

# Ab Initio Molecular Dynamics Simulations in Liquids and Glasses

## Basics and Applications - II

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# Outline - Application to Liquids and Glasses

## ① A case study : Binary Chalcogenides

Effect of the electronic model

Thermal history effects

Structure and Dynamics

## ② Properties from the electronic treatment

Infrared spectrum

Raman scattering

Electronic density of states

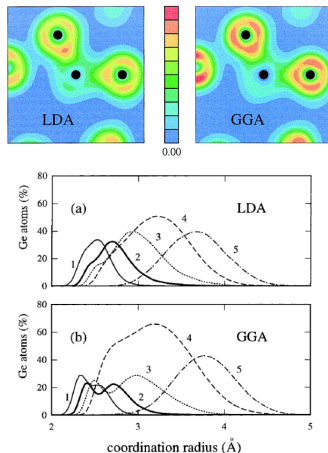
# A case study : Binary Chalcogenides

## EFFECT OF THE ELECTRONIC MODEL

### Nature of chemical bonding :

- In chalcogenides (e.g.  $\text{GeSe}_2$  or  $\text{GeS}_2$ ), presence of homopolar defects.
- Charge transfer. From covalent character to metallic. Change with temperature.
- **From LDA to GGA :**
  - Depletion of Ge valence charge and charge accumulation around Se indicates ionic character of the bonding. Lobes  $\rightarrow$  covalent contribution to the bonding character. Increased ionic character with GGA
  - 50% (LDA) and 63% (GGA) Ge are 4-fold in l- $\text{GeSe}_2$ . Too high metallic character.

Massobrio, Pasquarello and Car, JACS 121 (1999)



**Figure 3.** Average Se-coordination of Ge atoms in liquid  $\text{GeSe}_2$  as a function of the radius of the coordination sphere in the (a) LDA and (b) GGA. The coordination is defined as the number of nearest neighbors in the coordination sphere.

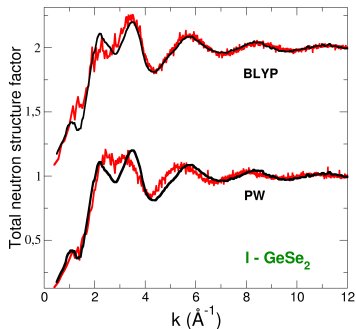
# A case study : Binary Chalcogenides

## EFFECT OF THE ELECTRONIC MODEL

Micoulaut and Massobrio, JOAM 11 (2009)

### Effect of the XC functional :

- In  $I\text{-GeSe}_2$ , increase of the pseudo-gap between C and V band when moving from PW (metallic character, electron gas) to BLYP (fitted on molecules).
- Increases the Ge tetrahedral coordination number and 2-fold for Se. Decrease the number of CN defects.
- Increases the number of Ge-Ge and Se-Se homopolar bondings. Increased structuration.





# A case study : Binary Chalcogenides

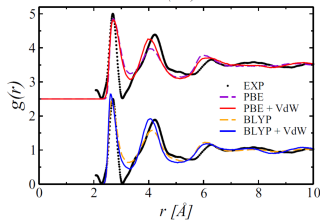
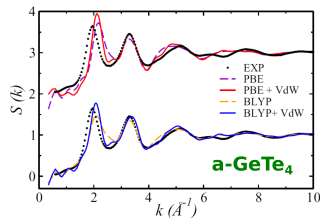
## EFFECT OF THE ELECTRONIC MODEL

### Effect of the XC functional + dispersion :

Bouzid et al. PRB 92 (2015)

- In **a-GeTe<sub>4</sub>**, similar features on structure encountered.
- BLYP favors a tetrahedral network, in contrast with PBE (octahedral+tetrahedral Ge).
- Dispersion corrections (VdW) cure a so-called Ge-Te "*bond distance problem*".

$$E_{disp} = -s_6 \sum_i \sum_j \frac{C_{ij}}{R_{ij}^6} f_{damp}(R_{ij})$$

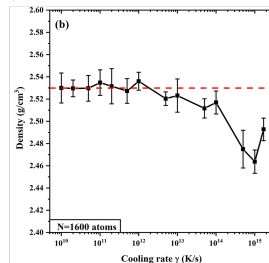
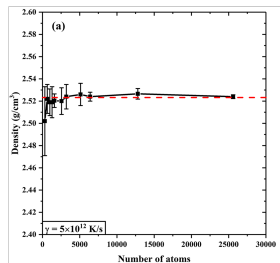


# A case study : Binary Chalcogenides

## THERMAL HISTORY EFFECTS

Deng and Du, JCP 148 (2018)

- Effects of system size ( $10^7$ ) and cooling rate of the simulation process ( $10^8$  K/s- $10^{15}$  K/s) in classical MD simulations are well known and documented
- Properties depend on the thermal history.
- Effects even more problematic in ab initio MD.
  - N=100-1000 atoms, 100 ps,  $10^{13}$ - $10^{16}$  K/ps
  - N=480 glassy GeSe<sub>2</sub>, 350 ps  
→ 56 years single CPU !!!

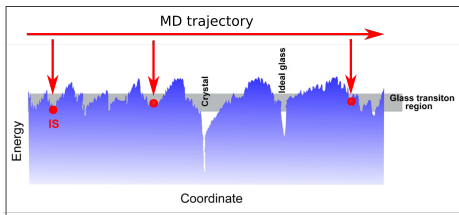


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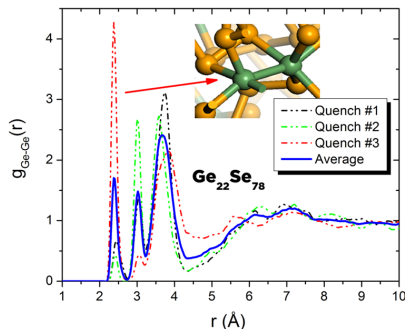
## THERMAL HISTORY EFFECTS

### Averages over inherent structures

C. Yildirim, PhD Thesis (2017)



- Liquids visit many configurations prior to 10-100 K/ps quenching followed by structural relaxation
- Produce independent quenches to generate **inherent structures** (local minima of the potential energy landscape)
- Average the glass structures for reliable results



# A case study : Binary Chalcogenides

## THERMAL HISTORY EFFECTS

Micoulaut, Pethes and Jóvári (2022)

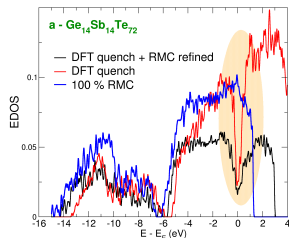
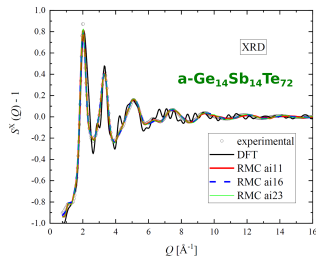
### Are there alternatives for saving time ?

#### ① Reverse Monte Carlo

- Glass configuration prepared by RMC. Then, DFT investigation.
- **Pros:** Time saving. Increased match with experimental structure (?).  
**Cons:** Unphysical model structure without relaxation events during the quenching (energy barriers).
- RMC refinement : DFT quench to 300 K → RMC → DFT investigation.

#### ② Classical MD prior to DFT study

- Valid for oxides. But for chalcogenides ?



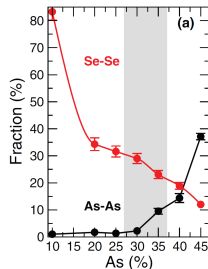
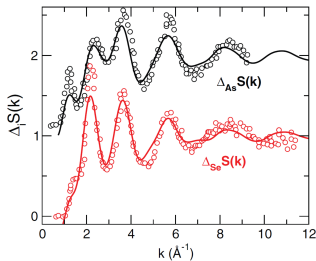
# A case study : Binary Chalcogenides

## STRUCTURE AND DYNAMICS

Bauchy, Kachmar and Micoulaut, JCP 141 (2014)

### 1 $\text{Ge}_x\text{Se}_{1-x}$ , $\text{As}_x\text{Se}_{1-x}$ or $\text{Ge}_x\text{S}_{1-x}$

- Accurate glass structures, in excellent agreement with scattering experiments.
- Presence of homopolar defects (Ge-Ge, As-As, Se-Se, S-S).



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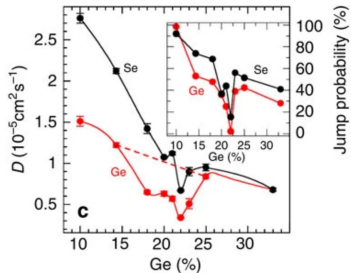
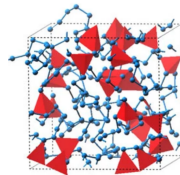
## STRUCTURE AND DYNAMICS

Yildirim, Raty and Micoulaut, Nature Comm. 7 (2016)

Bauchy et al. PRL 110 (2013)

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- Anomalies in dynamic properties



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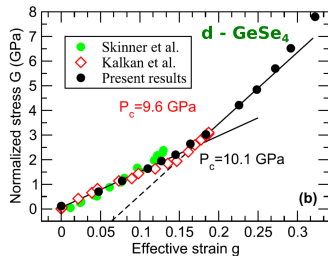
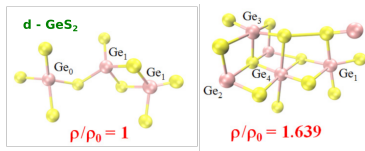
Wezka et al. PRB 90 (2014)

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### 2 **Densified chalcogenides**

- Coordination and geometry change with pressure
- Evidence of polyamorphism



## INFRARED SPECTRUM

Different methods can be used:

### ① **Finite electric field ( $\epsilon$ ) method** (Umari and Pasquarello, PRL 89 (2002))

- One adds into the functional a term  $E_{ion} = -\epsilon \cdot \mathbf{P}_{ion}$  with

$$\mathbf{P}_{ion} = \sum_i Z_i \cdot \mathbf{R}_i$$

- Dynamic Born charge tensors  $Z^* = F_\epsilon / \epsilon$  give acces to IR spectrum.

### ② **Linear response theory** (DFT perturbation theory, Putrino and Parrinello, PRL 2002)

- Similarly to the calculation of e.g. transport coefficients in linear response theory (autocorrelation functions)
- One considers consider the response of the system under a small perturbation through response (Green) functions coupled to an excitation at frequency  $\omega$ .



# Properties from the electronic treatment

## INFRARED SPECTRUM

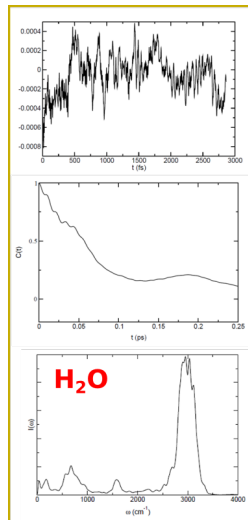
Courtesy of R. Vuilleumier (ENS)

- Perturbation to the Hamiltonian is :  
–  $\mathbf{M} \cdot \mathbf{E}$  with  $\mathbf{M}$  the dipolar momentum.
- Using linear response theory, one can show that the infrared absorption is :

$$\epsilon_2(\omega) = \frac{2\pi}{3Vk_B T} \int_{-\infty}^{\infty} e^{-i\omega t} \langle \mathbf{M}(t) \cdot \mathbf{M}(0) \rangle dt$$

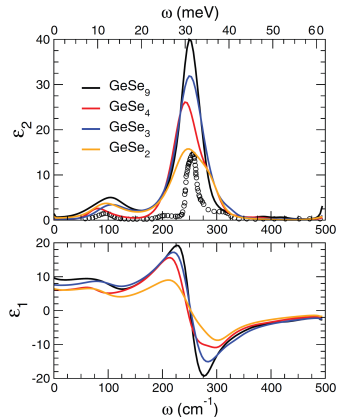
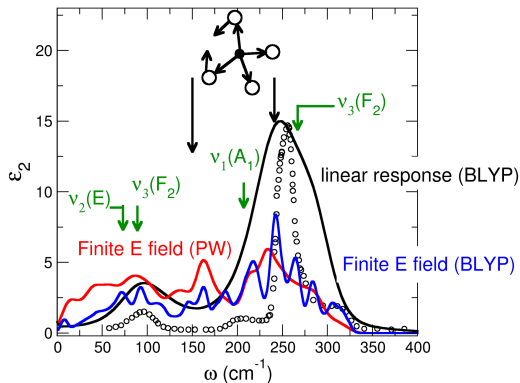
- Real part from Kramers-Krönig relations:

$$\epsilon_1(\omega) = \frac{2}{\pi} \int_0^{\infty} \frac{\Omega \epsilon_2(\Omega)}{\Omega^2 - \omega^2} d\Omega$$



## INFRARED SPECTRUM of Ge-Se GLASSES

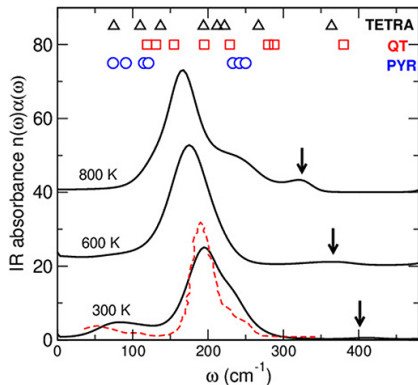
M. Micoulaut et al. PRB 88 (2013)



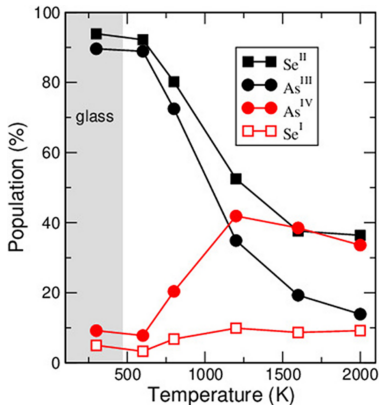
# Properties from the electronic treatment

## INFRARED ANALYSIS OF $\text{As}_2\text{Se}_3$

Signatures of coordination defects can be decoded from the analysis of the infrared spectra of liquid and glassy  $\text{As}_2\text{Se}_3$ .



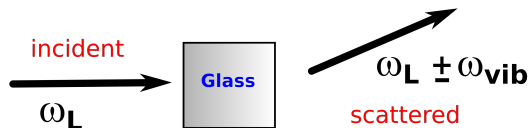
M. Micoulaut and P. Boolchand *Front. Mat.* 6 (2019)



Presence of a defect line at  $350\text{-}400\text{ cm}^{-1}$  compatible with the presence of four-fold As

# Properties from the electronic treatment

## RAMAN SCATTERING



Polarisation induced by electric field  $\mathbf{E}$  :  $\mathbf{M} = \overset{\leftrightarrow}{\chi} \mathbf{E}(t) = \overset{\leftrightarrow}{\chi} \mathbf{E}_m \cos \omega_L t$

$$\overset{\leftrightarrow}{\chi} (\{R\}) = \overset{\leftrightarrow}{\chi} (\{R_0\}) + \left( \{R\} - \{R_0\} \right) \frac{\partial \overset{\leftrightarrow}{\chi}}{\partial \{R\}} + \dots$$

Harmonic approximation of the lattice dynamics:  $\{R\} - \{R_0\} \simeq u \cos \omega_{\text{vib}} t$

$$\mathbf{M} = \overset{\leftrightarrow}{\chi} (\{R_0\}) \mathbf{E} \cos \omega_L t + \frac{1}{2} \frac{\partial \overset{\leftrightarrow}{\chi}}{\partial \{R\}} \mathbf{E}_m u \left[ \cos(\omega_L + \omega_{\text{vib}}) t + \cos(\omega_L - \omega_{\text{vib}}) t \right]$$

# Properties from the electronic treatment

## RAMAN SCATTERING

Raman cross section

Lazzeri and Mauri, PRL 90 (2003)

$$\frac{d\sigma}{d\Omega} \propto V \left( \frac{\omega_L}{c} \right)^4 \sum_{vib} \left| \mathbf{e}_S \cdot \frac{\partial \overset{\leftrightarrow}{\chi}}{\partial \{Q_{vib}\}} \cdot \mathbf{e}_L \right|^2 \frac{\hbar}{2\omega_{vib}} \cdot A_{vib}$$

with Raman susceptibility :

$$\frac{\partial \overset{\leftrightarrow}{\chi}}{\partial \{Q_{vib}\}} = \sum_I \frac{\mathbf{e}'_{vib}}{\sqrt{M_I}} \cdot \frac{\partial \overset{\leftrightarrow}{\chi}}{\partial \mathbf{R}_I}$$

and Raman tensor :

$$\frac{\partial \overset{\leftrightarrow}{\chi}}{\partial \mathbf{R}_I} = \frac{\partial \chi_{\mu\nu}}{\partial \mathbf{R}_I} \propto \frac{\partial^2 F_I}{\partial E_\mu \partial E_\nu}$$

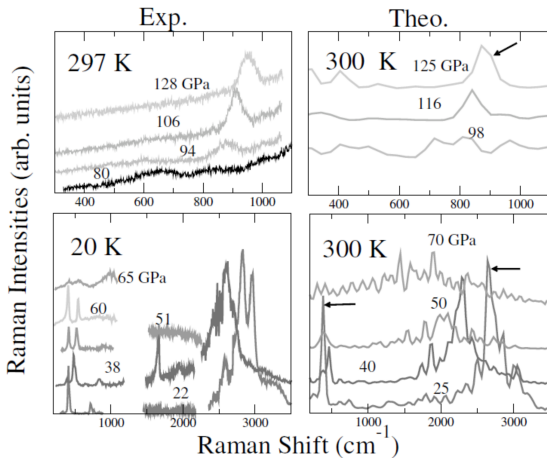
**Alternative** : Linear response theory from polarizability tensor :

Putrino and Parrinello, PRL 88 (2002)

$$\overset{\leftrightarrow}{\alpha} = \alpha_{\mu\nu}(t) = - \frac{\partial \mathbf{P}_\mu}{\partial \mathbf{E}_\nu} \equiv \frac{\partial^2 E}{\partial \mathbf{E}_\mu \partial \mathbf{E}_\nu}$$

# Properties from the electronic treatment

## RAMAN SCATTERING



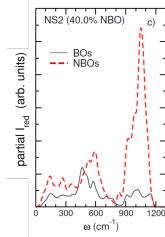
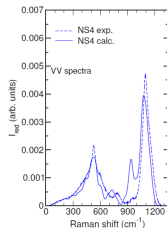
Putrino and Parrinello, PRL 88 (2002)

# Properties from the electronic treatment

## RAMAN SCATTERING

- Excellent reproduction of the Raman spectra
- Sodium silicates: Atomic scale contribution or contribution of identified species
- Beyond experimental Gaussian deconvolution
- More details: [P. Giannozzi et al., JPCM 21 \(2009\)](#)  
<http://www.quantum-espresso.org>

Kilymis et al. PRB 99 (2019)

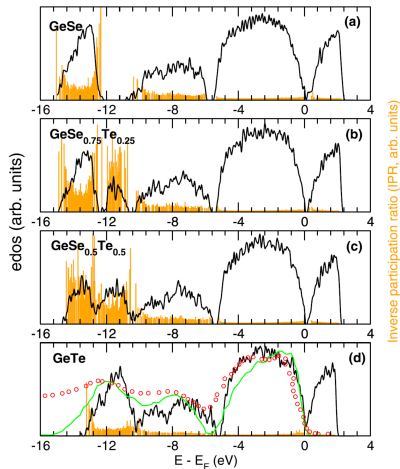


# Properties from the electronic treatment

## ELECTRONIC DENSITY OF STATES

Micoulaut et al. PRB 104 (2021)

- Computation of the KS eigenstates allows to obtain electronic density of states.
- Directly comparable with experiments from X-ray photoemission spectroscopy (XPS) for the valence band and with inverse photoemission for the conduction band.



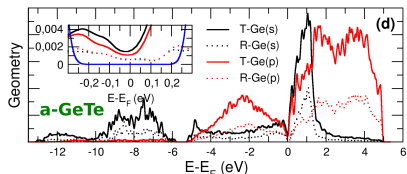
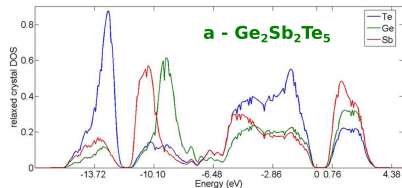


# Properties from the electronic treatment

## ELECTRONIC DENSITY OF STATES

Prasai and Drabold, PRB 83 (2011)

- Computation of the KS eigenstates allows to obtain electronic density of states.
- Directly comparable with experiments from X-ray photoemission spectroscopy (XPS) for the valence band and with inverse photoemission for the conduction band.
- Details from atomic structure (species, coordination defects,...) provides insight.



Micoulaut and Flores-Ruiz, (2022)

# Conclusion

- Ab initio methodology well established for glasses and liquids.
- Access to structure and dynamics ( $\propto$  classical MD) for covalent and semi-metallic systems.
- New properties can be calculated from ab initio simulations (Raman, IR, XPS, ...) in order to establish structure-property relationships.
- Atomic scale insight into vibrational spectra
- Possibility to investigate properties of chalcogenides or densified glasses
- Applications in optoelectronics where electronic phenomena are clearly at play.

Merci à : Steve Martin, Jincheng Du