

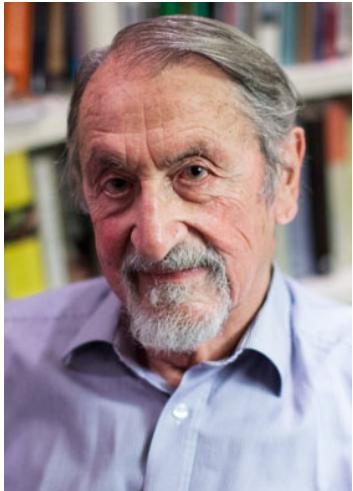
Molecular dynamics simulations of molten salts for MSFR

C. Simon

INP Orsay - EVOL - november 2013



Nobel prize for Molecular Dynamics



M. Karplus



M. Levitt



A. Warshel

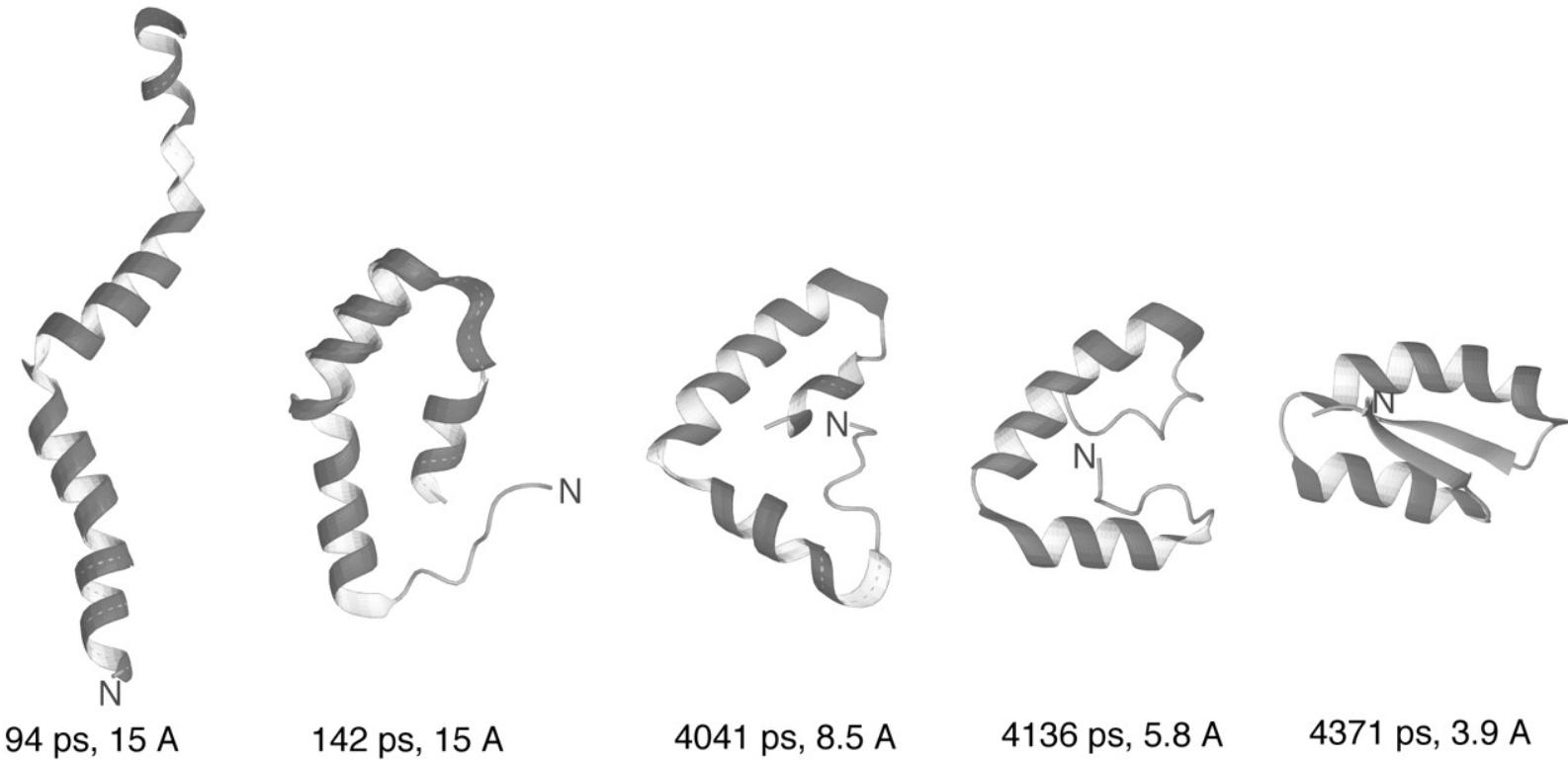
Prize motivation:

"for the development of multiscale models for complex chemical systems"

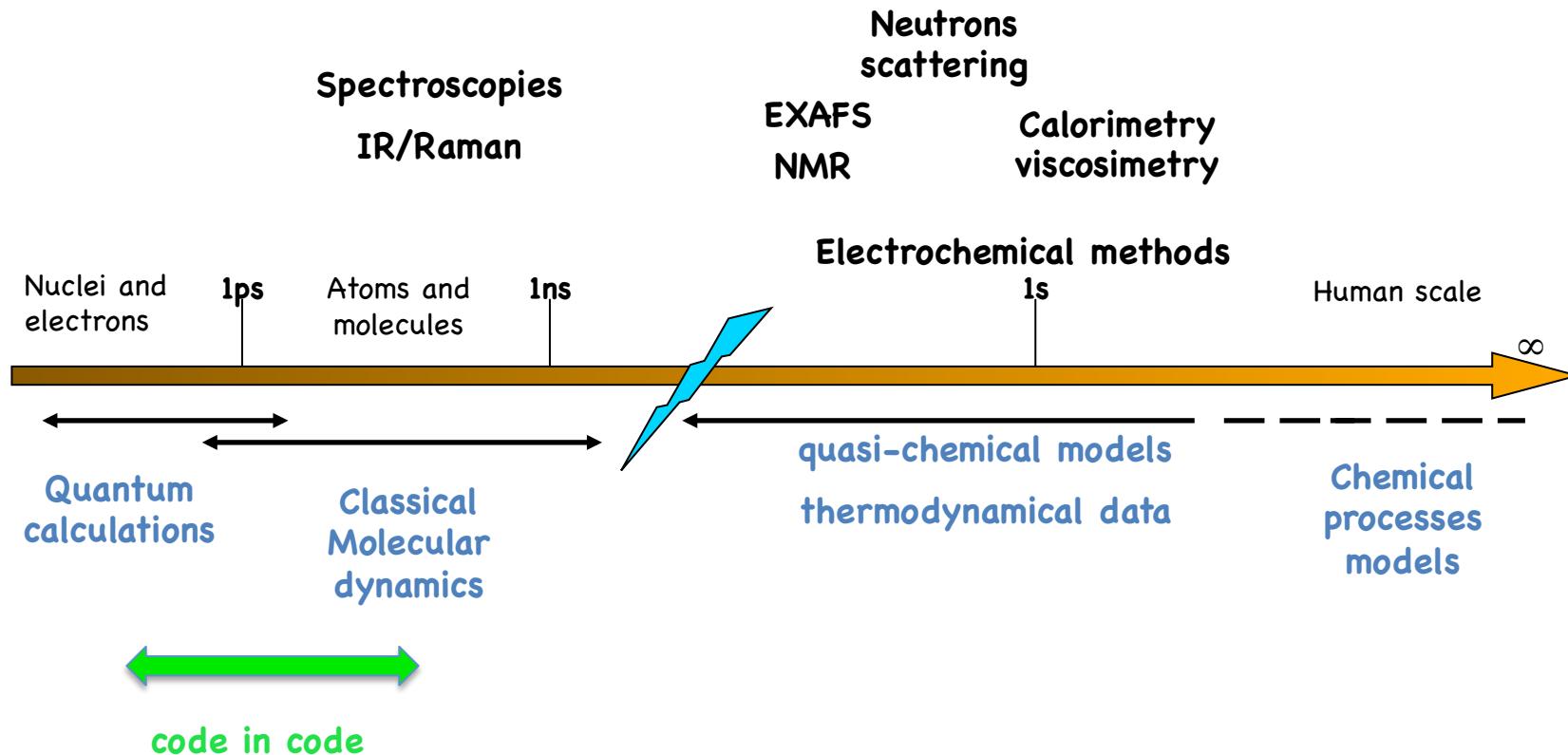
Application to biological systems

Prize motivation:

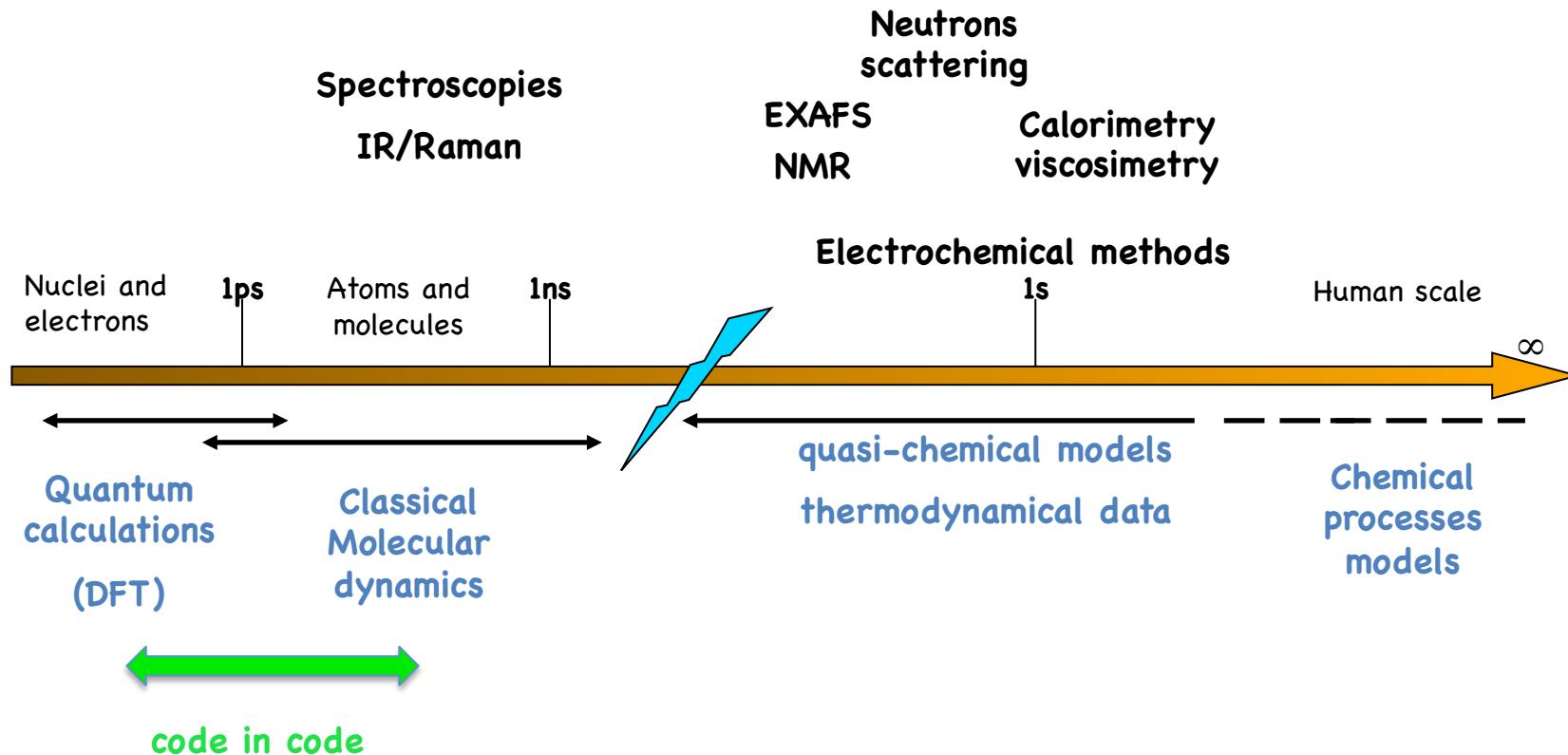
"for the development of multiscale models for complex chemical systems"



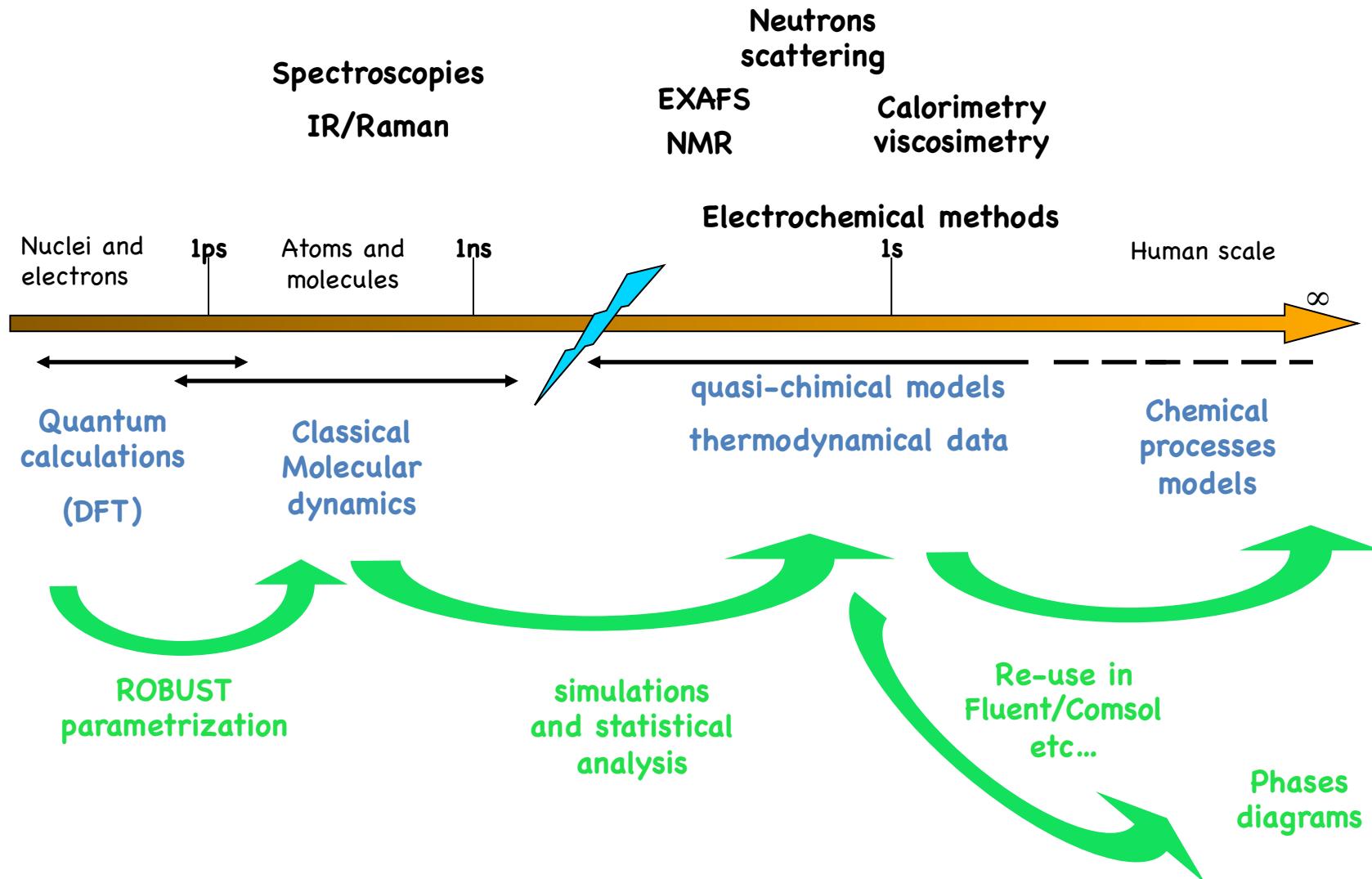
What are multiscale models ?



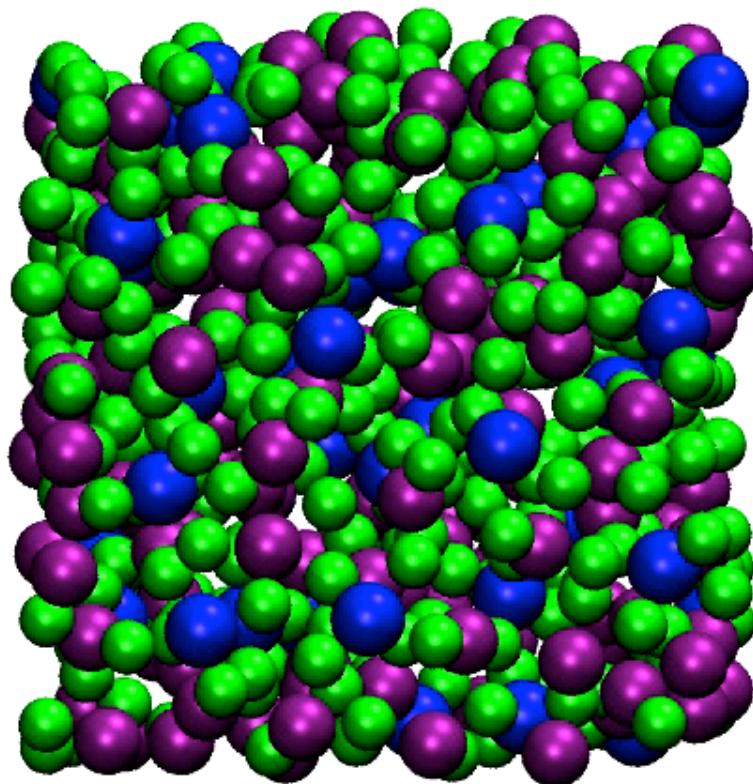
What are multiscale models ?



What are multiscale models ? Alternative approach



Molten salt simulation example



LiF-ThF₄

973 K - 1 ns

550 ions

How Molecular Dynamics works

Newtonian formulation :

$$f_i = -\frac{\partial V(q_i)}{\partial q_i} = \dot{p}_i = m_i \frac{d^2 q_i}{dt^2}$$

Idea to solve: limited development and iterative integration

~~Order 7 : Runge-Kutta~~

$$q_i(t + \delta t) = 2q_i(t) - q_i(t - \delta t) + \frac{f_i(t)}{m_i} \delta t^2$$

Used since the 60's, rigorously demonstrated > 1990 (Tuckerman and Martyna)

How it works

Newtonian formulation :

$$f_i = -\frac{\partial V(q_i)}{\partial q_i} = \dot{p}_i = m_i \frac{d^2 q_i}{dt^2}$$

Idea to solve: limited development and iterative integration

~~Order 7 : Runge-Kutta~~

~~Order 4-5 : Gear~~

$$q_i(t + \delta t) = 2q_i(t) - q_i(t - \delta t) + \frac{f_i(t)}{m_i} \delta t^2$$

Used since the 60's, rigorously demonstrated > 1990 (Tuckerman and Martyna)

How it works

Newtonian formulation :

$$f_i = -\frac{\partial V(q_i)}{\partial q_i} = \dot{p}_i = m_i \frac{d^2 q_i}{dt^2}$$

Idea to solve: limited development and iterative integration

~~Order 7 : Runge-Kutta~~

~~Order 4-5 : Gear~~

Order 2 : Verlet



$$q_i(t + \delta t) = 2q_i(t) - q_i(t - \delta t) + \frac{f_i(t)}{m_i} \delta t^2$$

Used since the 60's, rigorously demonstrated > 1990 (Tuckerman and Martyna)

How it works

- The model is fully described by $V(q_i)$
 - either in terms of potential
 - either in terms of force field (deriving from potential)
- Verlet algorithm yields trajectories of atoms and molecules
- From trajectories, statistical physics yield all properties

Fixed charges models

Coulomb potential:

$$V = \frac{z_i z_j e^2}{4\pi\epsilon_0 r_{ij}}$$

Pauli repulsion:

$$V = B_{ij} e^{-a_{ij} r_{ij}}$$

Dispersion:

$$V = - \left[\frac{C_6^{ij}}{r_{ij}^6} + \frac{C_{12}^{ij}}{r_{ij}^{12}} \right]$$

M. Tosi & F. Fumi *J. Phys. Chem. Solids*, **1964**, *25*, 45
F. Lantelme & P. Turq. *J. Chem. Phys.*, **1982**, *77*, 3177



Fixed charges models (2)

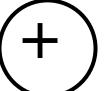
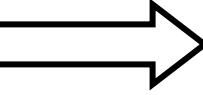
Origins of parameters a , B , C_6, C_8 :

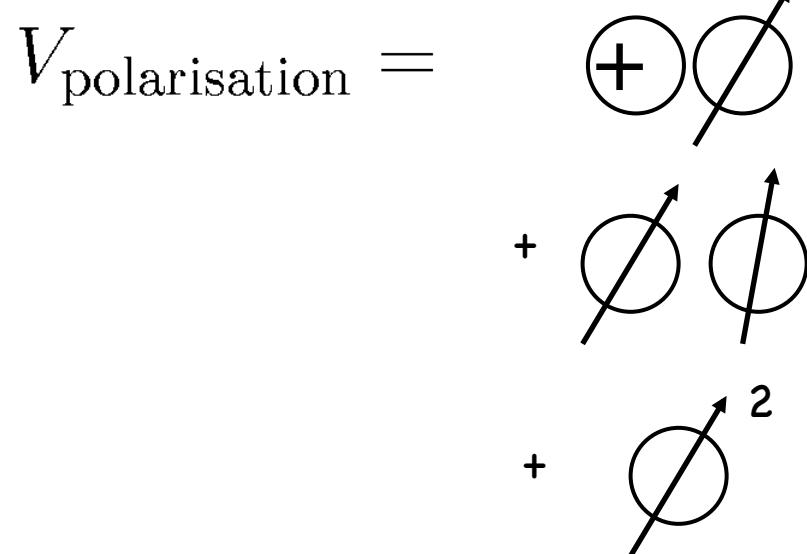
Empirically fitted to reproduce experimental data

This class of models is « fragile » :

- Pair potentials: no collective effects.
- Non-transferable parameters
- Limited validity ranges (temperature, composition, pressure)
- Impossible to describe mixtures
- Reliable for some properties and disastrous for others...

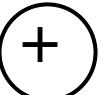
Polarization description

charge q^i   charge q^i and dipole μ^i 

$$V_{\text{polarisation}} =$$

$$+ \quad + \quad +$$

$$2$$

Polarization description

charge q^i  \longrightarrow charge q^i and dipole μ^i 

$$V_{\text{polarisation}} = \sum_{ij} \left(q^i \mu_\alpha^j g_D^{ij}(r^{ij}) - q^j \mu_\alpha^i g_D^{ij}(r^{ij}) \right) T_{ij}^\alpha$$

$$- \mu_\alpha^i \mu_\beta^j T_{ij}^{\alpha\beta}$$

$$+ \sum_i \frac{1}{2\alpha^i} |\mu^i|^2$$

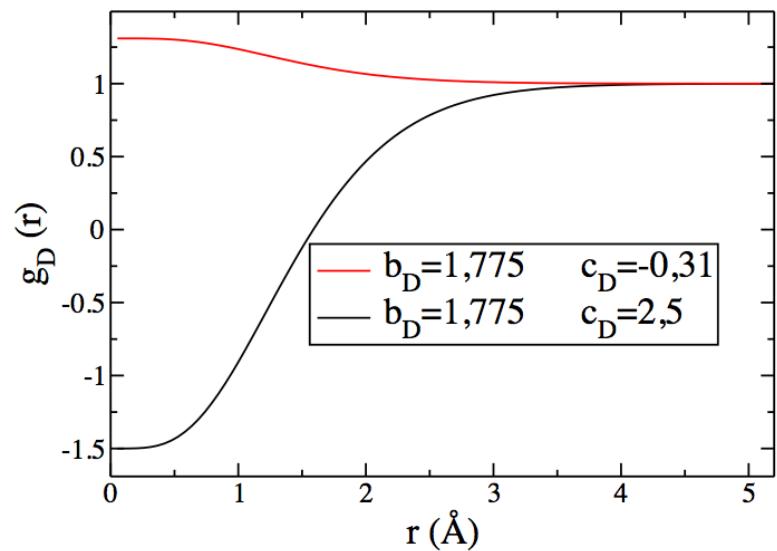
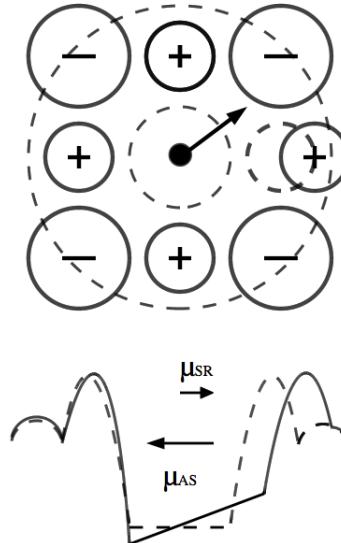
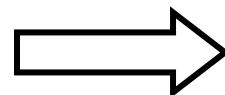
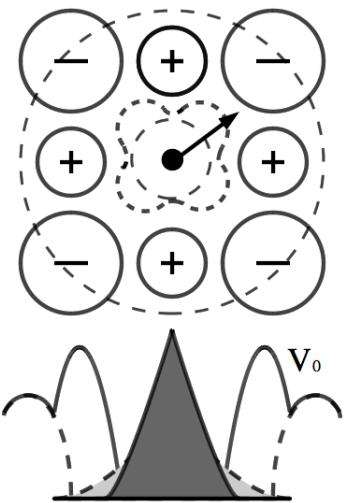


$$T_{ij}^\alpha = \nabla_\alpha \frac{1}{r^{ij}} \quad T_{ij}^{\alpha\beta} = \nabla_\alpha \nabla_\beta \frac{1}{r^{ij}} \quad \alpha, \beta \equiv x, y, z$$

α^i : polarisability dipole $\mu^i = \alpha^i E$ field

Polarization description (2)

Electronic density confinement
(in condensed phase)



anion : $c_D > 0$
cation : $c_D < 0$

$$g_D(r) = 1 - c_D e^{-b_D \times r} \sum_{k=0}^4 \frac{(b_D \times r)^k}{k!}$$

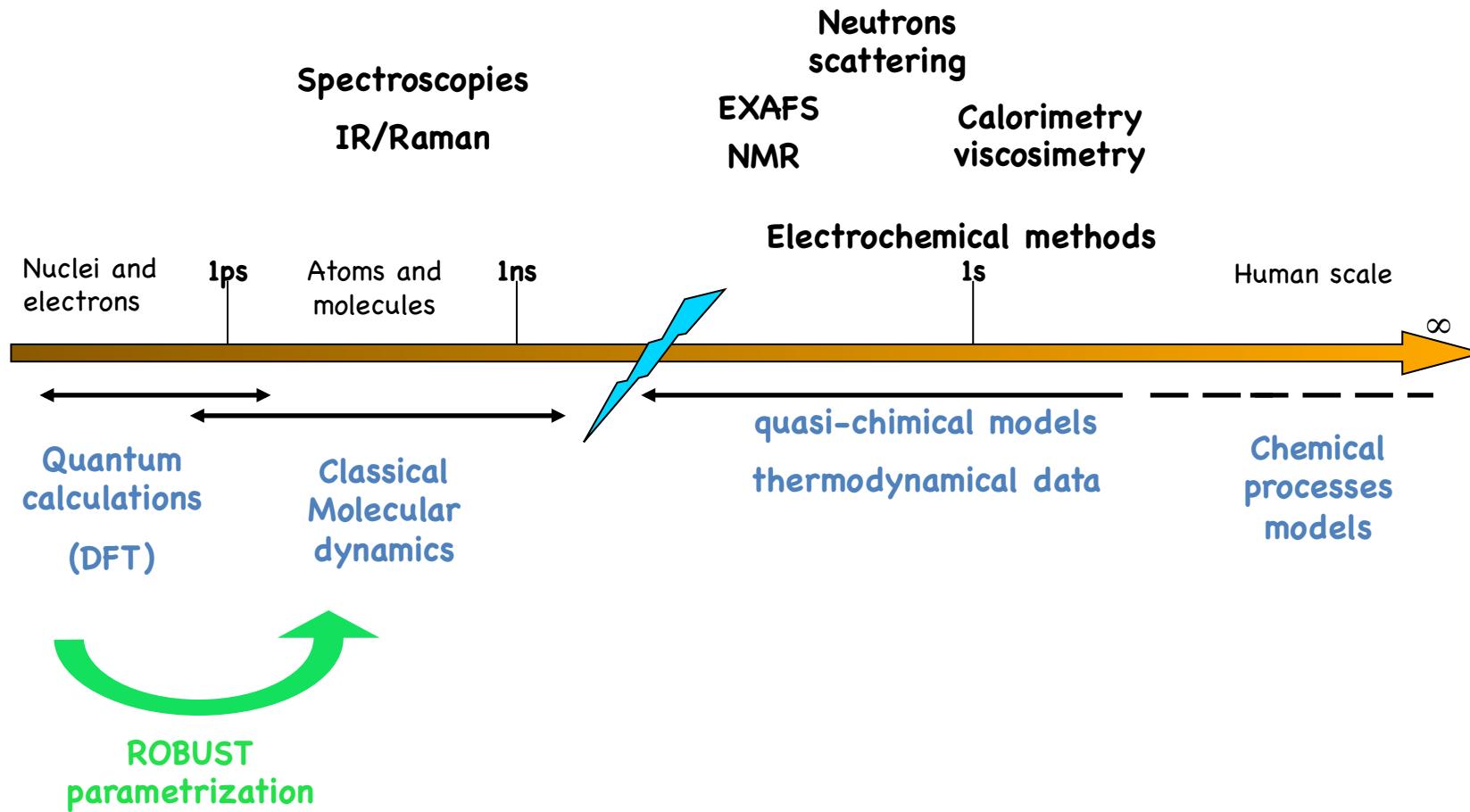
Polarization description (3)

Origins of parameters a, B, C_6, C_8, a, b, c :

Empirically fitted to reproduce experimental data

More tolerant models, but still non-transferable
Too much empirical parameters !

How to parametrize ?



How to use quantum mechanics ?

We need to compute dipoles, and therefore charges.

Many tools are available :

- Mulliken charges
- Davidson charges
- ELF
- RESP
- etc...

Often difficult to interpret

Often non-consistent

How to use quantum mechanics ?

We need to compute dipoles, and therefore charges.

Many tools are available :

- Mulliken charges
- Davidson charges
- ELF
- RESP
- etc...

Often difficult to interpret

Often non-consistent



Walter Kohn
(Nobel prize 1998)

For condensed phase, DFT is the main method

Wannier localization is the best method

How to use quantum mechanics ?

We need to compute dipoles, and therefore charges.

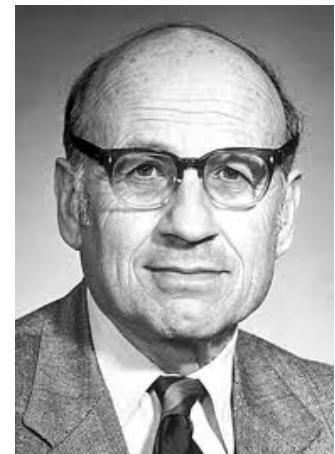
Many tools are available :

- Mulliken charges
- Davidson charges
- ELF
- RESP
- etc...

Often difficult to interpret

Often non-consistent

For condensed phase, DFT is the main method
Wannier localization is the best method



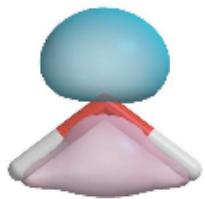
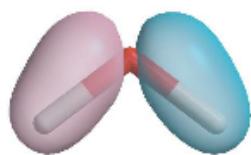
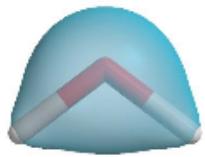
Walter Kohn
(Nobel prize 1998)



Scanned at the American
Institute of Physics

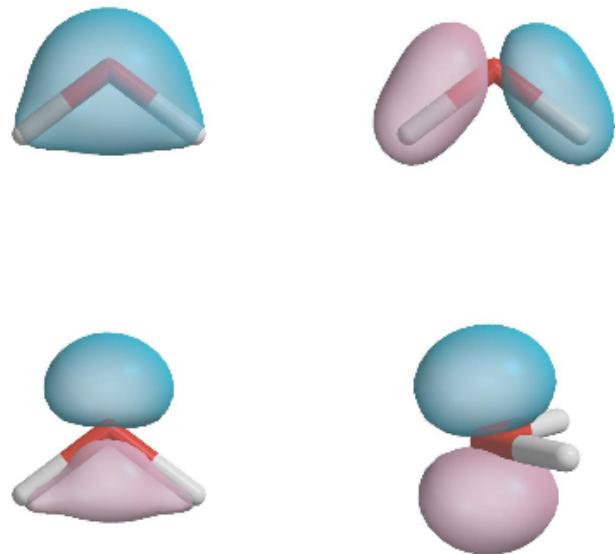
Wannier orbitals

Kohn-Sham canonical orbitals

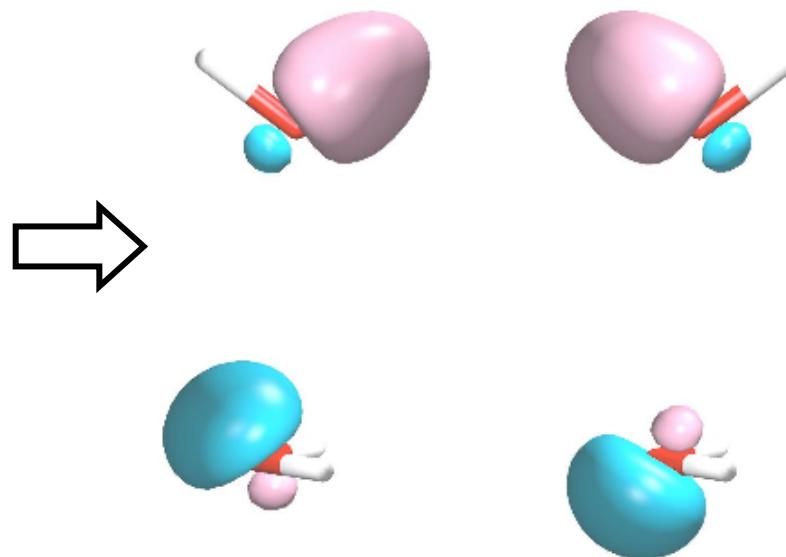


Wannier orbitals

Kohn-Sham canonical orbitals

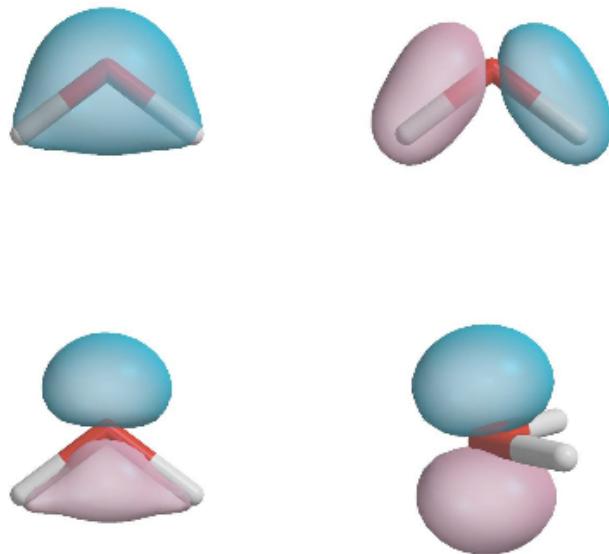


Localized Wannier orbitals

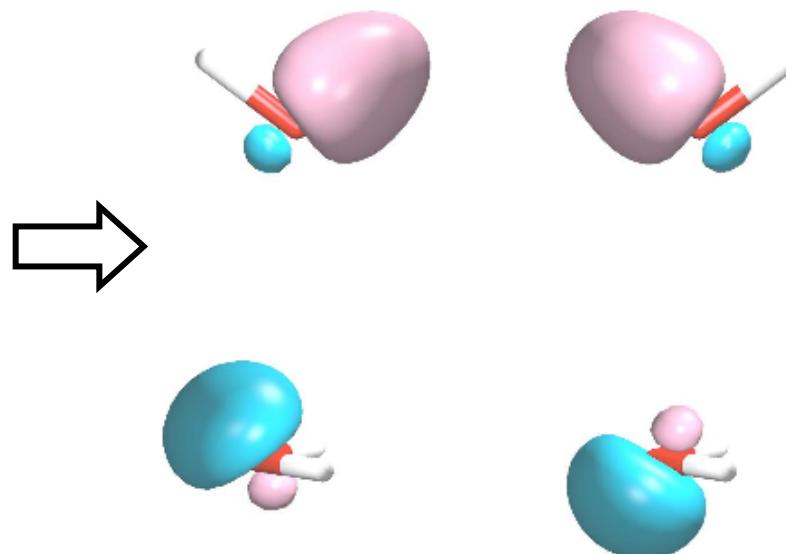


Wannier orbitals

Kohn-Sham canonical orbitals



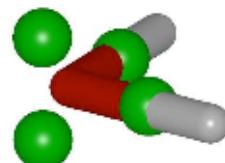
Localized Wannier orbitals



One criteria : minimize the spread

$$S = \sum_{k=1}^{N_{states}} \left[\langle w_k | r^2 | w_k \rangle - \langle w_k | \vec{r} | w_k \rangle^2 \right]$$

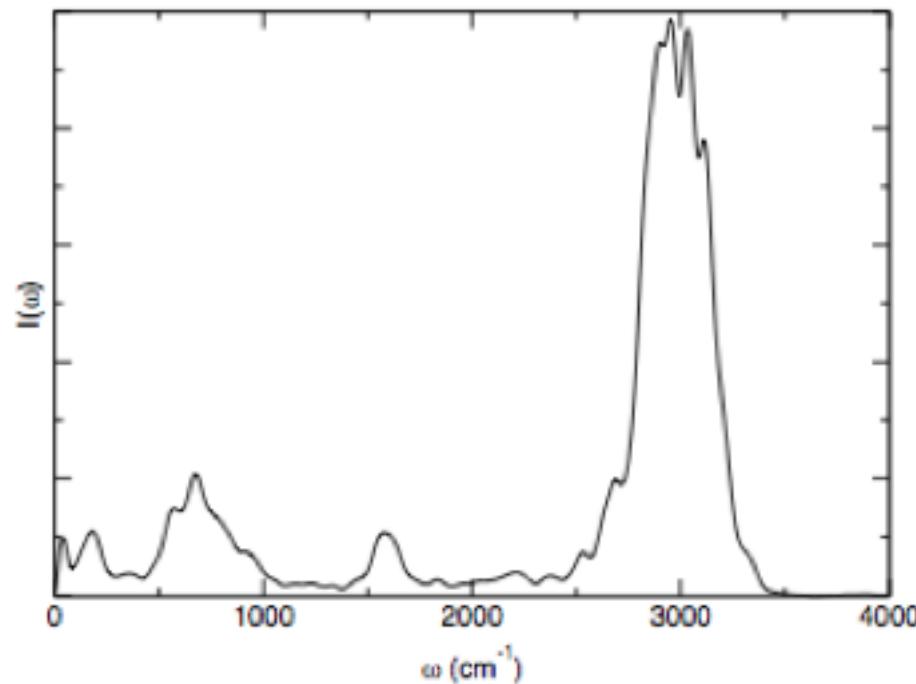
Wannier centers :



charges:
 $q_H = +1$ $q_O = +6$
 $q_{WC} = -2$

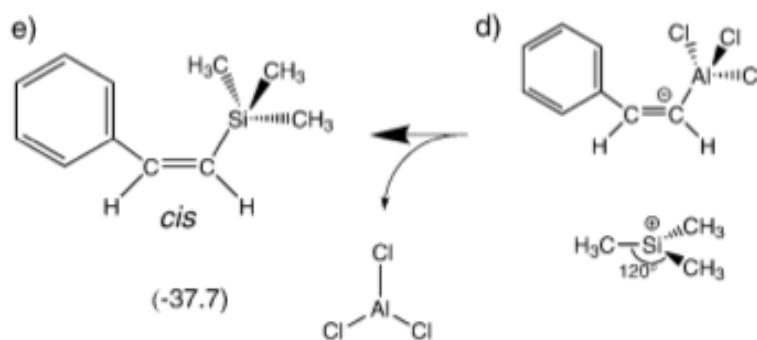
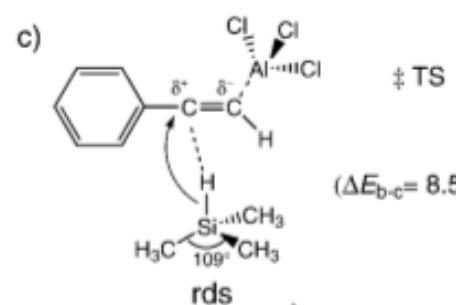
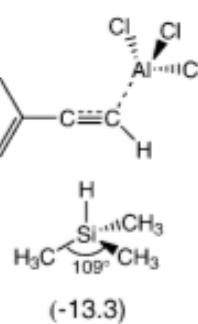
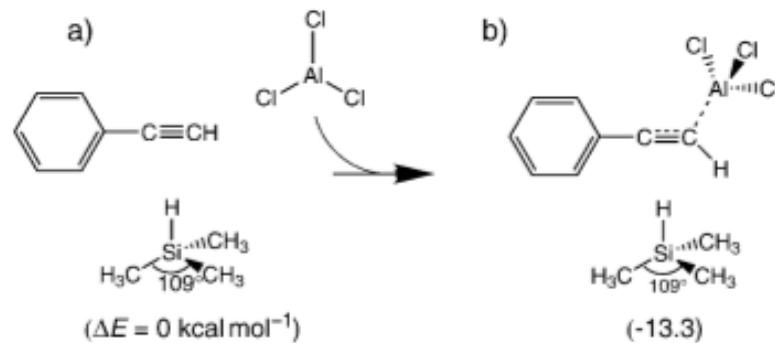
Wannier centers have physical meaning

Water infrared spectrum

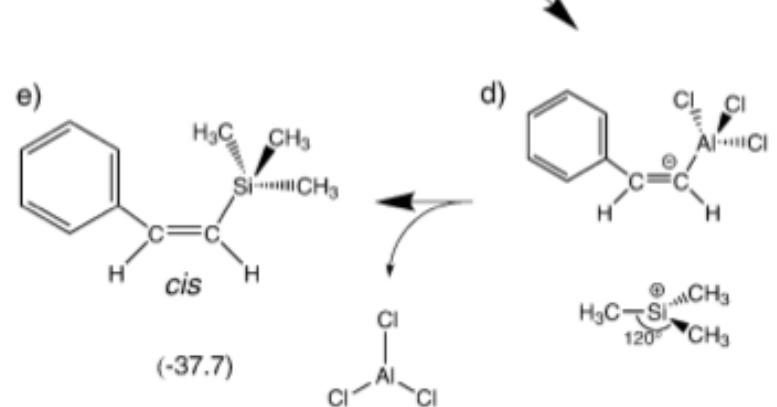
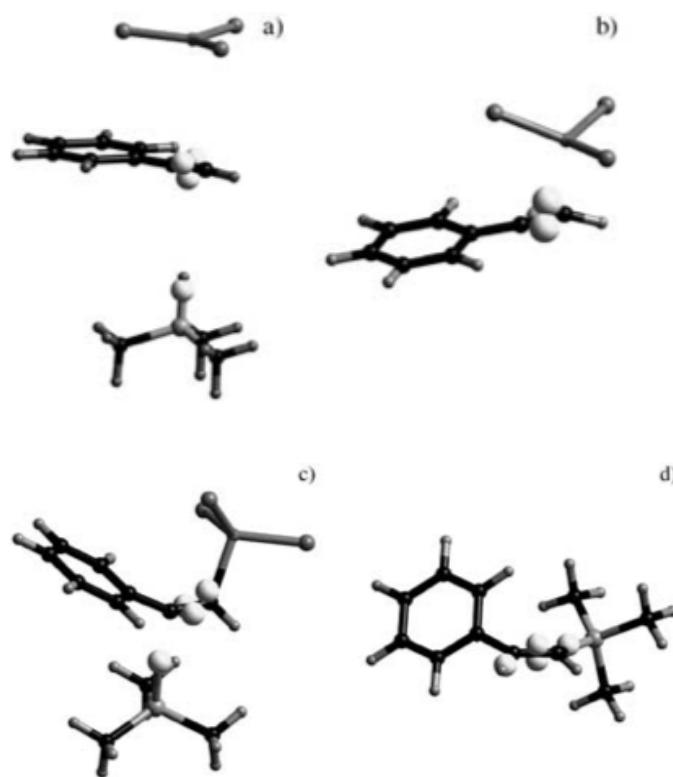
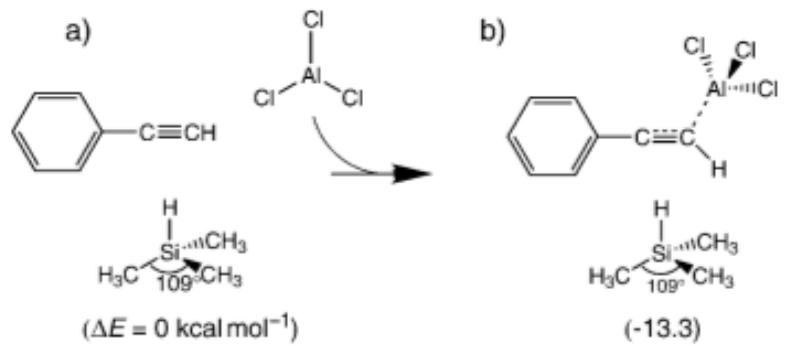


$$I(\omega) = \frac{\beta\omega^2}{2} \int_{-\infty}^{\infty} e^{i\omega t} \langle M(0)M(t) \rangle_0 dt$$

Wannier centers have chemical meaning

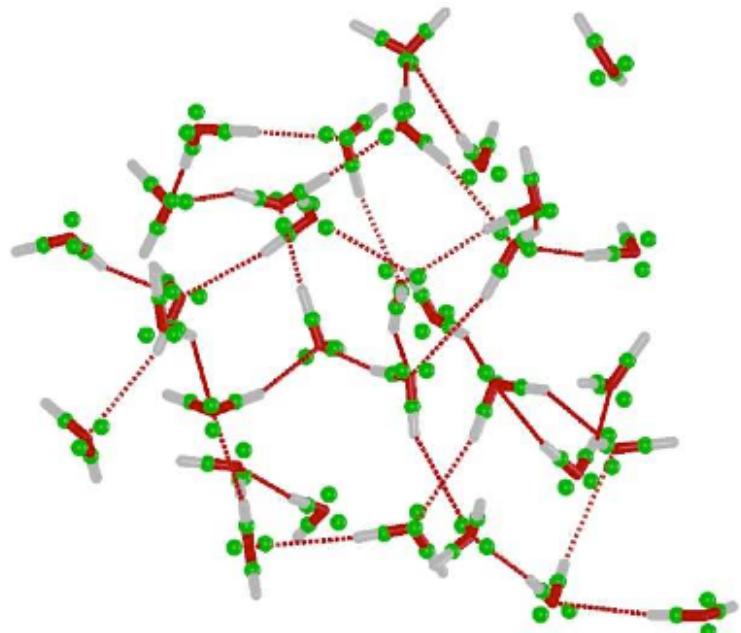


Wannier centers have chemical meaning



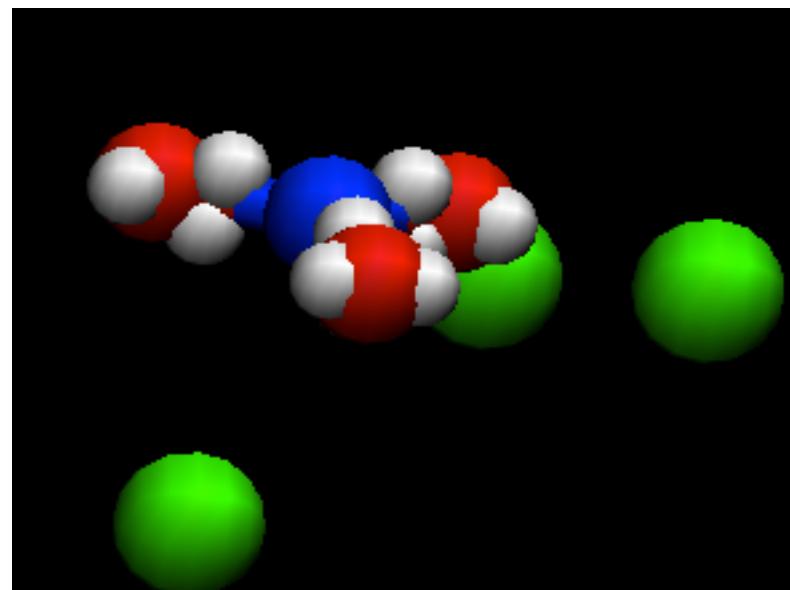
Zipoli et al., *ChemPhysChem*,
2005, 6, 1772

Wannier have limitations...

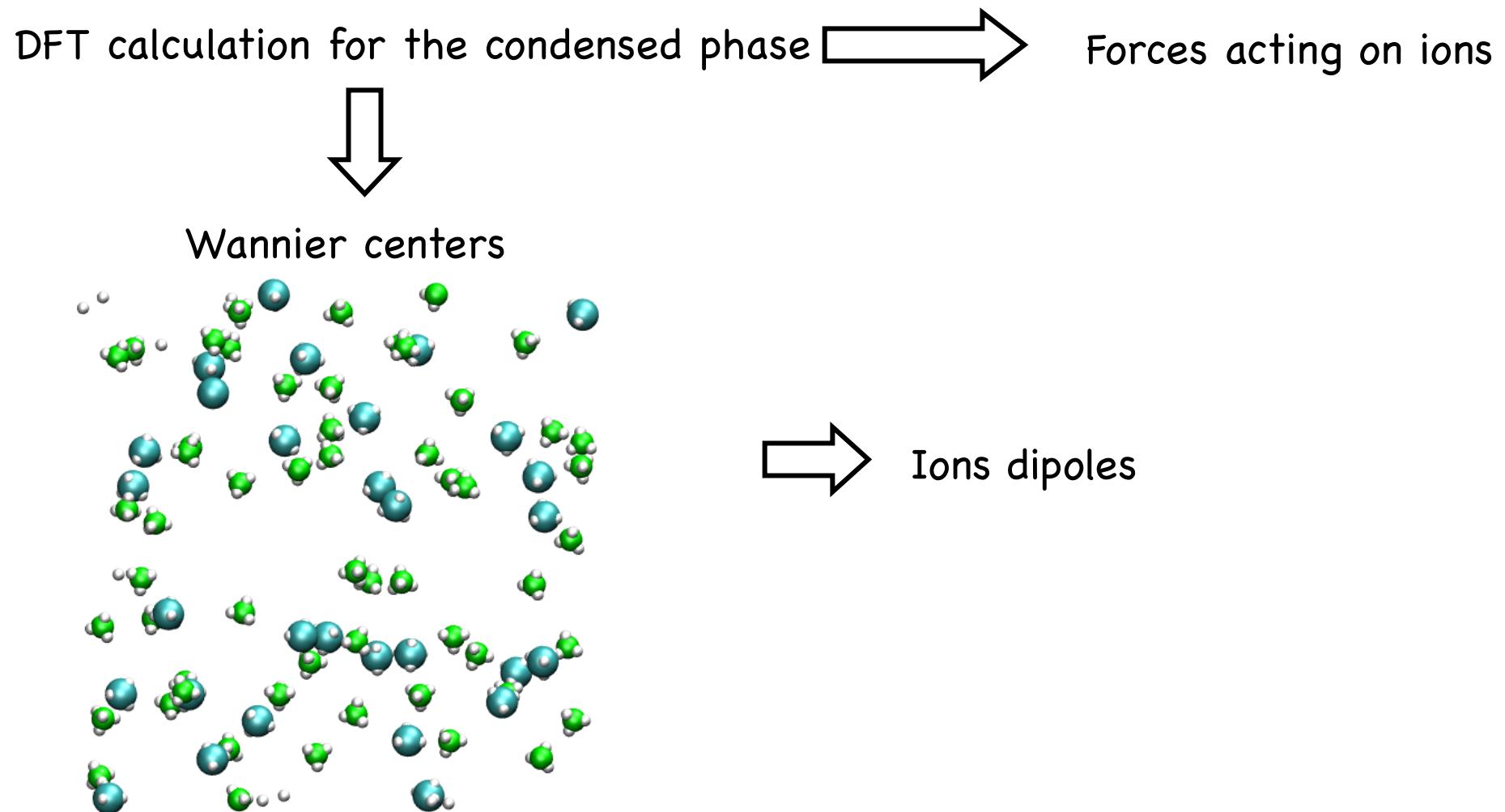


H-bonding

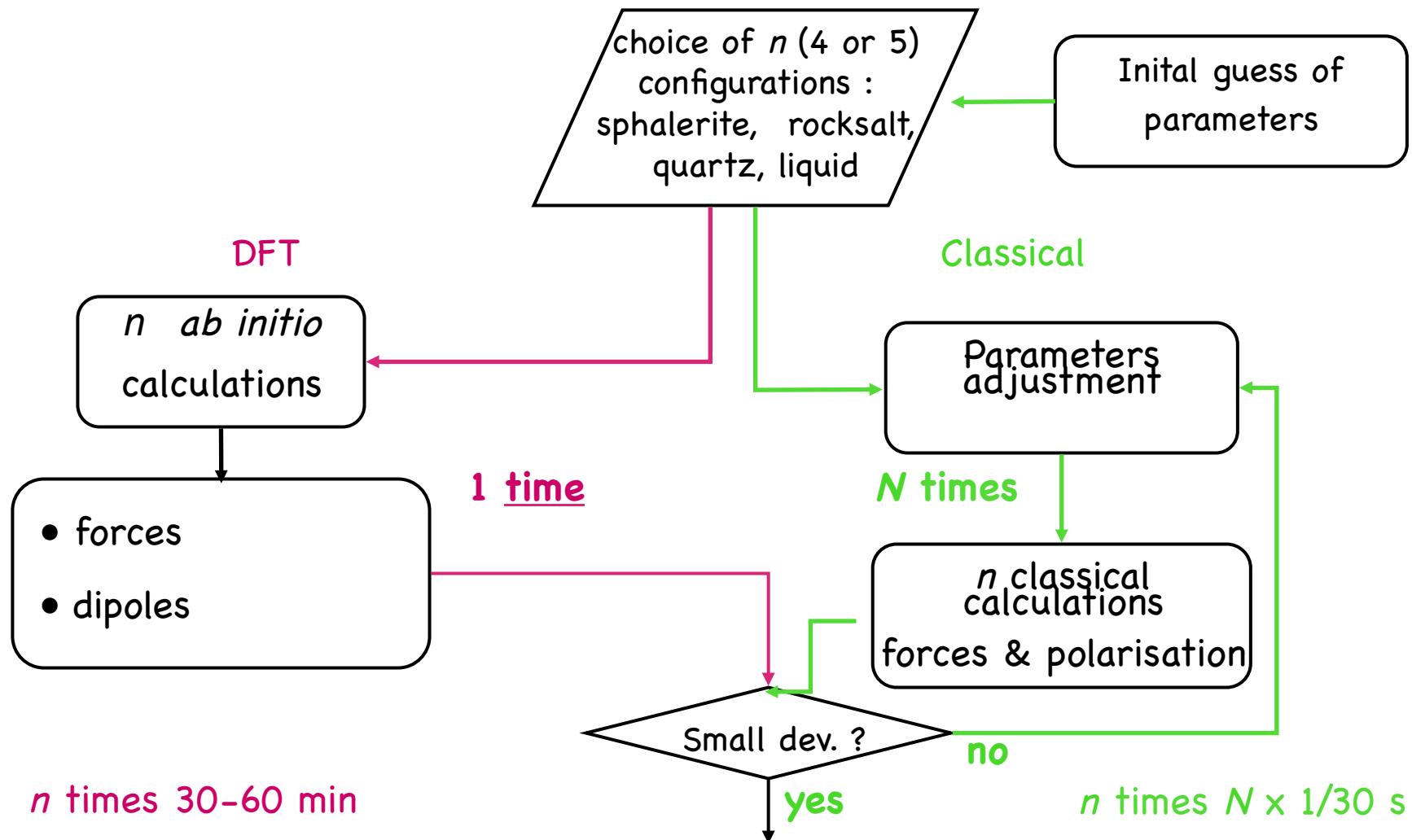
Conjugaison



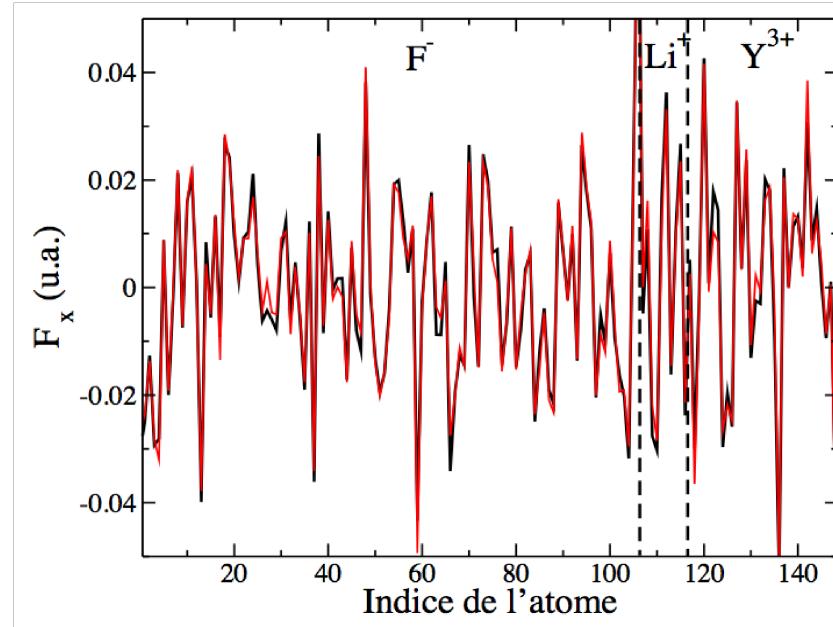
Use of Wannier centers to build models



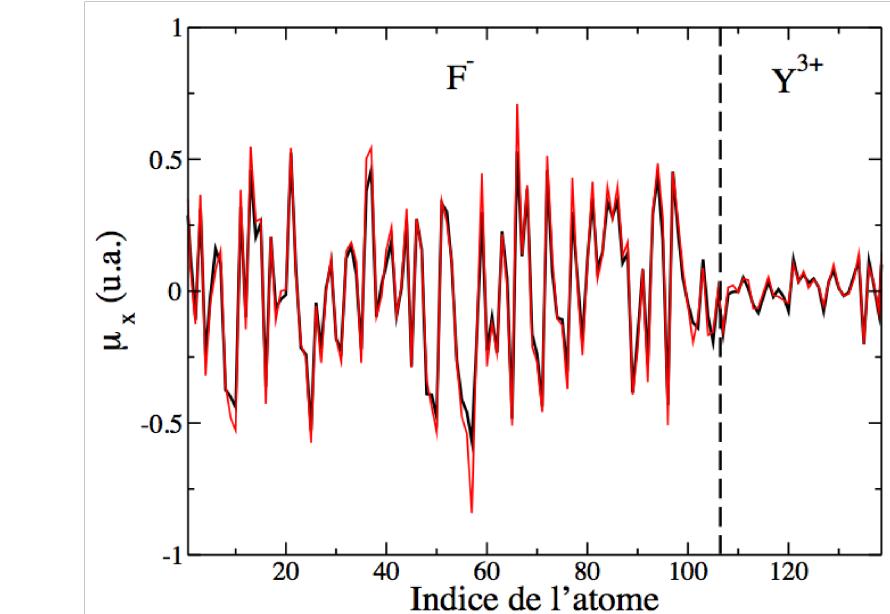
Algorithm



Results



$$c_P = 5,6 \%$$



and

$$c_F = 6,8 \%$$

Parameters fitted on DFT :

B, a, α, b, c .

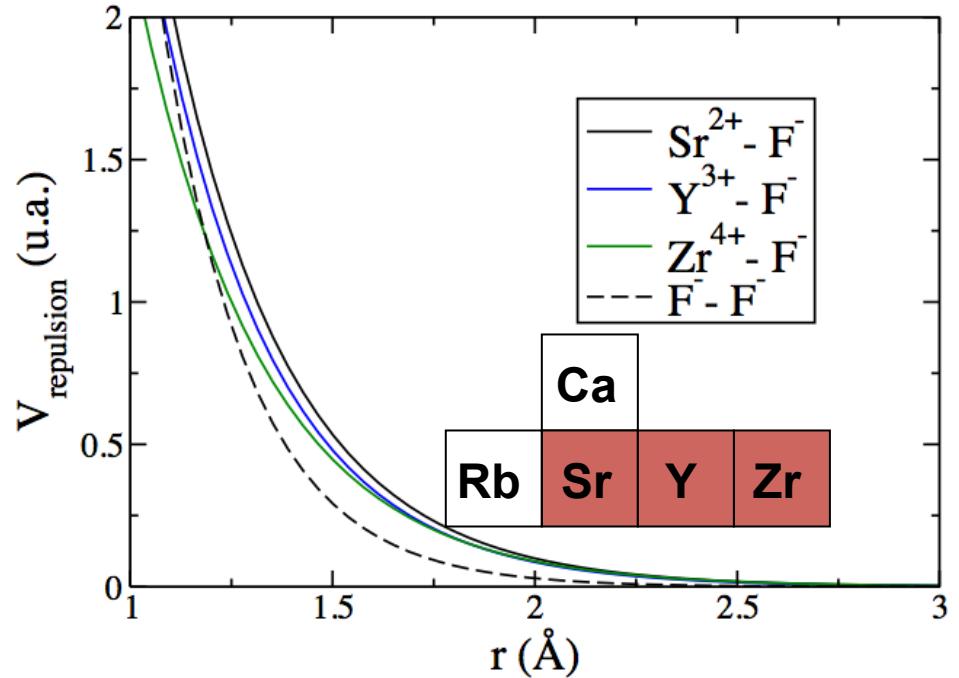
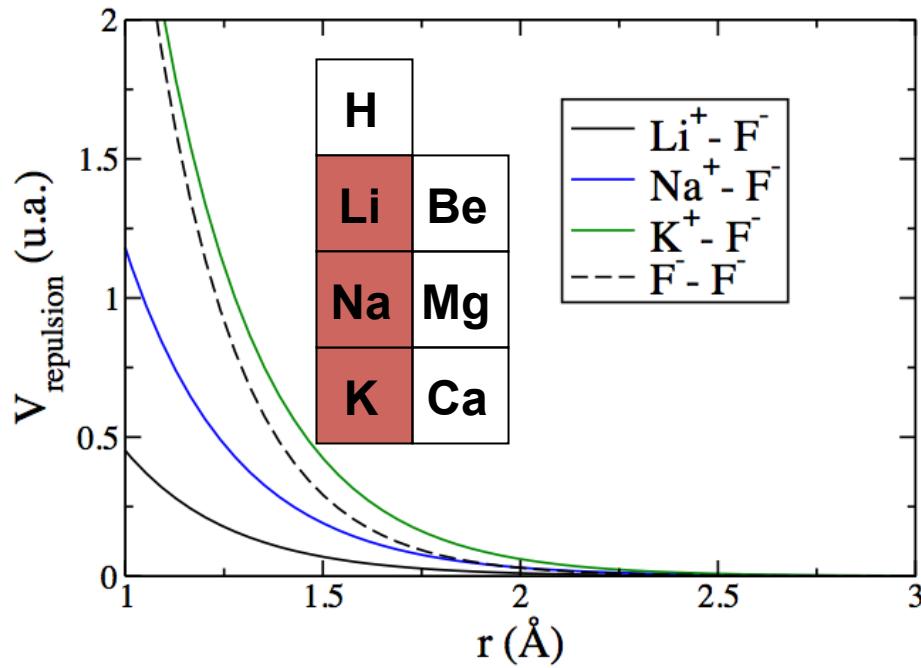
Still C_6, C_8 empirical

Non-sensitive to choices

- pseudo-potentials
- functional (PBE, BLYP...)

Transferable models

Meaningful parameters

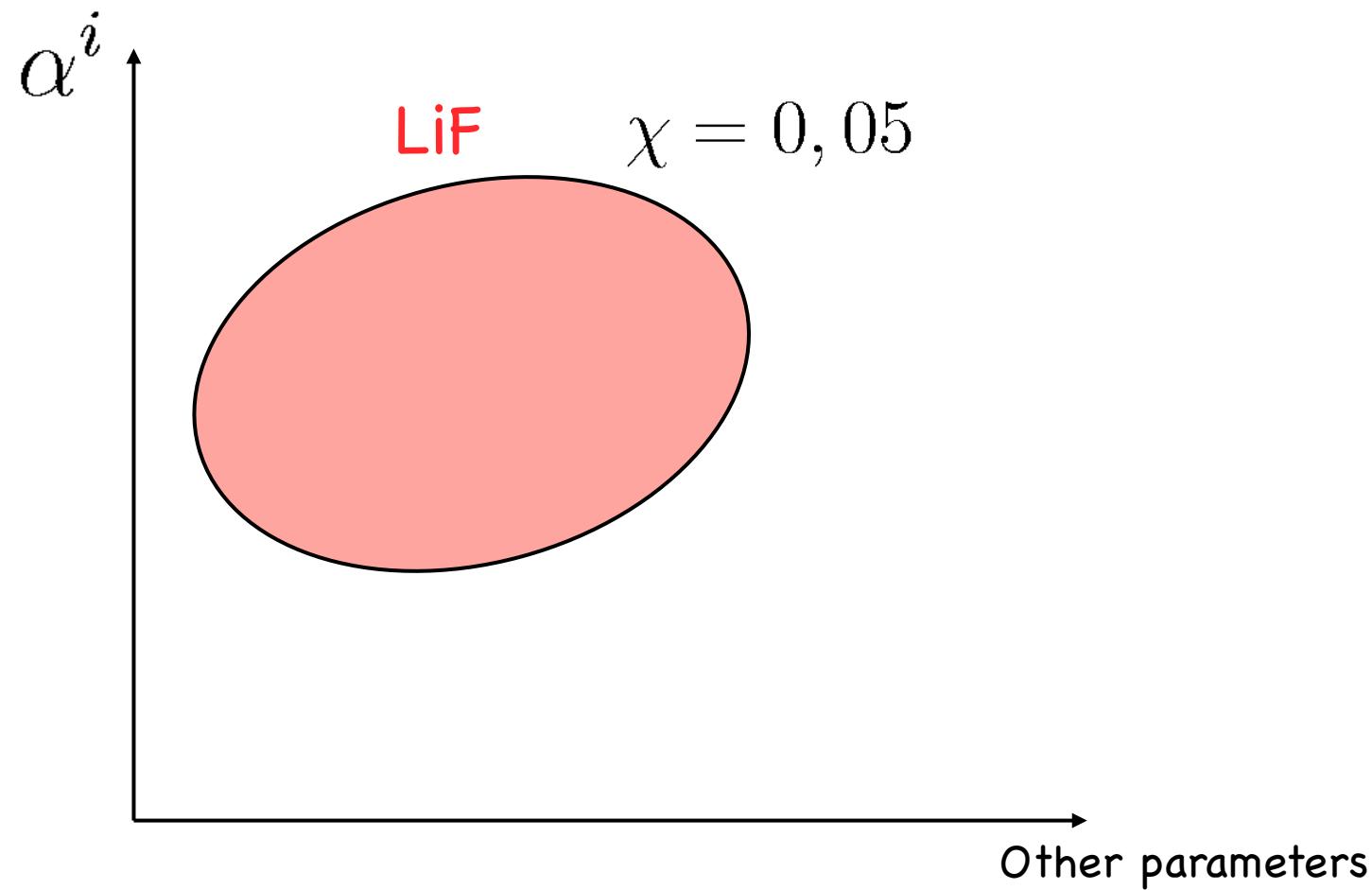


In the **column**, cation radius **increases with Z**

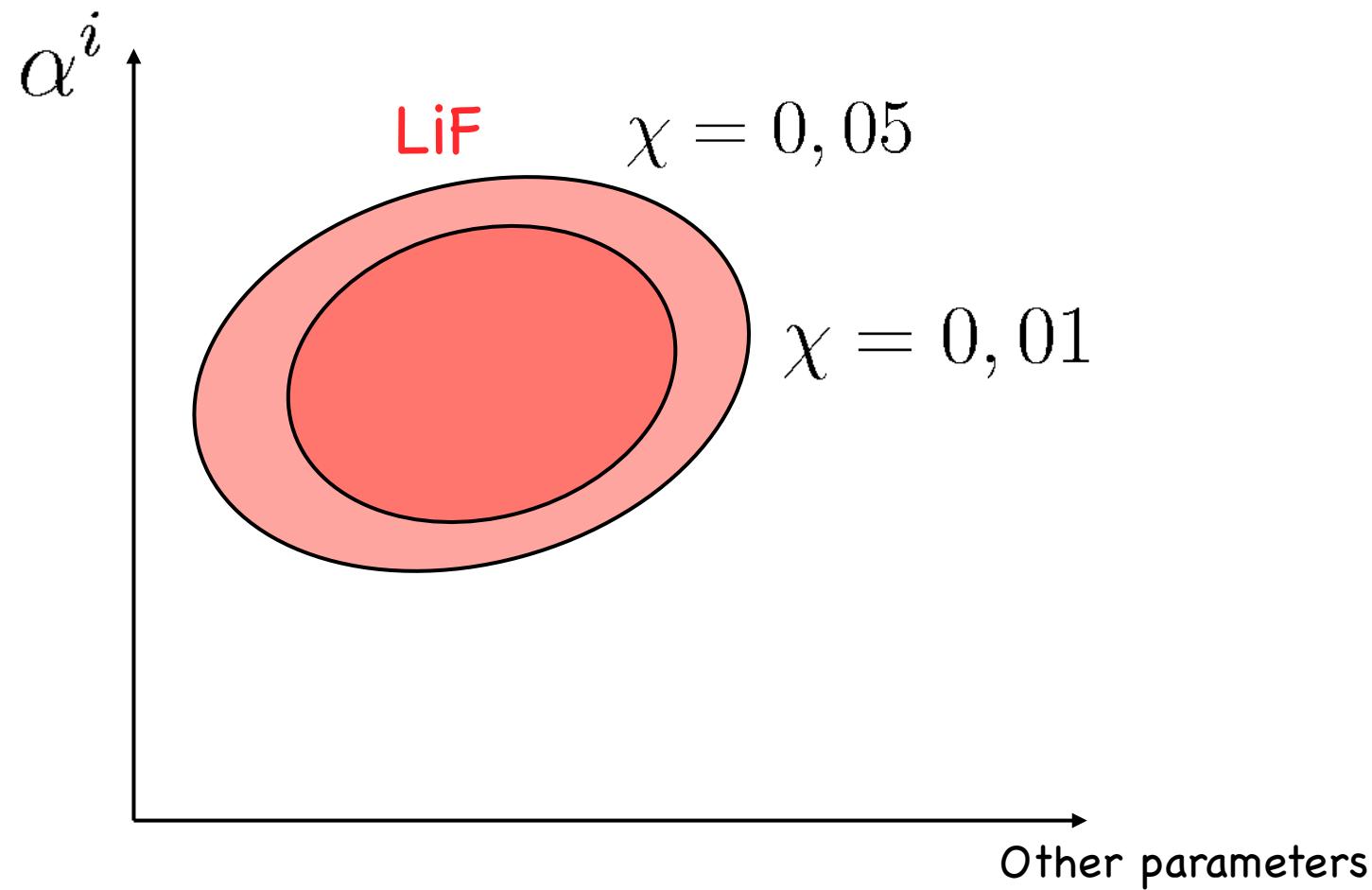
In the **period**, cation radius is almost **constant**

Transferable potentials : all the mixtures use the same parameters

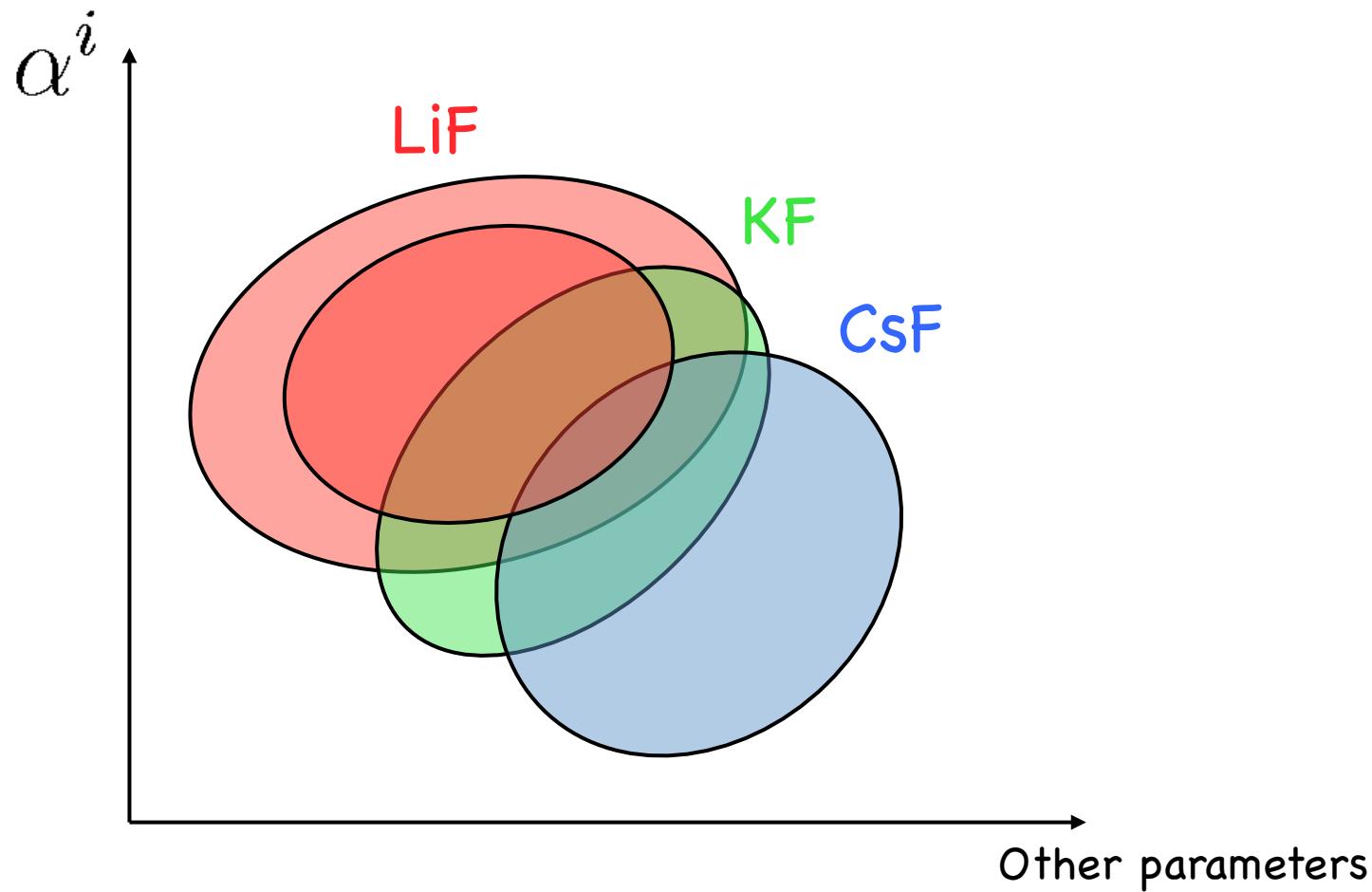
Can we fit a global model ?



Can we fit a global model ?



Can we fit a global model ?



Fitted models (and validated !)

Fluorides (non-empirical)

Li^+ , Na^+ , K^+ , Cs^+ ,

Be^{2+} , Ca^{2+} , Sr^{2+} , Ba^{2+} , (Sn^{2+} , Pb^{2+})

Y^{3+} , Al^{3+} , La^{3+}

Zr^{4+} , Th^{4+} , (U^{4+})

Chlorides (semi-empirical, non-empirical in progress)

Li^+ , Na^+ , K^+ , ...

Sc^{3+} , Y^{3+} , La^{3+} , Tb^{3+} , U^{3+}

Oxydes (semi-empirical, non-empirical)

Ca^{2+} , Mg^{2+} , Sr^{2+} , Ba^{2+}

Al^{3+}

Si^{4+}

Simple applications examples

Thermodynamical properties
Structure
IR-Raman
Transport properties
(diffusion, electrical conductivity, viscosity)

Thermodynamics

Obviously....

Thermodynamics

Obviously...

$$U = \langle V \rangle$$

Thermodynamics

Obviously...

$$U = \langle V \rangle$$

Thermodynamical properties U, C_v, H, C_p

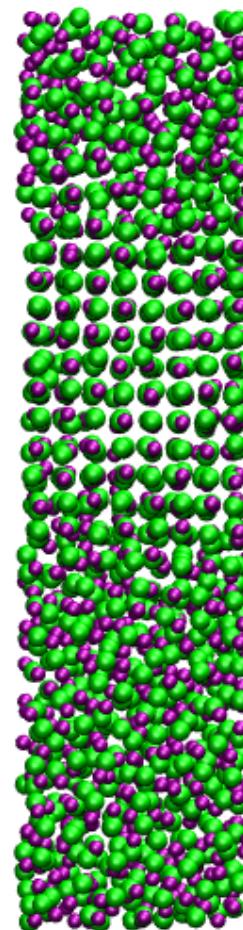
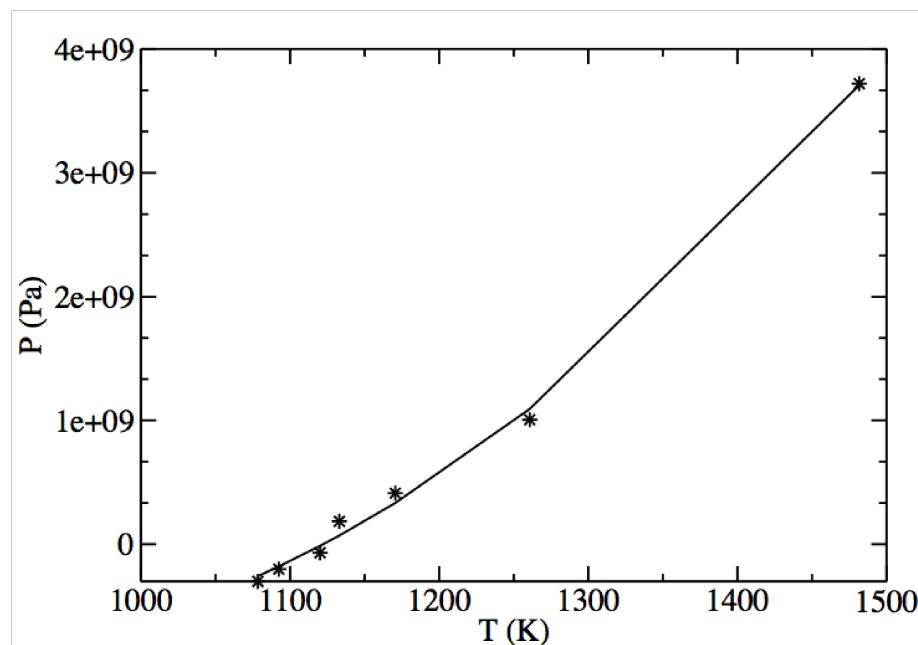
Thermodynamics

Thermodynamical properties U , C_v , H , C_p
(we even have access to the contributions of various interactions)

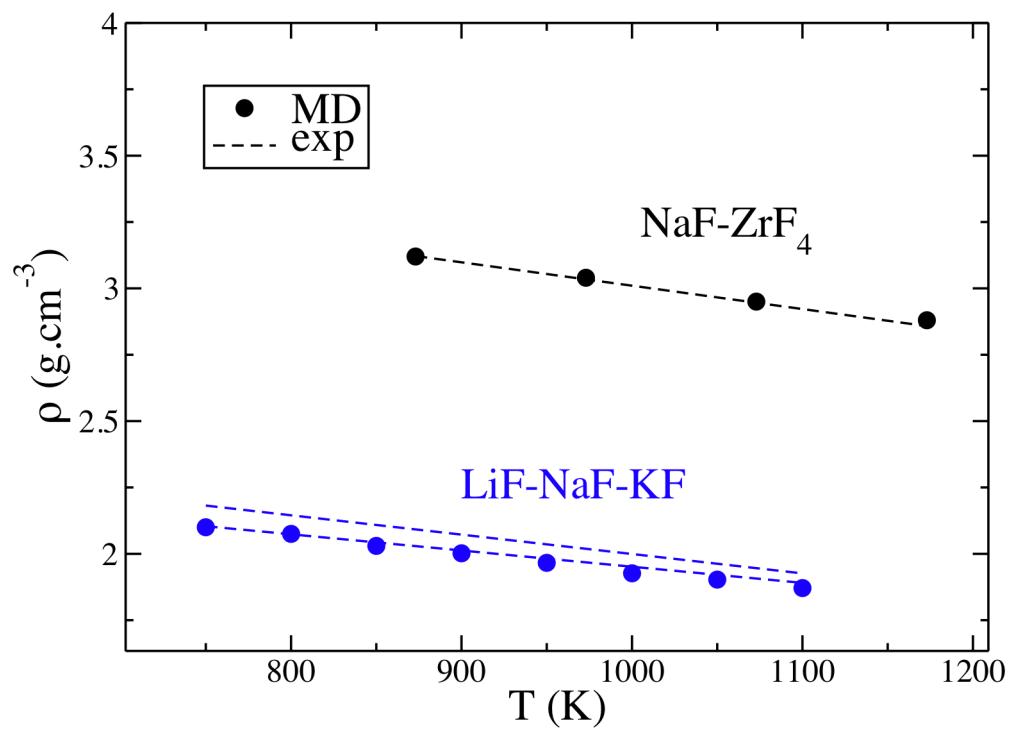
Phase changes :

$$\text{LiF} : T_{\text{exp}} = 1121 \pm 2 \text{ K}$$

$$T_{\text{calc}} = 1122 \pm 1 \text{ K}$$



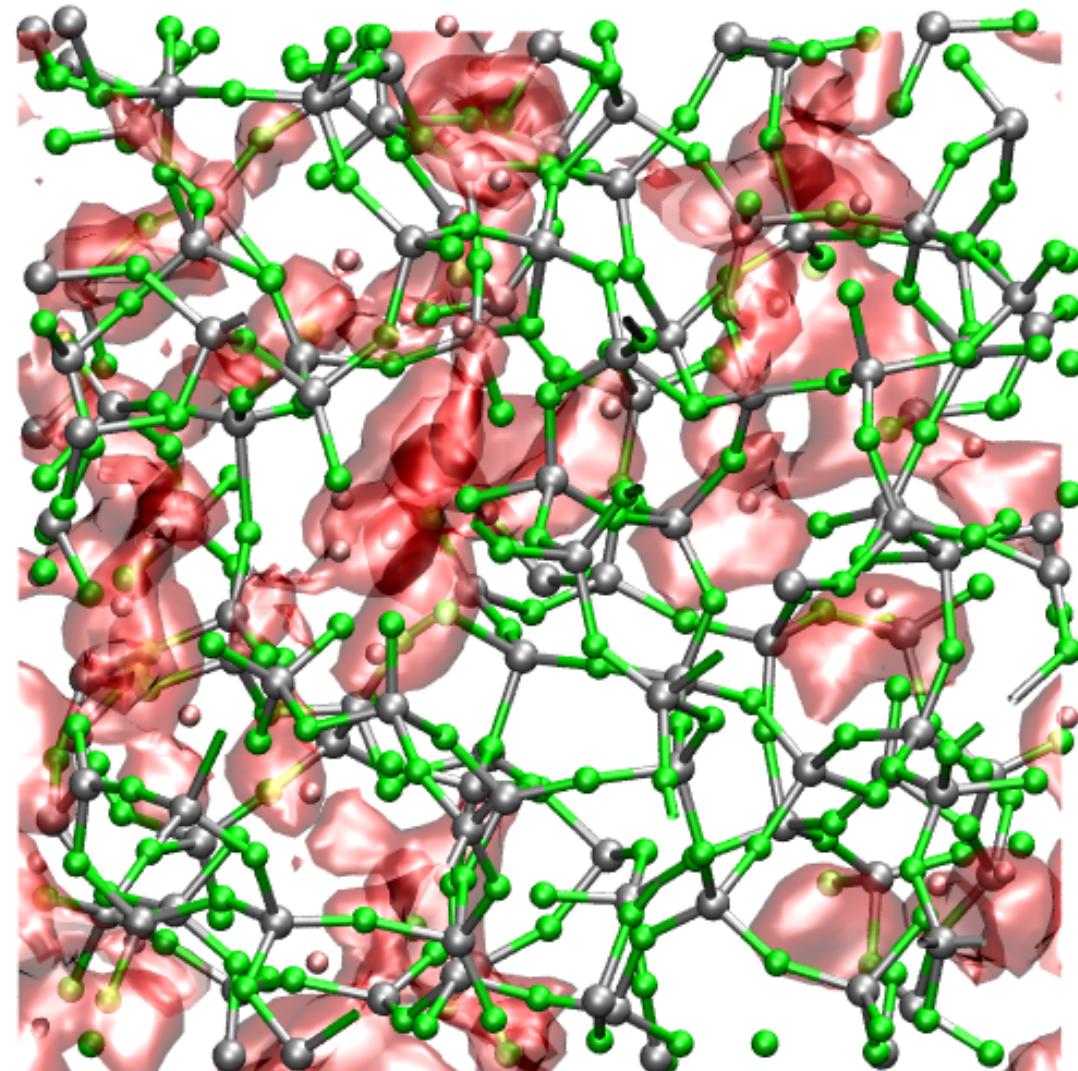
Density-compressibility



Structure

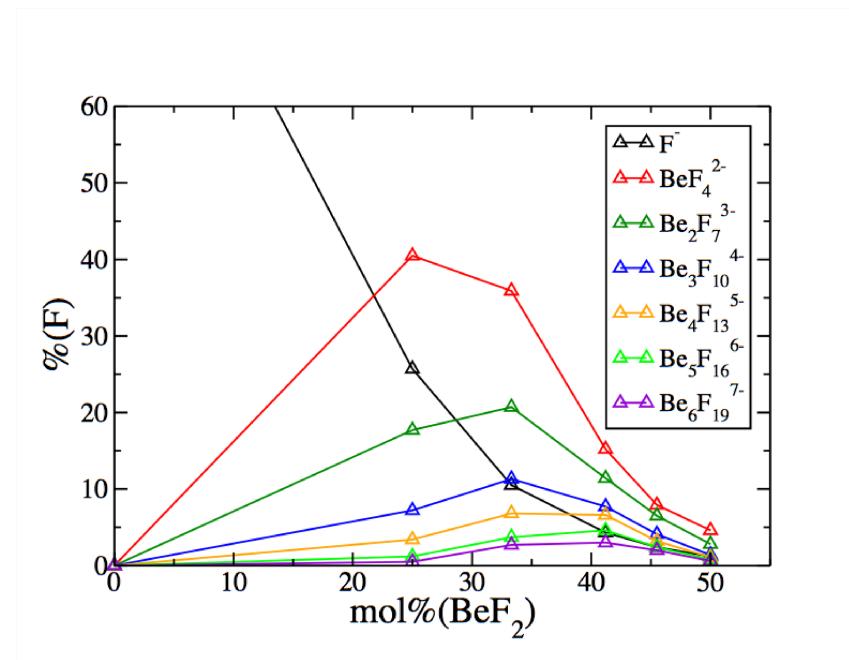
LiF-BeF_2 20:80
at 800 K

Zones with high Li^+
density =
Zones for
cooperative
diffusion of Li^+



Speciation

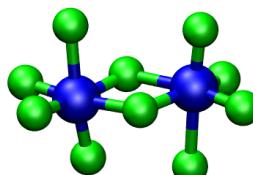
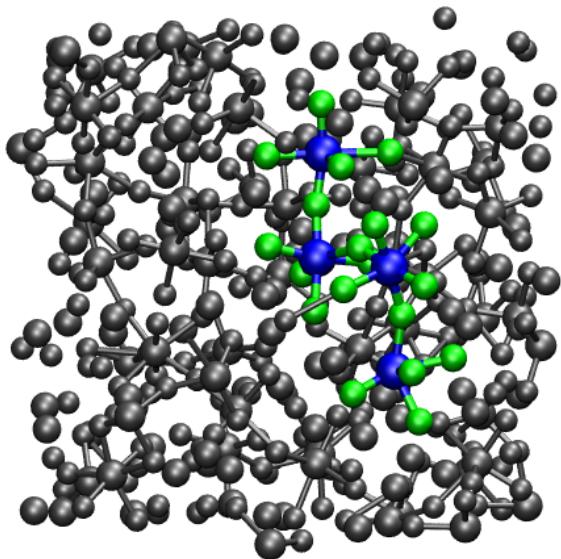
LiF-BeF₂
Mixtures at 1200 K



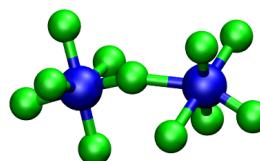
Proportions for species
-> injection in CALPHAD

Speciation (2)

LiF-AlF_3



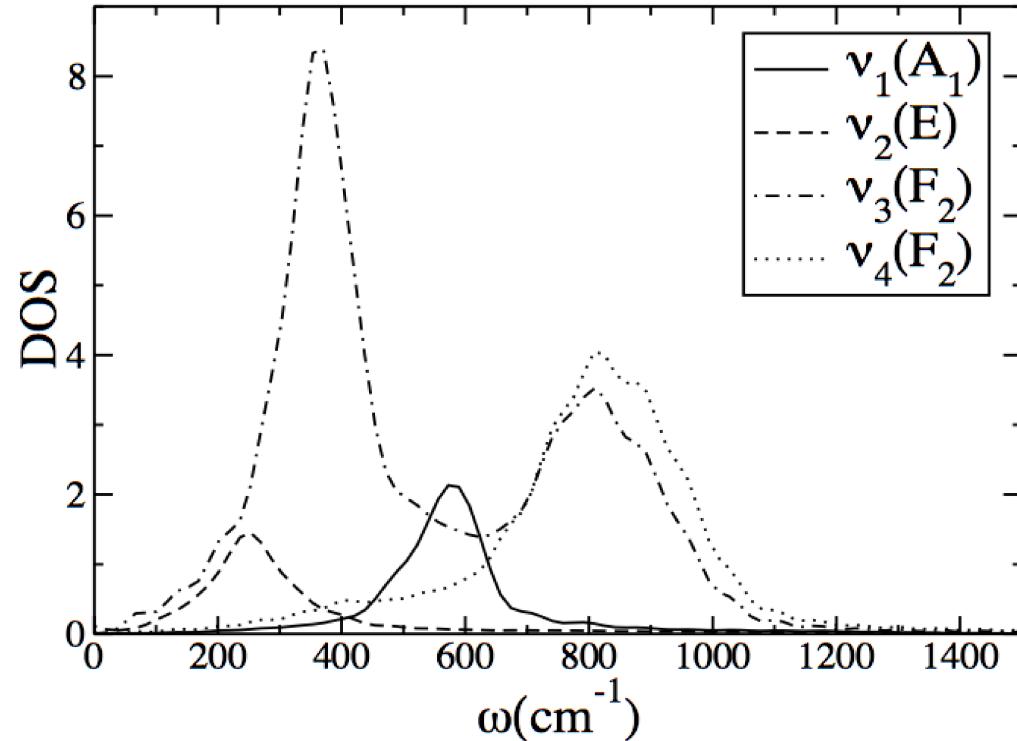
Edges: 5%



Corners: 5%

IR-Raman spectroscopy

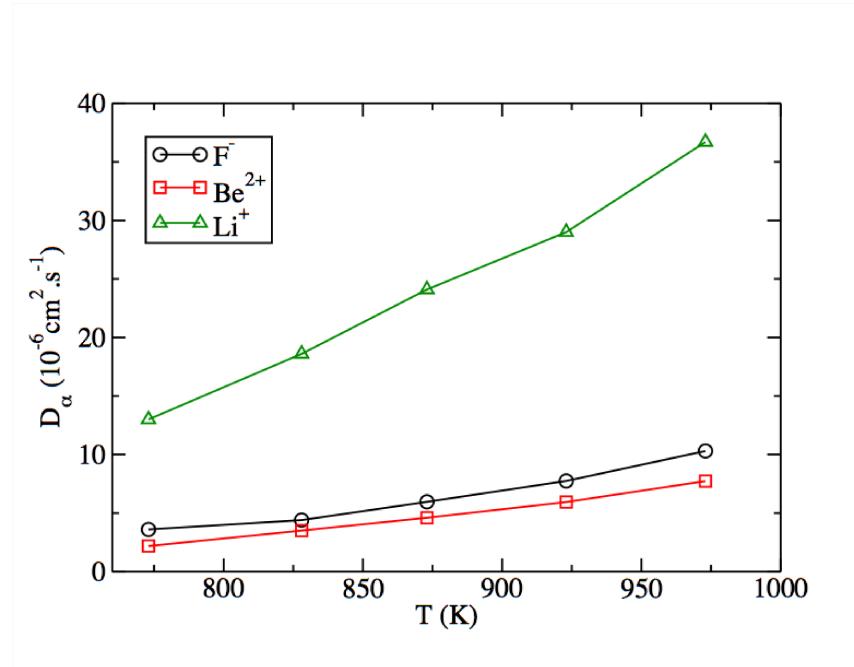
LiF-BeF₂



$$I(\omega) = \frac{\beta\omega^2}{2} \int_{-\infty}^{\infty} e^{i\omega t} \langle M(0)M(t) \rangle_0 dt$$

Self-diffusion

$\text{LiF}-\text{BeF}_2$

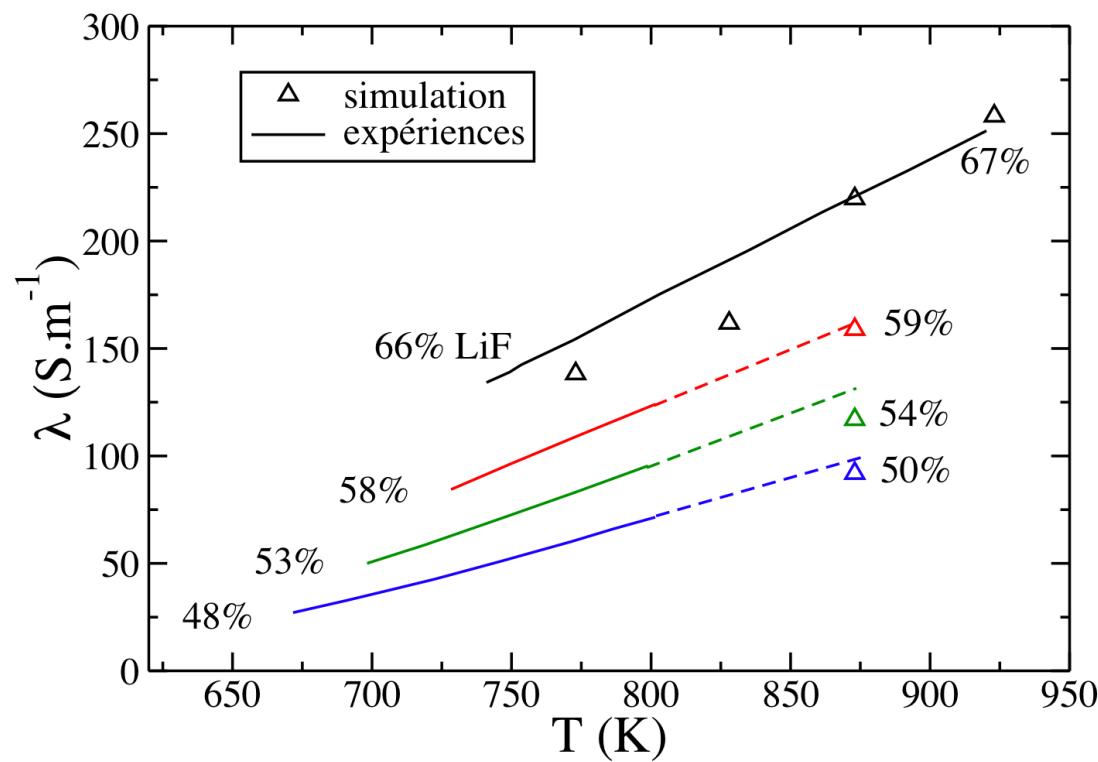


$$D = \lim_{t \rightarrow \infty} \frac{1}{3} \left\langle (r(t) - r(0))^2 \right\rangle$$

Electrical Conductivity

LiF-BeF₂

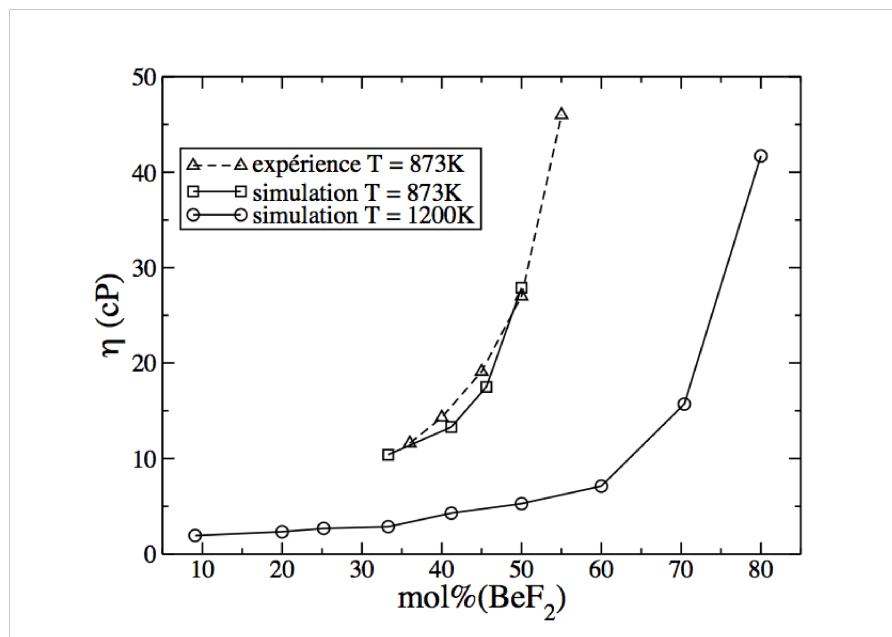
$$\lambda = \frac{\beta e^2}{3V} \int_0^\infty \langle j(t) \cdot j(0) \rangle dt$$



Viscosity

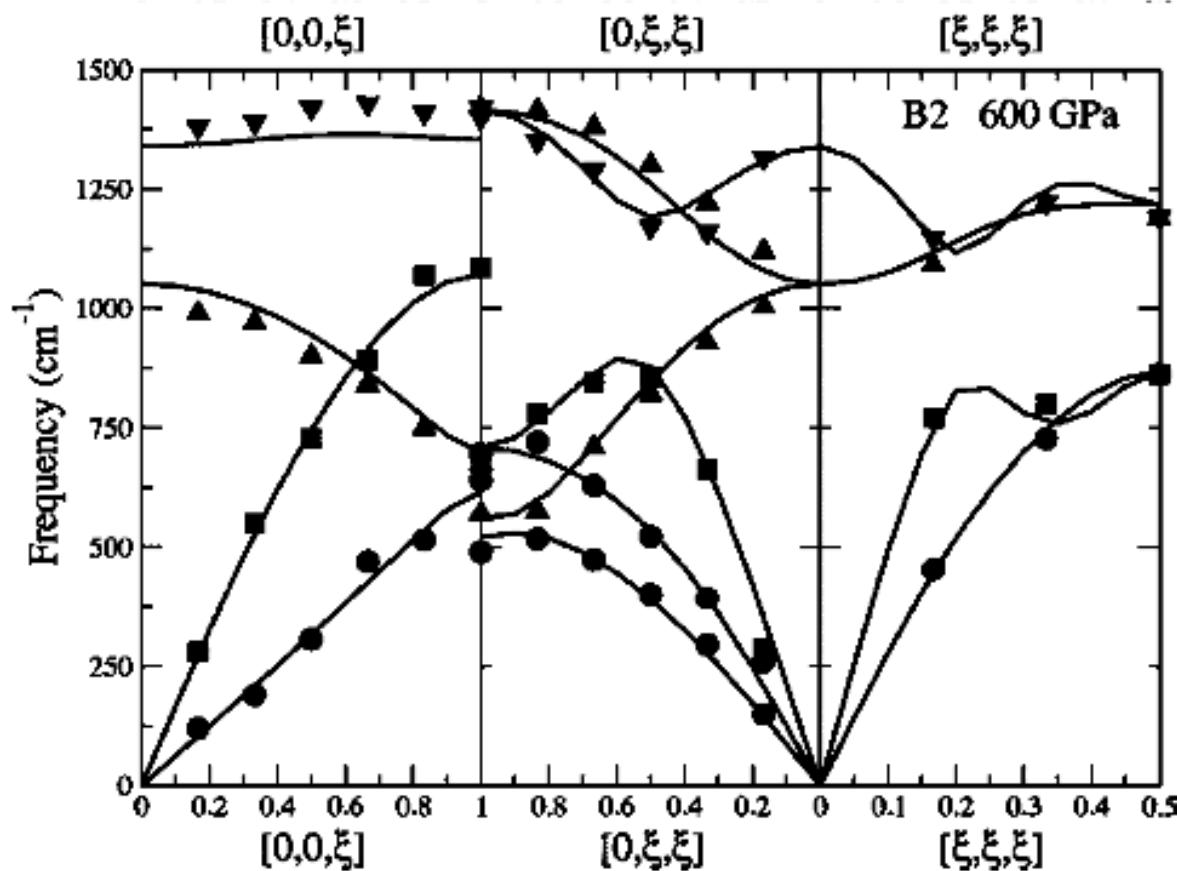
LiF-BeF₂

$$\eta = \frac{\beta}{V} \int_0^\infty \langle \sigma_{\alpha\beta}(t) \cdot \sigma_{\alpha\beta}(0) \rangle dt$$

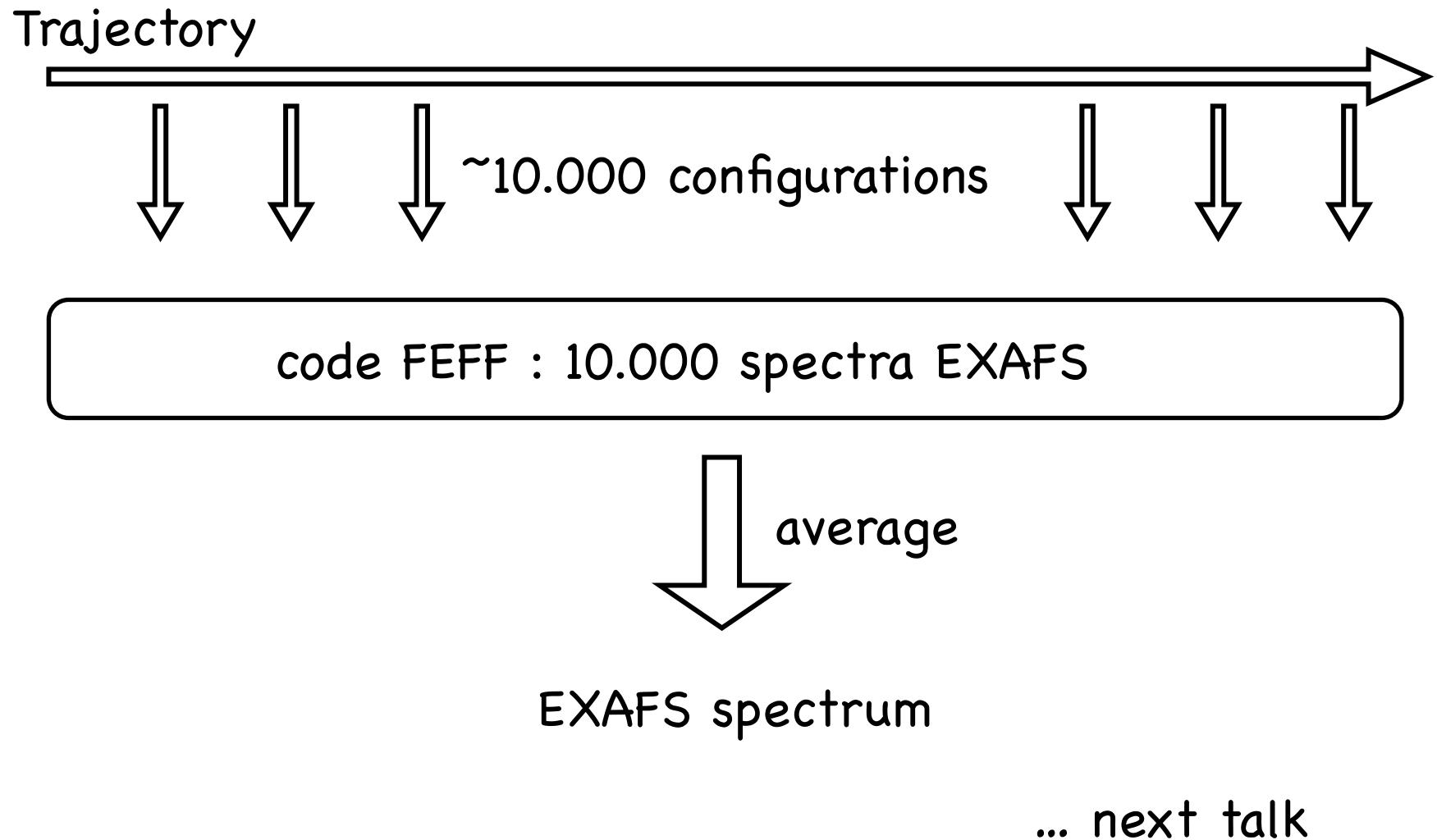


Phonons (solid)

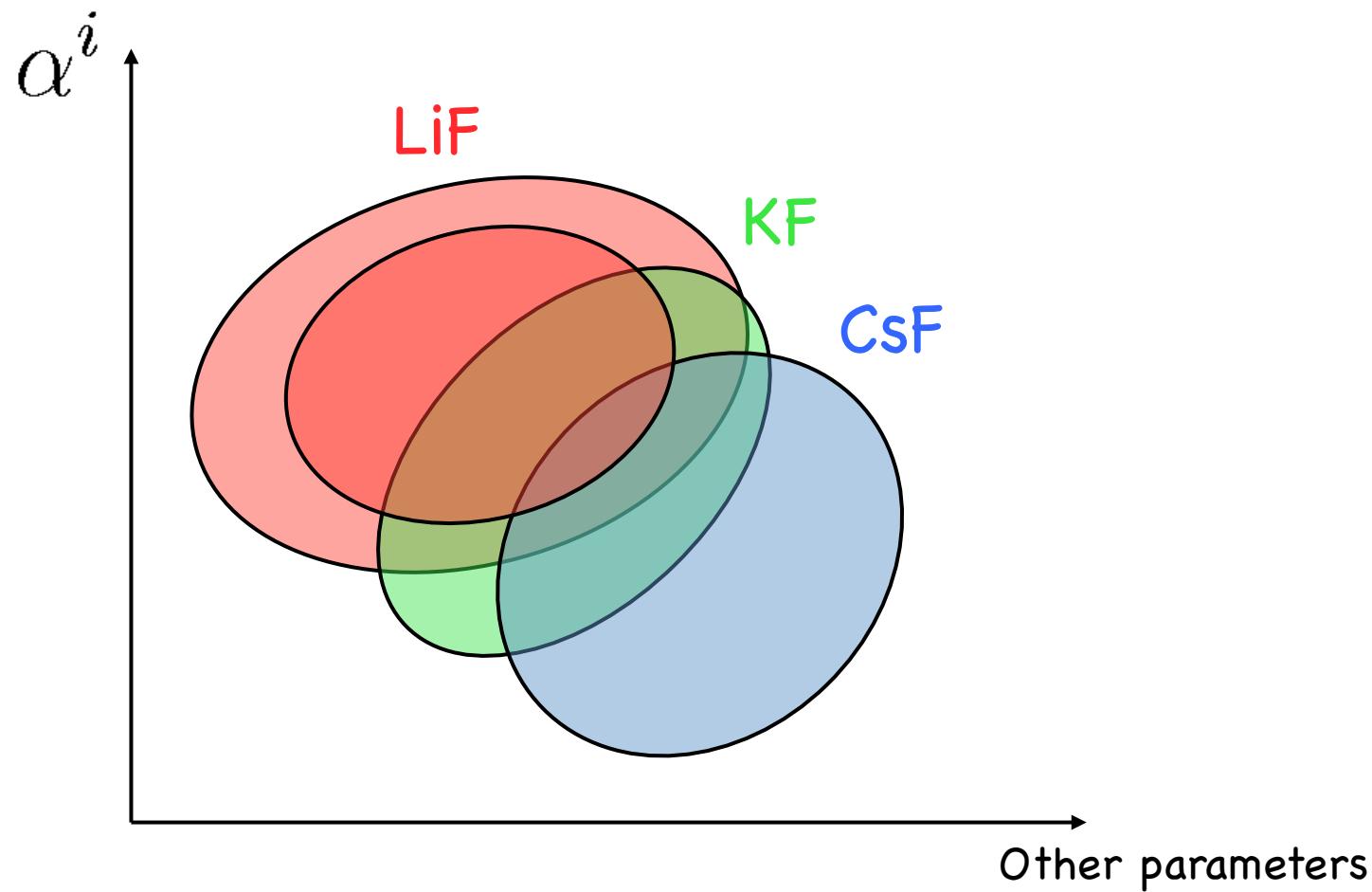
MgO



Testing structure description: EXAFS



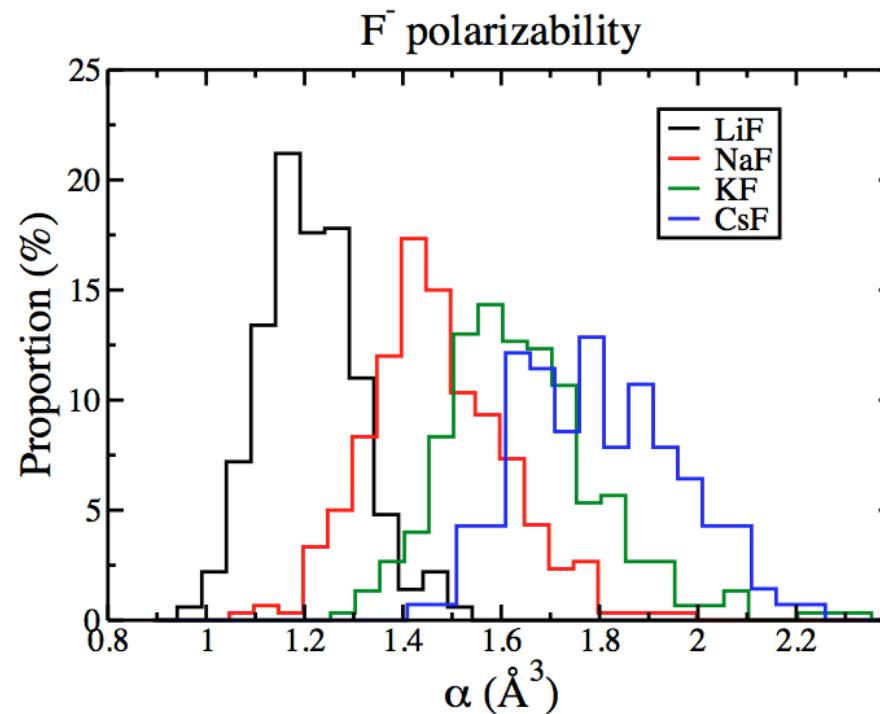
Can we build a global model ? (2)



Can we build a global model ? (2)

Invert

$$\mu^i = \alpha^i E$$



Paramètres ajusté d'après la DFT: B , a , b , c

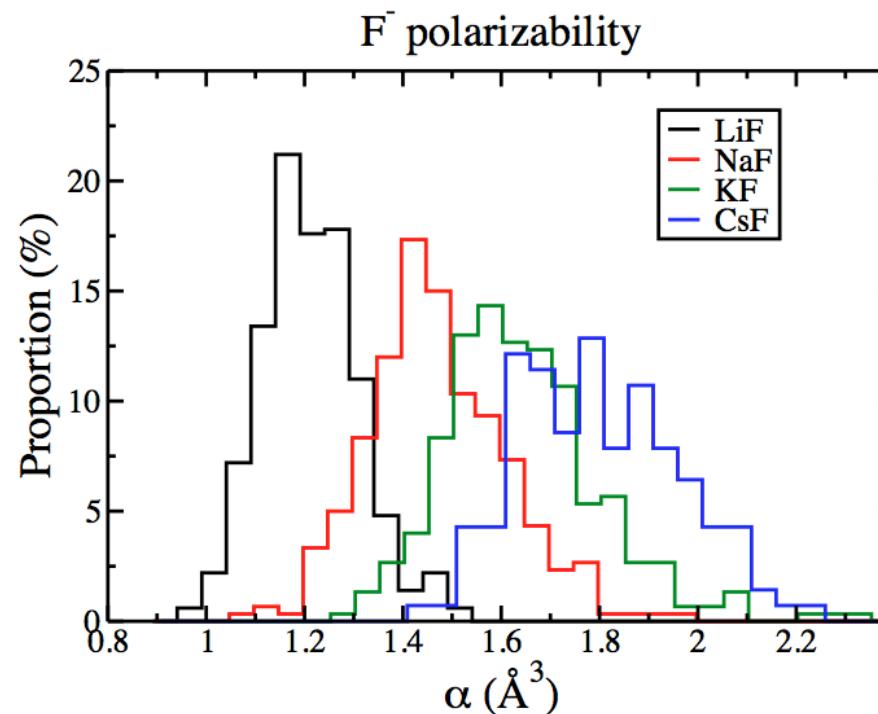
Paramètre dérivé de la DFT: α

Paramètres ajusté sur des données expérimentales : C_6, C_8

Derive α

Invert

$$\mu^i = \alpha^i E$$



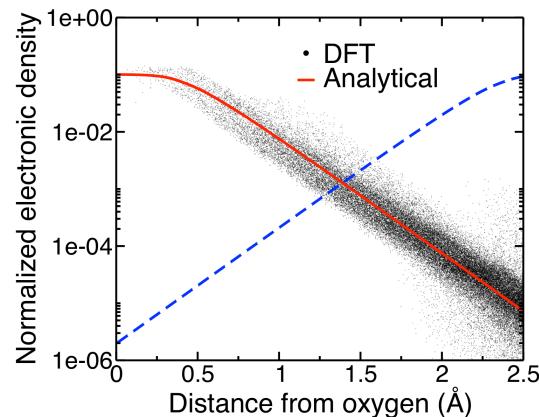
Parameters fitted on DFT: B, a, b, c

Parameter derived from DFT: α

Parameters fitted on experimental data : C_6, C_8

Derive C_6 and C_8 from Wannier centers

$$C_6^{kl} = \frac{3}{32\pi^{3/2}} \int_{|\mathbf{r}| \leq r_c} d\mathbf{r} \int_{|\mathbf{r}'| \leq r'_c} d\mathbf{r}' \frac{\sqrt{\rho_k(\mathbf{r})\rho_l(\mathbf{r}')}}{\sqrt{\rho_k(\mathbf{r})} + \sqrt{\rho_l(\mathbf{r}')}}$$



$$\rho_k(\mathbf{r}) = 2 \times \frac{\kappa_k^3}{8\pi} e^{-\kappa_k |\mathbf{r} - \mathbf{r}_k|}$$

$$\kappa_k = \frac{2\sqrt{3}}{S_k}$$

$$C_6^{IJ} = \sum_{k \in I, l \in J} C_6^{kl}$$

$$C_8^{IJ} = \sum_{k \in I, l \in J} 5(d_k^2 + d_l^2) C_6^{kl}$$

B. Rotenberg, et al. *Phys. Rev. Lett.* **2010**, *104*, 138301

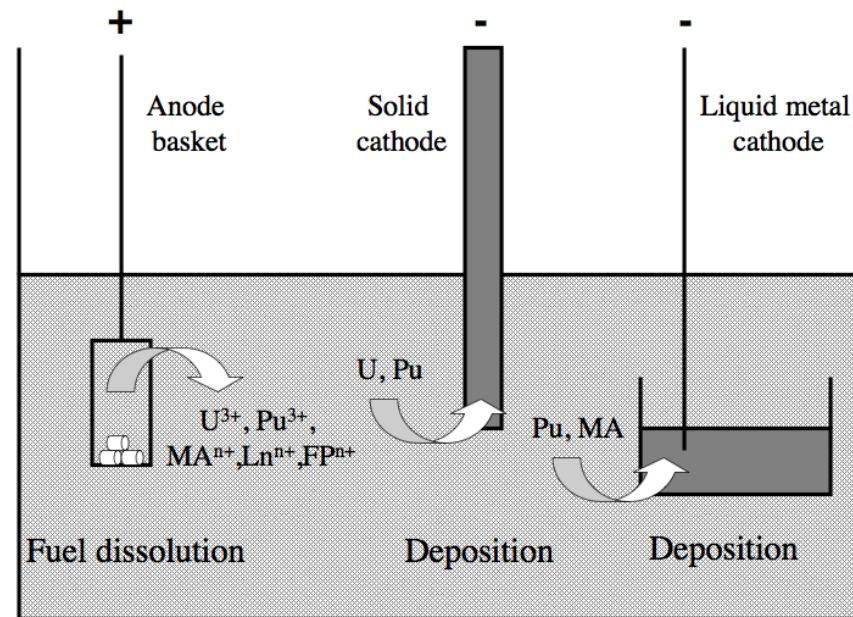
Parameters derived from DFT: a , C_6 et C_8 , B , a

Parameters fitted on DFT: b , c

More applications : toward electrochemistry and separations

Activity coefficients for separation

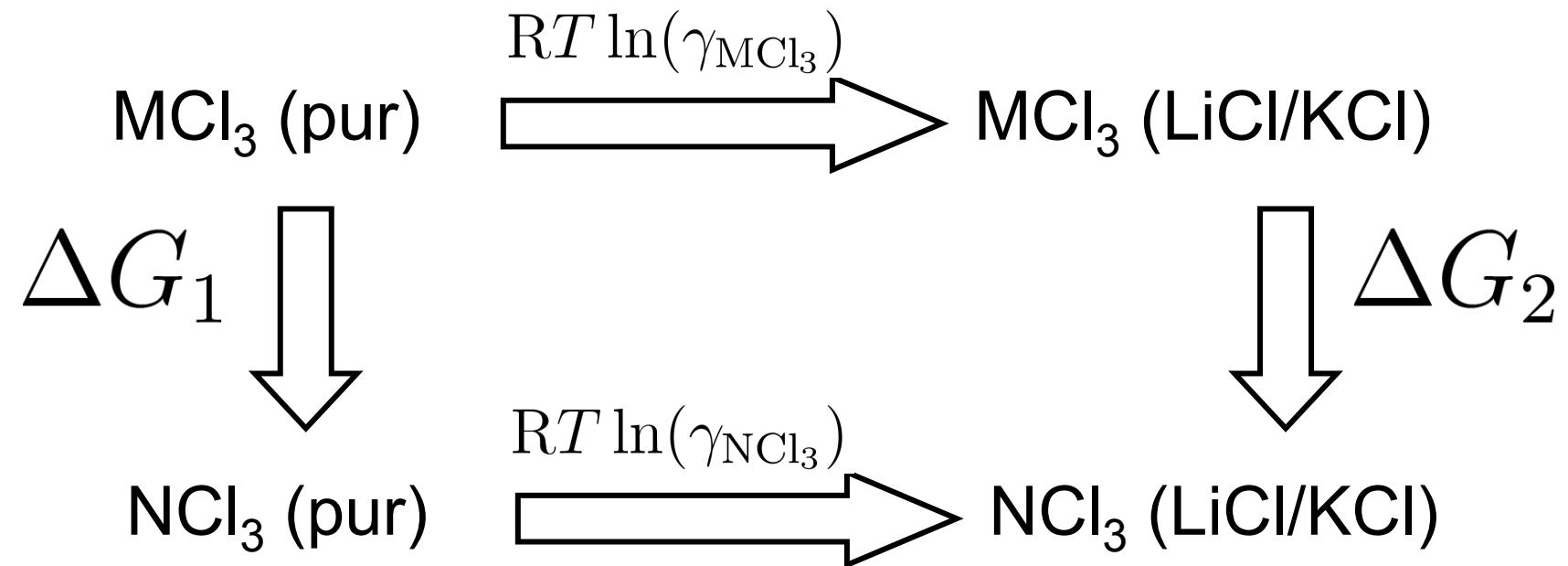
Eutectic mixture LiCl-KCl



Apparent standard potential is related to activity coefficients:

$$E_{M^{n+}/M(0)}' = E_{M^{n+}/M(0)}^0 + \frac{RT}{nF} \ln \left(\frac{\gamma_{M^{n+}}}{\gamma_{M(0)}} \right)$$

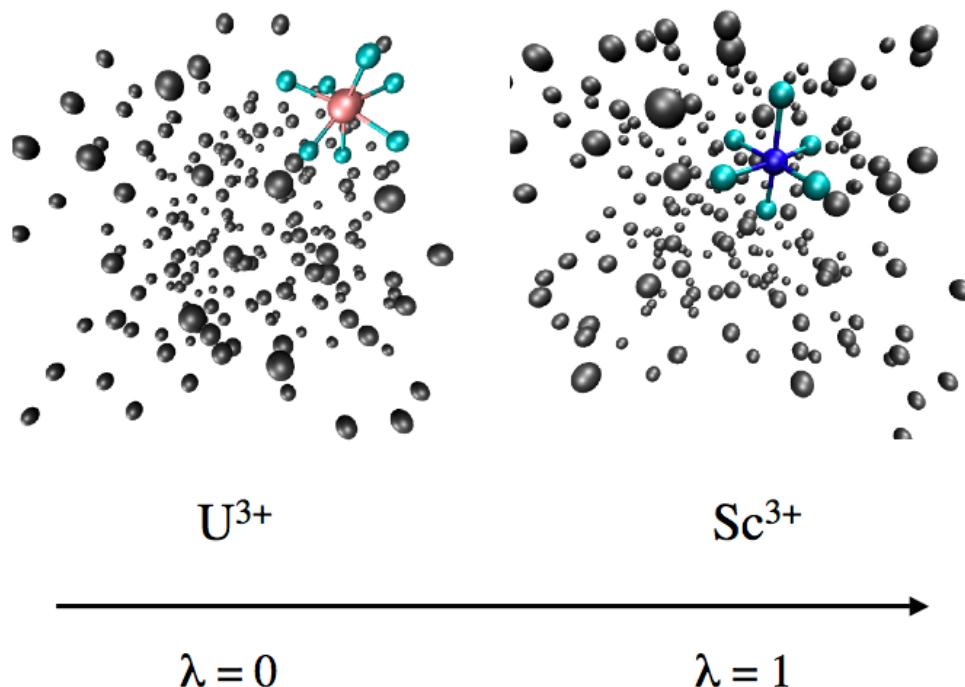
Thermodynamical cycle



$$\Delta G_2 - \Delta G_1 = RT \ln\left(\frac{\gamma_{\text{MCl}_3}}{\gamma_{\text{NCl}_3}}\right)$$

“Virtual” transmutation

$$V(\lambda) = (1 - \lambda)V_{\text{MCl}_3/\text{LiKCl}} + \lambda V_{\text{NCl}_3/\text{LiKCl}}$$

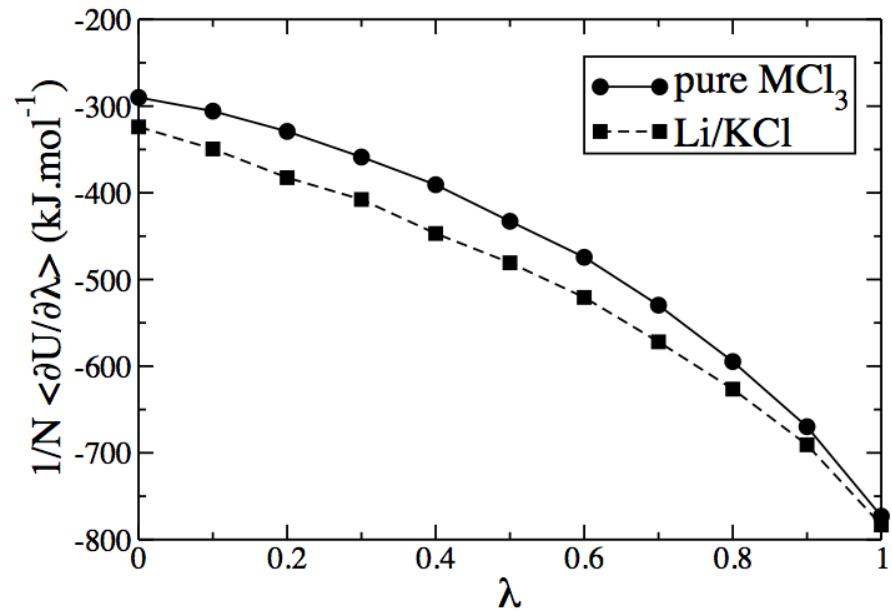


« transmutation »
d' U^{3+} en Sc^{3+}

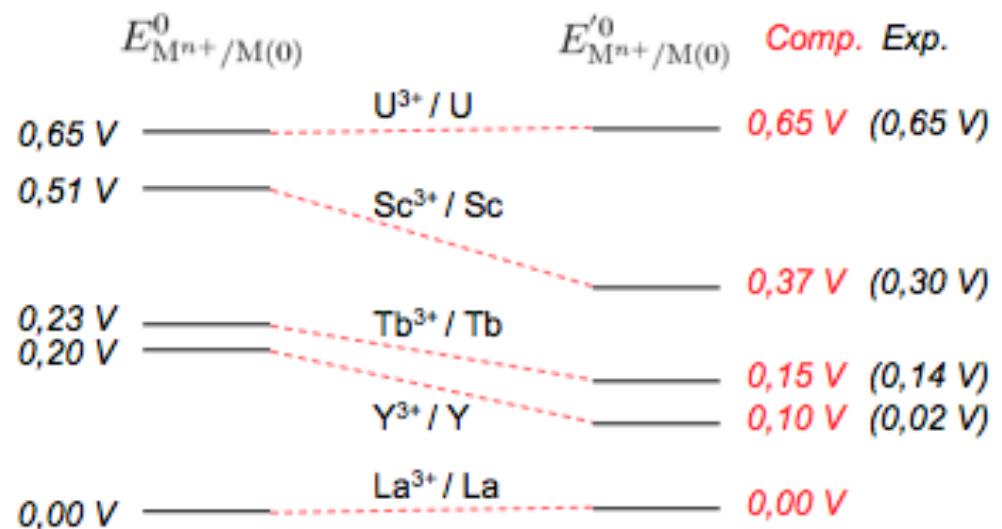
J. G. Kirkwood, J. Chem. Phys., 1935, 3, 300.



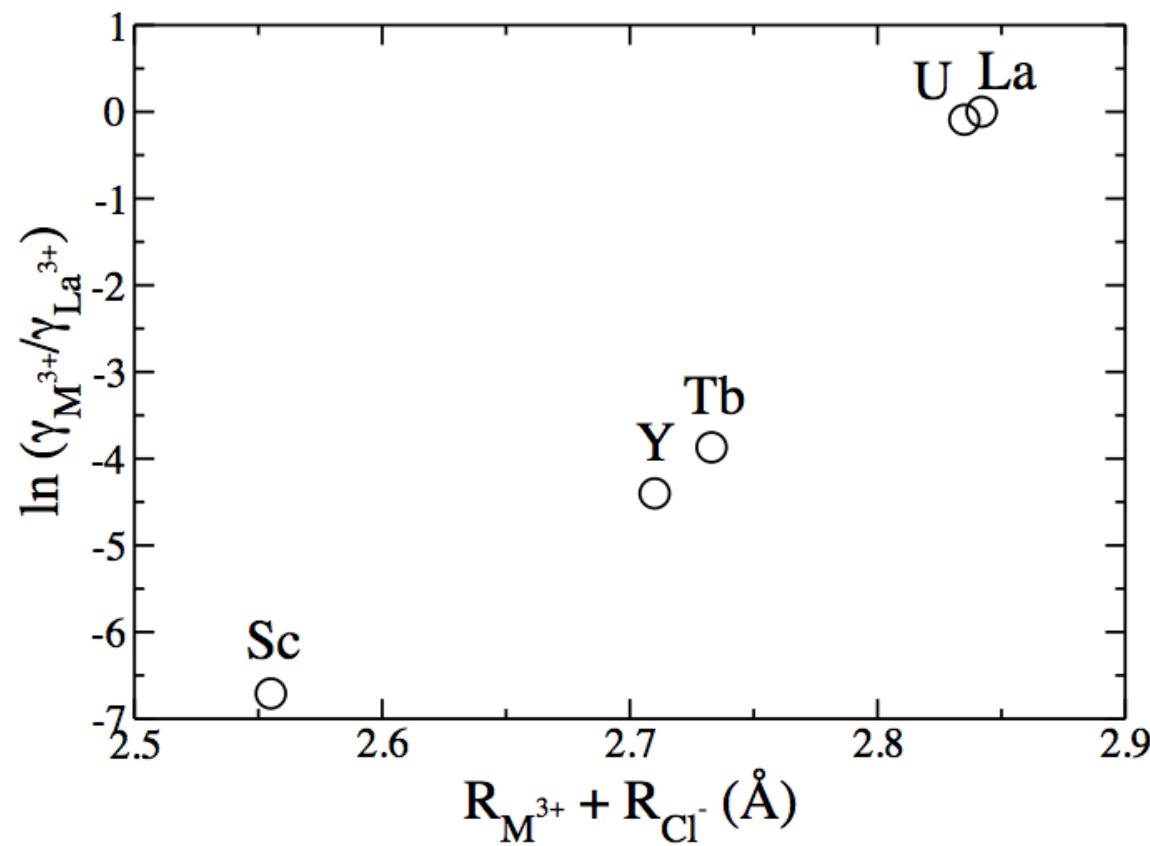
Results



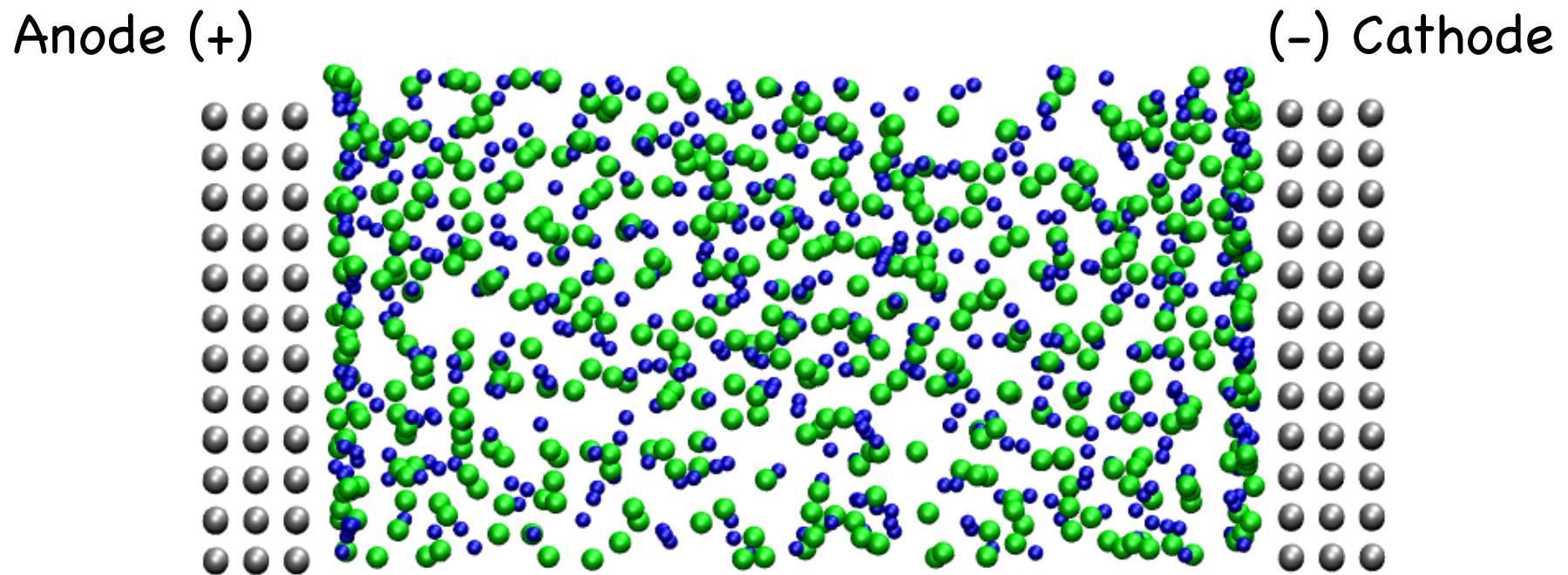
$$\Delta G_i = \int_0^1 \left\langle \frac{\partial V(\lambda)}{\partial \lambda} \right\rangle_\lambda d\lambda$$



Correlation radius-activity coefficient



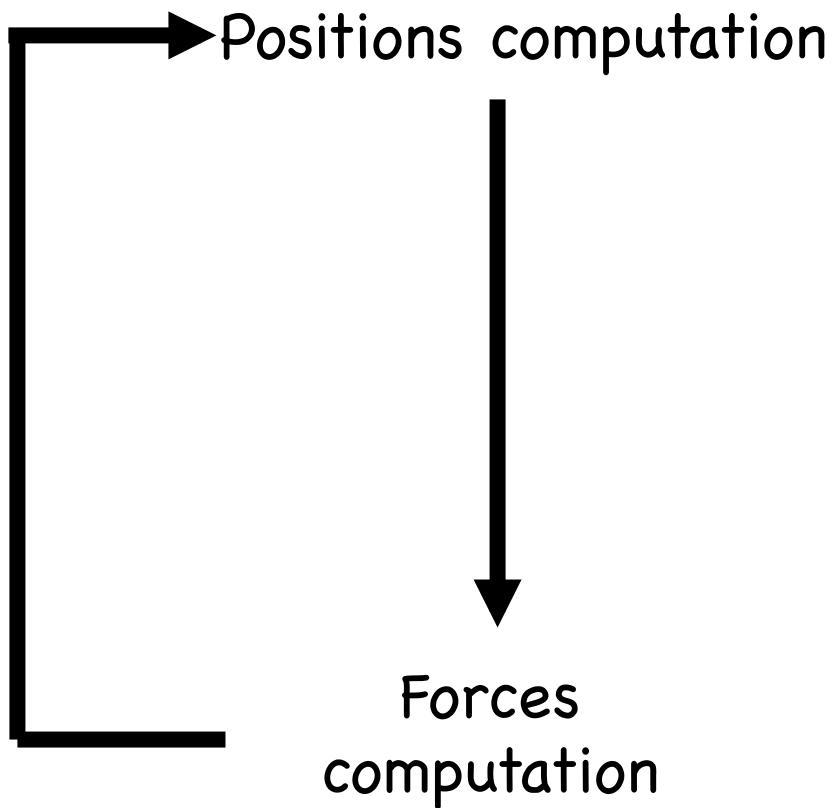
Explicit electrochemical cell



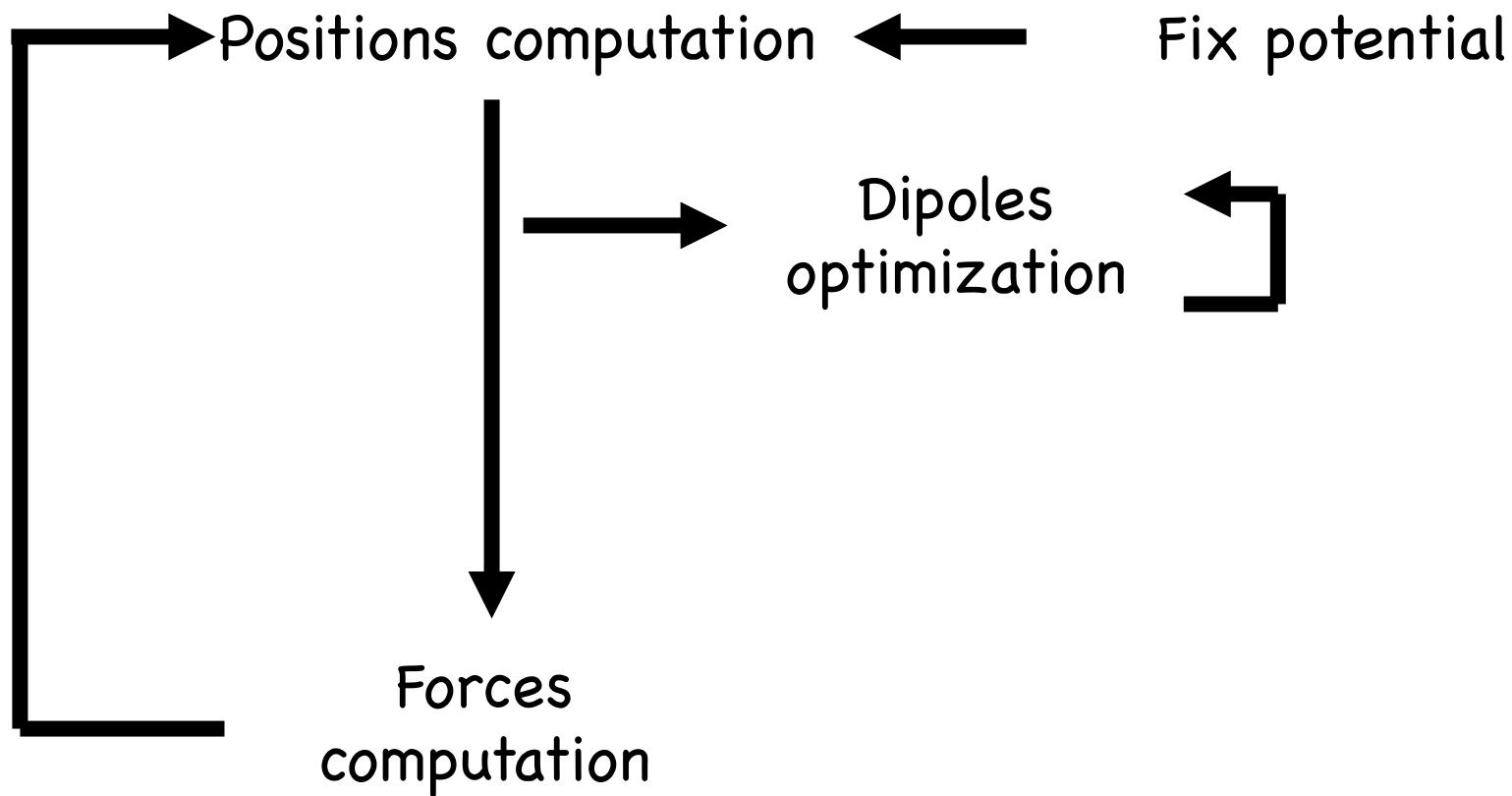
LiCl (1000 ions) + Al (432 atoms, CC [100])

Constant potential simulation

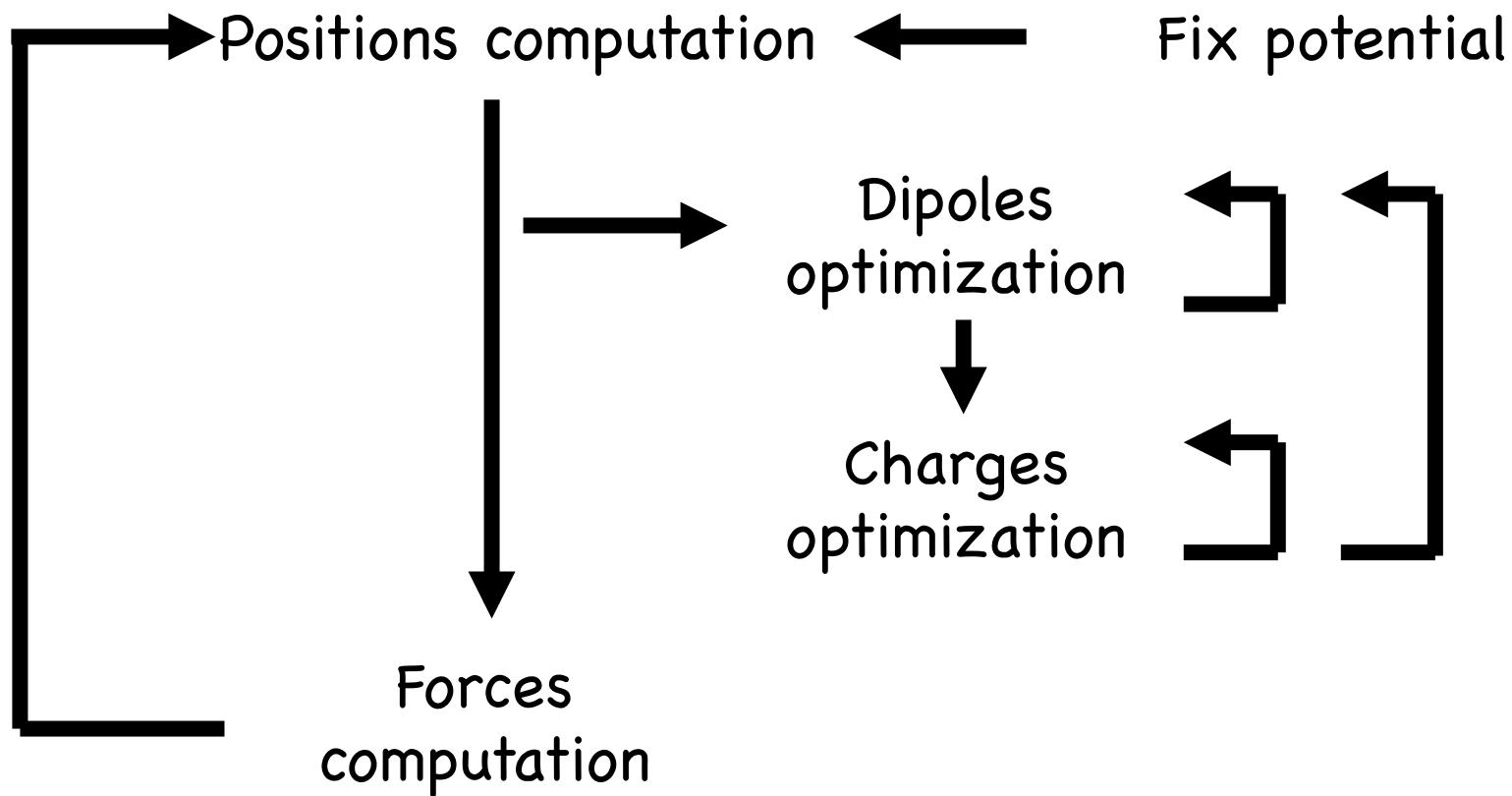
Modified MD algorithm



Modified MD algorithm

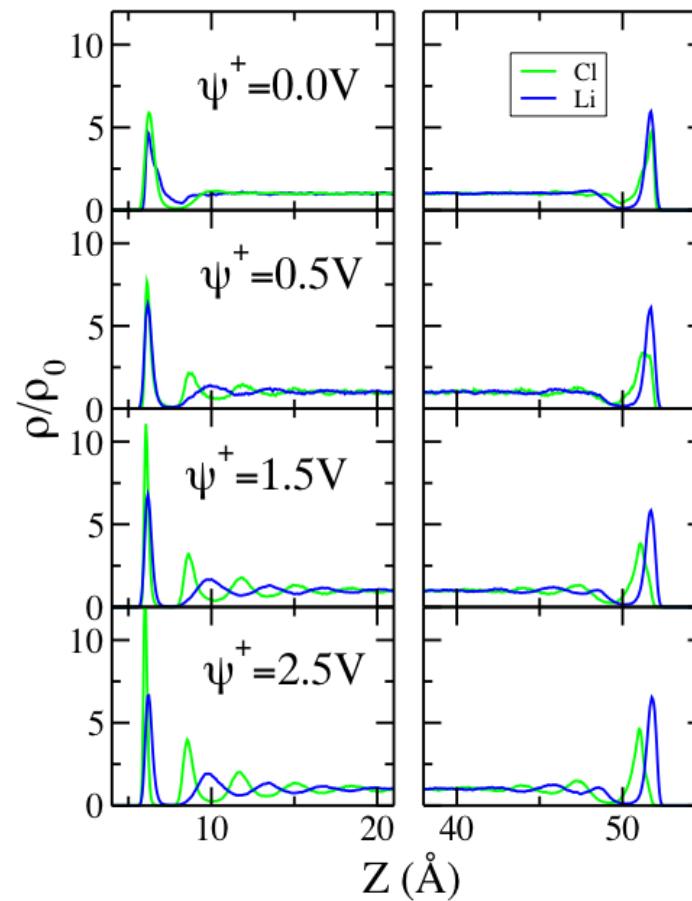


Modified MD algorithm



Surface (100)

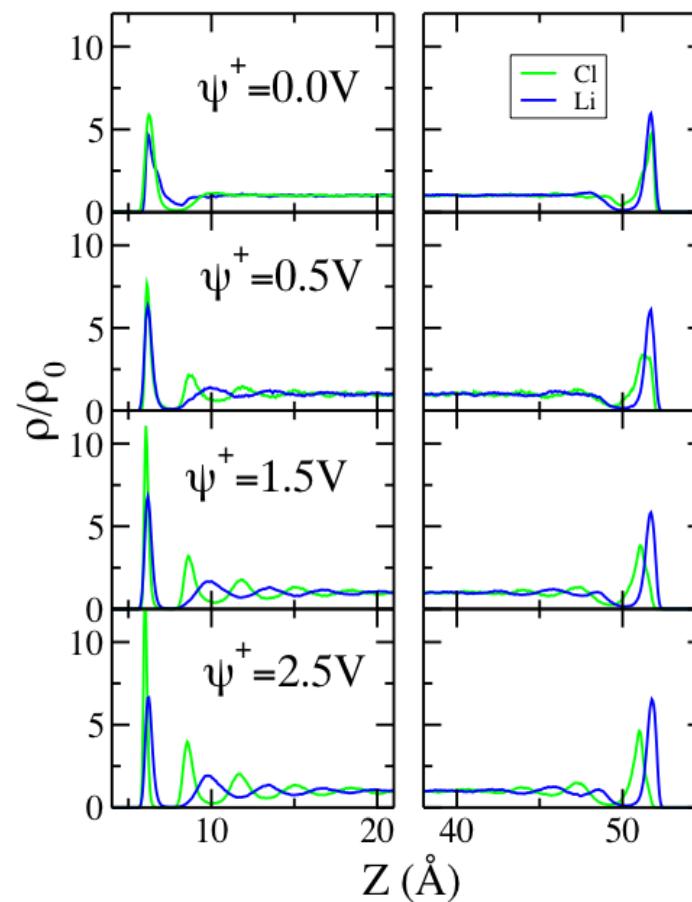
Anode (+)



(-) Cathode

Surface (100)

Anode (+)



(-) Cathode

Adsorption peaks moves

Li^+ stays, Cl^- goes further

Positive charge raising

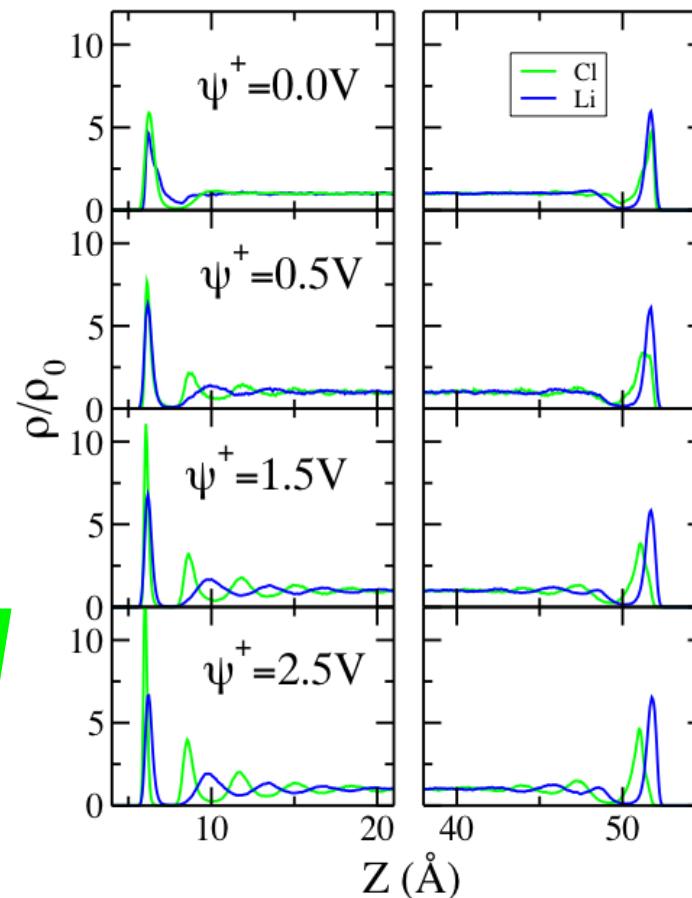
Surface (100)

Anode (+)

Adsorption peak increases

more Cl⁻ than Li⁺

Negative charge raising



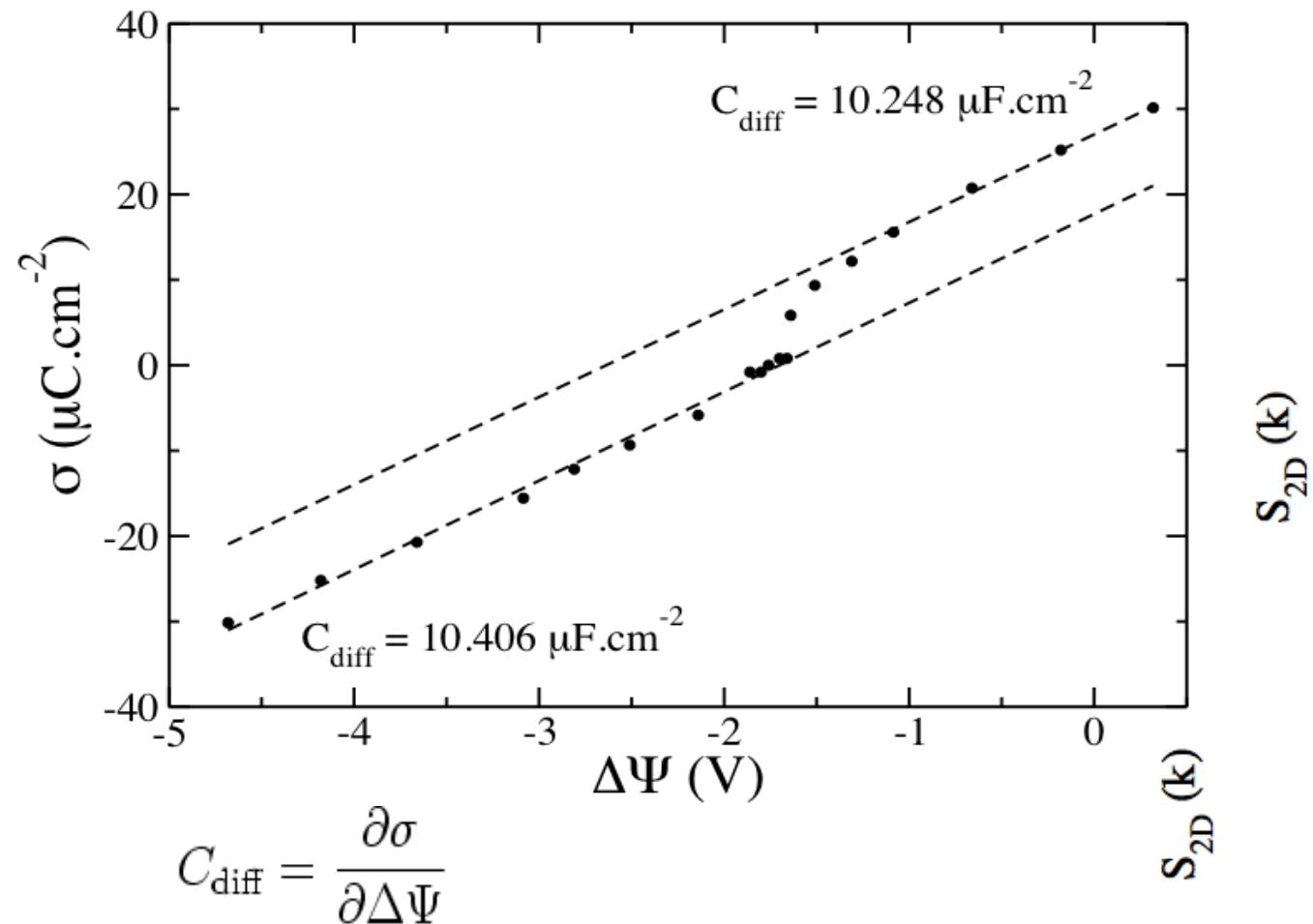
(-) Cathode

Adsorption peaks moves

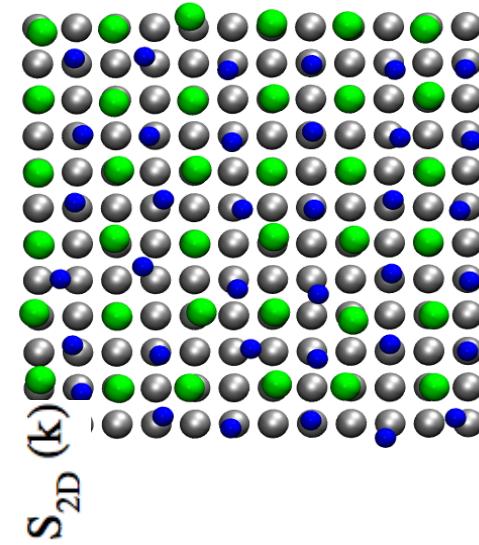
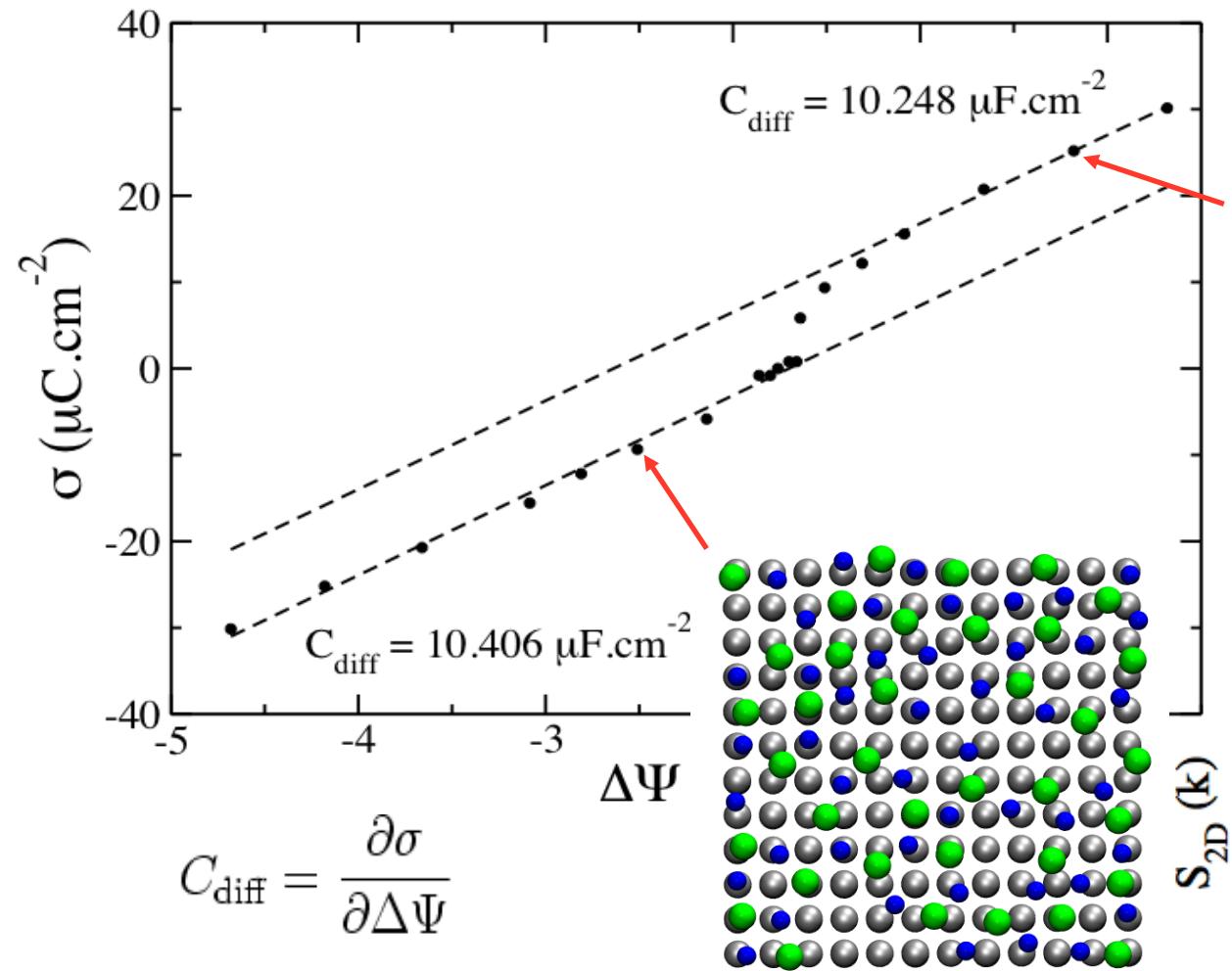
Li⁺ stays, Cl⁻ goes further

Positive charge raising

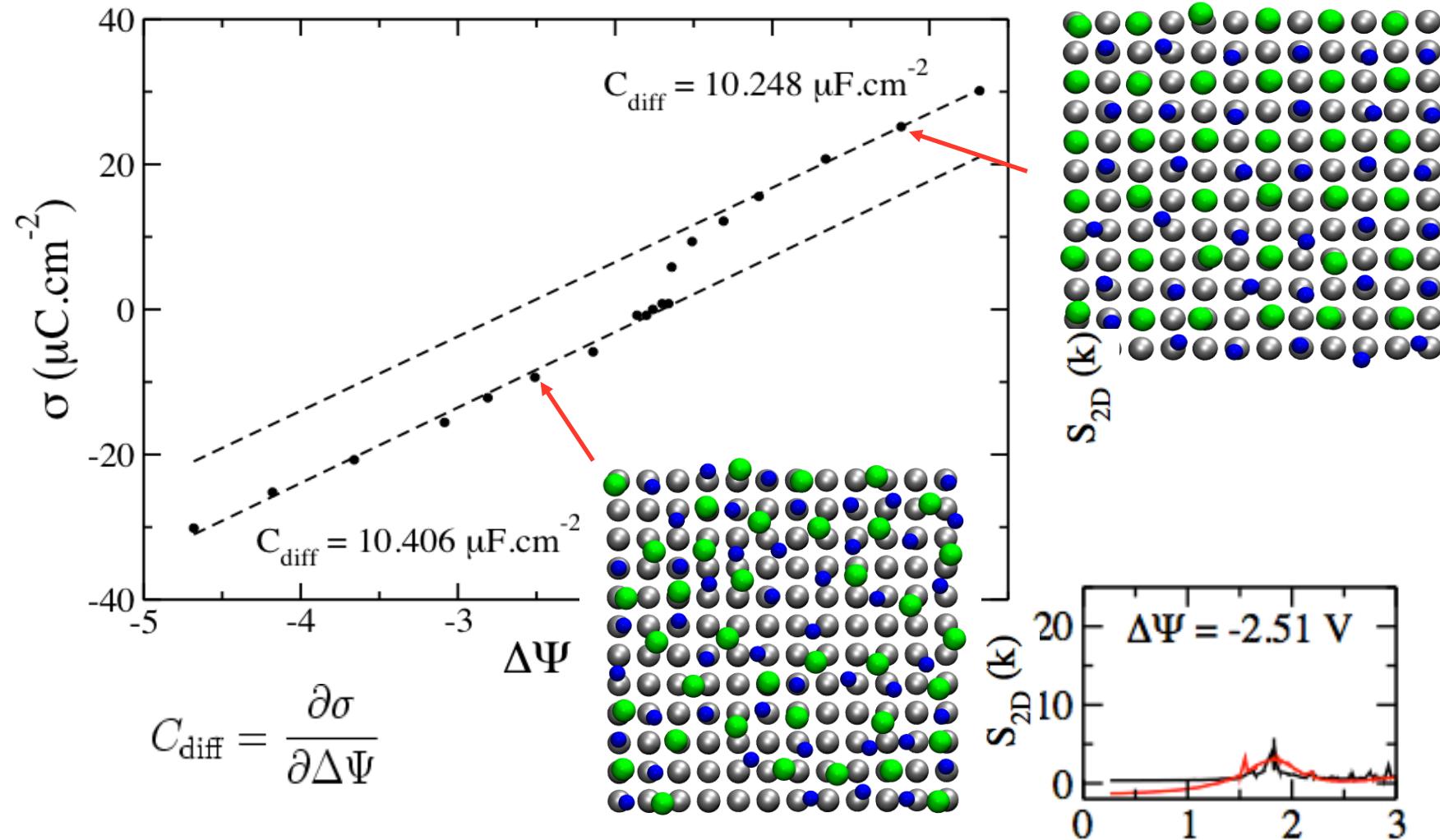
Electrodes polarization



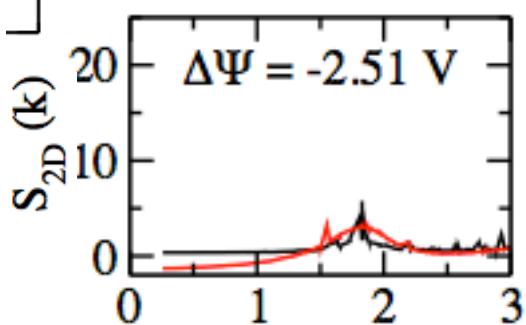
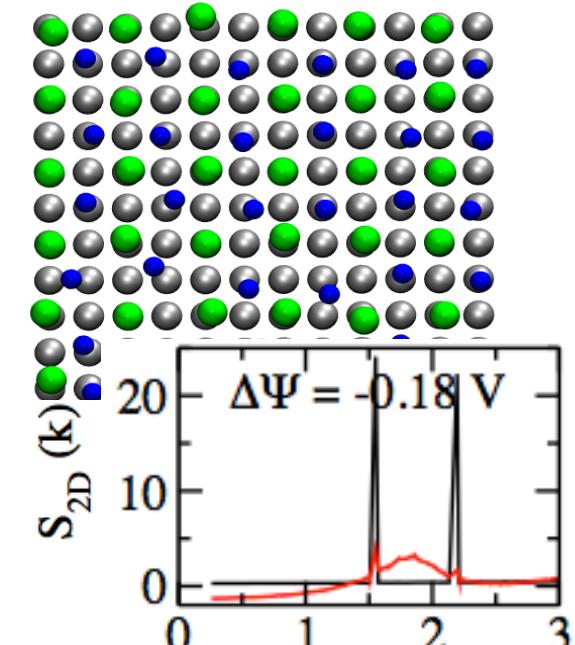
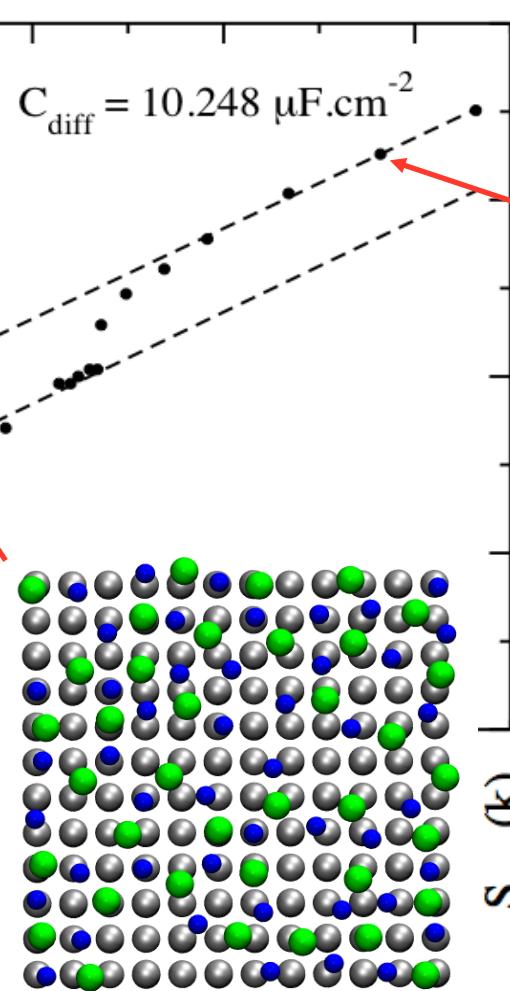
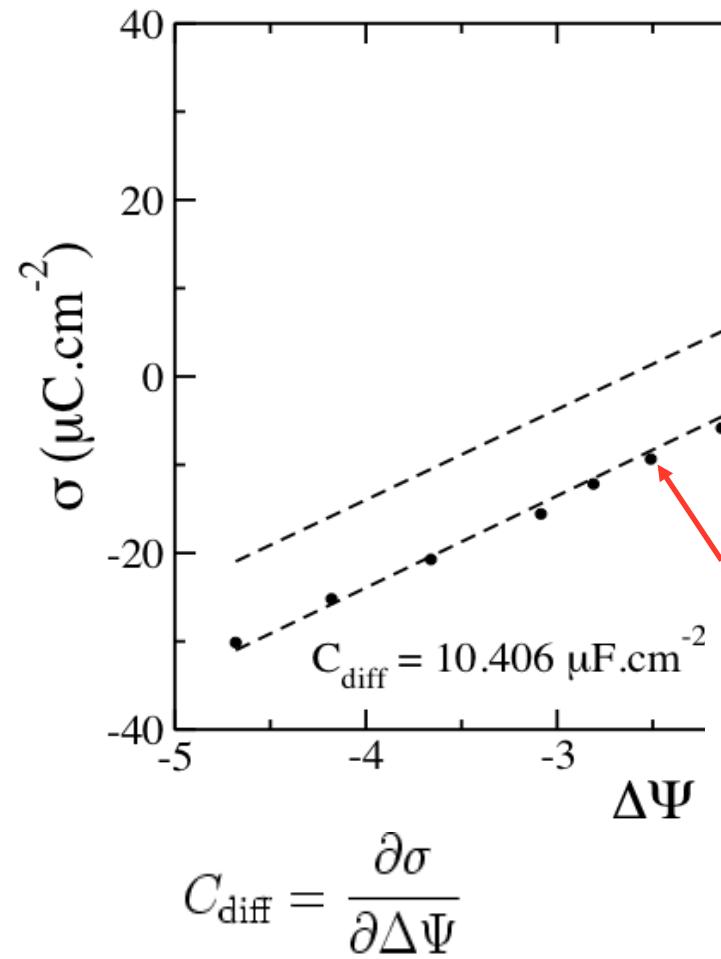
Electrodes polarization



Electrodes polarization

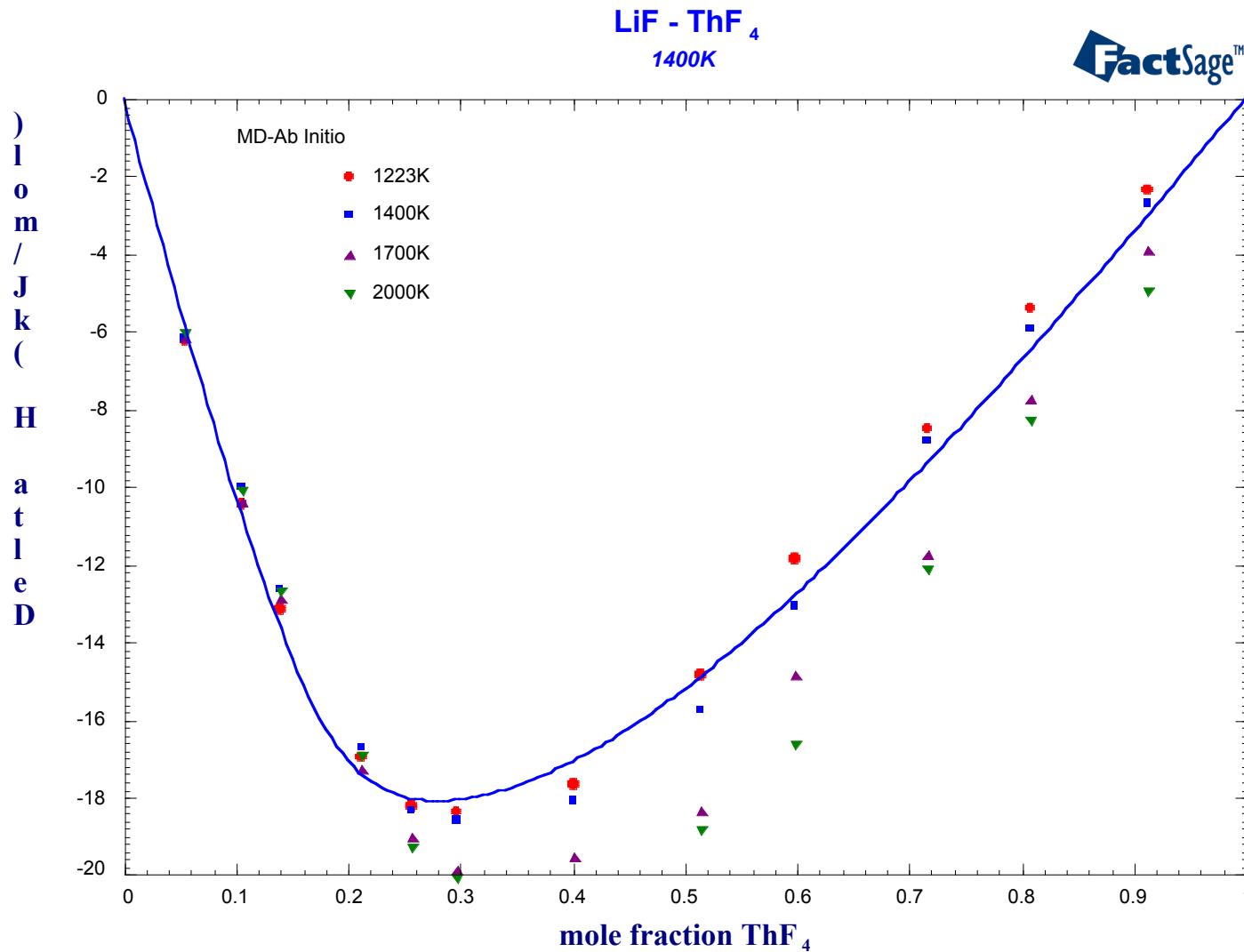


Electrodes polarization

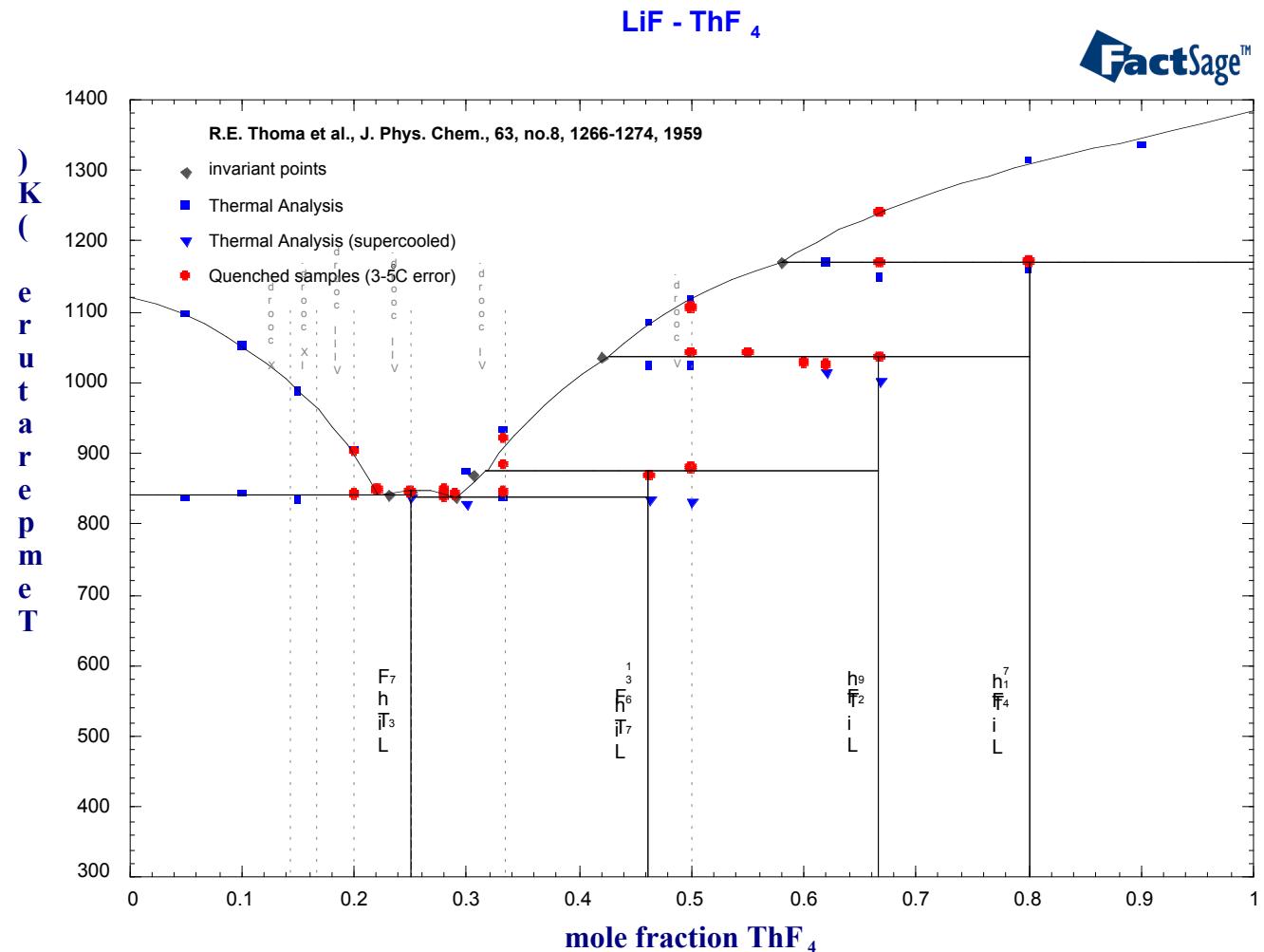


More applications : toward thermodynamical models

Enthalpy of mixing



Binary phase diagram



Ternary phase diagram

