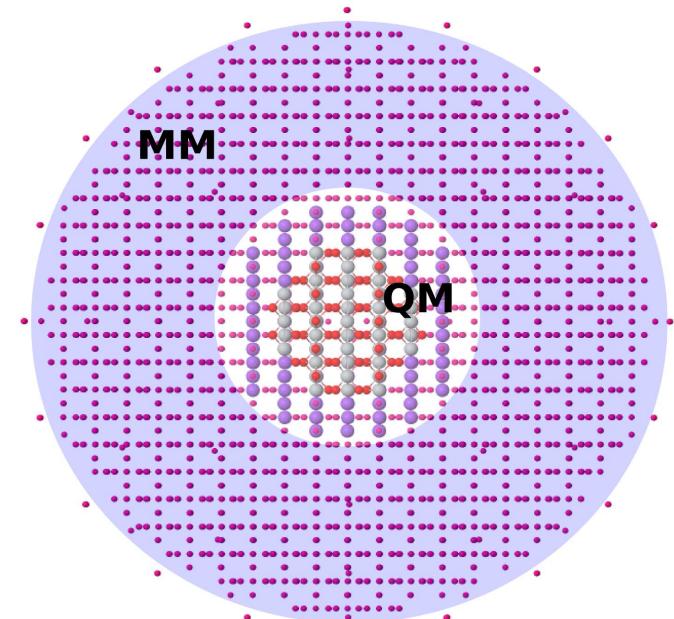
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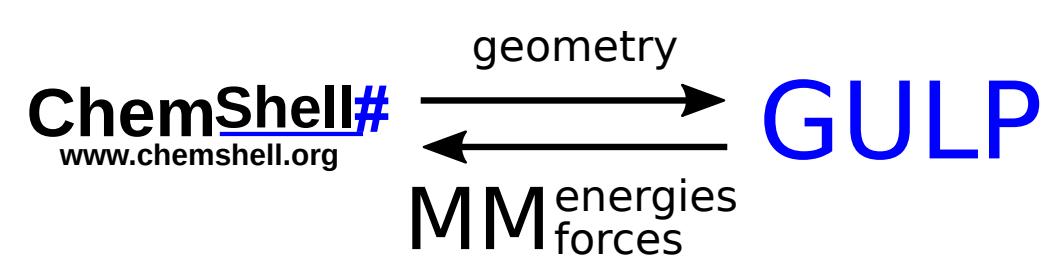
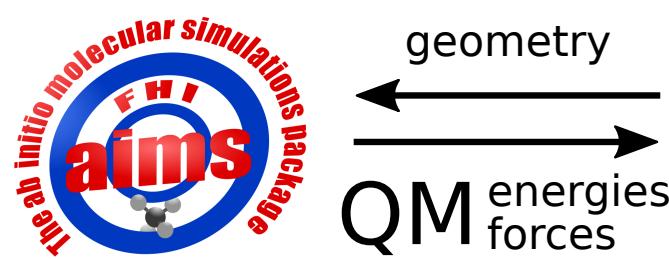


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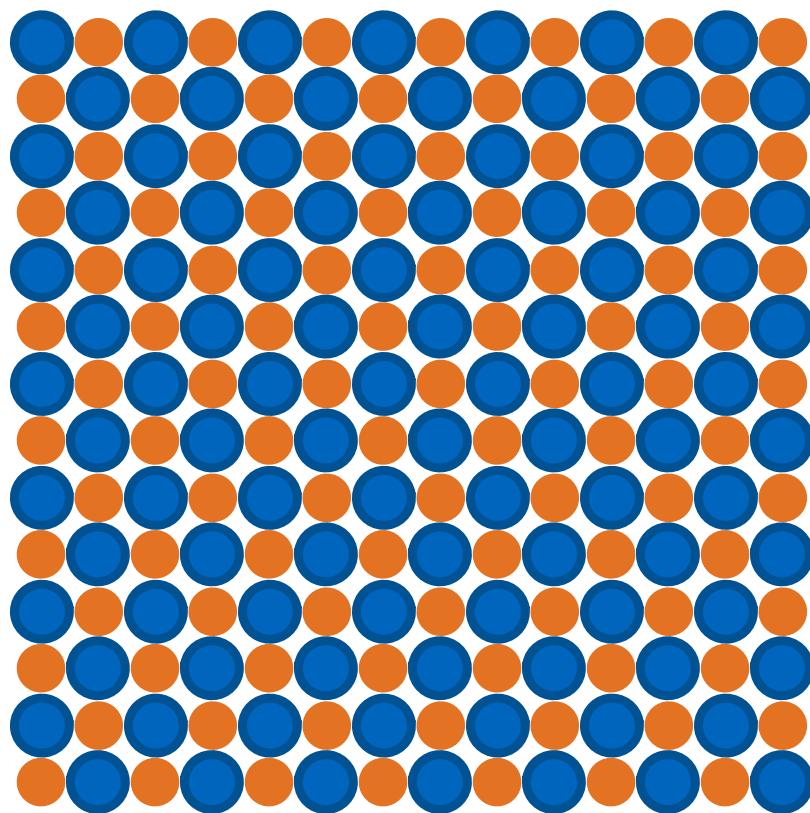
# Atomistic embedding (QM/MM)



**seamless coupling**  
between  
quantum mechanics (**QM**)  
and  
molecular mechanics (**MM**)



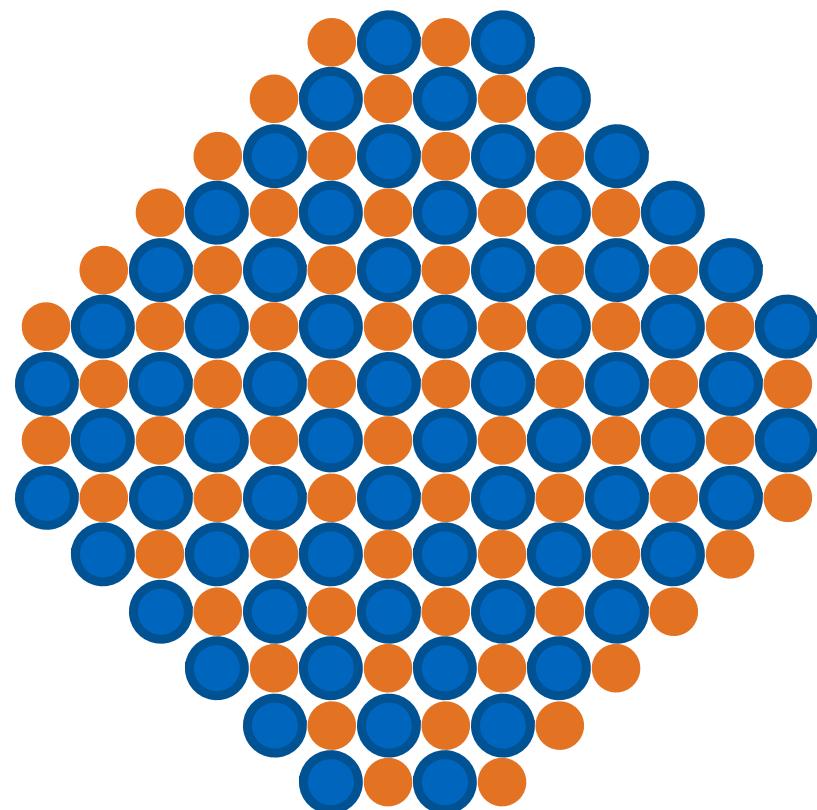
# Structure of a QM/MM simulation



**Example:** Crystal with **positive** and **negative** sites

- Cut large cluster
- Designate QM and MM atoms
- Positive sites near QM atoms ⇒ charge leakage
- Replace singularities with Pseudo-potentials  
⇒ transition region
- Still missing: Periodic Madelung potential,  
correction for multipole moments
- Fitted charges to fix Potential in QM Zone

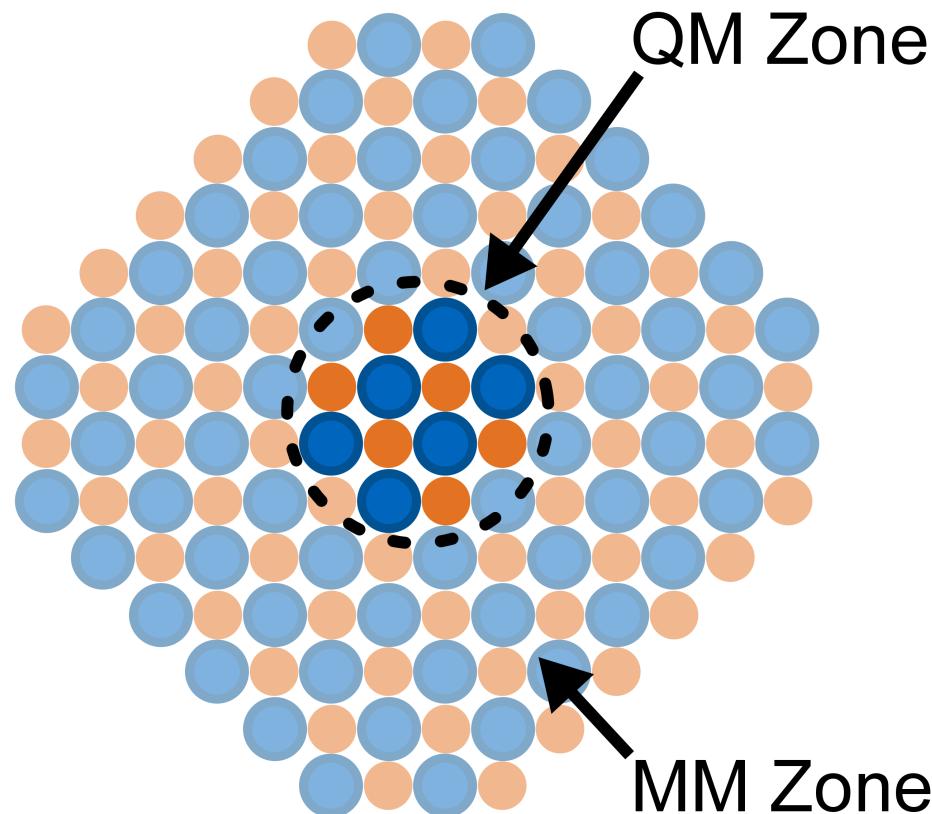
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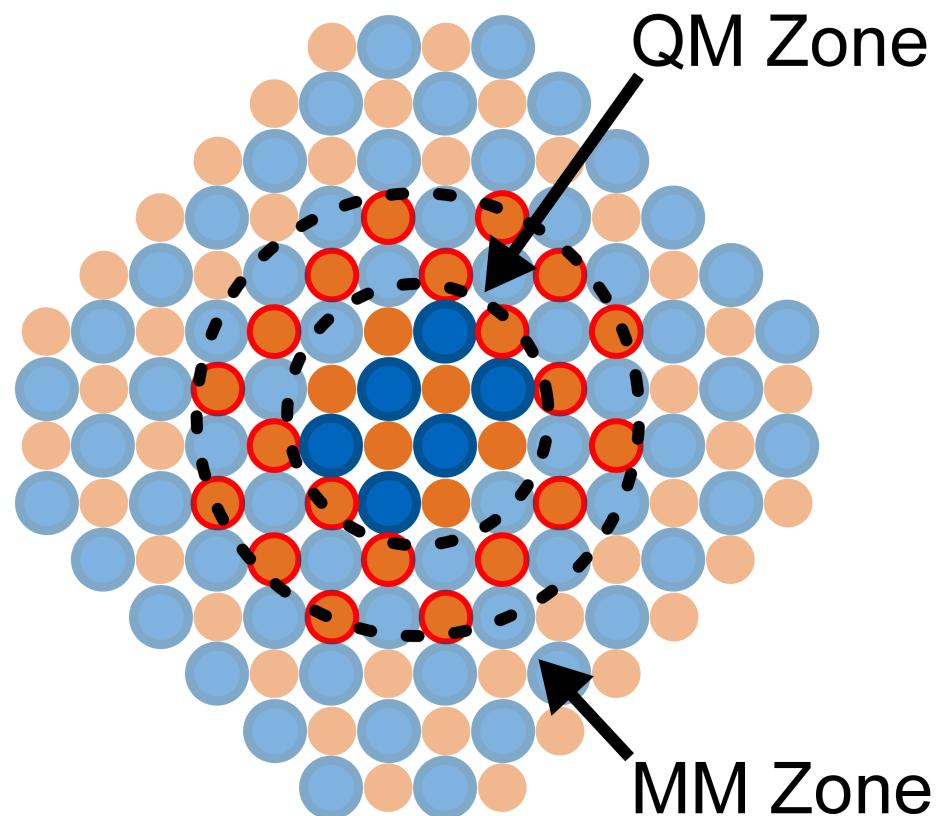
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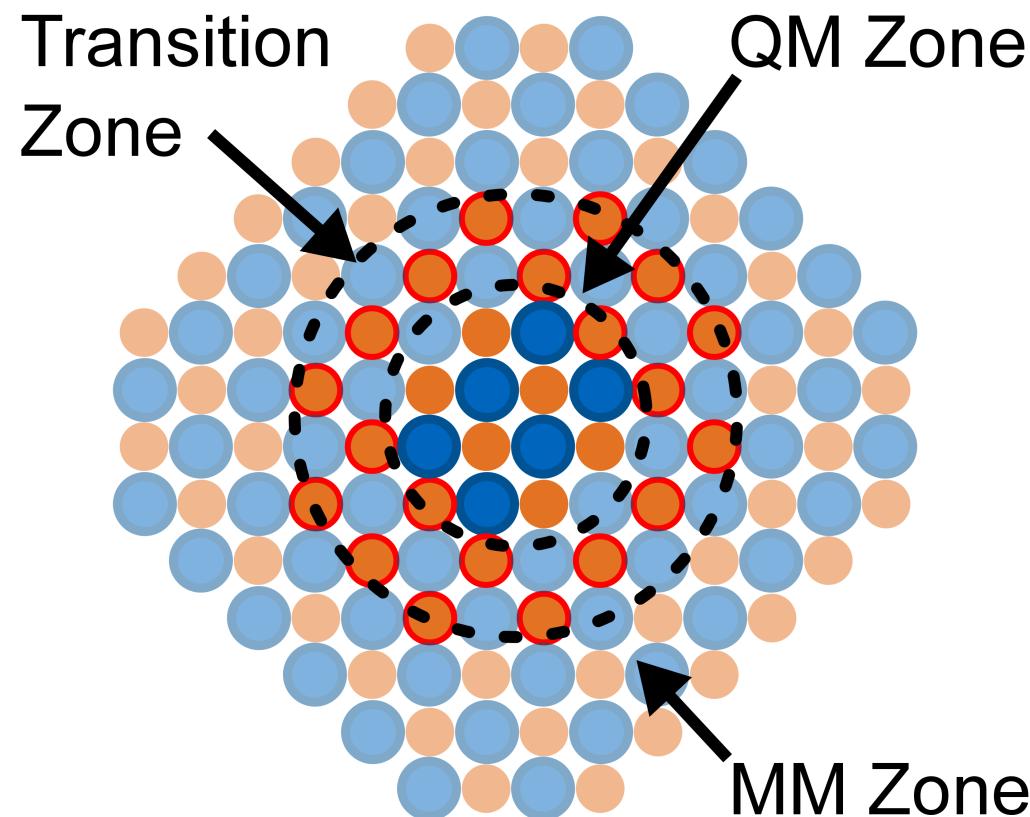
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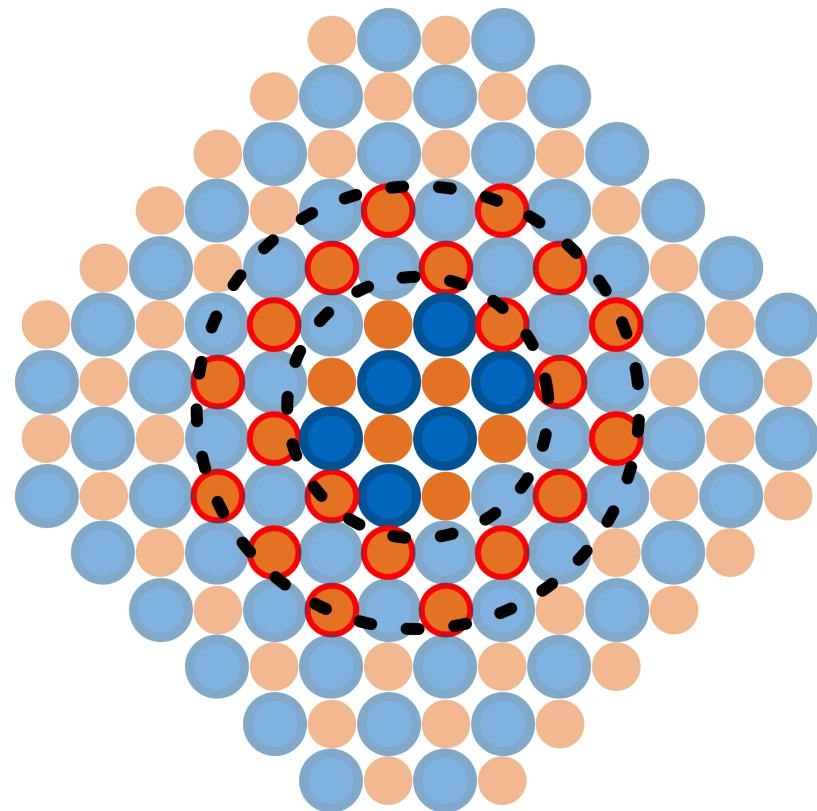
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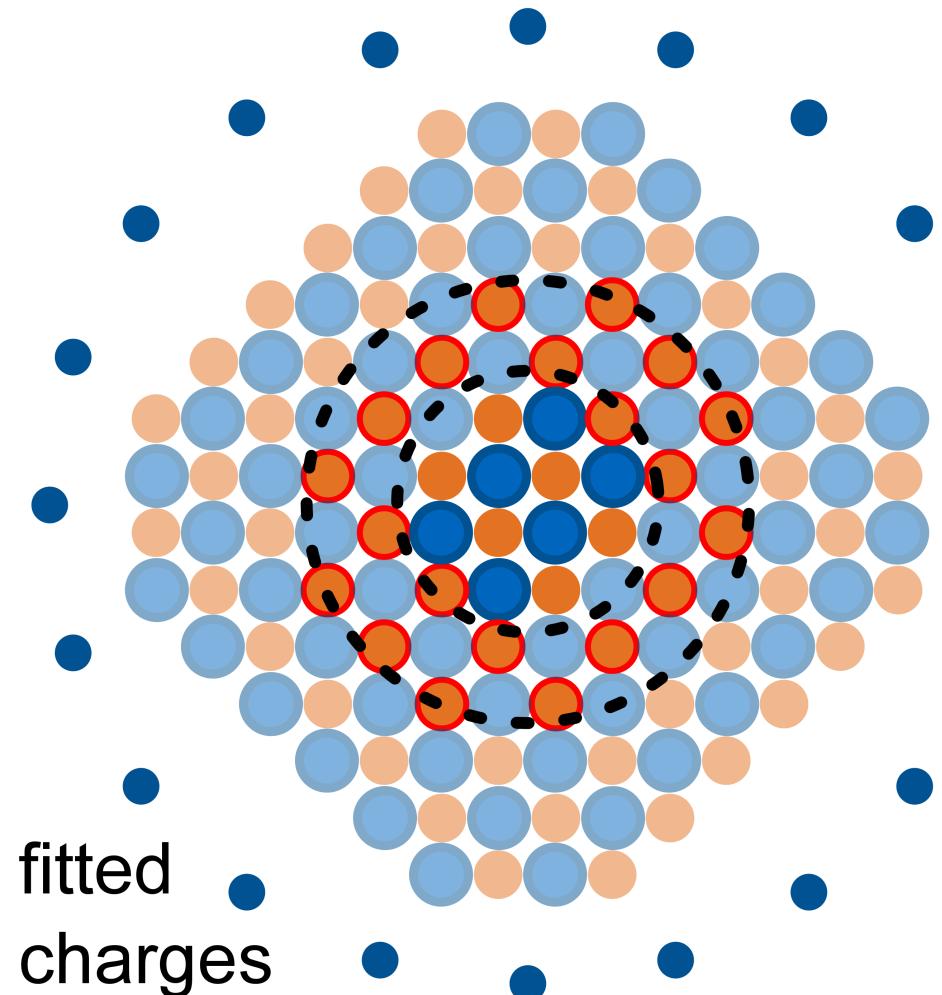
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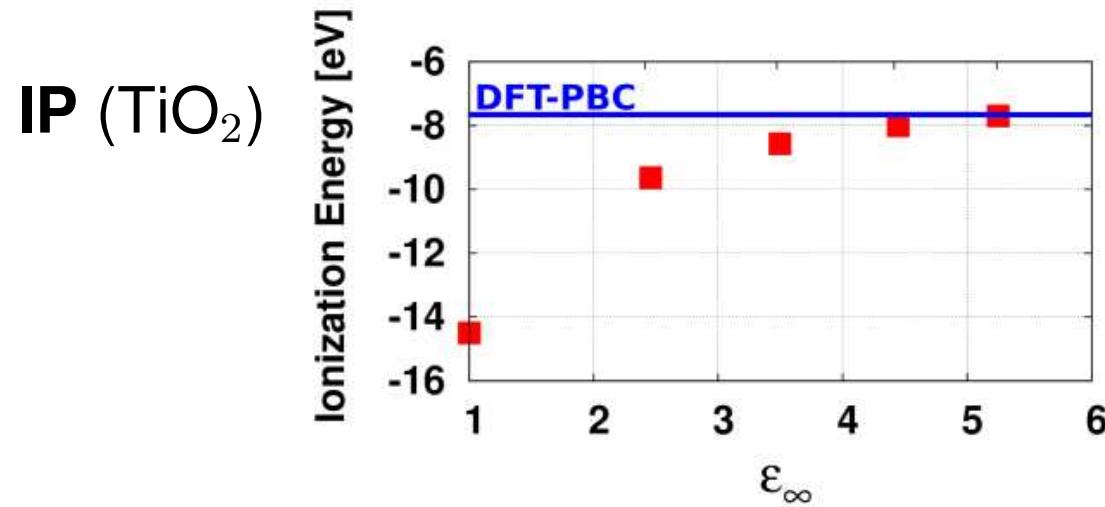
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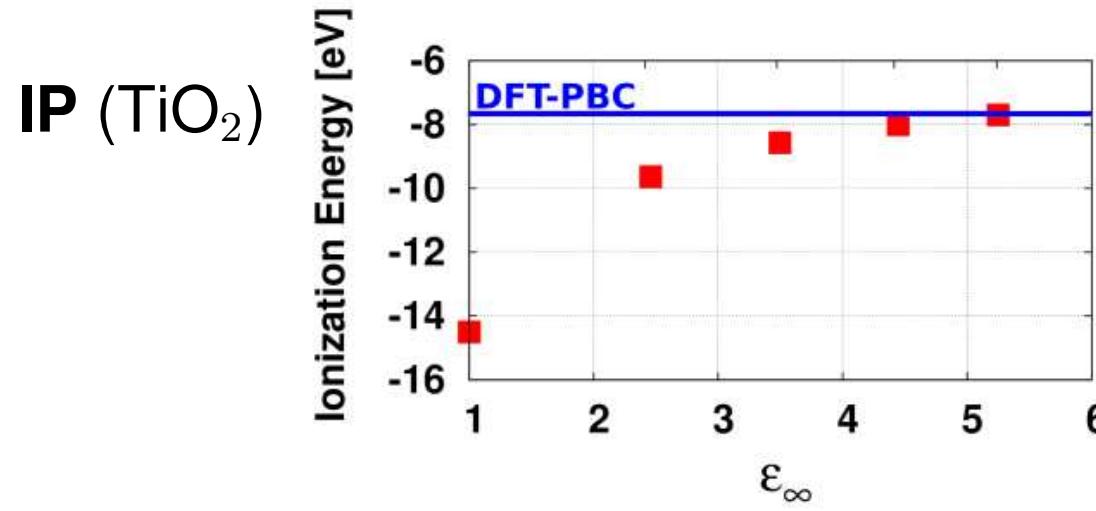
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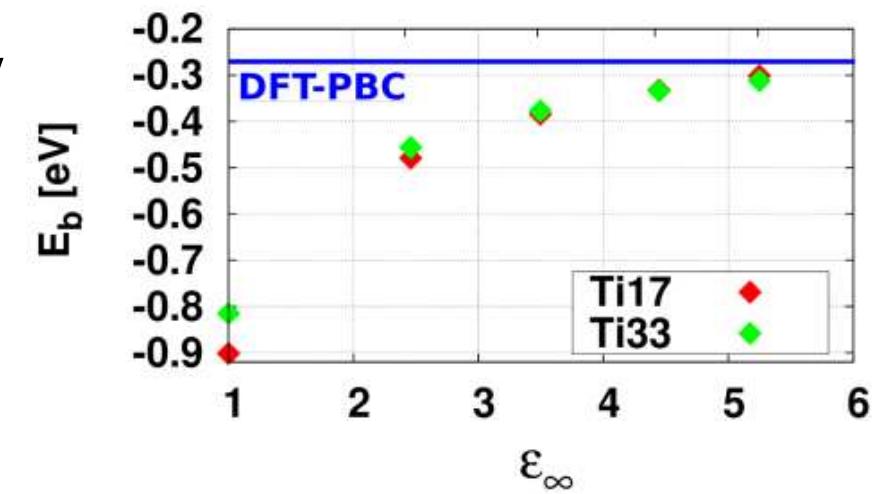
# Effect of environment polarisability (MM)



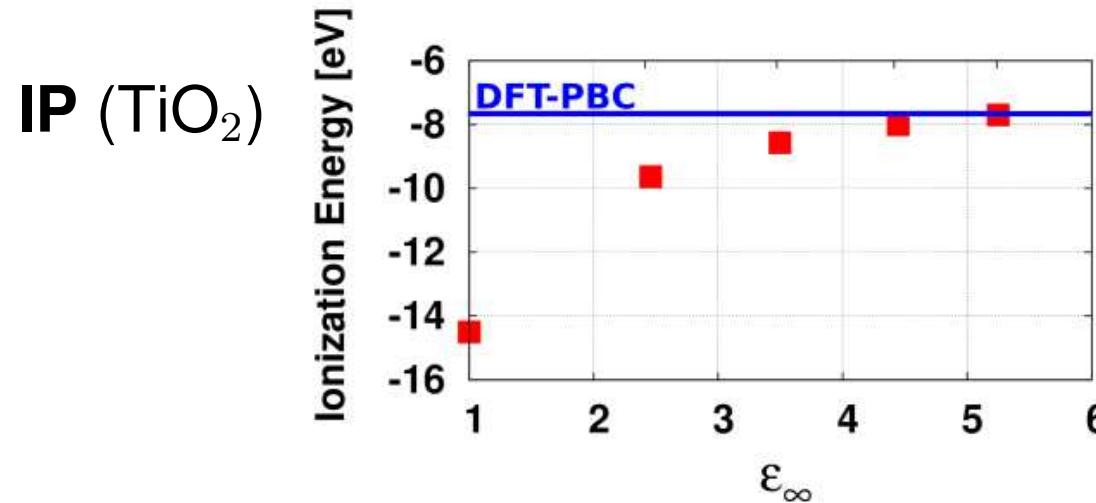
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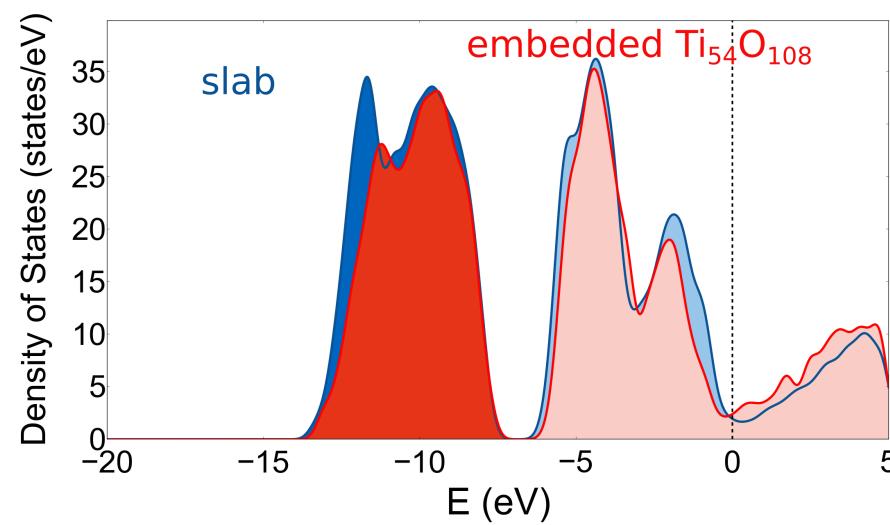
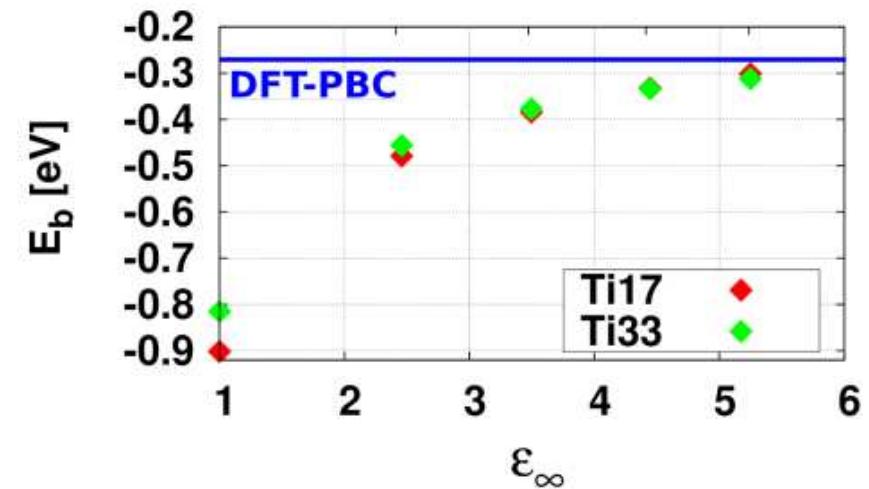
Binding Energy  
 $\text{OH}@\text{TiO}_2$



# Effect of environment polarisability (MM)



**Binding Energy**  
OH@TiO<sub>2</sub>



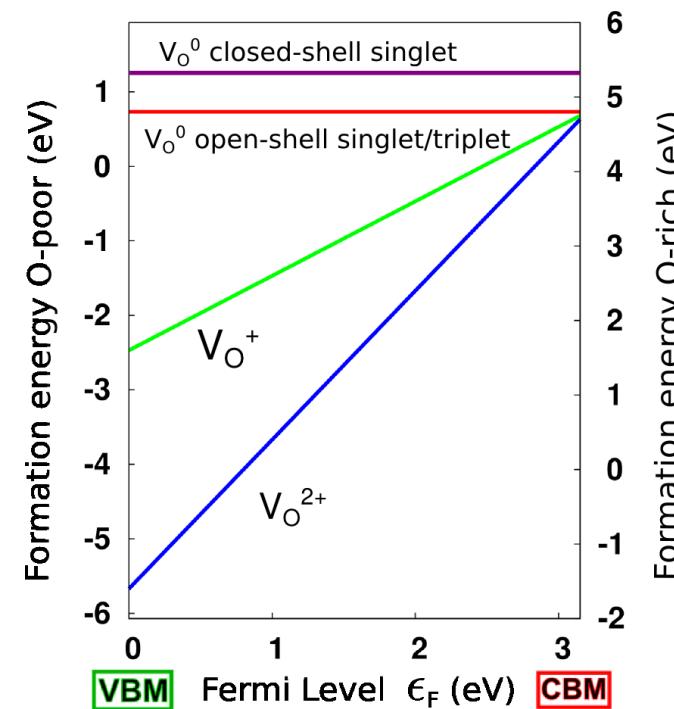
“Seamless embedding” recovers electronic structure  
(DOS of the rutile TiO<sub>2</sub> 110-surface)

Berger, et. al., J. Chem. Phys. 141, 024105 (2014)

# Example: Rutile TiO<sub>2</sub> (110) Surface Oxygen Vacancy

$$G_f(q) \approx E_{\text{defect}}(q) - E_{\text{pristine}}(q) + \mu_O + q\varepsilon_f$$

FHI-aims HSE06, tight settings, polarisably embedded Ti<sub>46</sub>O<sub>92</sub>

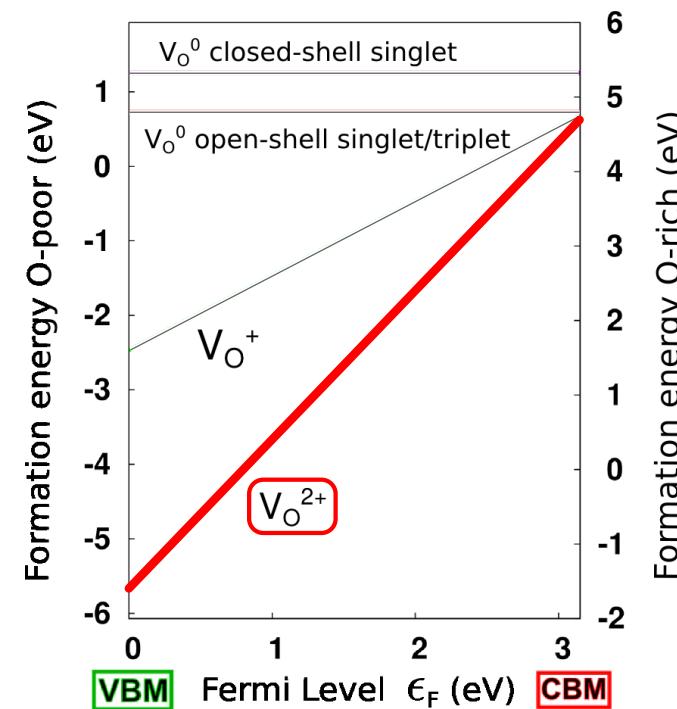


Berger, Oberhofer, Reuter, Phys. Rev. B **92** 75308 (2015)

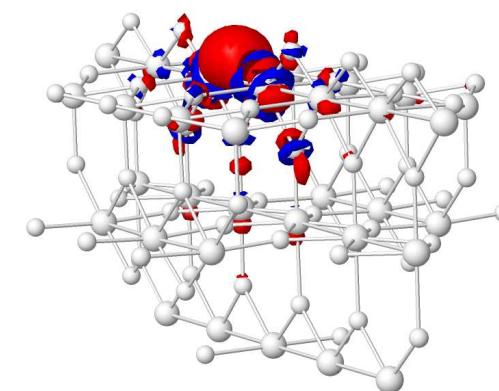
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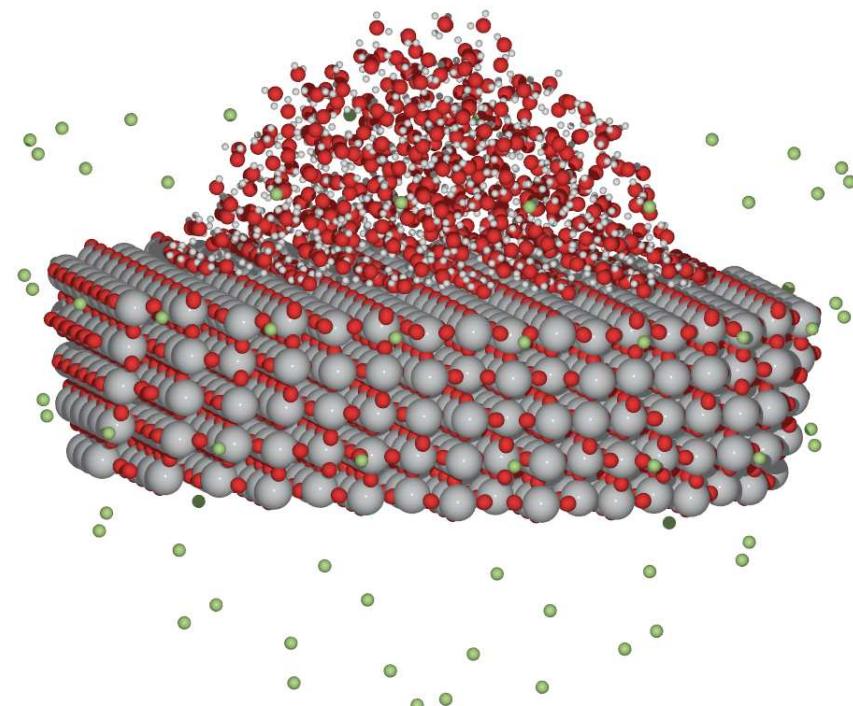


Charged defect stable over wide range of doping ( $\varepsilon_f$ ) and oxidation conditions



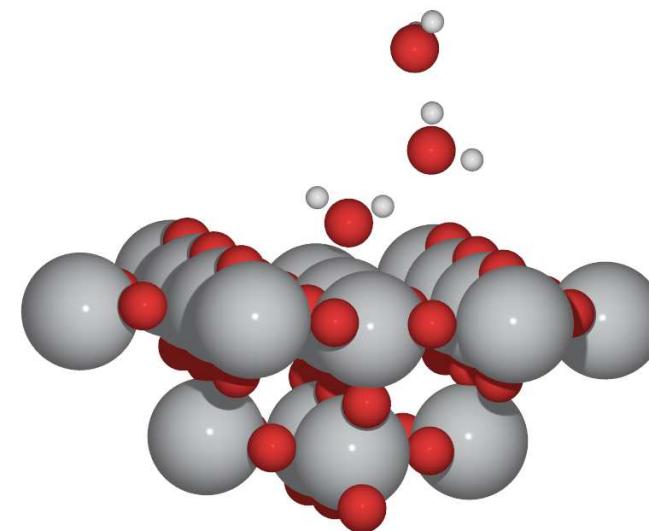
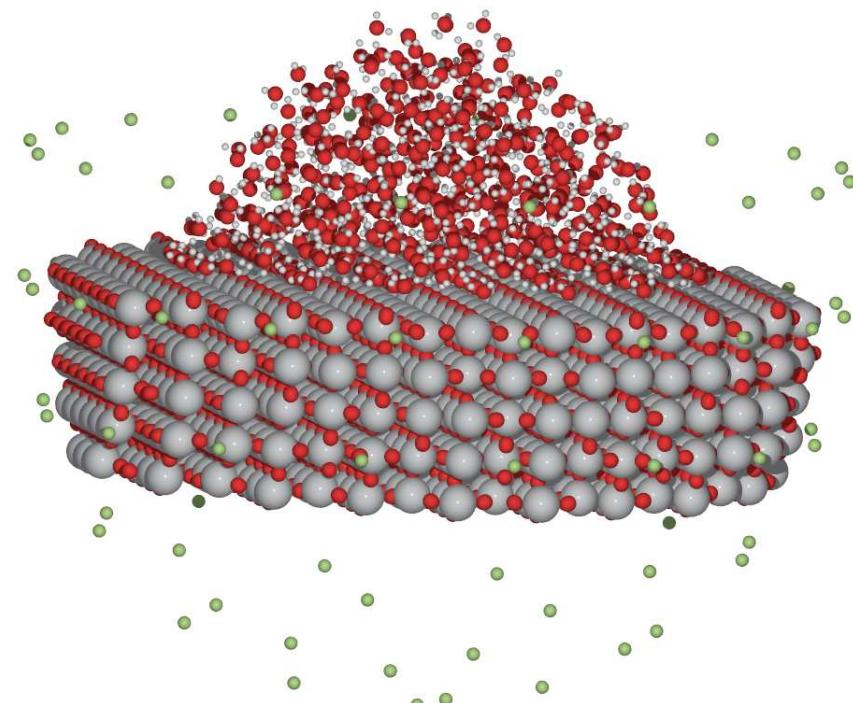
Charges localise at defects  $\Rightarrow$  photo-electrocatalysis

# Example: Free Energy Barriers



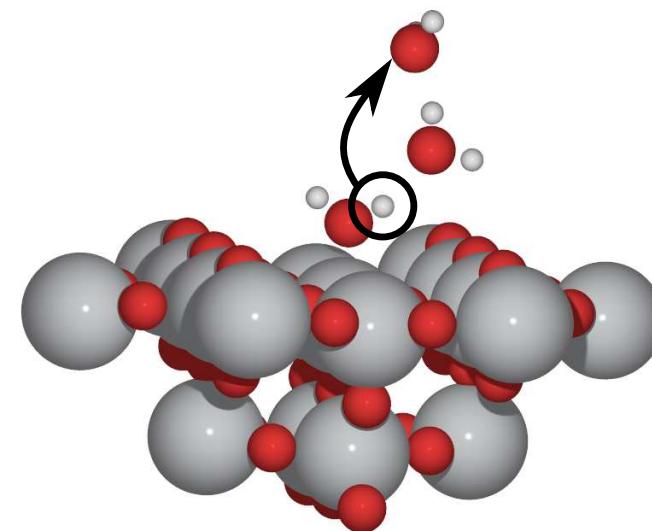
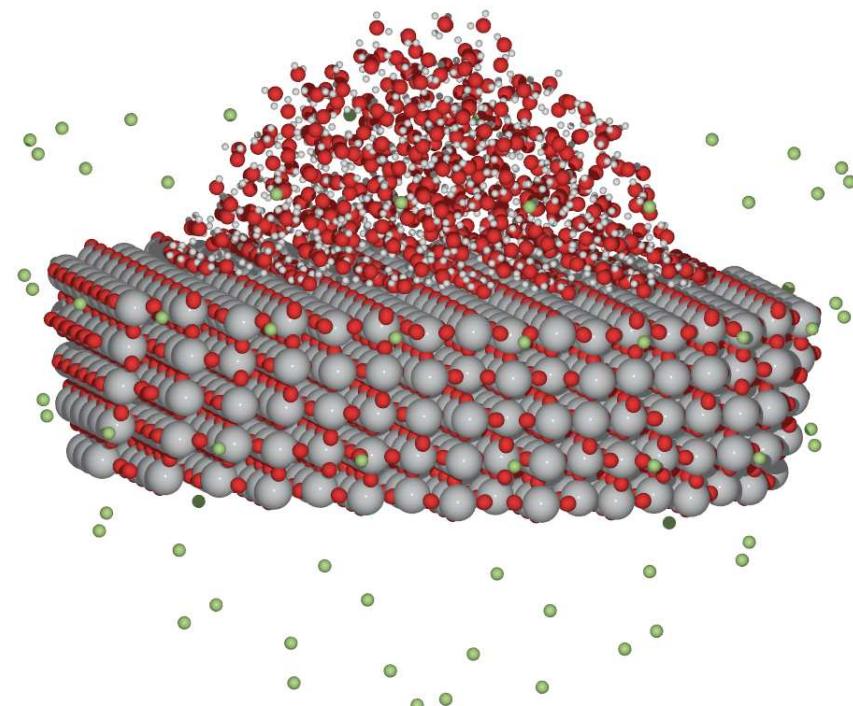
Stecher, Reuter, Oberhofer, Phys. Rev. Lett. **116**, 276001 (2016)

# Example: Free Energy Barriers



Stecher, Reuter, Oberhofer, Phys. Rev. Lett. **116**, 276001 (2016)

# Example: Free Energy Barriers

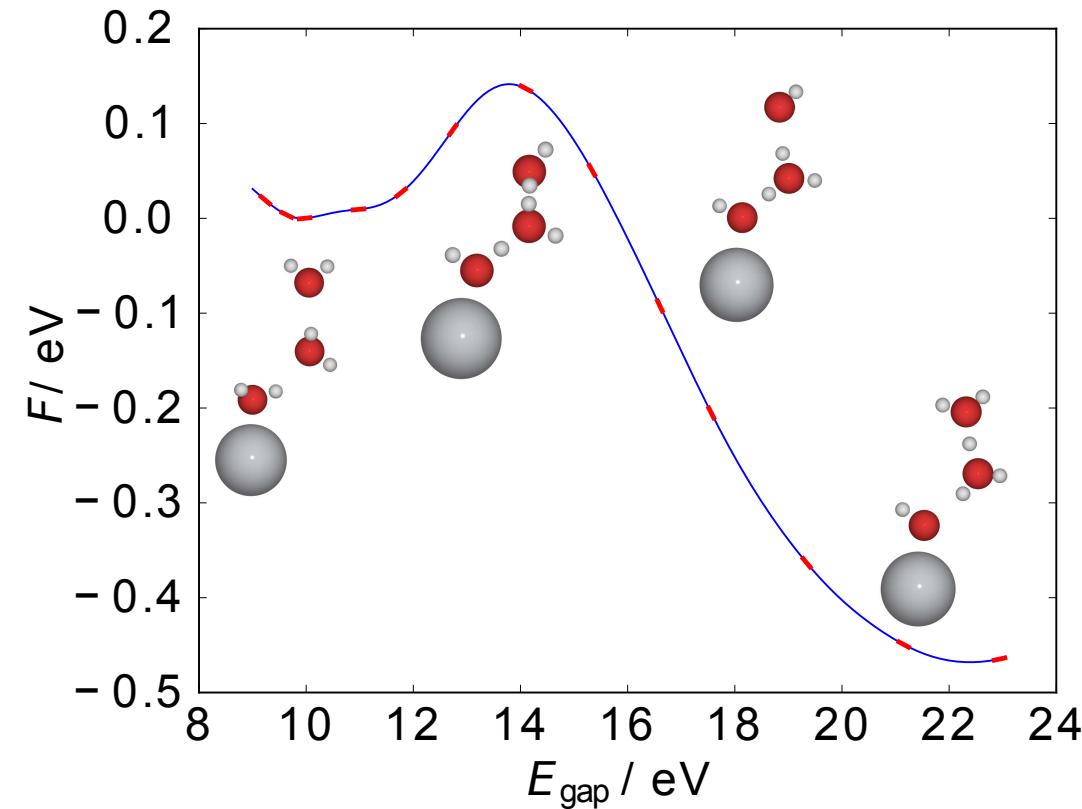


Stecher, Reuter, Oberhofer, Phys. Rev. Lett. **116**, 276001 (2016)

# Example: Free Energy Barriers

Initial proton abstraction driven by electron hole:

FHI-aims HSE06, tight settings, umbrella sampling/energy gap reaction coordinate

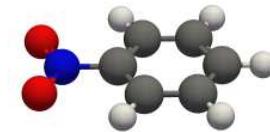


Basis-set corrected  
**barrier  $200 \pm 40 \text{ meV}$**

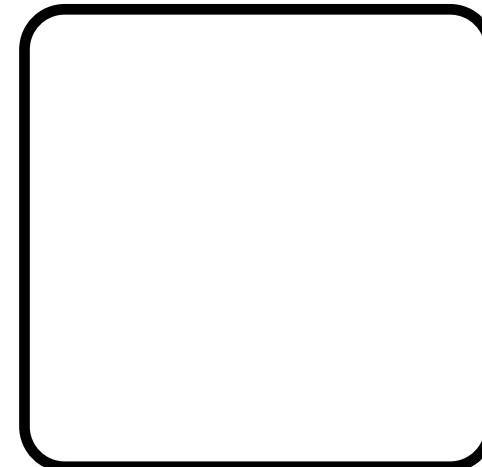
Stecher, Reuter, Oberhofer, Phys. Rev. Lett. **116**, 276001 (2016)

# Continuum embedding

$$\nabla \cdot [\nabla v(\mathbf{r})] = -4\pi n_{\text{sol}}(\mathbf{r})$$



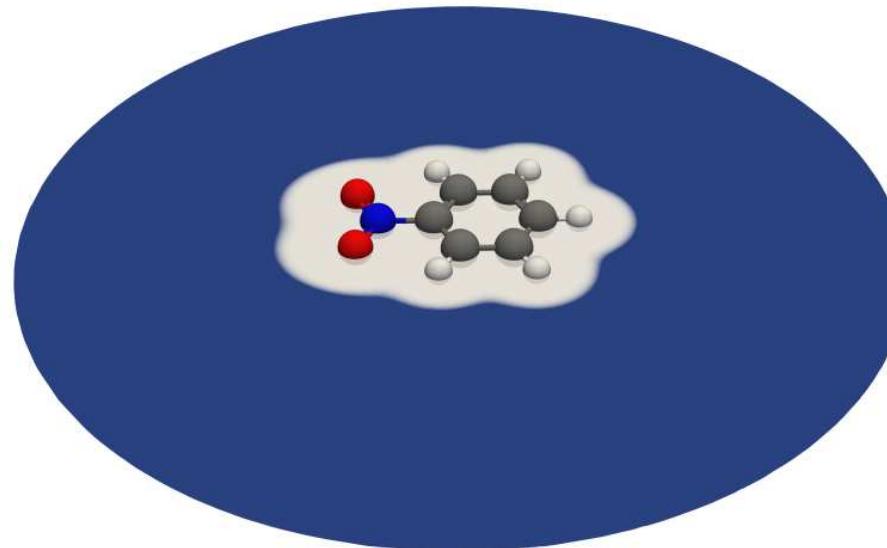
**Parameters:**



Poisson equation in **vacuum**

# Continuum embedding

$$\nabla \cdot [\varepsilon[n_{\text{el}}(\mathbf{r})] \nabla v(\mathbf{r})] = -4\pi n_{\text{sol}}(\mathbf{r})$$



**Parameters:**

$$\{n_{\min}, n_{\max}\}$$

$$\{\alpha, \beta, \gamma\}$$

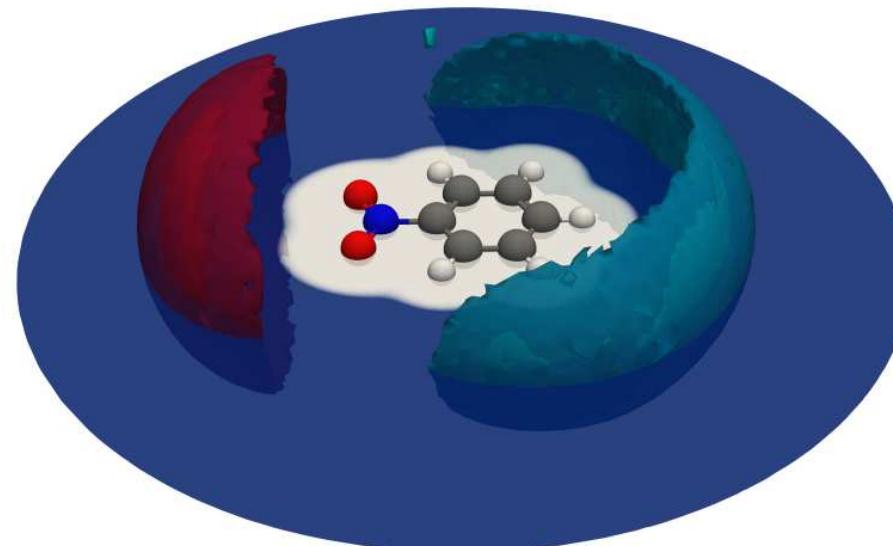
solvation cavity shape

non-electrostatics

Poisson equation in a **dielectric continuum**

# Continuum embedding

$$\nabla \cdot [\varepsilon[n_{\text{el}}(\mathbf{r})] \nabla v(\mathbf{r})] = -4\pi n_{\text{sol}}(\mathbf{r}) - 4\pi n_{\text{ion}}^{\text{PB}}(\mathbf{r})$$



**Parameters:**

$\{n_{\min}, n_{\max}\}$

$\{\alpha, \beta, \gamma\}$

$\{a\}$

$\{n_{\min}^\alpha, n_{\max}^\alpha\}$

solvation cavity shape

non-electrostatics

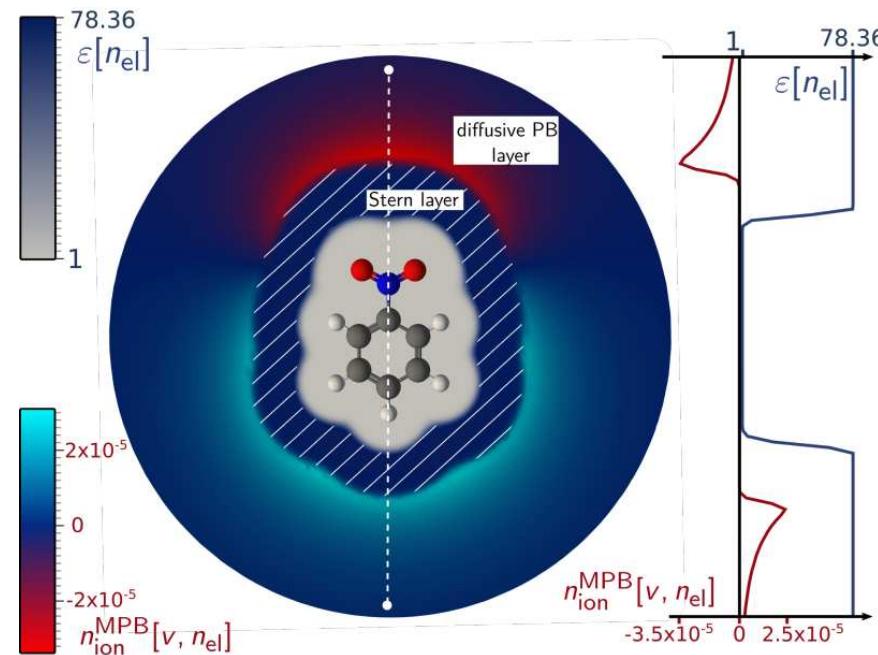
ion size

ion cavity shape  
(Stern layer)

(modified) Poisson Boltzmann equation in a **dielectric continuum**

# Continuum embedding

$$\nabla \cdot [\varepsilon[n_{\text{el}}(\mathbf{r})] \nabla v(\mathbf{r})] = -4\pi n_{\text{sol}}(\mathbf{r}) - 4\pi n_{\text{ion}}^{\text{PB}}(\mathbf{r})$$



## Parameters:

- $\{n_{\min}, n_{\max}\}$
- $\{\alpha, \beta, \gamma\}$
- $\{a\}$
- $\{n_{\min}^\alpha, n_{\max}^\alpha\}$

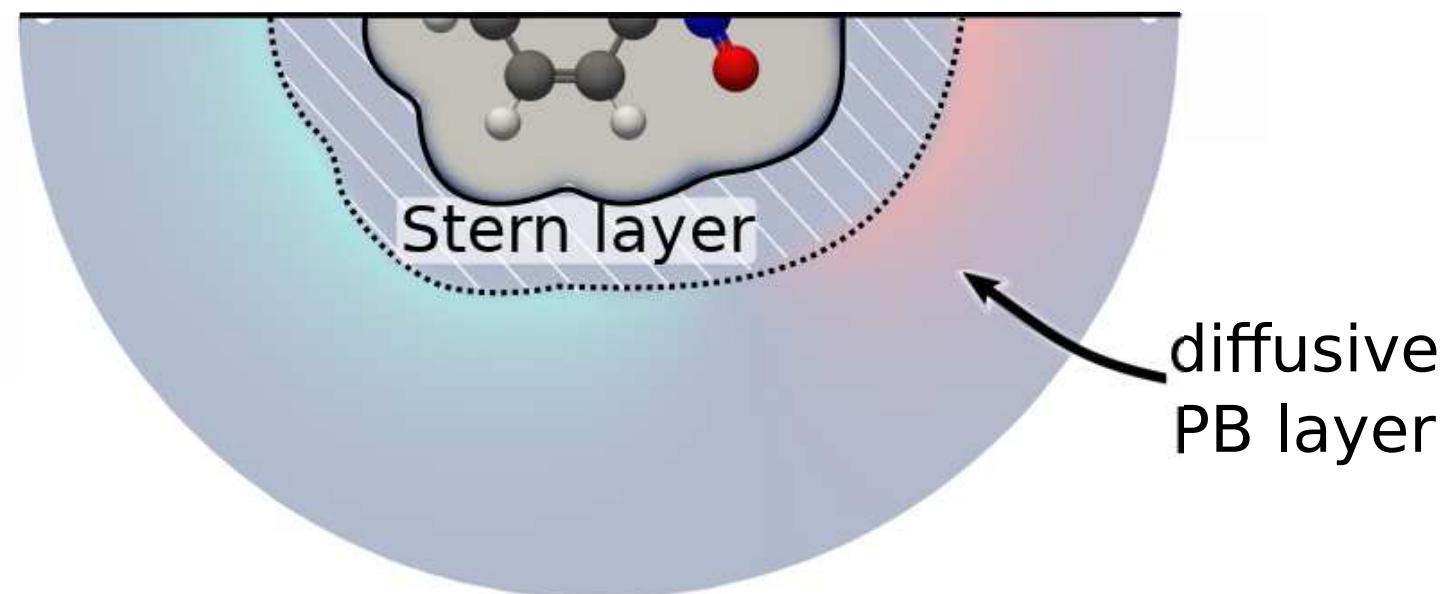
solvation cavity shape  
 non-electrostatics  
 ion size  
 ion cavity shape  
 (Stern layer)

ionic “cavity” not necessarily same as solvation cavity  $\Rightarrow$  **8 parameters in total**

Borukhov, Andelman, and Orland, *Electrochim. Acta* **46**, 221 (2000)  
 Ringe, Oberhofer, Hille, Matera, and Reuter, *J. Chem. Theor. Comput.* **12**, 4052 (2016)

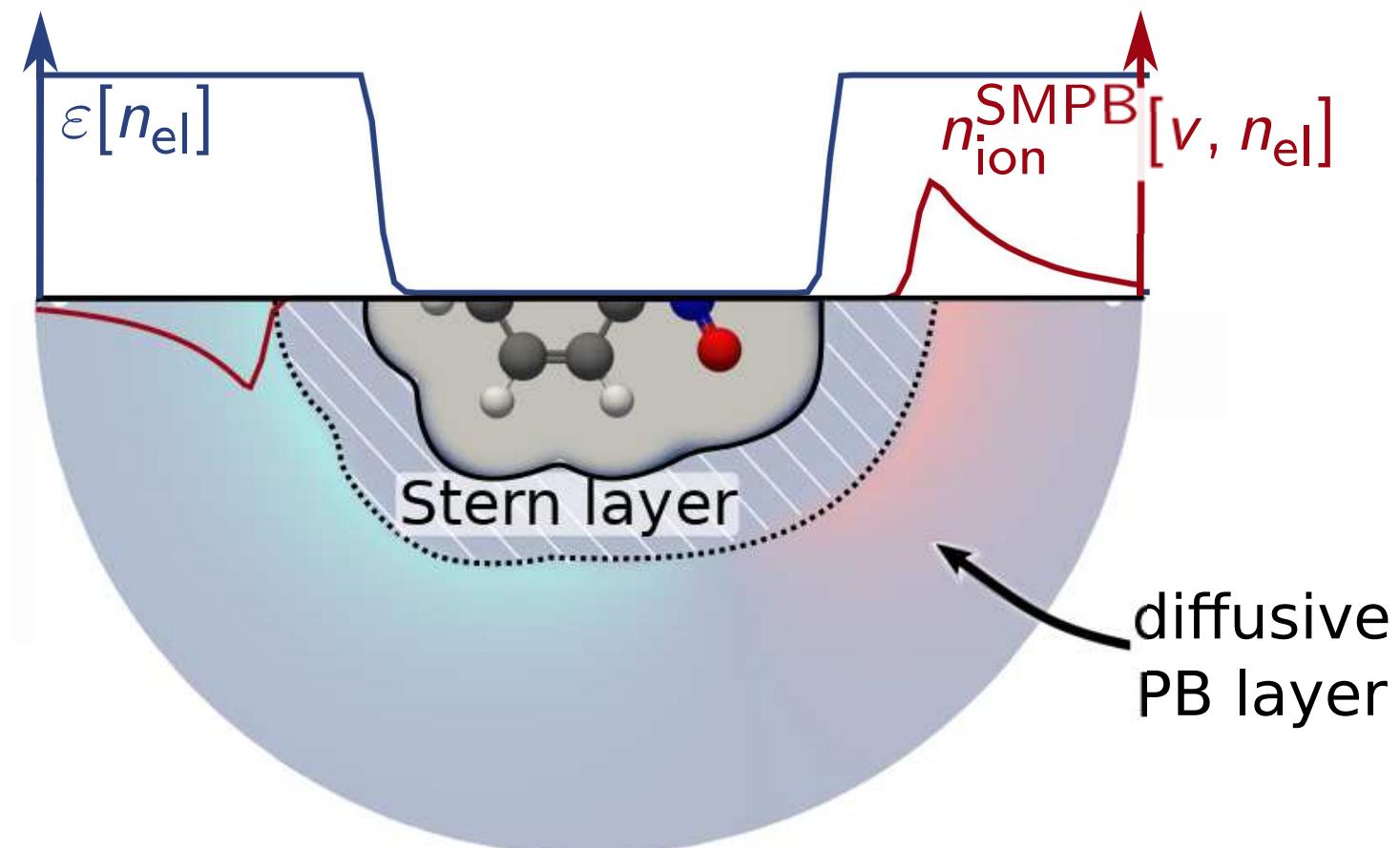
# Significance of the parameters

**Example:** Nitrobenzene in H<sub>2</sub>O with 1M NaCl



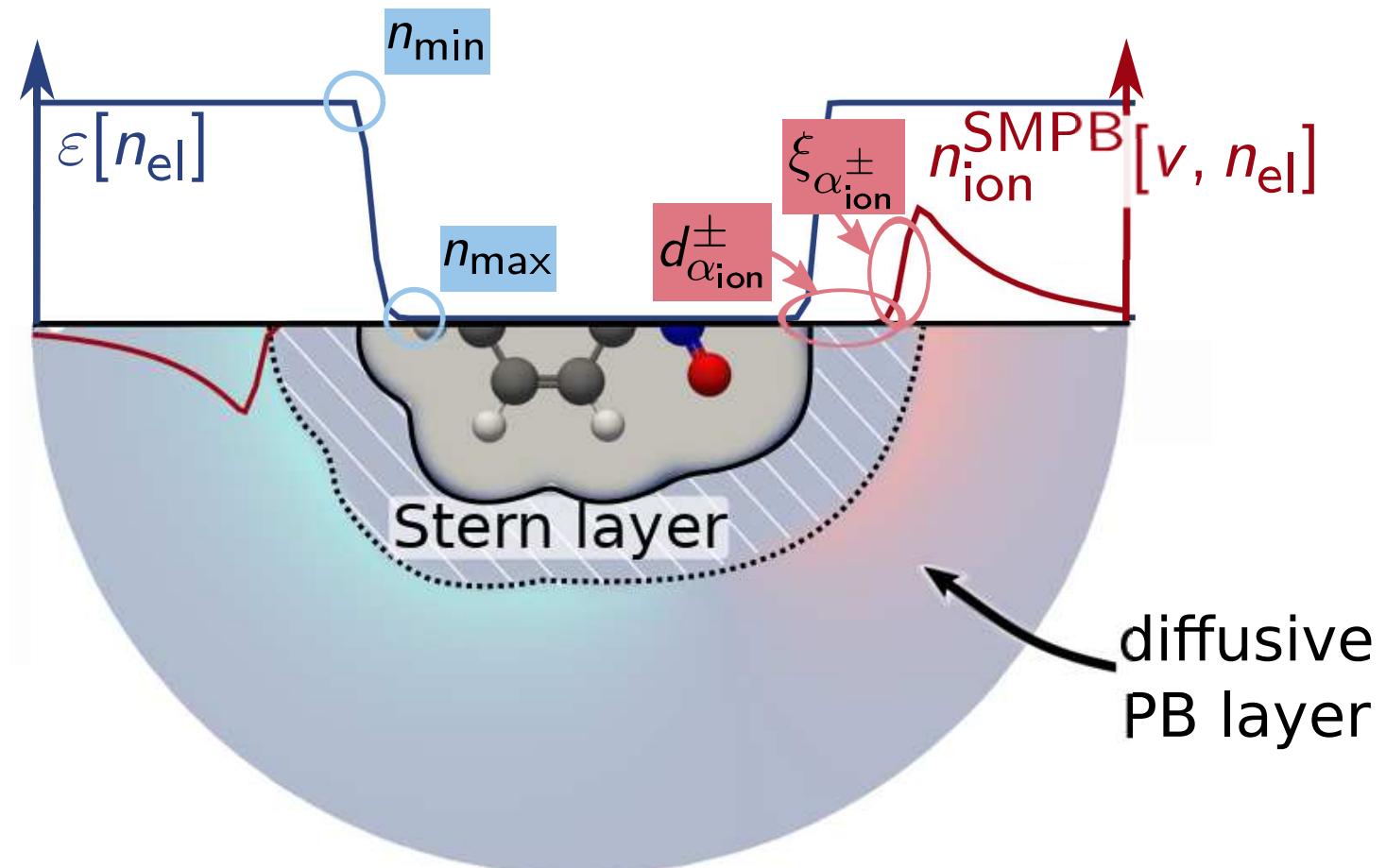
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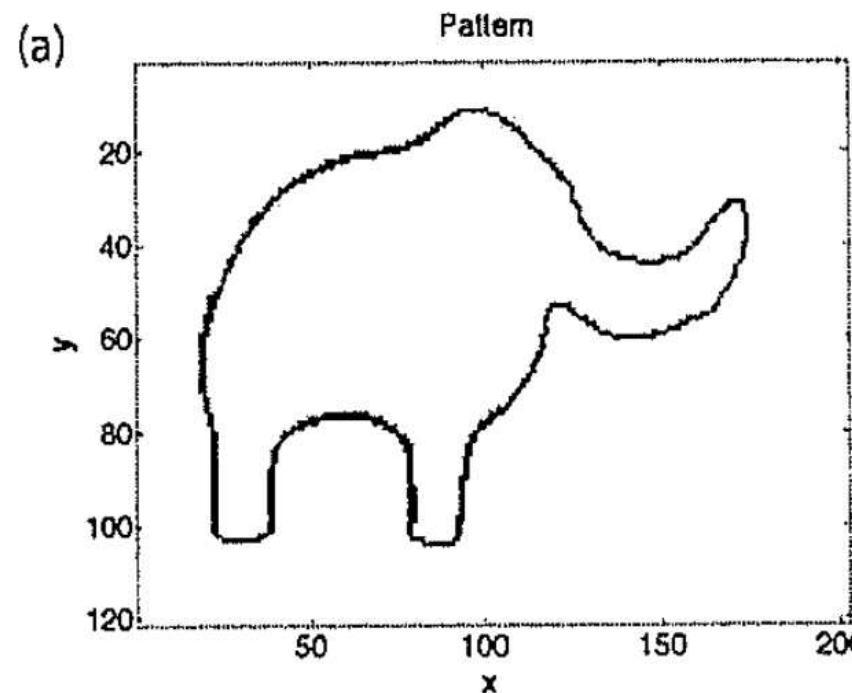


**With four parameters I can fit an elephant,  
and with five I can make him wiggle his trunk.**

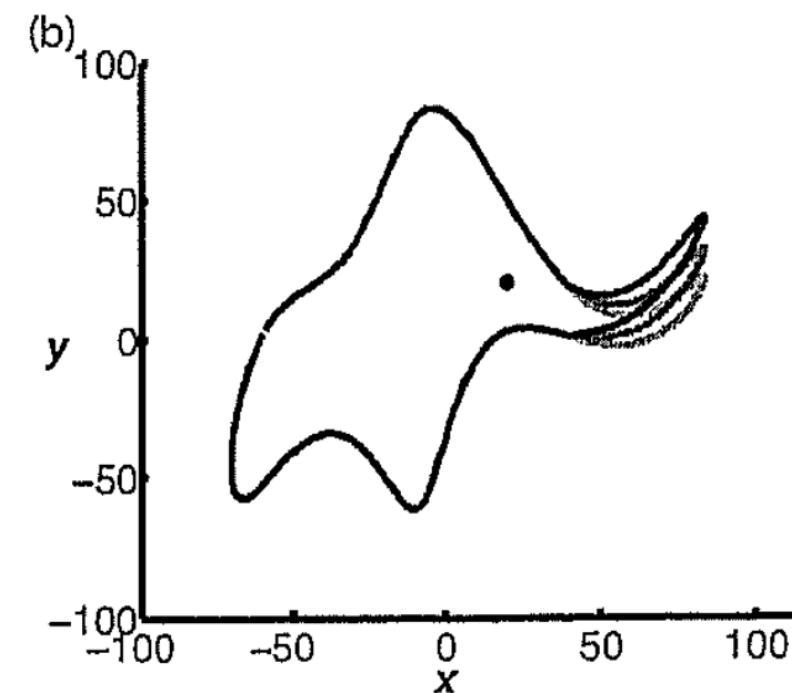
J. von Neumann via E. Fermi

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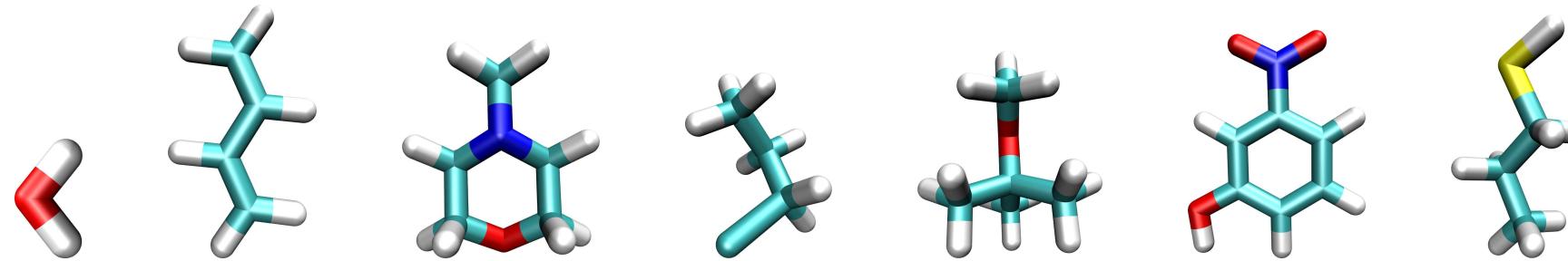
An elephant pattern.



5 parameter fit output, note the trunk wiggling.

Mayer, Khairy, and Howard, Am. J. Phys. **78**, 648 (2010)

# Fixing solvation parameters

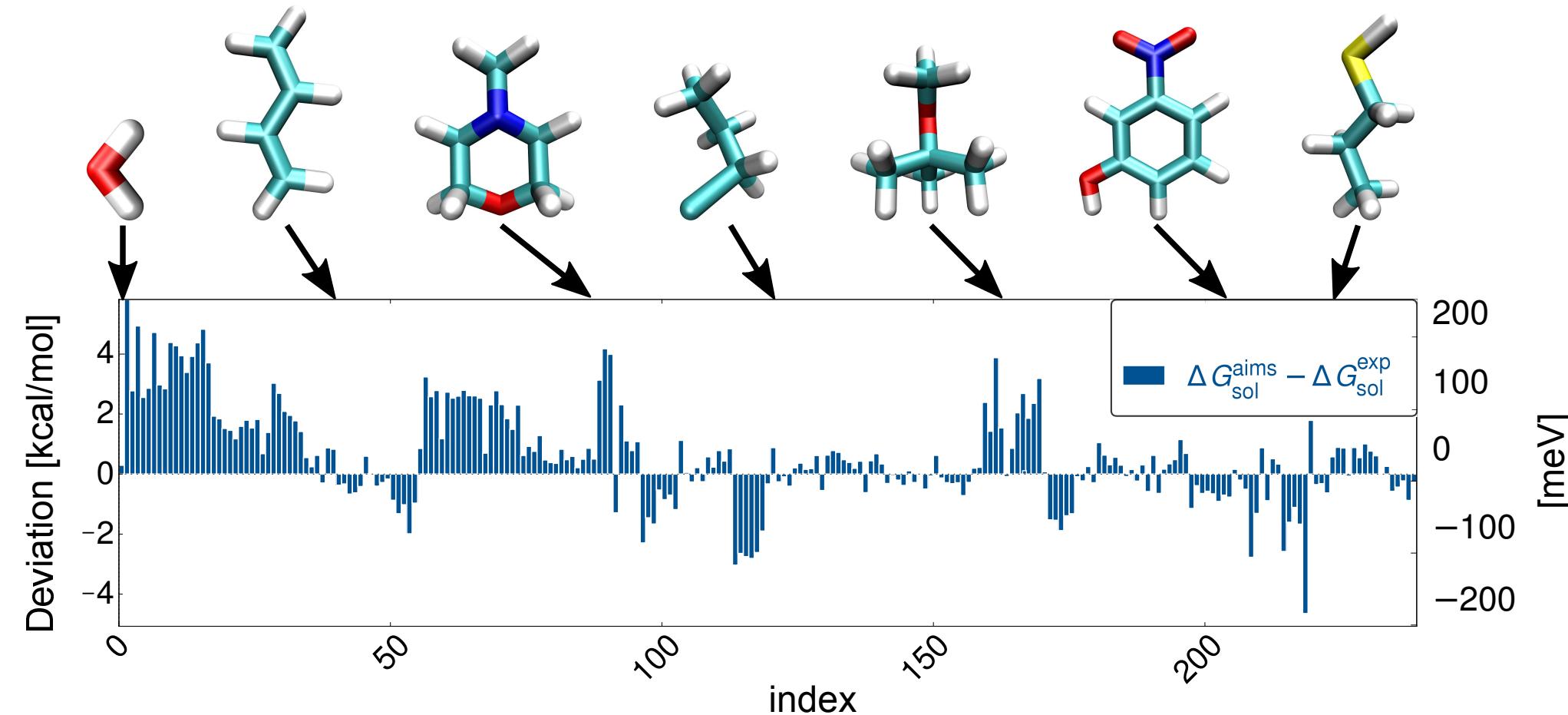


240 molecule test-set with known  
**experimental** solvation free energies

⇒ fit solvation parameters

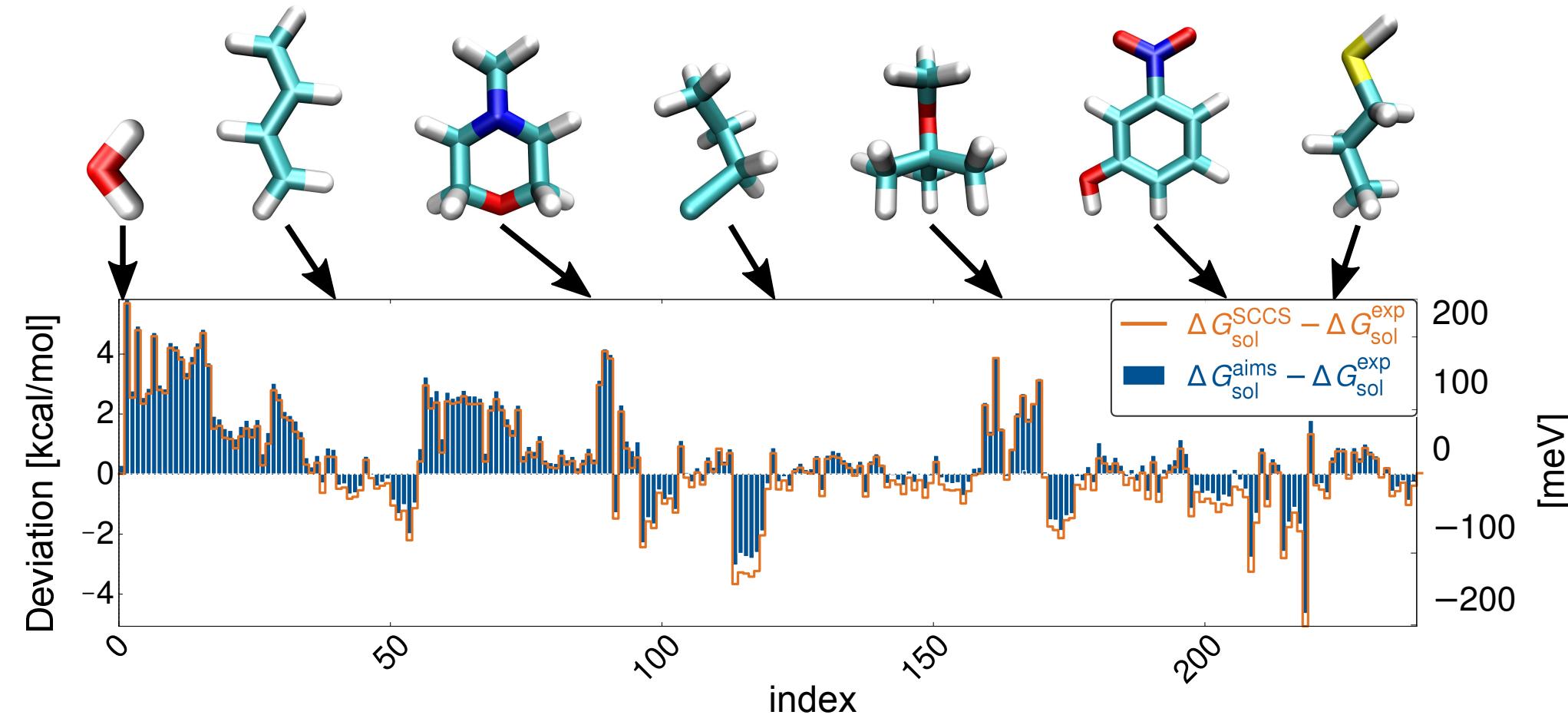
Andreussi, Dabo, and Marzari, J. Chem. Phys. **136**, 064102 (2012)  
Ringe, Oberhofer, Hille, Matera, and Reuter, J. Chem. Theor. Comput. **12**, 4052 (2016)

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Andreussi, Dabo, and Marzari, J. Chem. Phys. **136**, 064102 (2012)  
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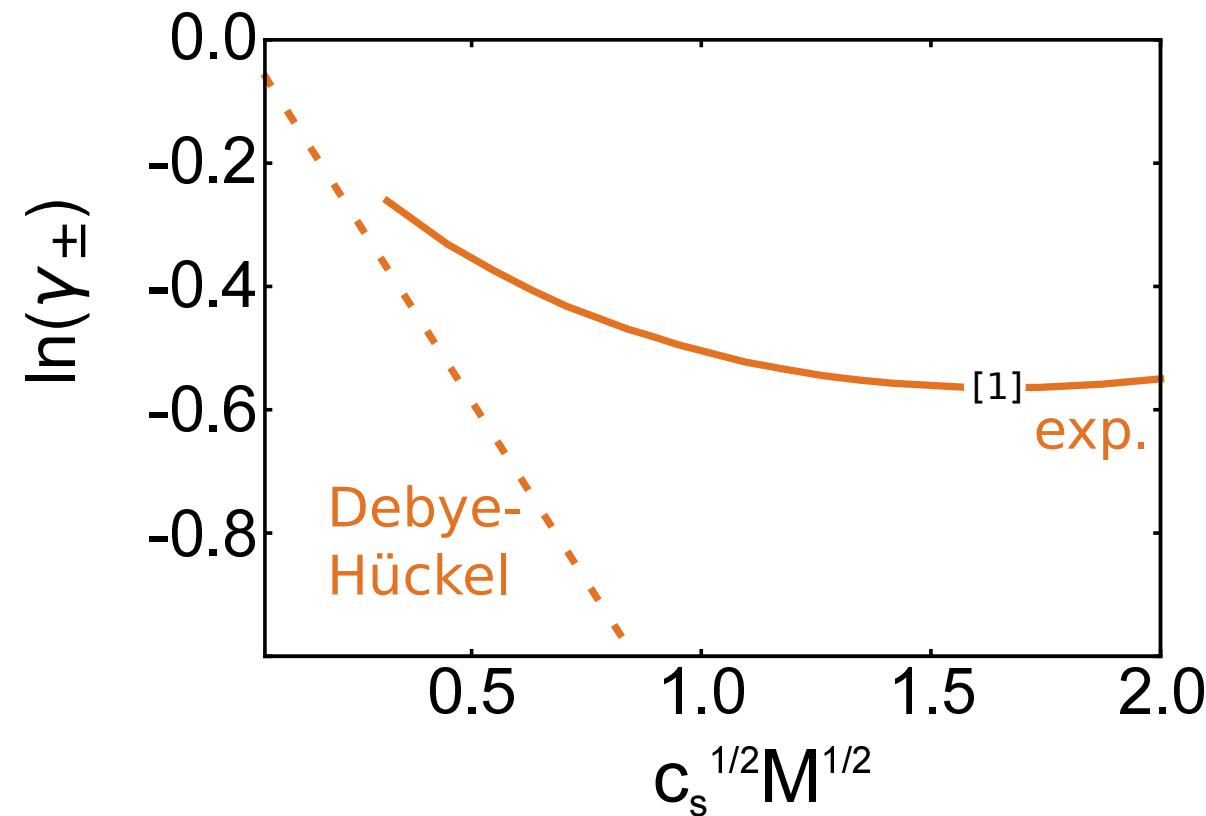
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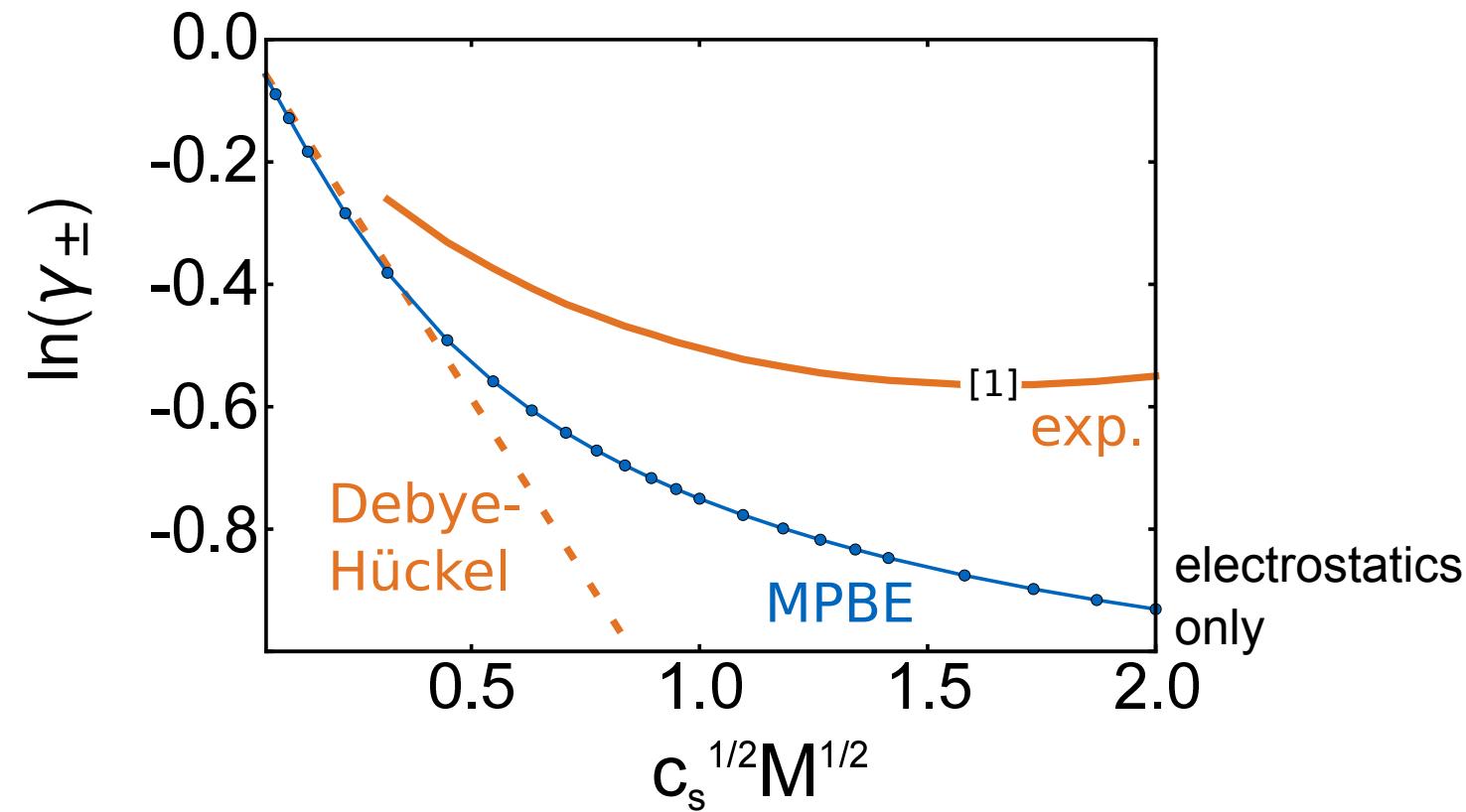
First approach **salt activity coefficients (KCl)**



Robinson and Stokes, *Electrolyte Solutions*, 2nd ed.; Butterworths Publications Limited: New York (1959)  
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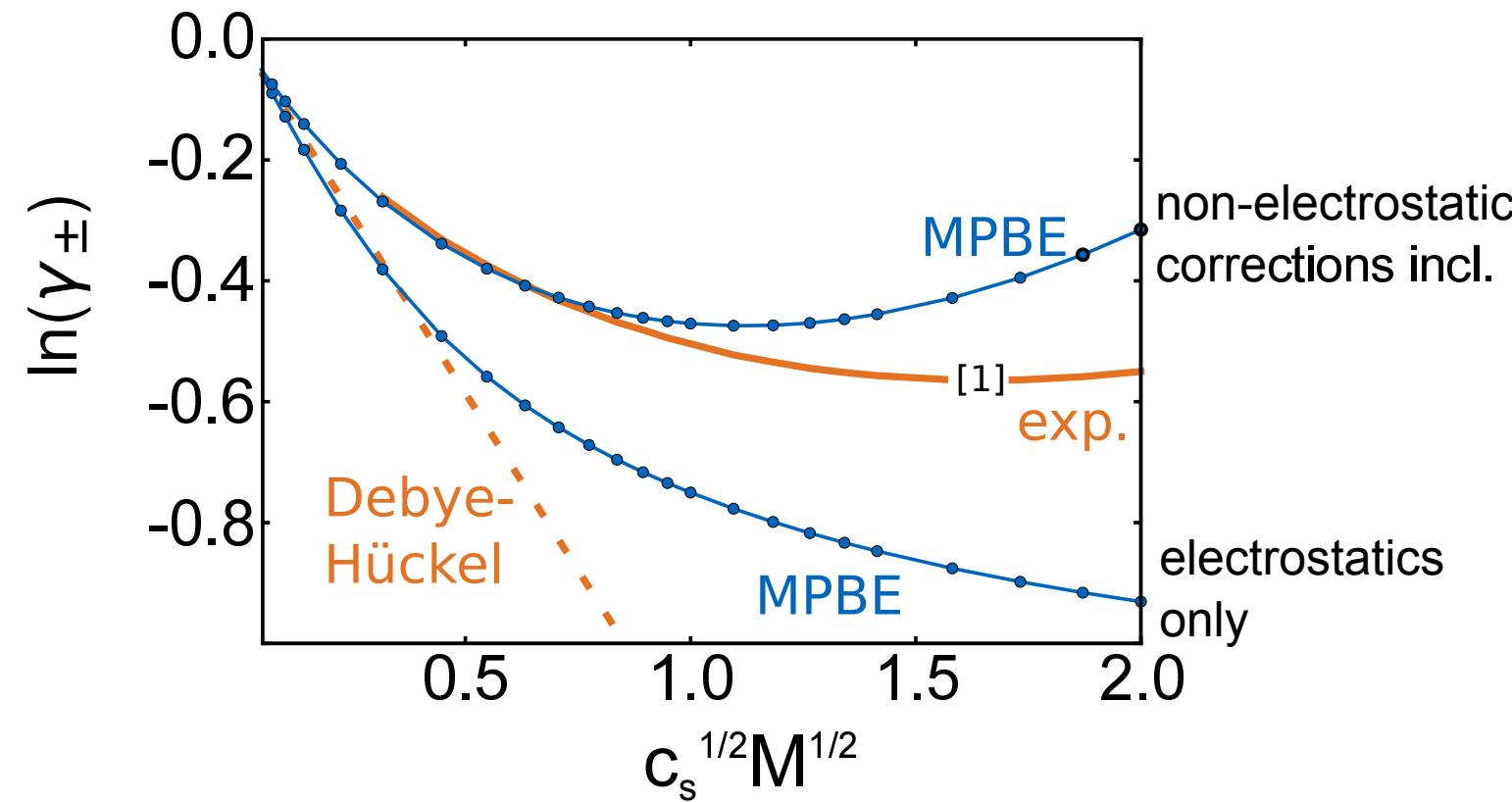
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# Fixing ionic parameters

First approach **salt activity coefficients** (KCl)



⇒ ion parameters can be fit to  
**physical observables**

Robinson and Stokes, *Electrolyte Solutions*, 2nd ed.; Butterworths Publications Limited: New York (1959)  
Ringe, Oberhofer, Hille, Matera, and Reuter, J. Chem. Theor. Comput. **12**, 4052 (2016)

# Fixing ionic parameters

Molecular test-set, **Setschenow coefficients**

Linear relationship of solvation free energy of  
(neutral) molecules with salt concentration

$$\Delta\Delta G_{\text{ion}} \propto k_s c_s$$

Ringe, Oberhofer, and Reuter, J. Chem. Phys. **146**, 134103 (2017)

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Molecular test-set, **Setschenow coefficients**

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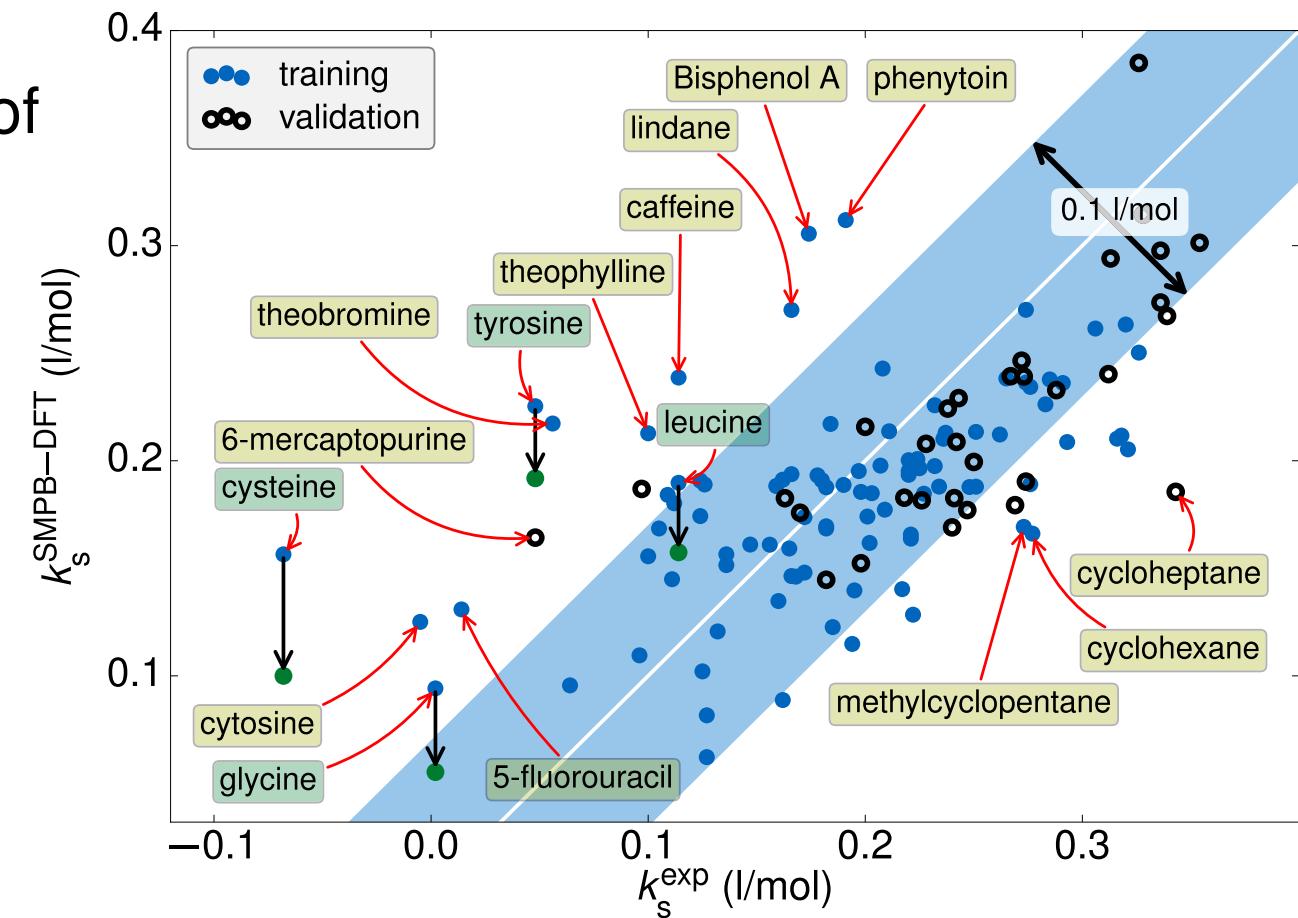
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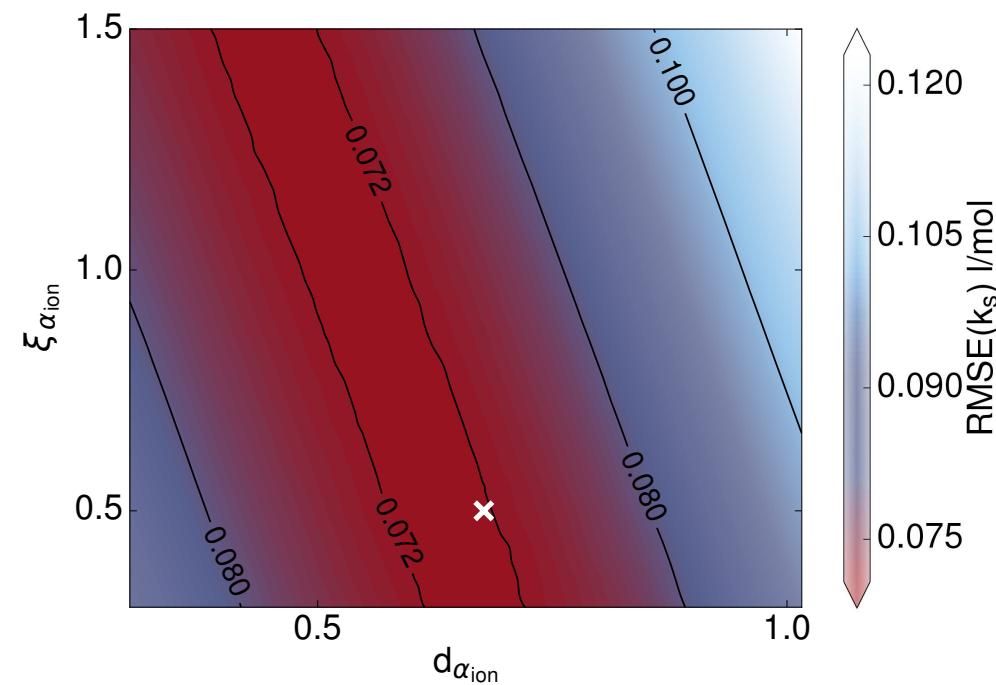
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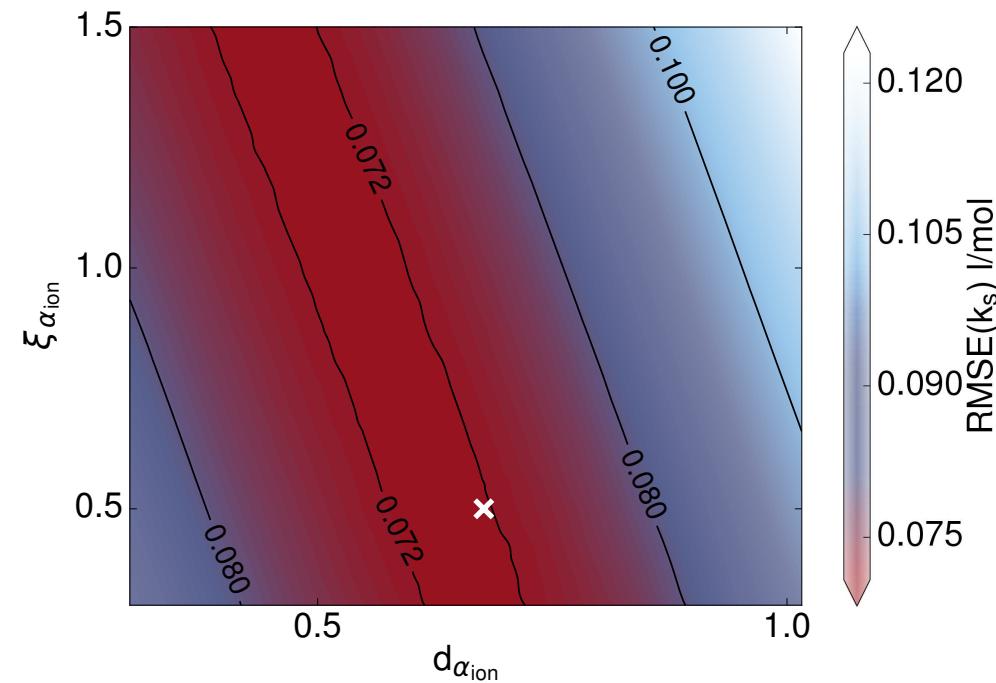
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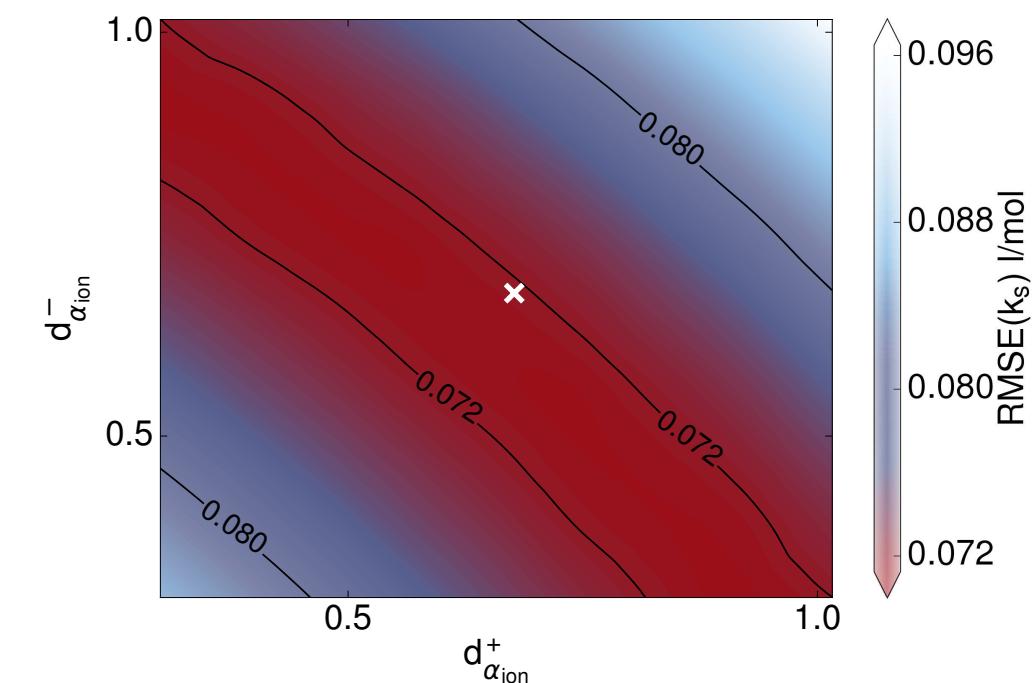
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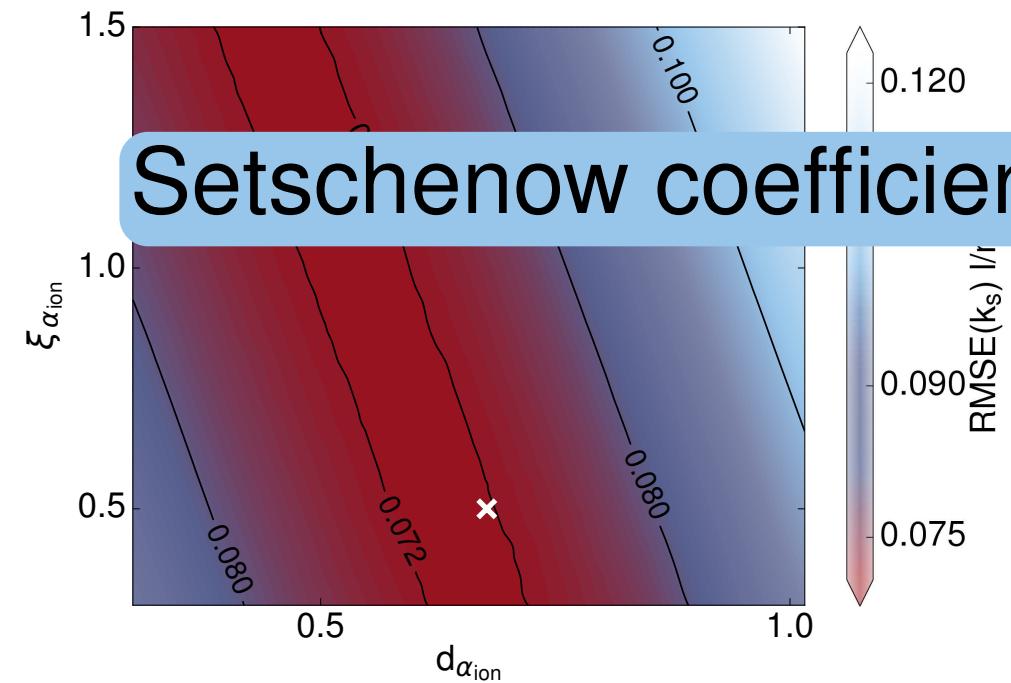
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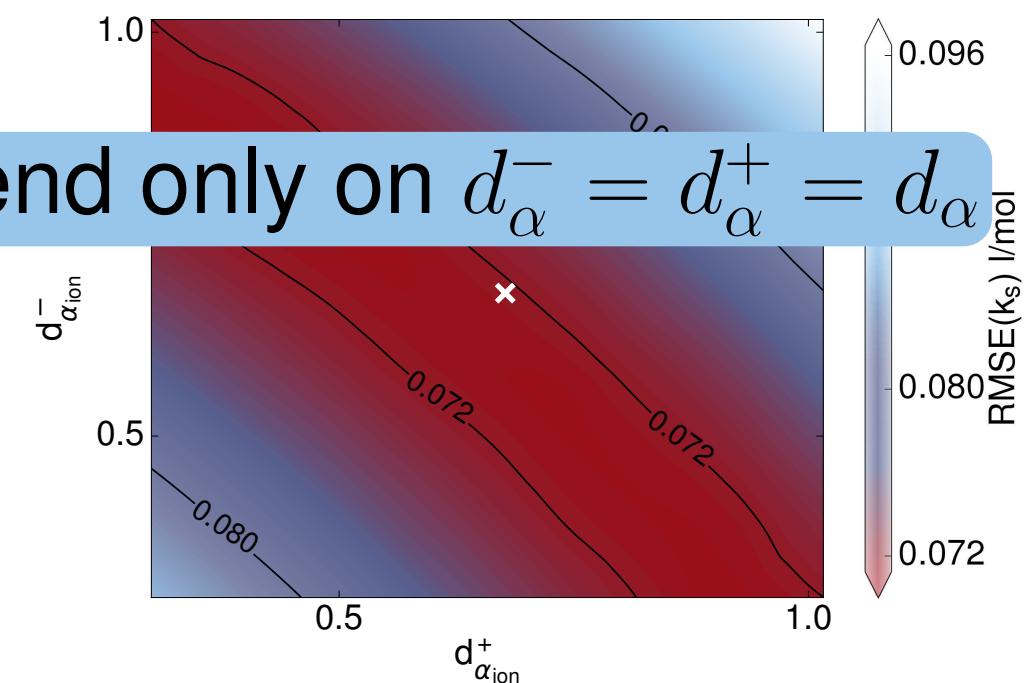
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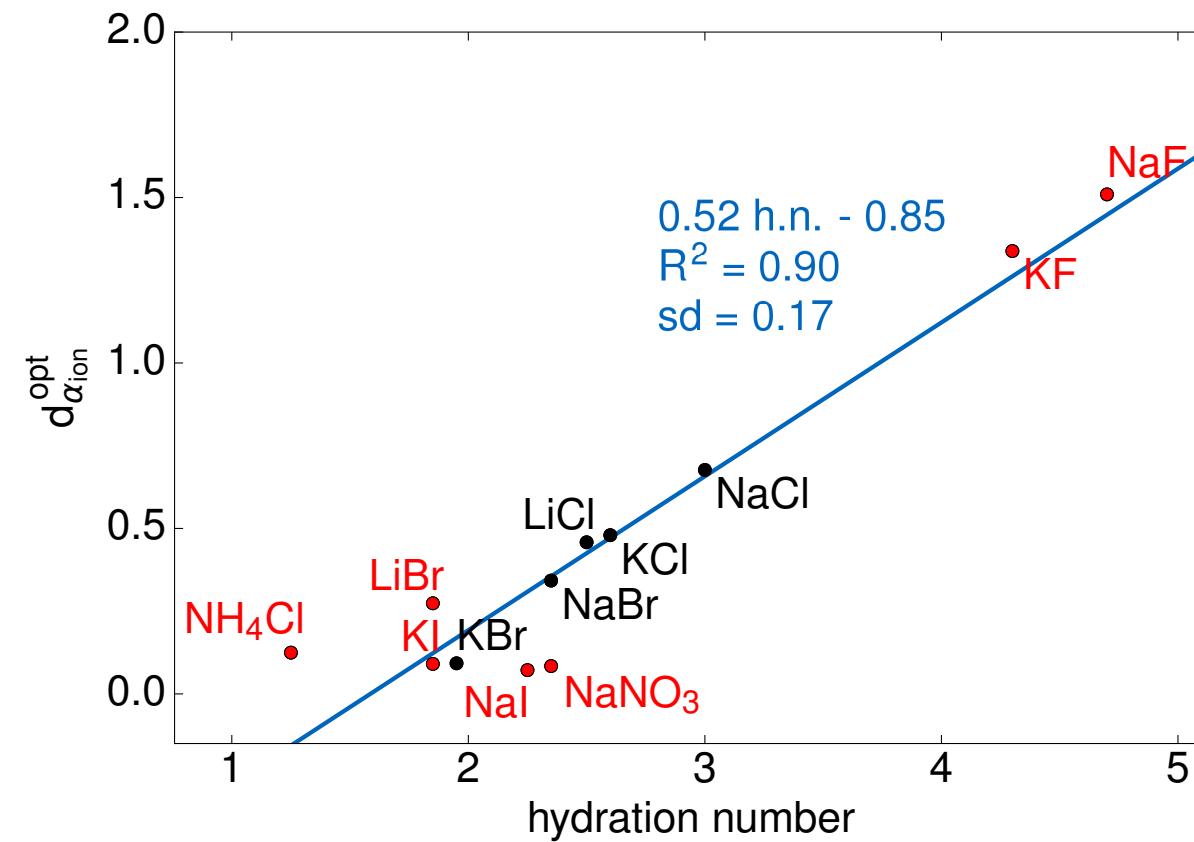
Setschenow coefficients depend only on  $d_\alpha^- = d_\alpha^+ = d_\alpha$

# Scaling relation for $d_\alpha$ (Stern Layer width)

What to do with other salts (with often little or no experimental data)?

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$d_\alpha$  correlates with the **hydration number**.

⇒ predict ionic parameter.

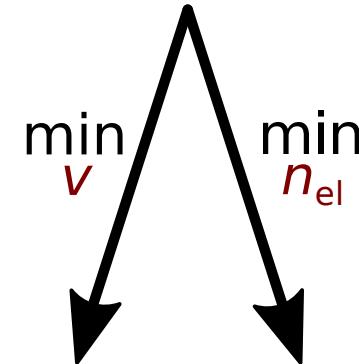
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# SMPB in practice



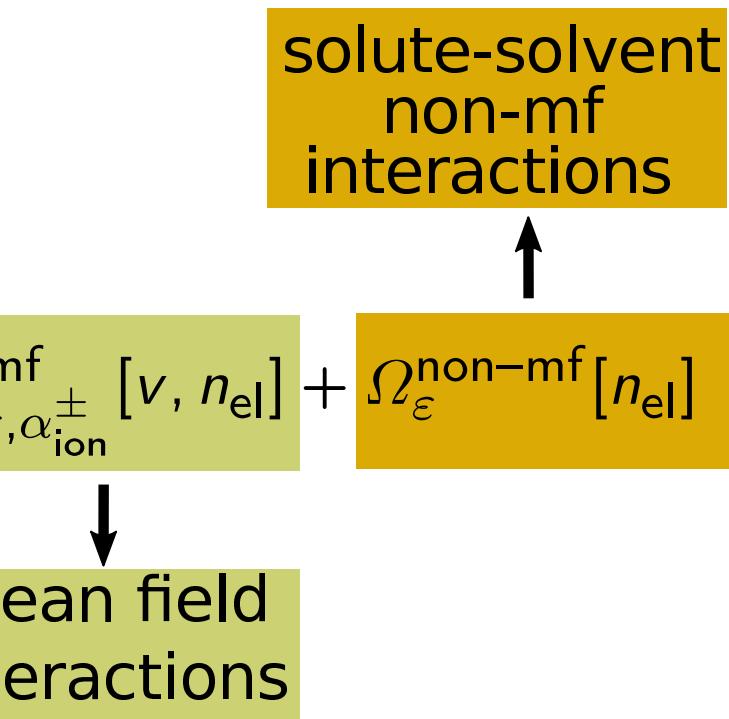
## Free energy functional

$$\Omega_{\varepsilon, \alpha_{\text{ion}}^{\pm}} [\nu, n_{\text{el}}] = T^S[n_{\text{el}}] + E^{\text{xc}}[n_{\text{el}}] +$$

$$\min_{\nu} \quad \min_{n_{\text{el}}}$$


SMPBE modified KS-eq.

Newton-Multipole-Expansion Relaxation Method (MERM)



# Solving the MPBE

**Regularisation**

$$v = v^{\text{free}} + \delta v$$

**Rewrite SMPB as root-finding Problem**

$$\mathcal{F}[v] = \nabla \cdot [\varepsilon \nabla v] + 4\pi(n_{\text{sol}} + n_{\text{ion}}[v]) = 0$$

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## Solve by relaxation method, recast as screened Poisson equation

$$(\Delta - \kappa^2)\delta v_{n+1} = -4\pi q[v_n] + \hat{L}_1[v_n]\delta v_{n+1} ,$$

$$\delta v_{n+1}(\mathbf{r}) = - \int d\mathbf{r}' G_1(|\mathbf{r} - \mathbf{r}'|) \left( -4\pi q[v_n(\mathbf{r}')] + \hat{L}_1[v_n(\mathbf{r}')]\delta v_{n+1}(\mathbf{r}') \right) ,$$

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Ringe, Oberhofer, Hille, Matera, and Reuter, J. Chem. Theor. Comput. **12**, 4052 (2016)

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## Solve Integral by Multi-centre multipole expansion MERM

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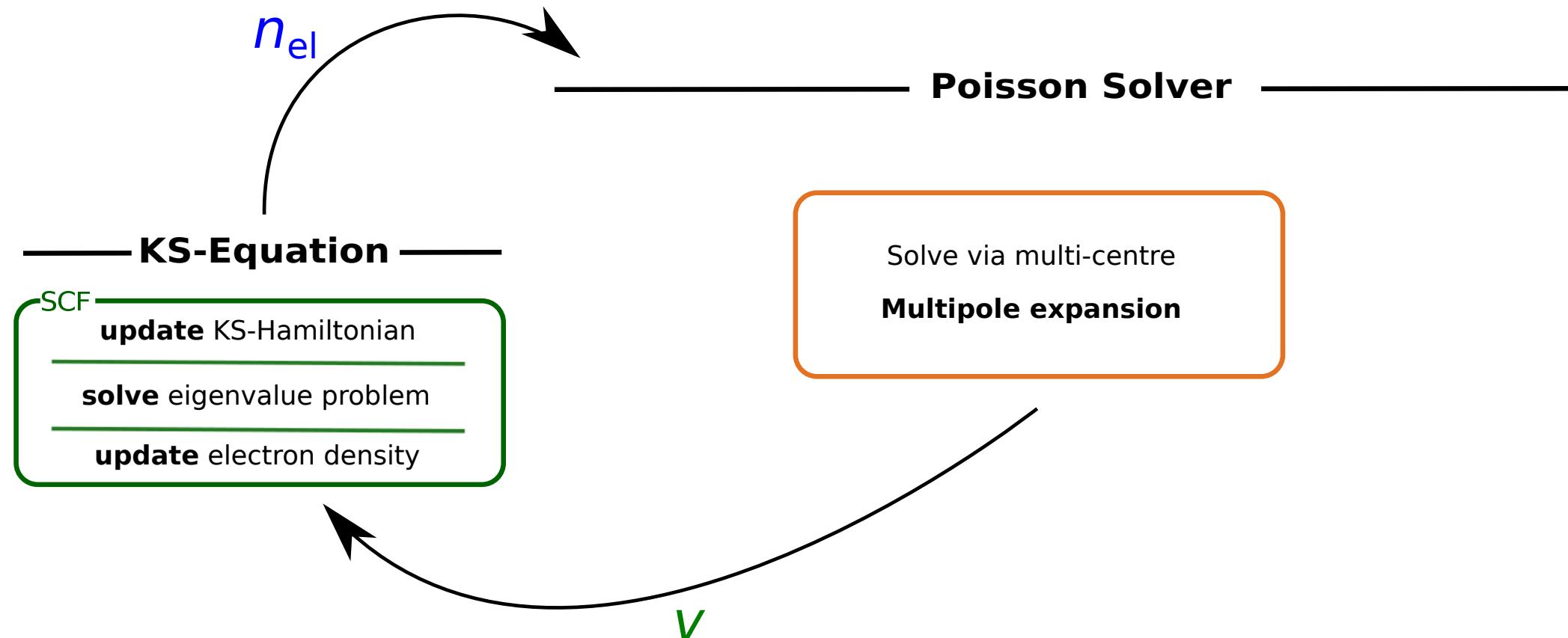
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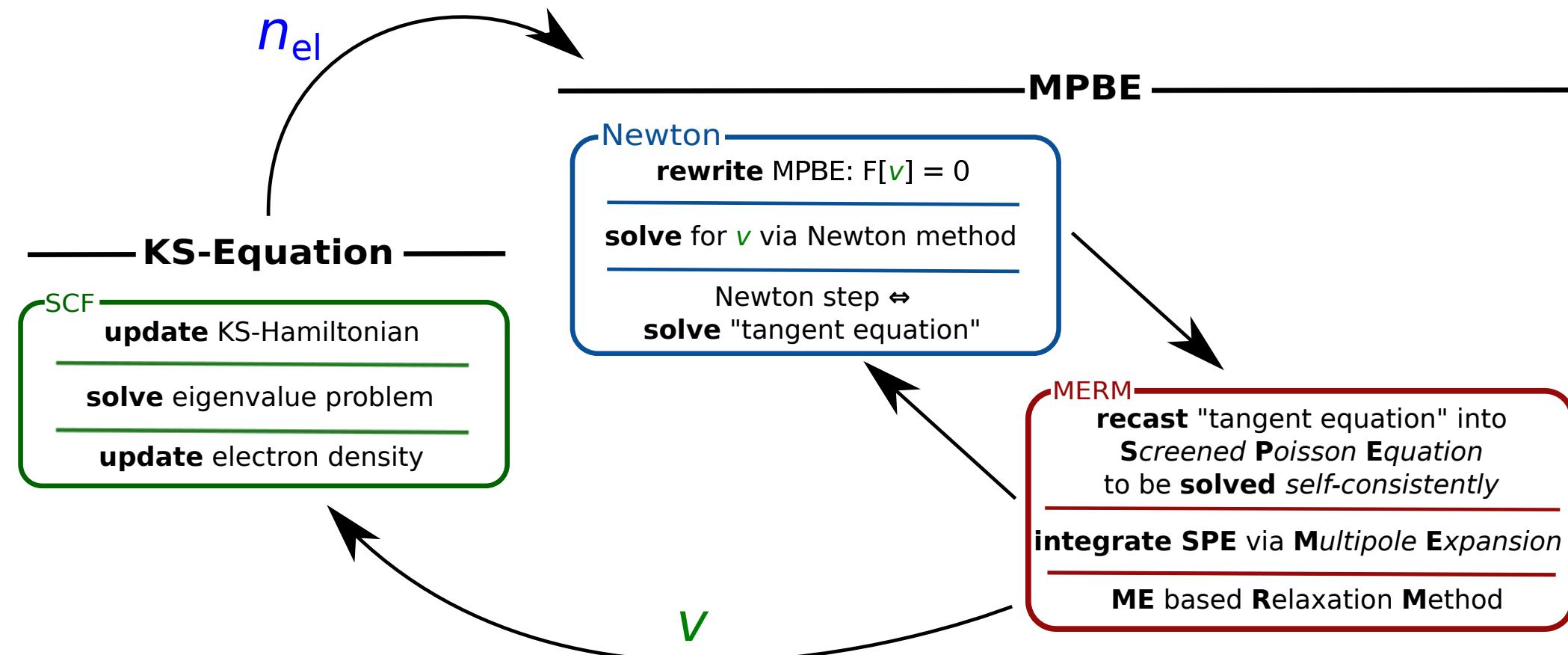
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