

# Structural properties and phase transitions of hydrogen and hydrogen-rich compounds by Quantum Monte Carlo

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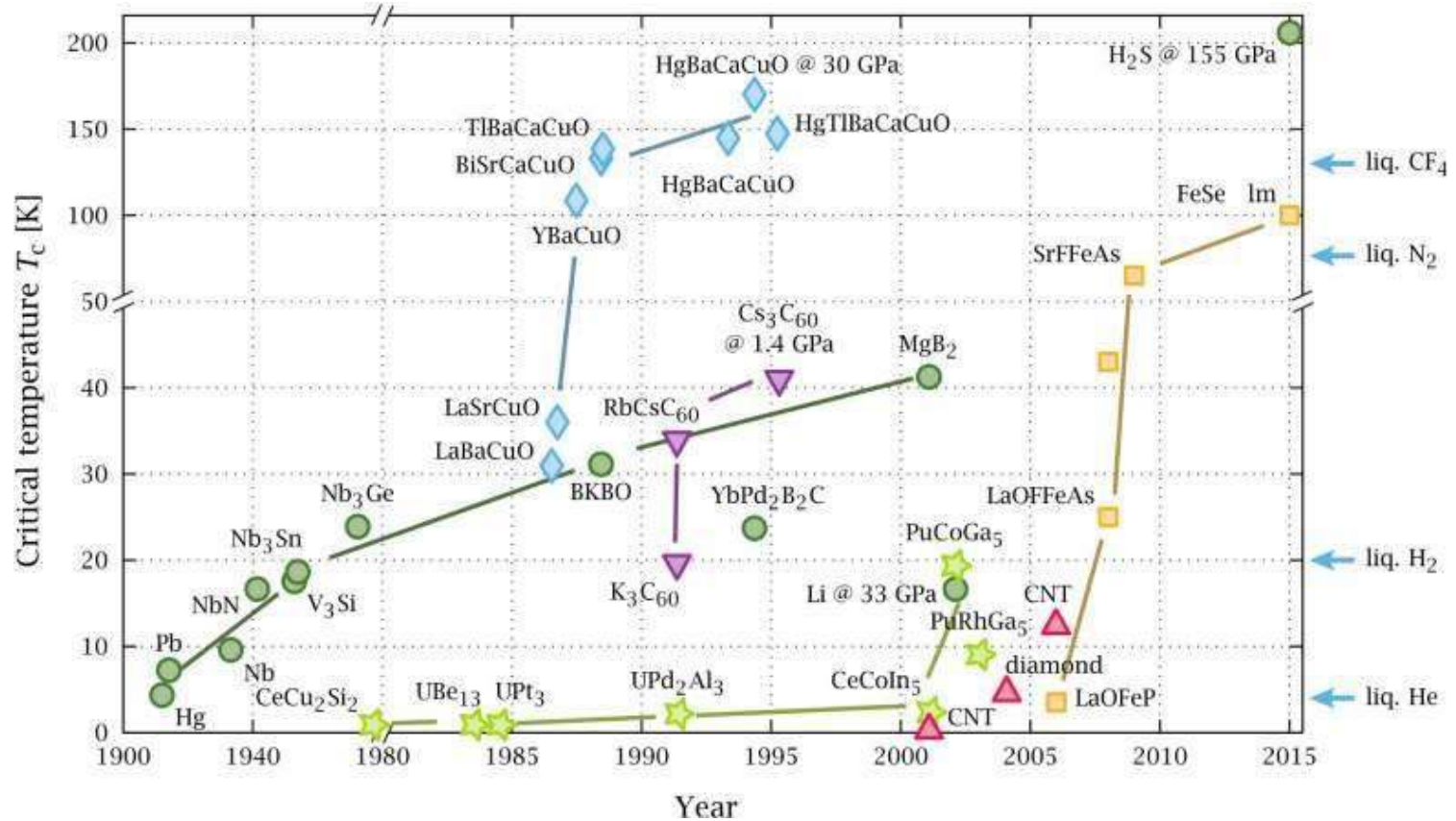


# Outline

1. Theoretical/Computational challenges
2. High-pressure hydrogen phase diagram
3. Proton transfer in water clusters
4. Perspectives

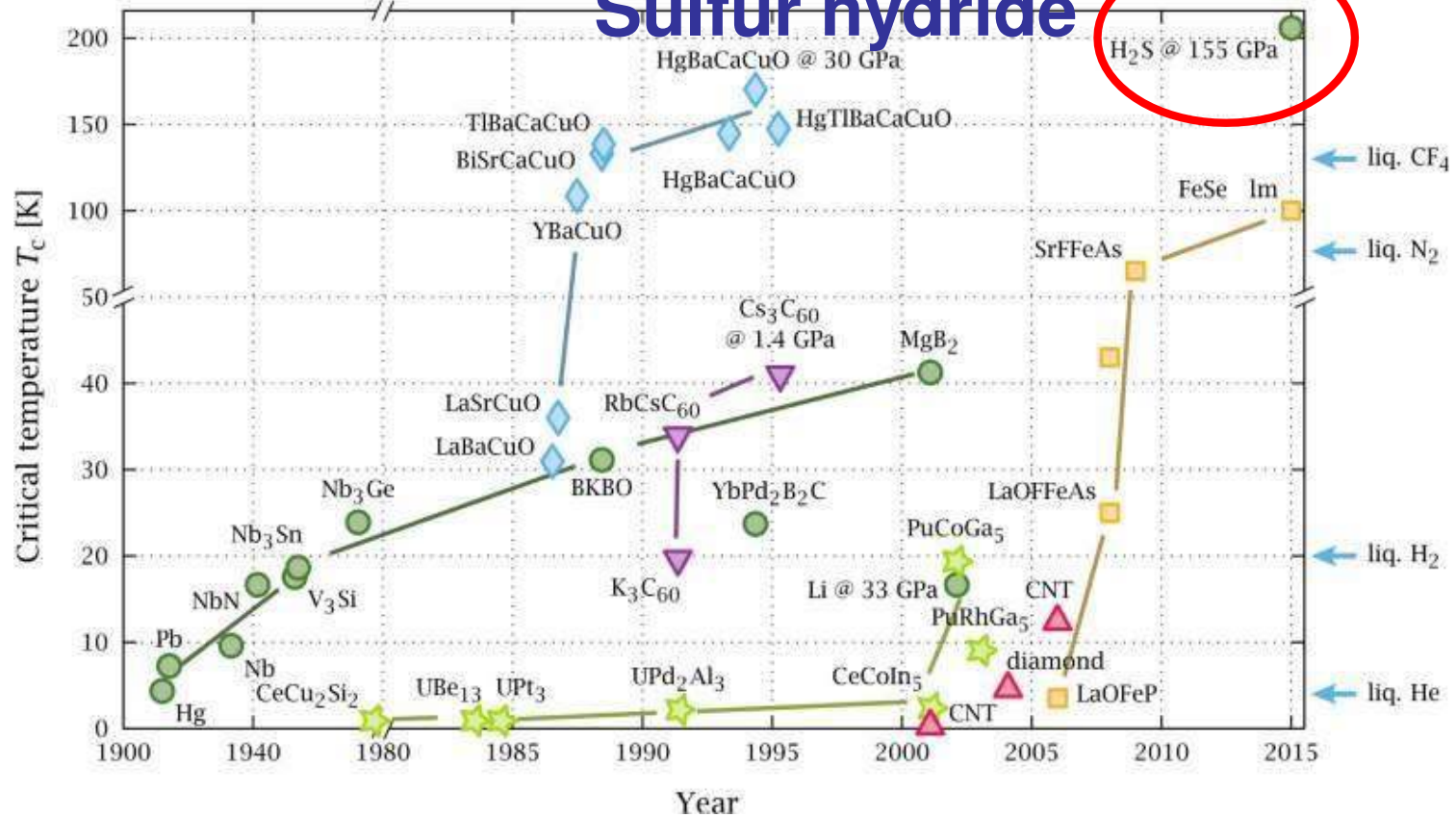
- **Hydrogen and hydrogen-rich materials** belong to the family of *quantum* materials / *quantum* crystals:
  - Both electrons and nuclei are **quantum particles**
  - **Nuclei with light mass** → **quantum nuclear delocalization**
  - **Nuclear quantum effects (NQE) lead to remarkable properties**

# Towards room temperature superconductivity



## Hydrogen-based high-pressure superconductivity

### Sulfur hydride



# Hydrogen as **conventional** high-temperature superconductor

Three Bardeen-Cooper-Schrieffer (BCS) golden rules to maximize

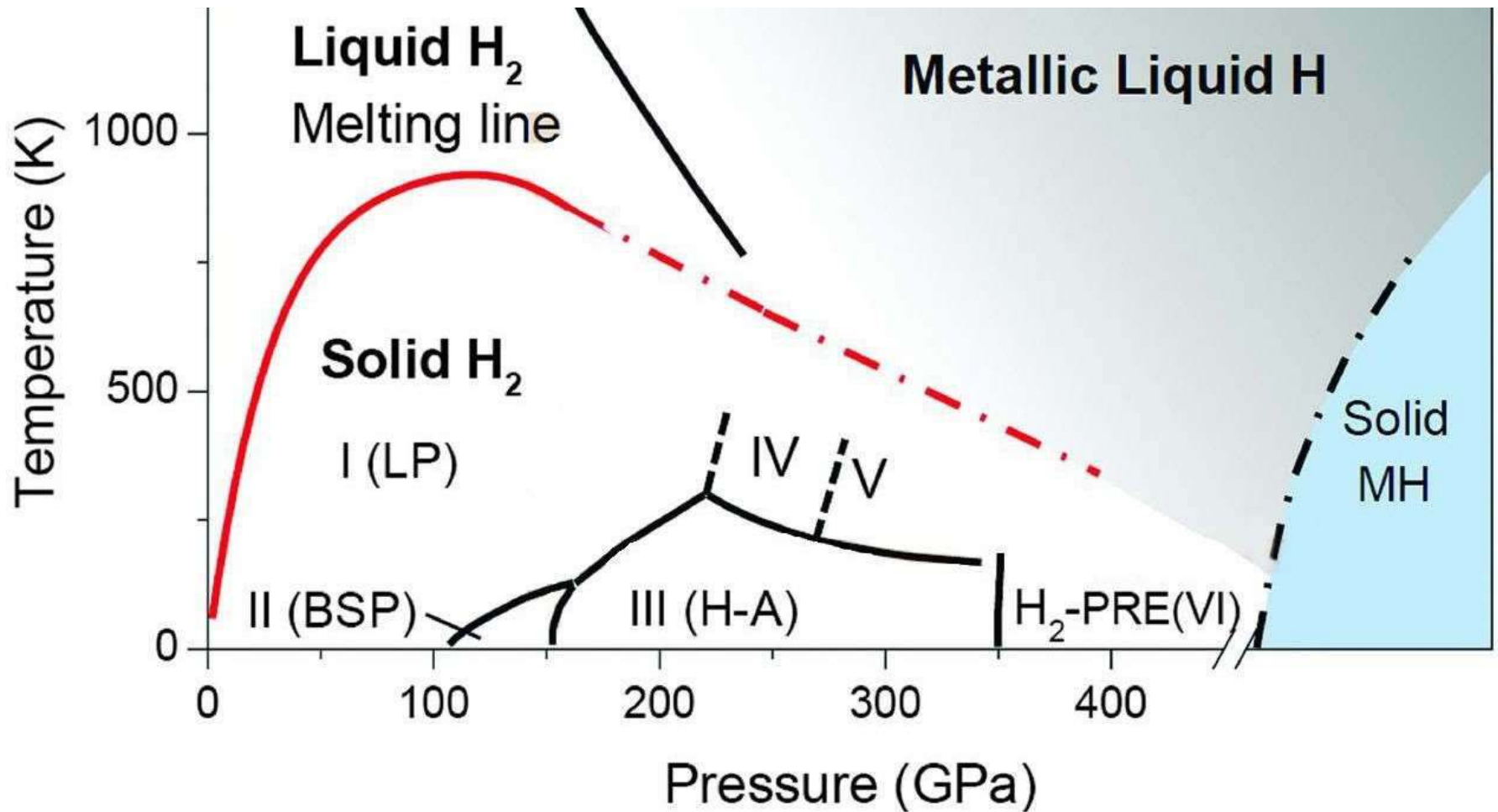
$$\Delta = 2 \sim \omega_{\text{cut}} e^{-1/N(\epsilon_F) V}$$

1. large nuclear vibrations
2. high electronic density of states at the Fermi level
3. strong coupling between phonons and electrons

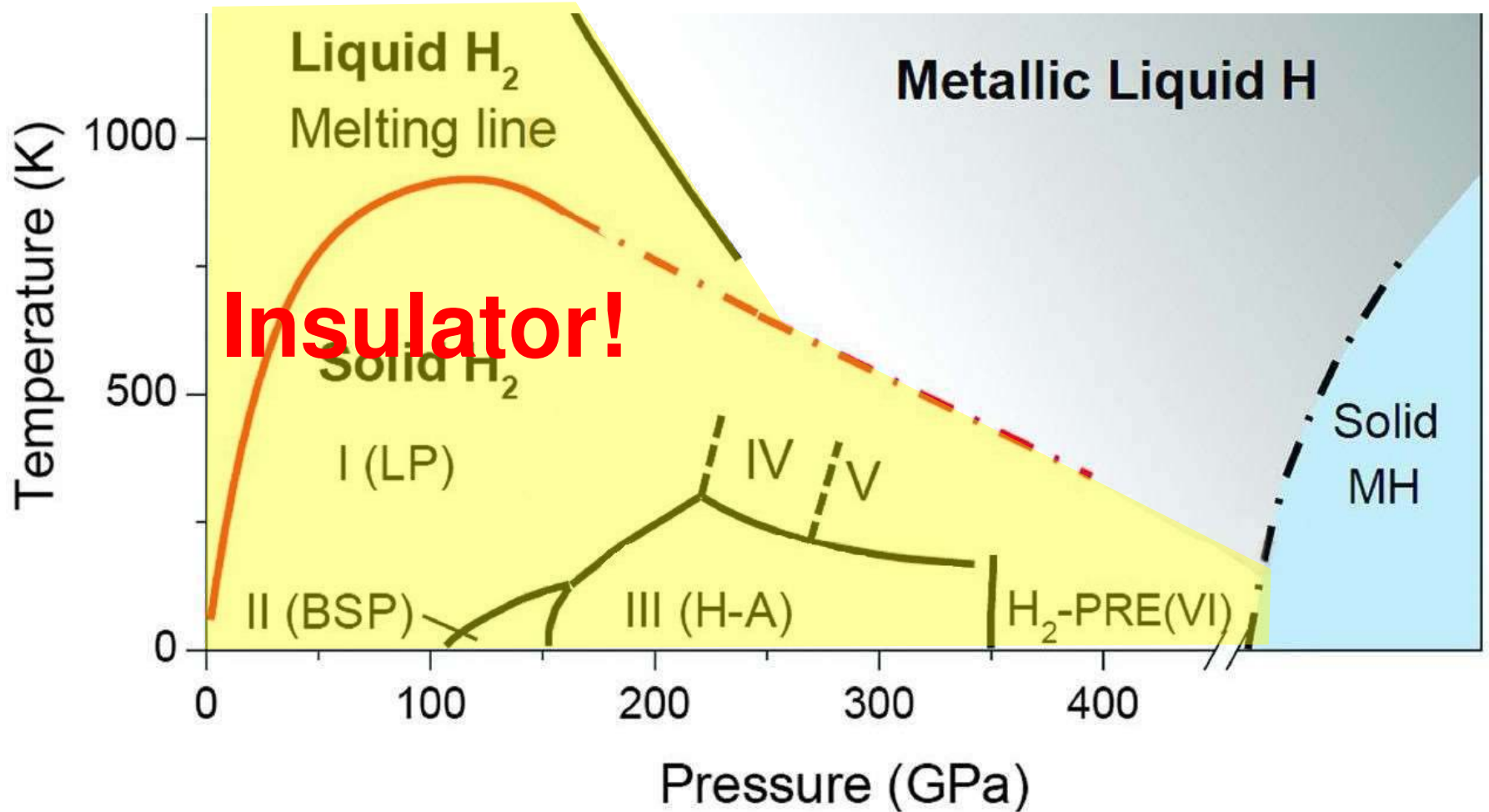


Hydrogen will meet the above requirements thanks to its light mass  
**But first it needs to become a metal!**

# Hydrogen phase diagram

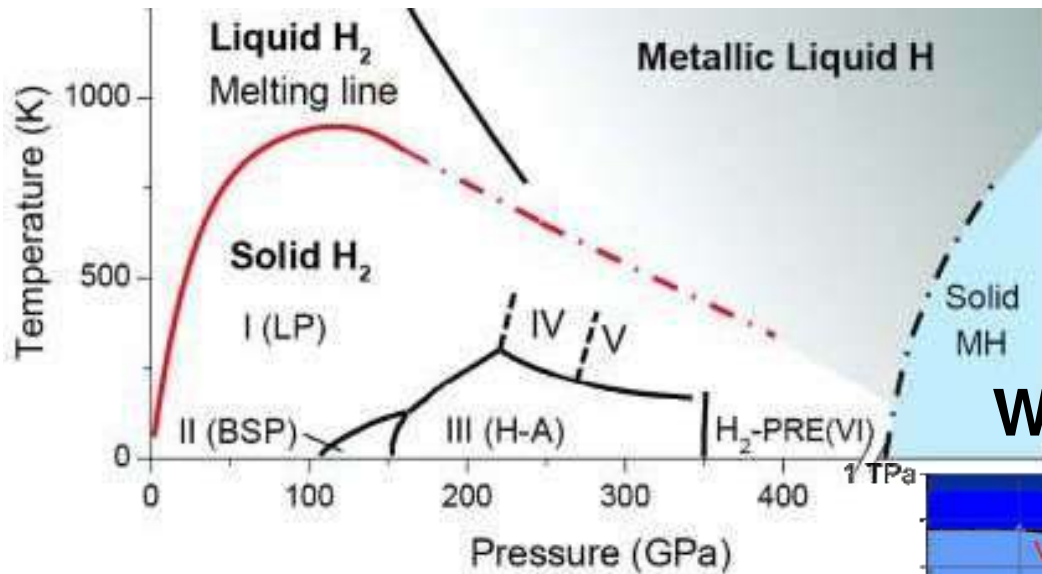


# Hydrogen phase diagram



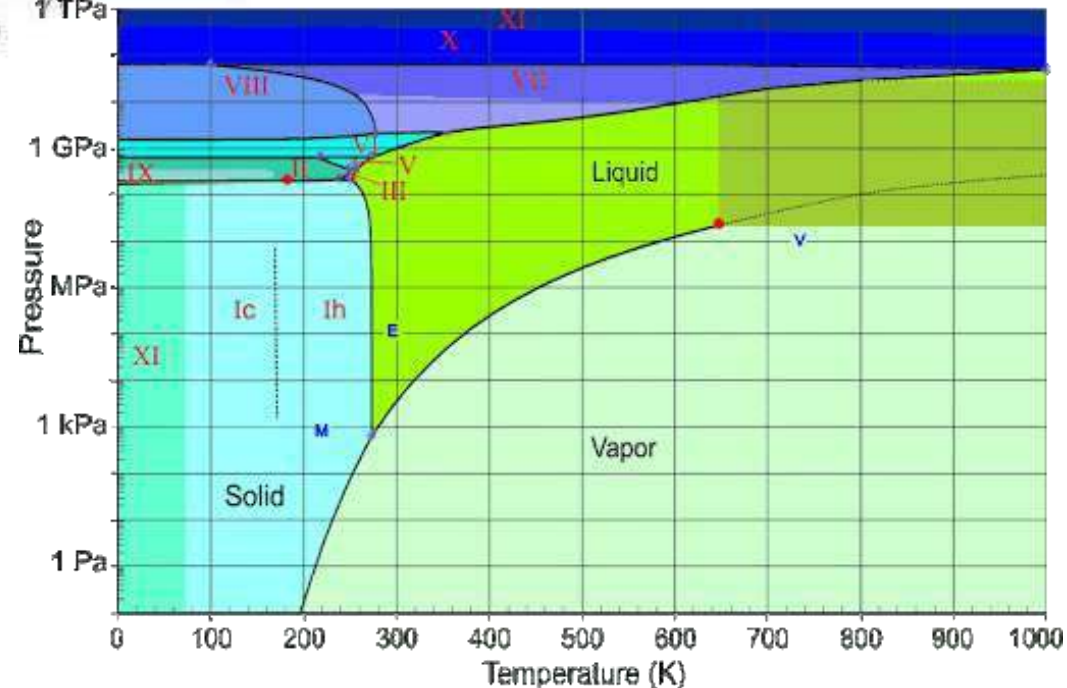


# Hydrogen/Water phase diagrams



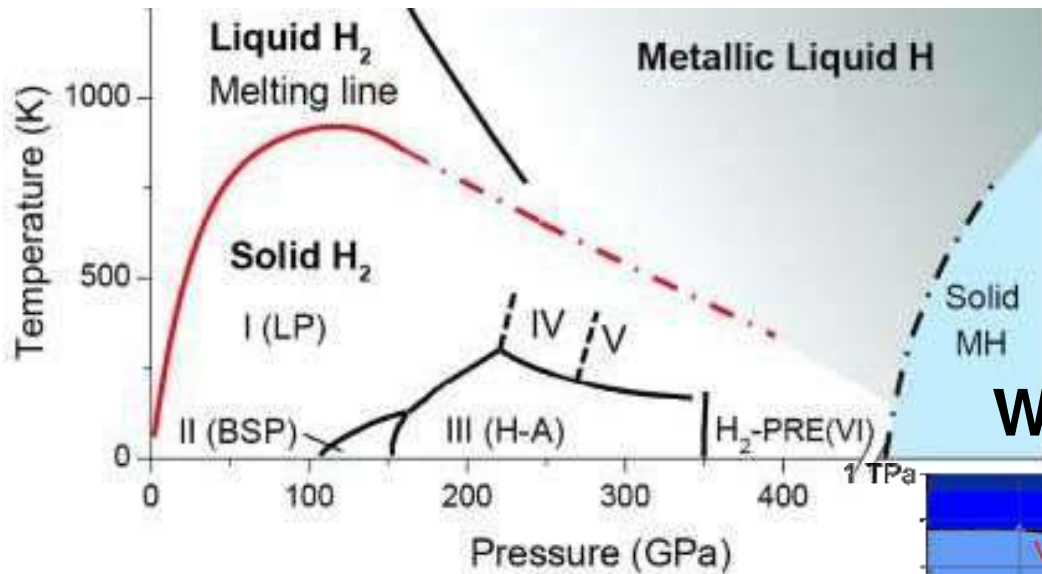
Hydrogen

Water (H-bonded network)



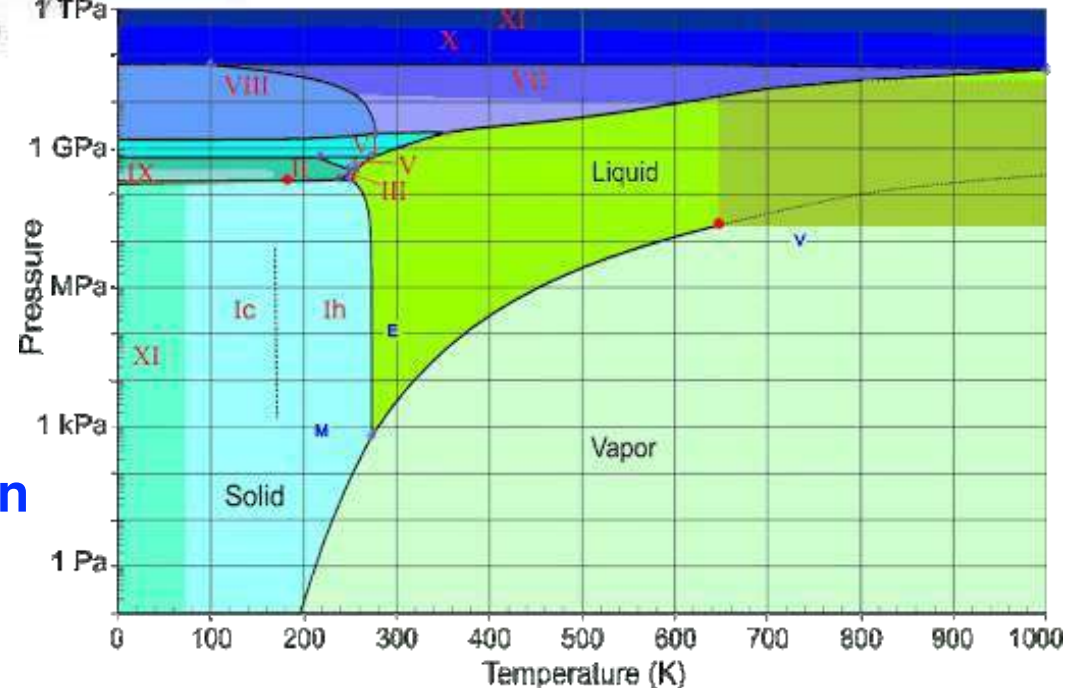
**Quantum materials:**  
**Very complex and**  
**rich phase diagrams**

# Hydrogen/Water phase diagrams



Hydrogen

Water (H-bonded network)



**Quantum materials:**  
**Very complex and rich phase diagrams**

**Competition/interplay between internal (electronic) and vibrational (nuclear) energies**

# Theoretical/computational challenges

- Accurate evaluation of **electronic internal energies** (i.e. full account of *electronic correlation*)
- Accurate treatment of **the nuclear degrees of freedom by a quantum description** (i.e. full account of *nuclear quantum effects*)
- Non-trivial **interplay** between the two

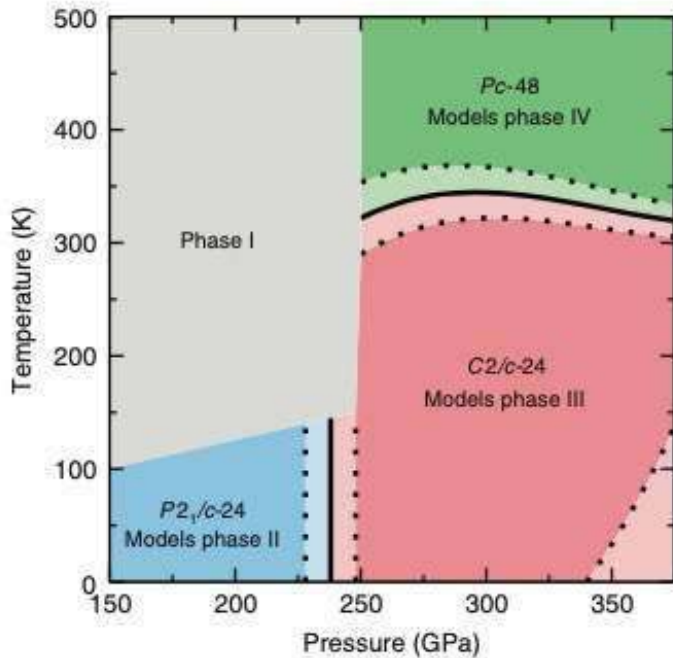
# Theoretical/computational challenges

- Accurate evaluation of **electronic internal energies** (i.e. full account of *electronic correlation*)
- Accurate treatment of **the nuclear degrees of freedom by a quantum description** (i.e. full account of *nuclear quantum effects*)
- Non-trivial **interplay** between the two

Large variety of structures (in competition) spanning a wide pressure-range  
→ ***Quantum Monte Carlo (QMC) most valuable method***

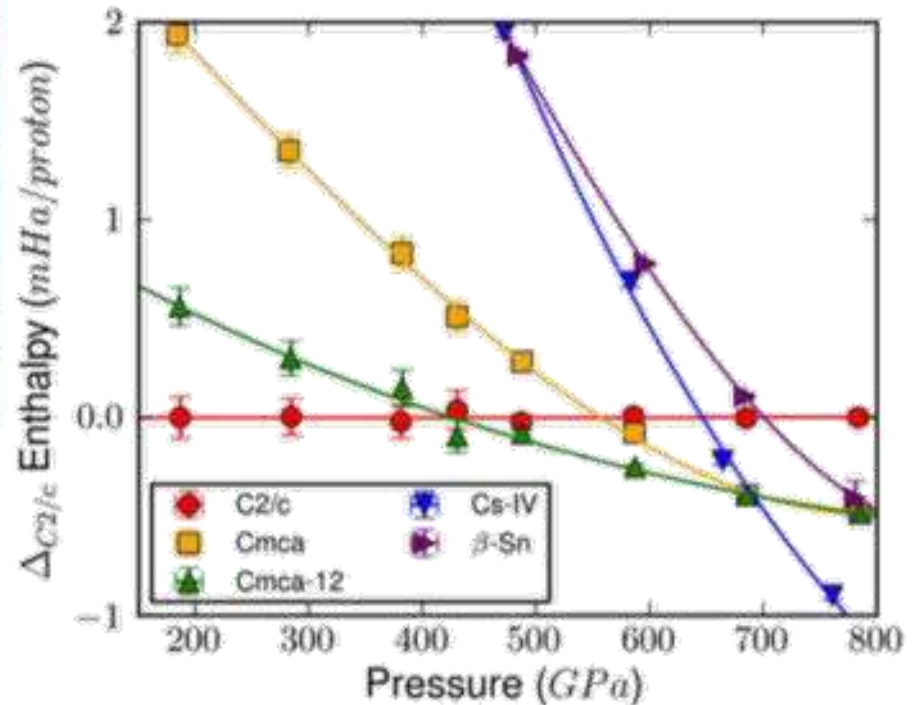
# Hydrogen phase diagram from DMC

Several works!



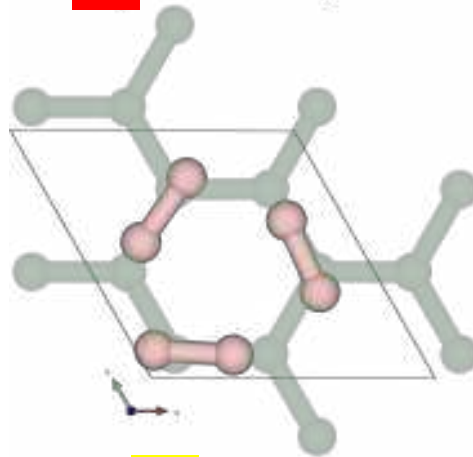
Nat Comm **6**, 8794 (2015)  
N.D. Drummond *et al.*

PRL **114**, 105305 (2015)  
McMinis, Clay III, Lee, Morales

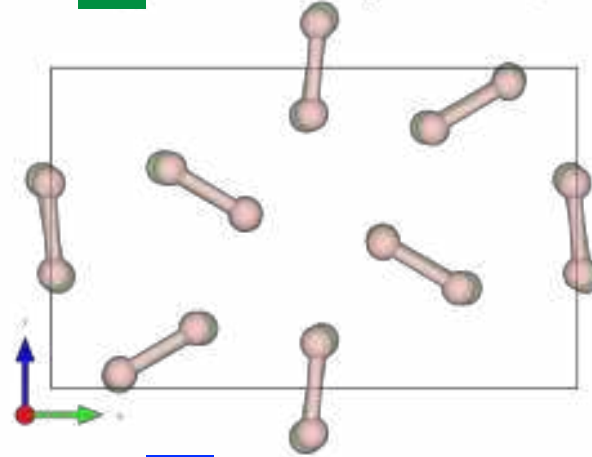


# Competing symmetries

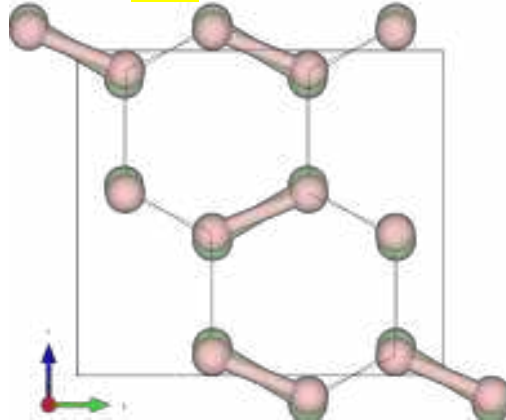
**C2/c-24 (phase III)**



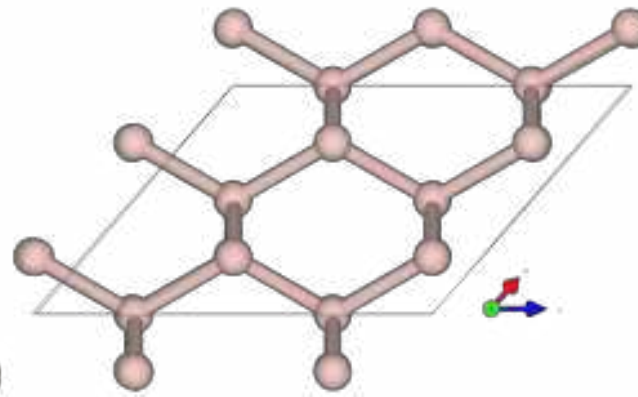
**Cmca-12 (phase VI)**



**Cmca-4**



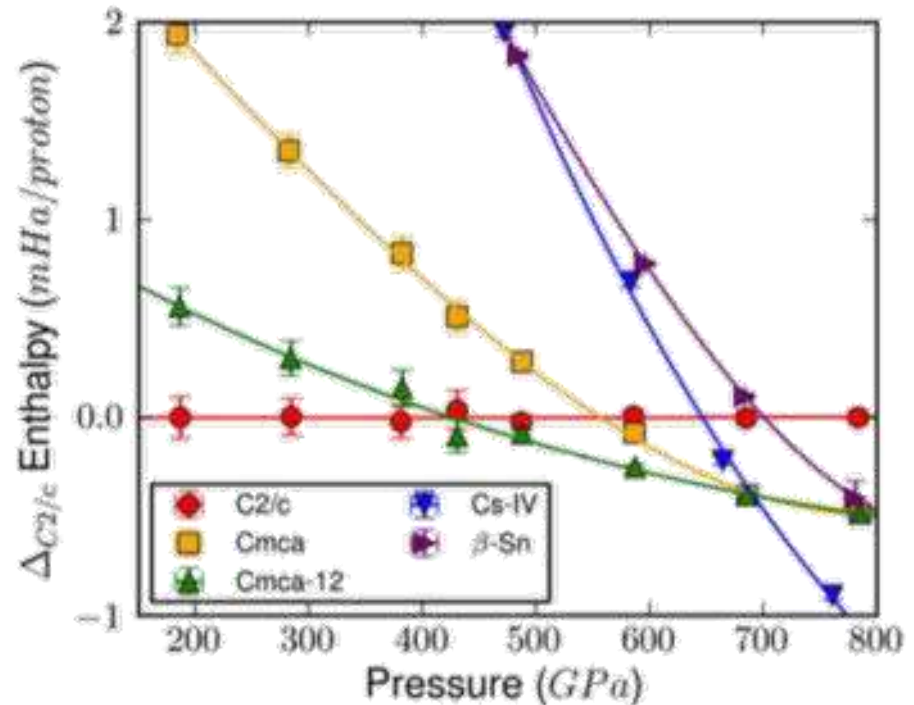
**Cs-IV (atomic)**



# Hydrogen phase diagram from DMC

PRL **114**, 105305 (2015)  
McMinis, Clay III, Lee, Morales

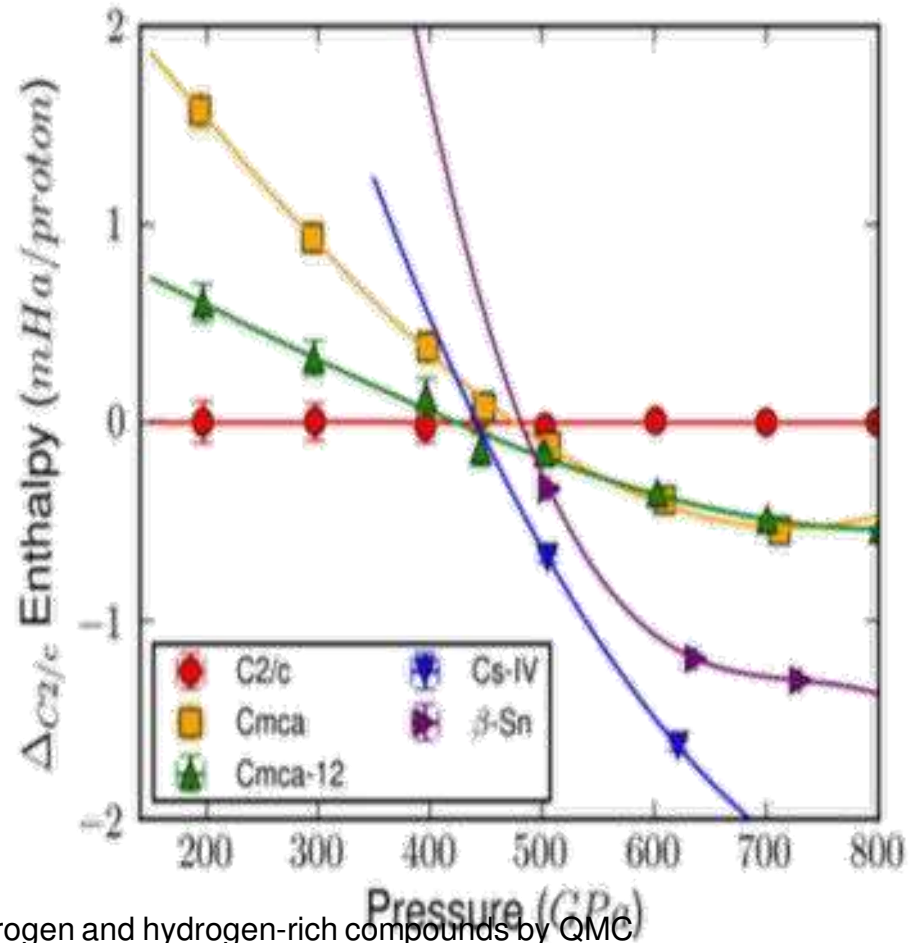
Internal energies from QMC  
*Static lattice*  
*(DFT-DF equilibrium geometry)*



# Hydrogen phase diagram from DMC

PRL **114**, 105305 (2015)  
 McMinis, Clay III, Lee, Morales

Internal energies from QMC  
*Harmonic zero point energies*  
*(DFT-DF equilibrium geometry)*

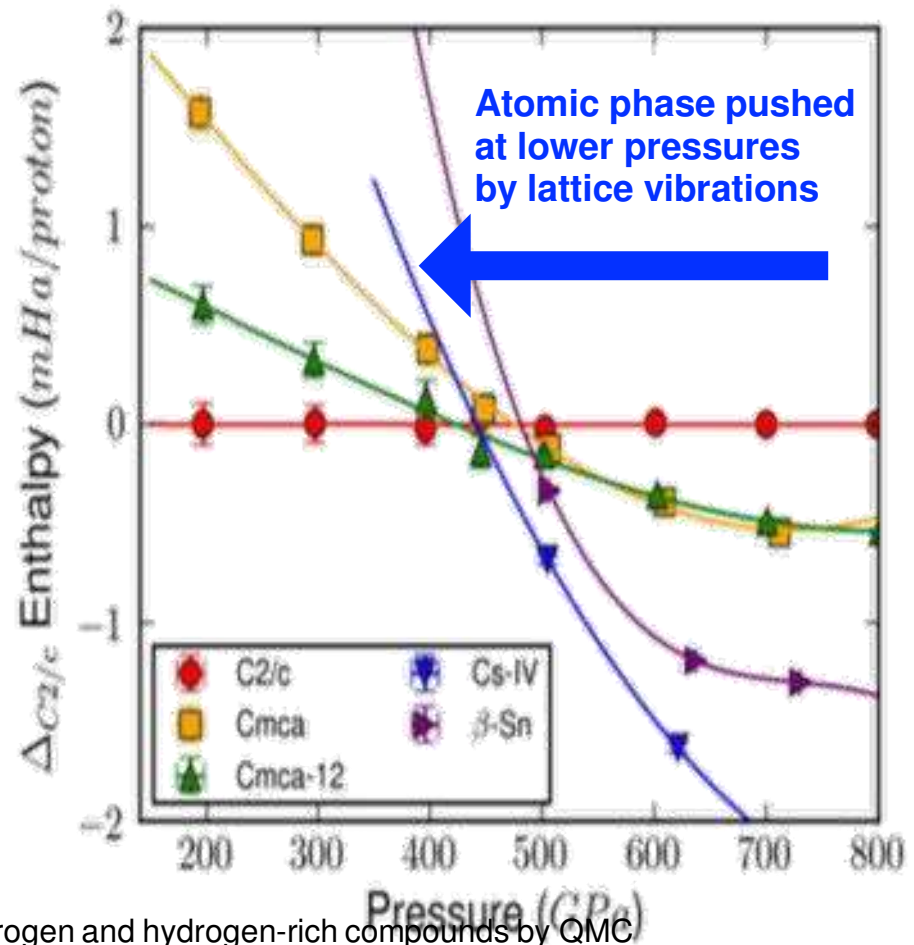




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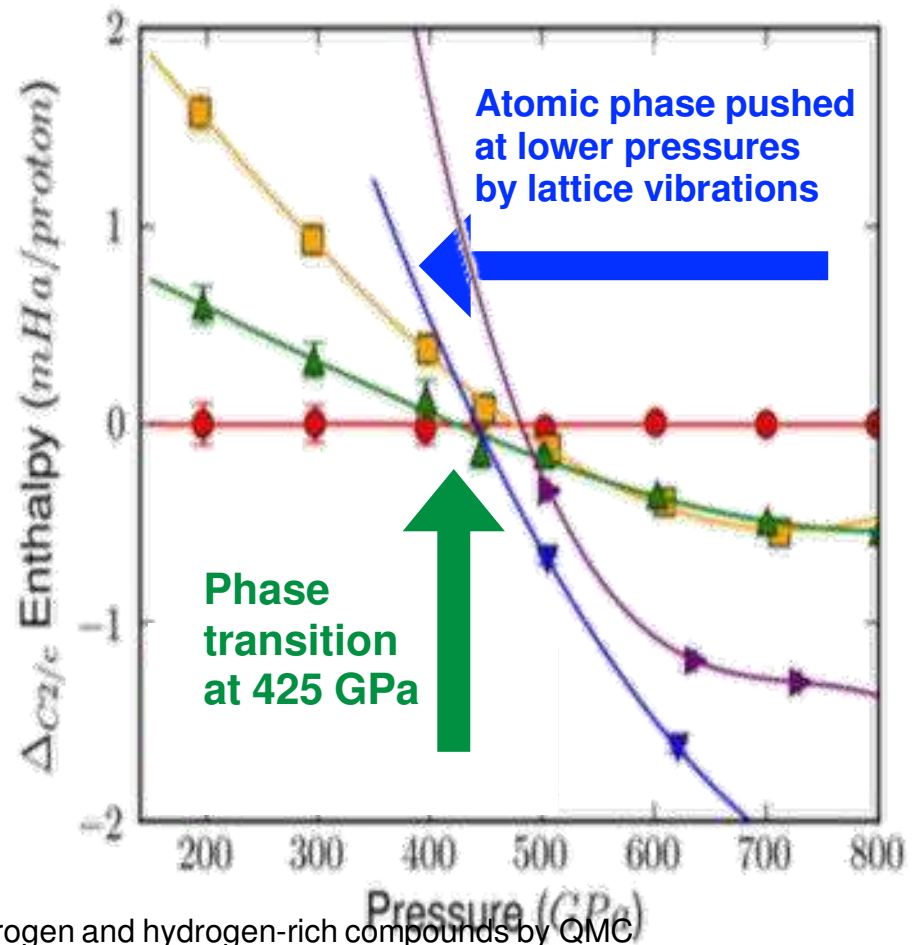


# Hydrogen phase diagram from DMC

PRL **114**, 105305 (2015)  
McMinis, Clay III, Lee, Morales

Internal energies from QMC  
**Harmonic** zero point energies  
(DFT-DF equilibrium geometry)

Predicted transition  
from C2/c to Cmca-12  
However atomic phase very close!



## Synchrotron infrared spectroscopic evidence of the probable transition to metal hydrogen

<https://doi.org/10.1038/s41586-019-1927-3>

Paul Loubeyre<sup>1\*</sup>, Florent Occelli<sup>1</sup> & Paul Dumas<sup>1,2</sup>

Received: 12 April 2019

Accepted: 26 November 2019

Published online: 29 January 2020

Hydrogen has been an essential element in the development of atomic, molecular and condensed matter physics<sup>1</sup>. It is predicted that hydrogen should have a metal state<sup>2</sup>;

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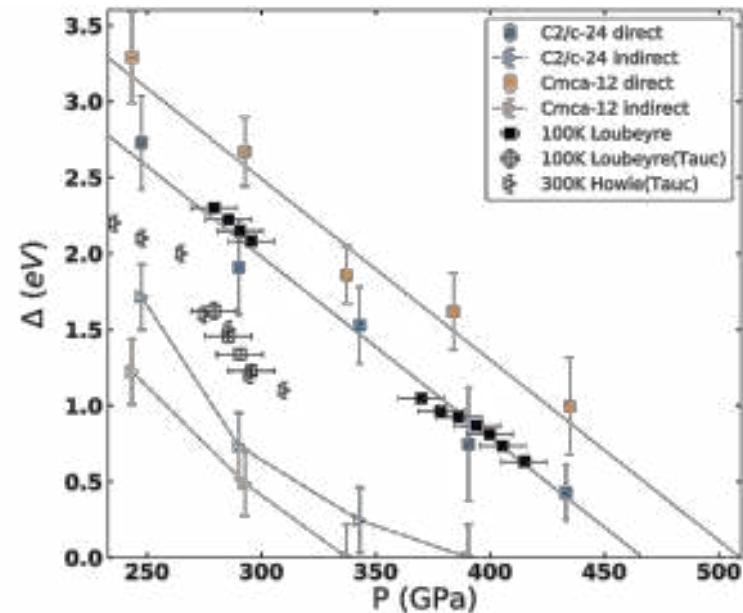
PRL **124**, 1 6401 (2020),  
Gorelov, Holzmann, Ceperley, Pierleoni

**Direct gap** computed by reptation QMC  
on coupled electron-ion Monte Carlo  
lattice configurations

**C2/c gap closure in agreement  
with infrared spectroscopy**

**Strong renormalization by NQE!!!**

(as also suggested by Azadi, Drummond, Foulkes in  
PRB **95**, 035142 (2017))



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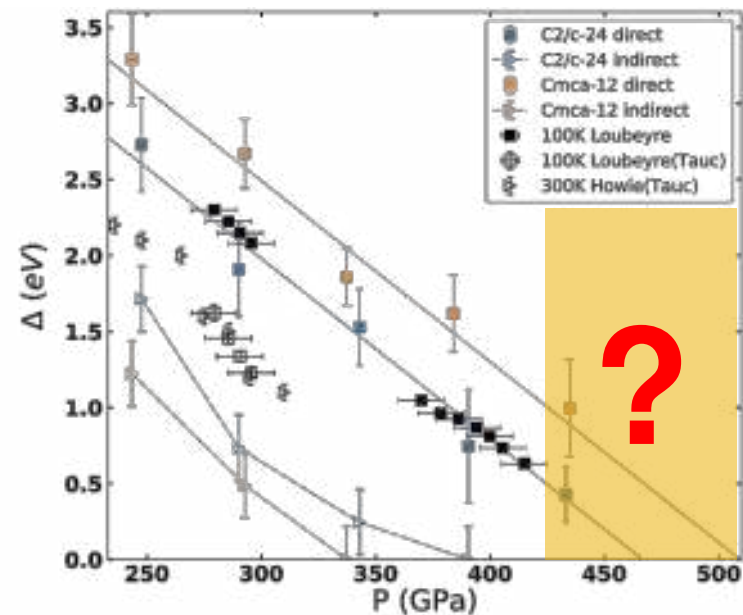
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**Which metallic phase above 425 GPa?**

**Where is the atomic phase located?**



Strategy:

1. Compute **anharmonic vibrational energies** using the self consistent harmonic approximation (**SCHA**) within DFT (BLYP)
2. Compute **internal electronic energies** by **diffusion Monte Carlo** on the SCHA centroids (which include structural deformation due to NQE)
3. Add the **SCHA vibrational zero point energy** to the DMC internal energy for the **final phase diagram**

By construction, the “best harmonic approximation” for the nuclear degrees of freedom at a given potential energy surface.

It minimizes the vibrational free energy functional of the system.

$$\mathcal{F}[\tilde{\rho}] = E[\tilde{\rho}] - TS[\tilde{\rho}] \geq F,$$

Gaussian density matrix solution of auxiliary harmonic Hamiltonian

$$\mathcal{H}_{\mathcal{R},\Phi} = K + \frac{1}{2} \sum_{ab} (R_a - \mathcal{R}_a) \Phi_{ab} (R_b - \mathcal{R}_b).$$

The stochastic SCHA implementation minimizes:

$$F = \min_{\mathcal{R}, \Phi} F[\mathcal{R}, \Phi] = F[\mathbf{q}, \Phi_{\text{eq}}]$$

$\mathbf{q}$  are the centroid positions,  $\Phi_{\text{eq}}$  is the force constant matrix

$$\Psi_{\mathbf{q}}^k(\mathbf{x}_1, \dots, \mathbf{x}_{N_{el}}) = J_{\mathbf{q}}(\mathbf{r}_1, \dots, \mathbf{r}_{N_{el}}) \Psi_{SD,q}^k(\mathbf{x}_1, \dots, \mathbf{x}_{N_{el}})$$

$\mathbf{q}$  is the ion position, the wave function depends explicitly on the ion coordinates through the ion-centered periodized Gaussian basis set  
The Jastrow is optimized at the variational VMC level

$$J_{\mathbf{q}} = \exp \left[ \sum_i \sum_j \sum_{\text{atoms}} J_{\mathbf{q}}^{1\text{body}}(|r_i - q_j|) + \sum_{i < j} \Phi_{J_{\mathbf{q}}} (r_i, r_j) \right]$$

1-body Jastrow

$$J_{\mathbf{q}}^{1\text{body}}(r - q) = Z_{\mathbf{q}} \frac{1 - e^{-aP(|r-q|)}}{a}$$

many-body Jastrow  $\Phi_{J_{\mathbf{q}}}(r_i, r_j) = \frac{1}{2} \frac{P(|r_i - r_j|)}{1 + bP(|r_i - r_j|)} + \sum_{a,b} \sum_{\mu,\nu} g_{\mu,\nu}^{a,b} \Psi_{a,\mu}^J(r_i - q_a) \Psi_{b,\nu}^J(r_j - q_b)$

mapping function

$$P(x) = \begin{cases} x & (-\frac{1}{6} < x < \frac{1}{6}) \\ -\frac{1}{54(1/2+x)^2} & (-\frac{1}{2} \leq x \leq -\frac{1}{6}) \\ \frac{1}{54(1/2-x)^2} & (\frac{1}{6} \leq x \leq \frac{1}{2}). \end{cases} \quad \text{in crystal units}$$

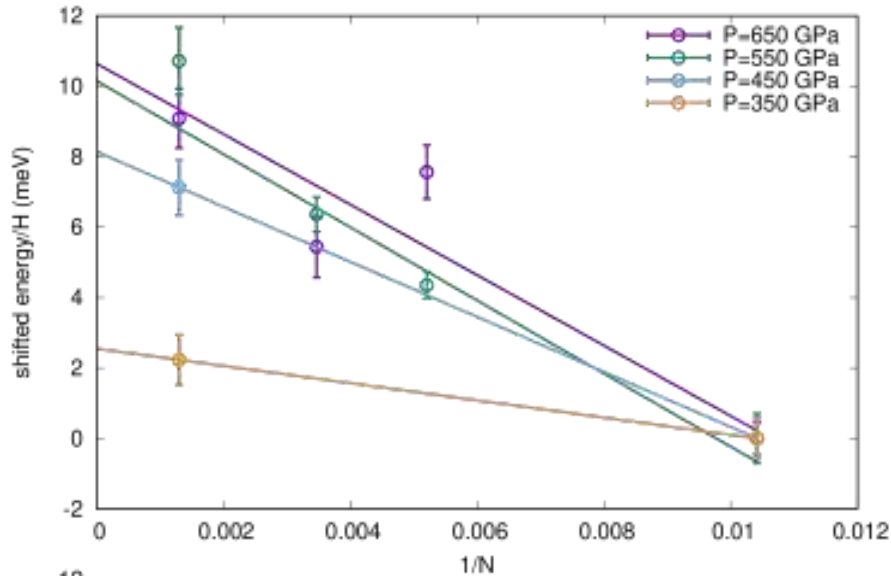


# QMC technicalities

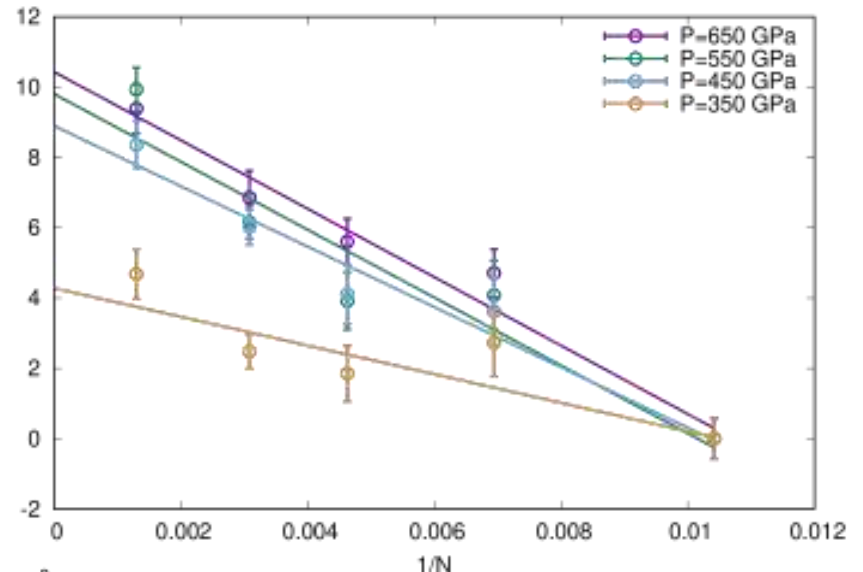
- TurboRVB QMC package
- SD orbitals taken from density functional theory (DFT) within the local density approximation (LDA) built in TurboRVB
- Dense k-point sampling (twist average over  $18 \times 18 \times 18$  in most phases)
- Kwee-Zhang-Krakauer (KZK) functional for finite size corrections
- Explicit finite-size extrapolation up to  $N_{eI}=1024$  for the atomic phase and  $N_{eI}=768$  for the main molecular phases
- Jastrow optimization
- Nodal relaxation through orbital optimization for  $N_{eI}=96$  at some pressure/phase
- Variational and Lattice regularized diffusion Monte Carlo simulations

# Finite size-extrapolation

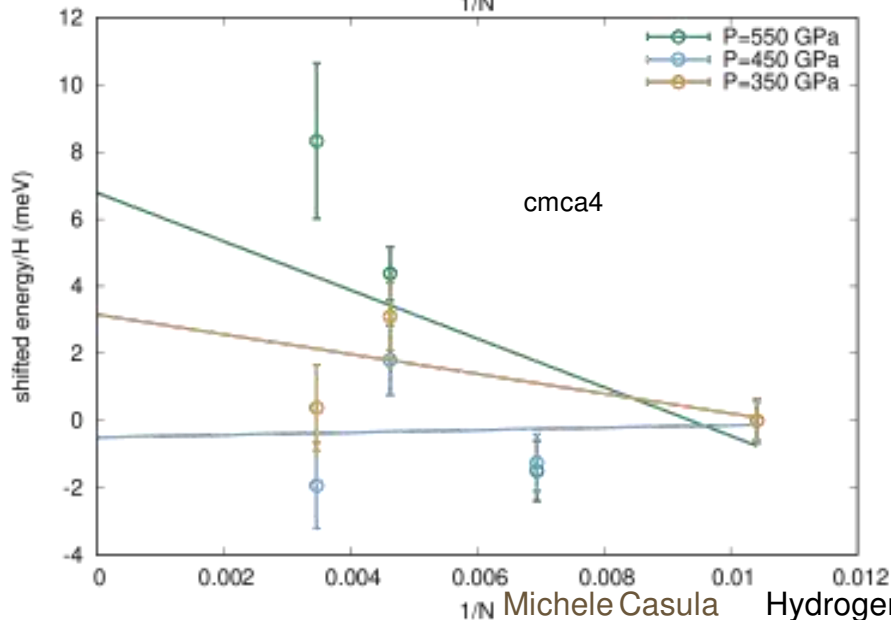
C2/c molecular hydrogen



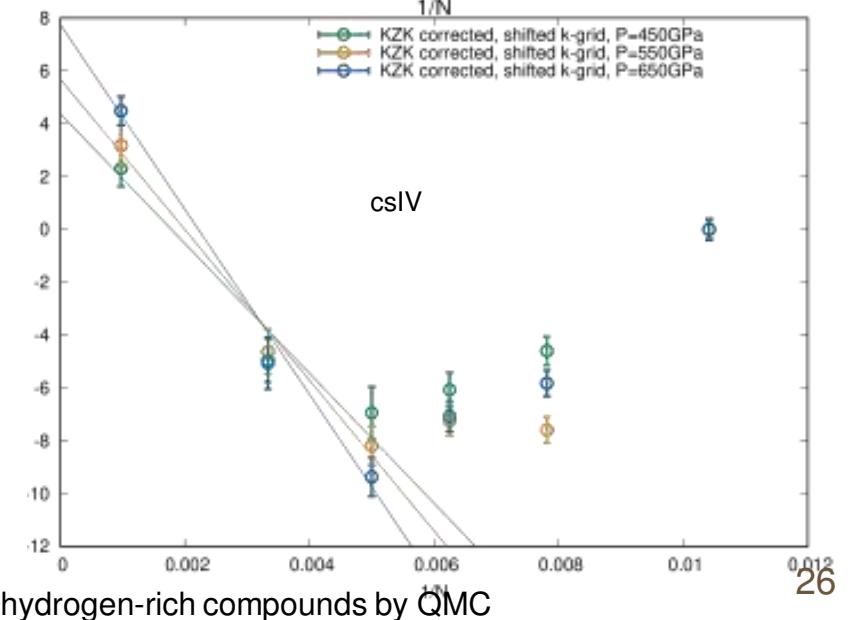
cmca-12 molecular hydrogen



cmca4



csIV



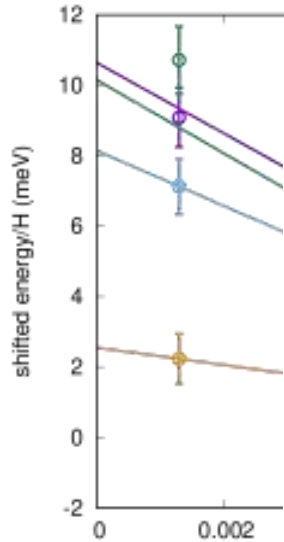
# Finite size-extrapolation

GPU acceleration  
to reach the largest sizes  
(1024 atoms)

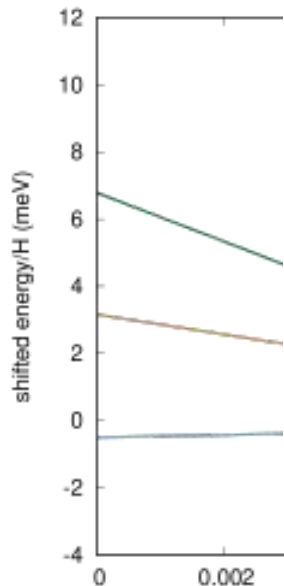
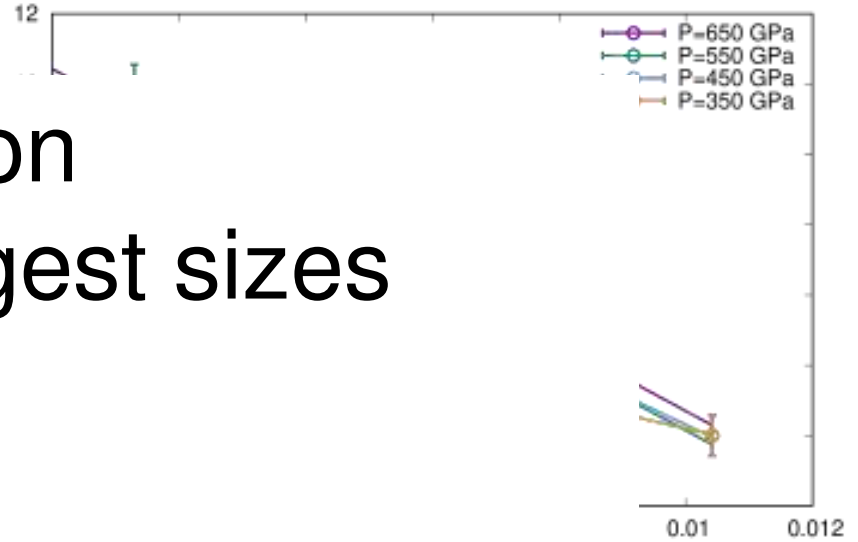
Marconi100@CINECA

252 nodes (4 GPU per node)  
wall time: 12 hours

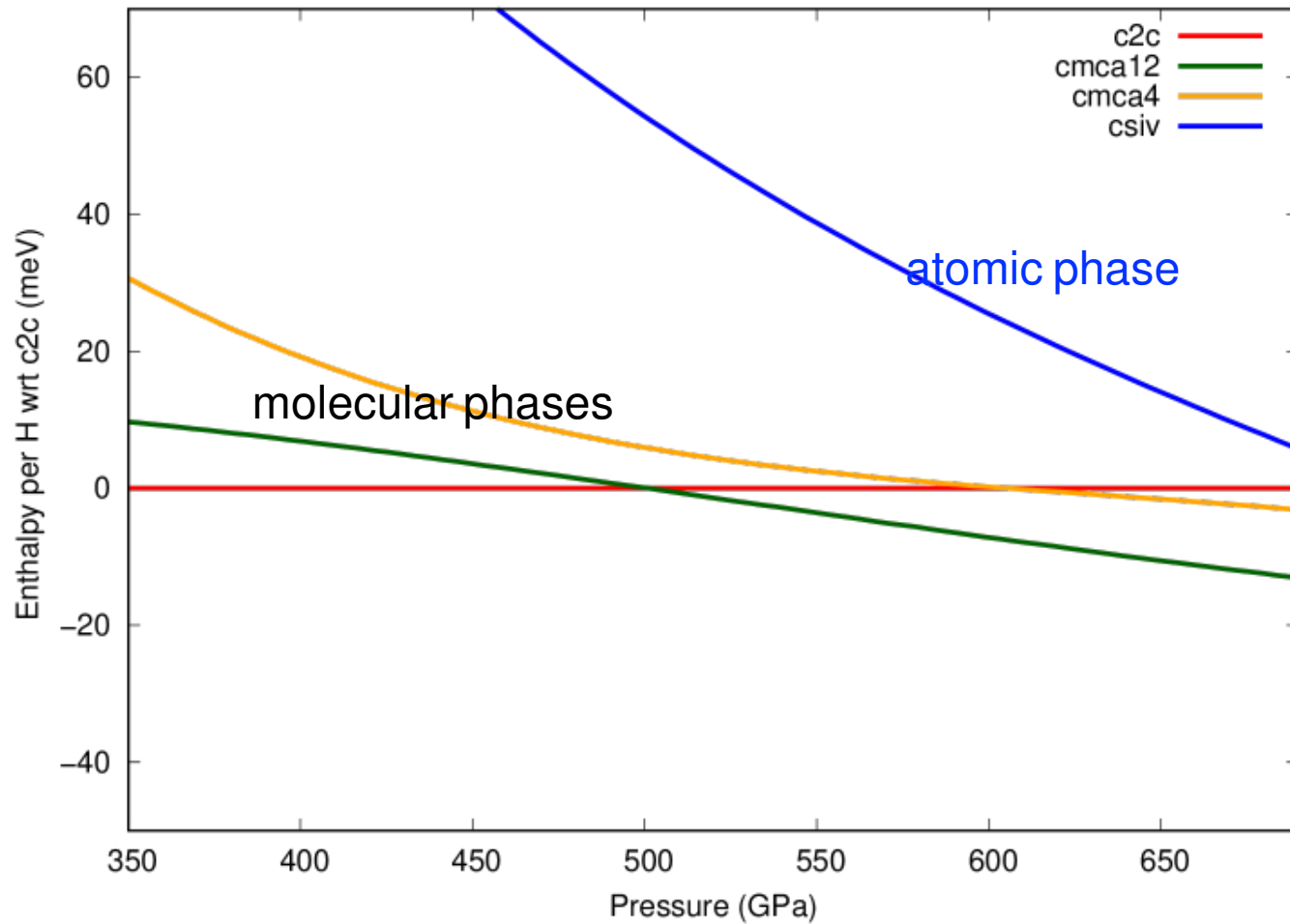
C2/c molecular hydrogen



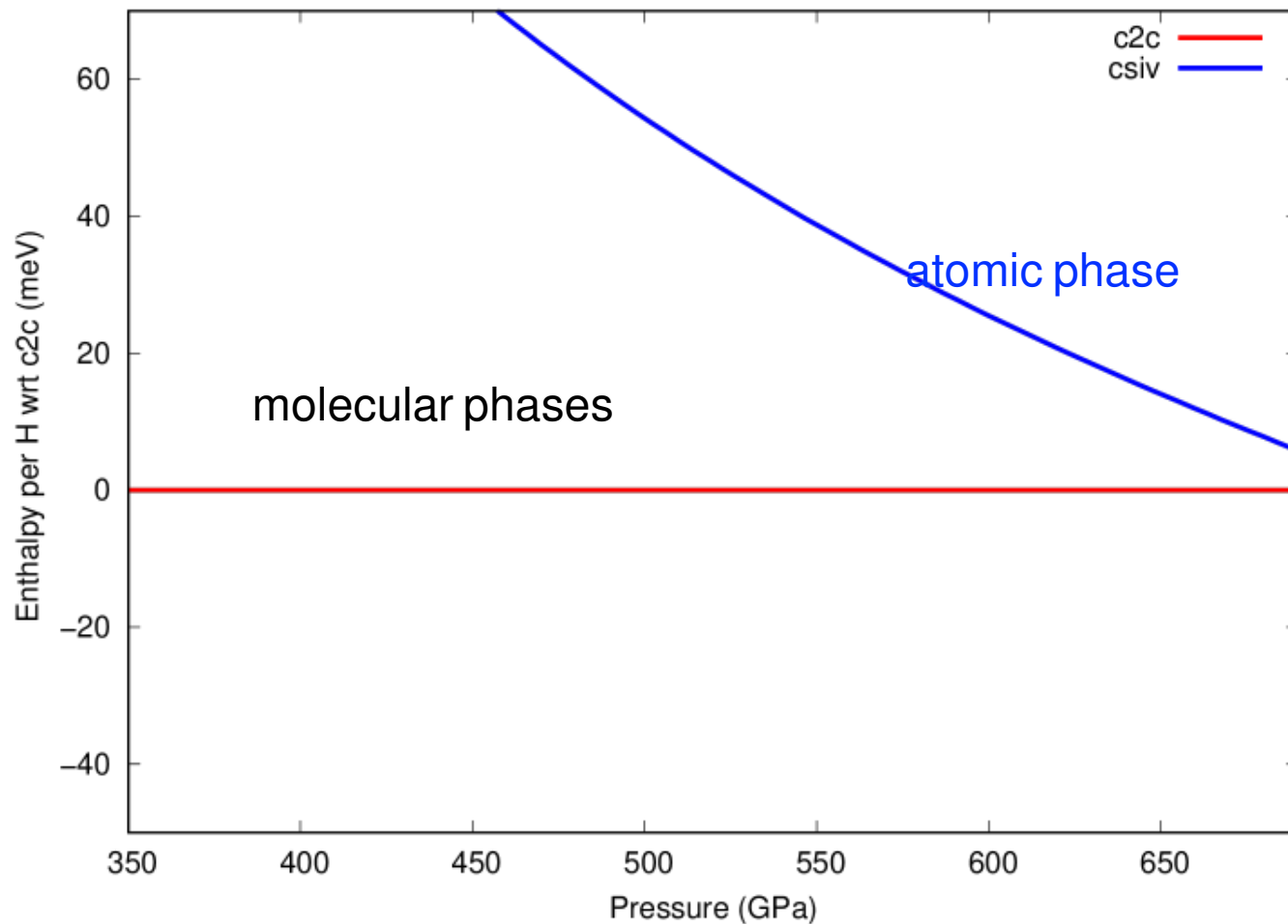
cmca-12 molecular hydrogen



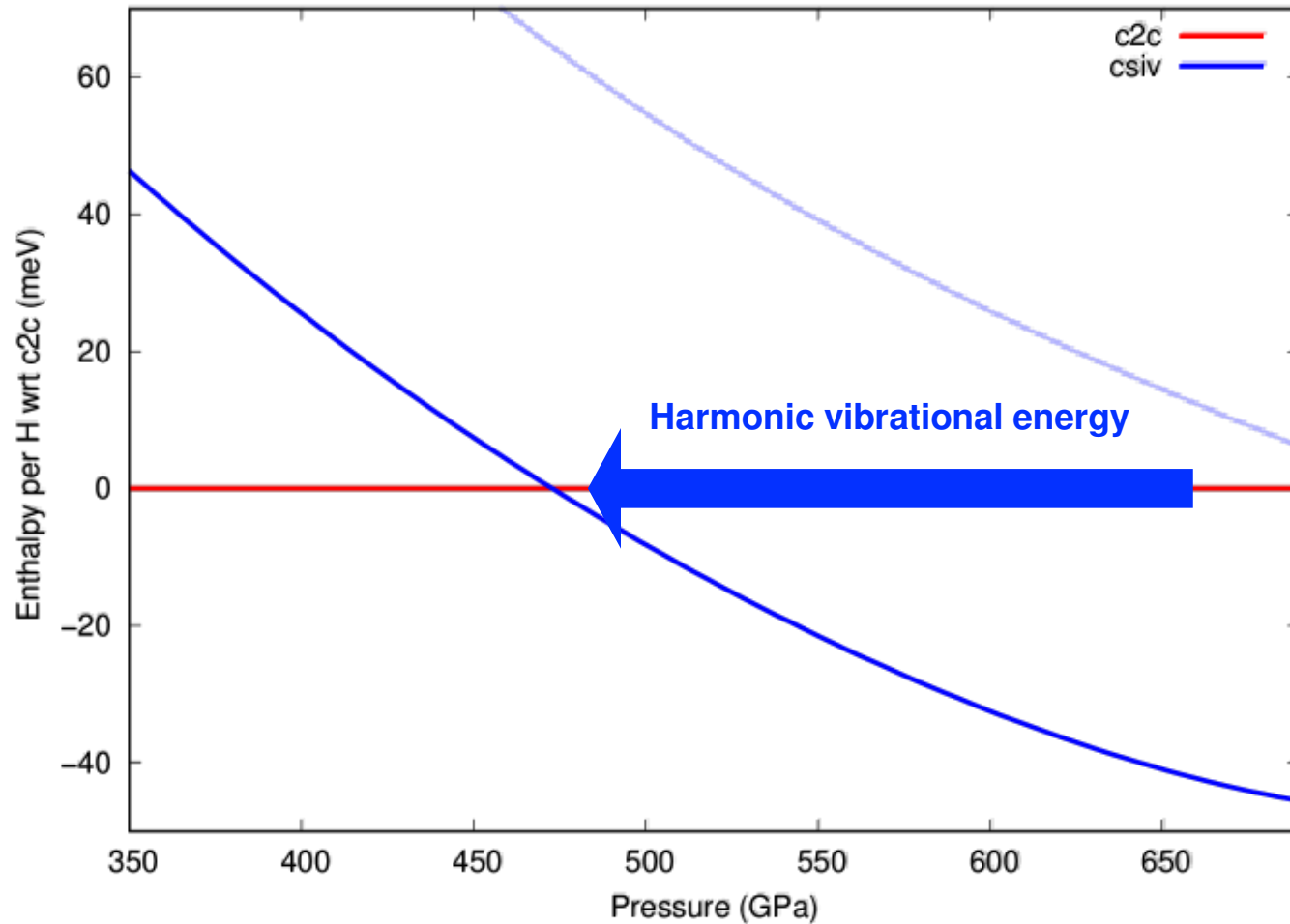
# Static lattice (SCHA centroid)



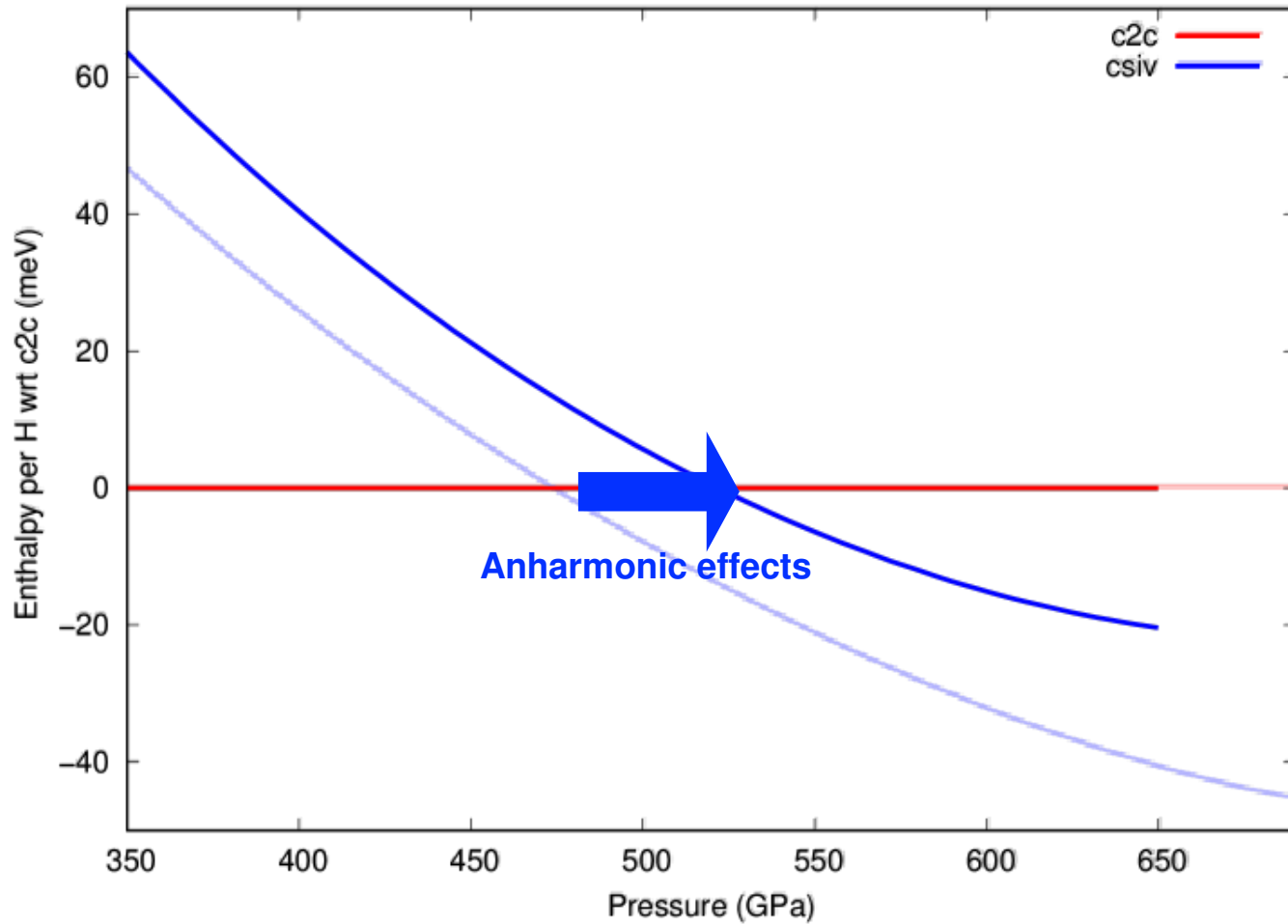
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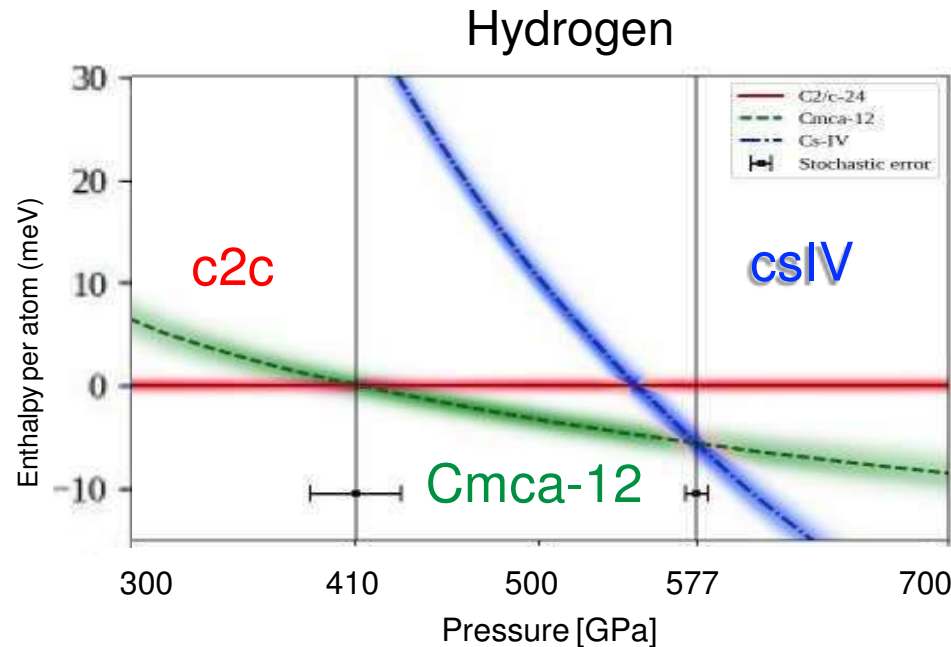
# Harmonic lattice (BLYP phonons)



# Anharmonic lattice (SCHA phonons)



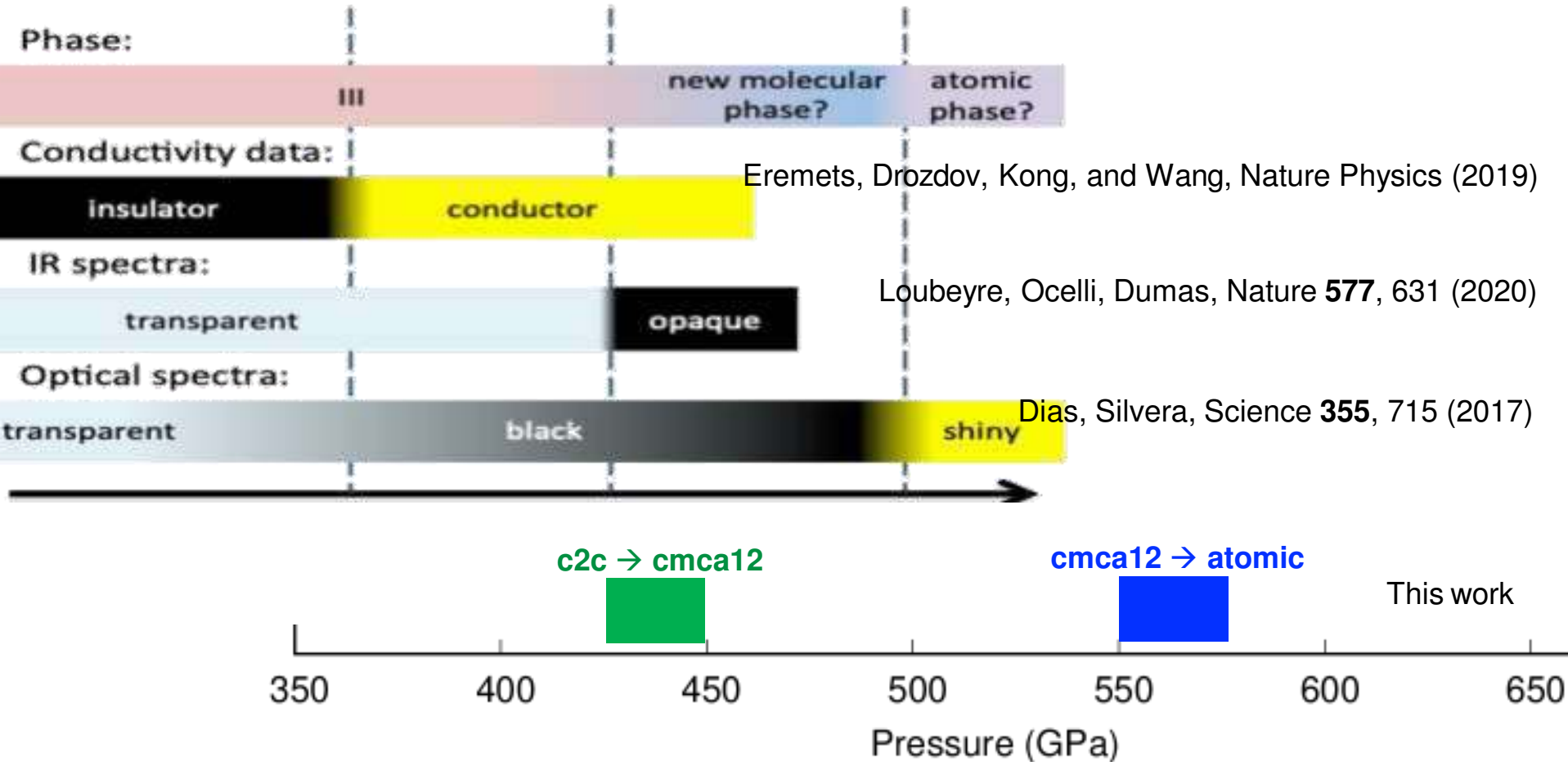
# High-pressure phase diagram



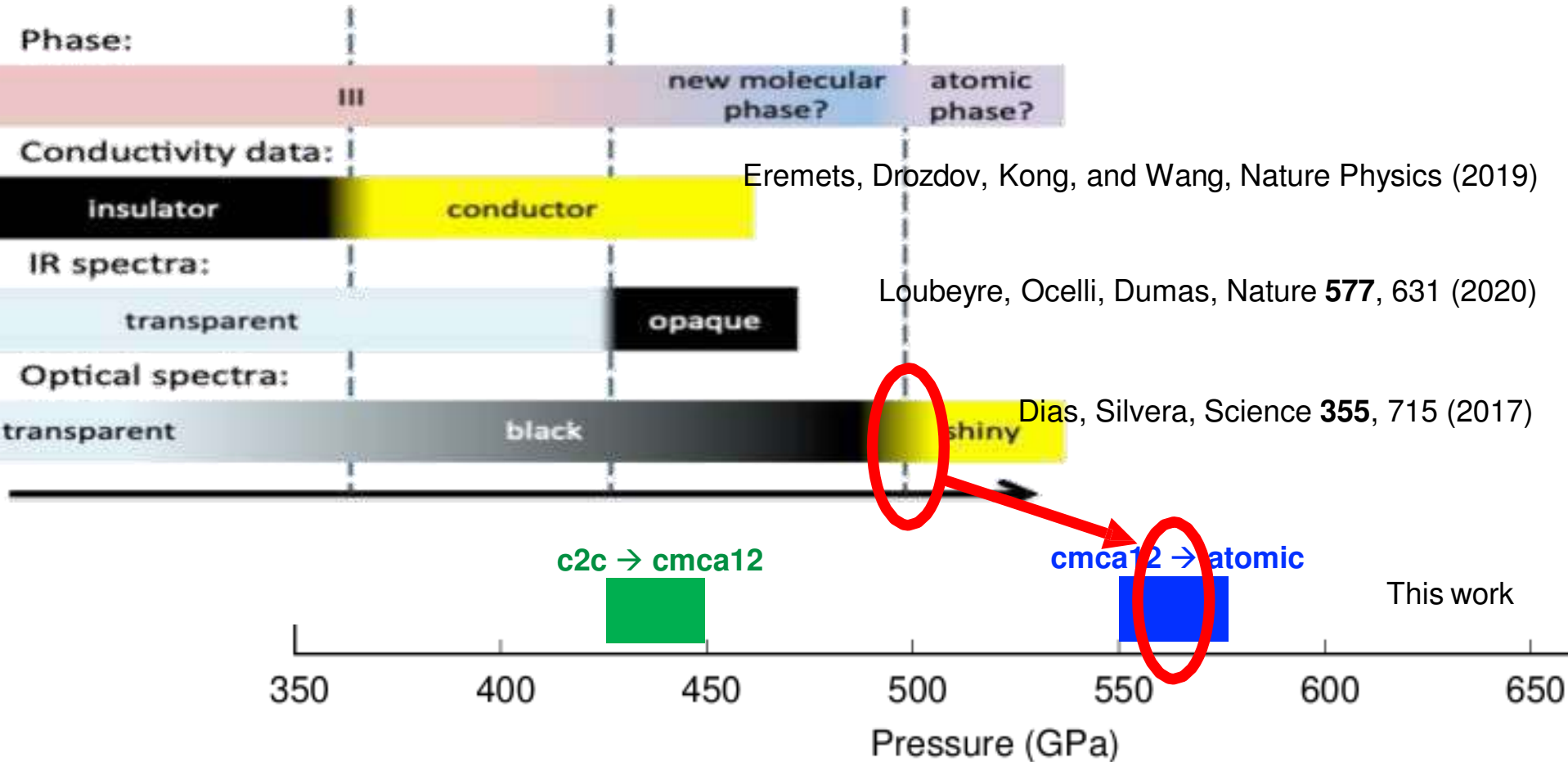
- Molecular c2c → Cmca-12 transition pressure **slightly reduced** by anharmonicity
- Atomic phase transition **pushed up** by anharmonic effects

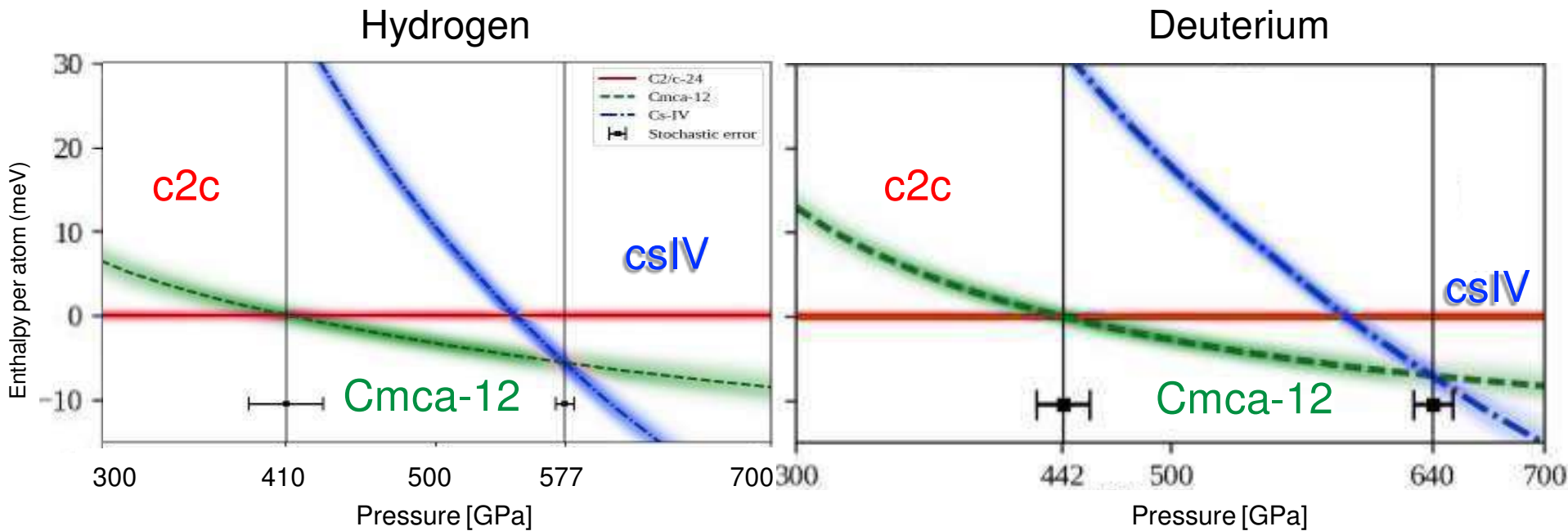


# Transition pressures



# Transition pressures

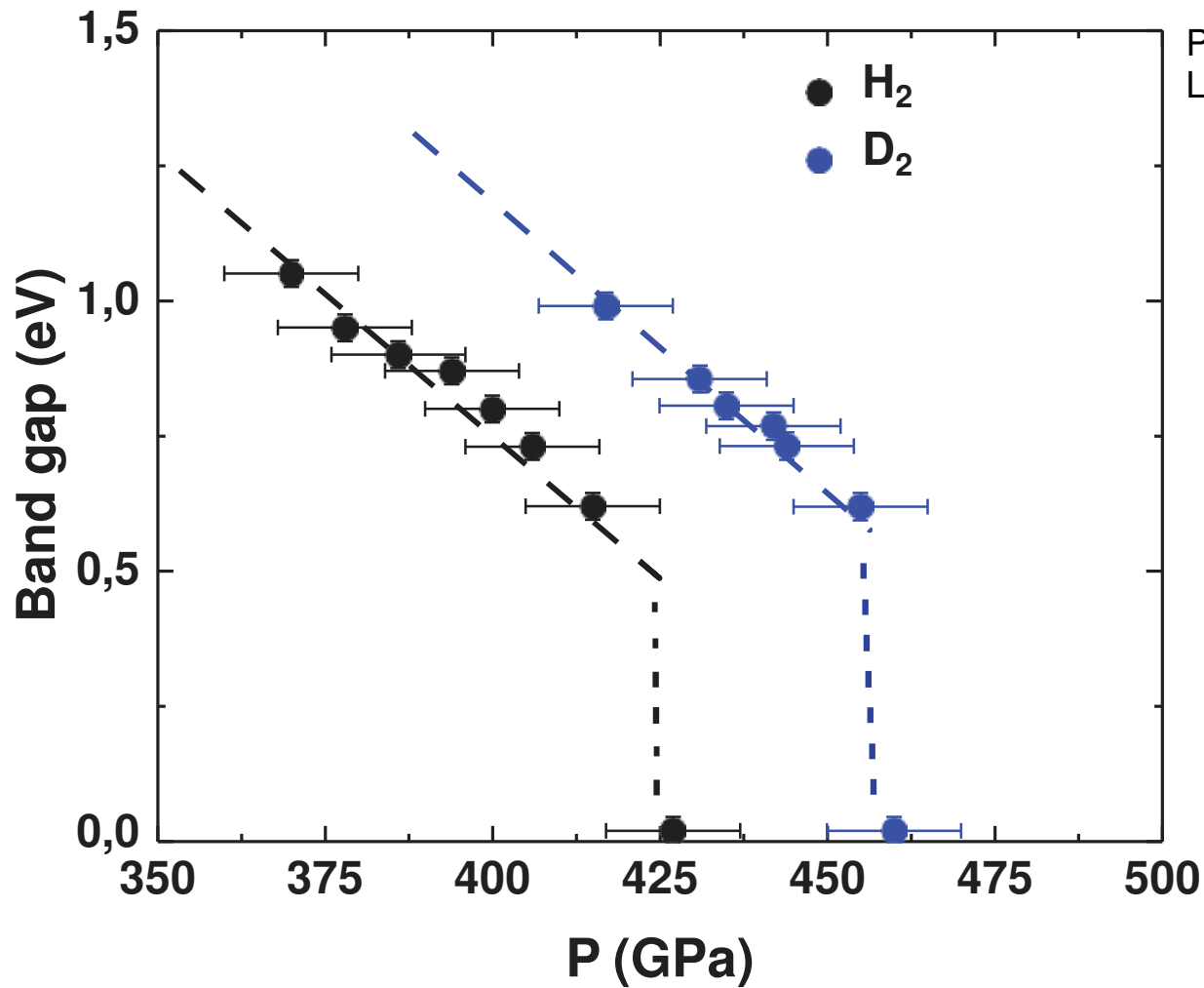




- Isotope effect affecting both  $c2c \rightarrow Cmca-12$  and  $Cmca-12 \rightarrow csIV$  phase transitions:

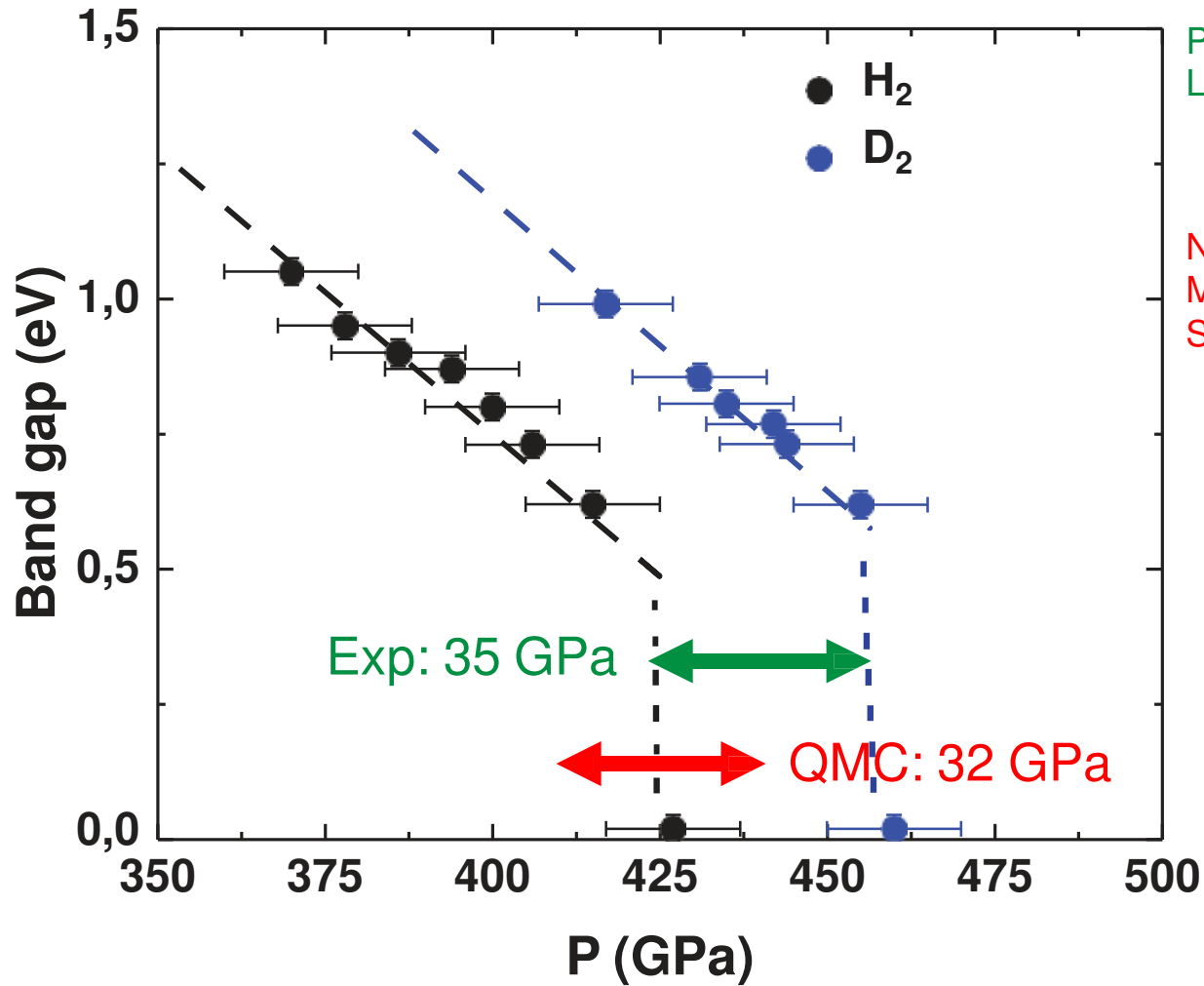
- ✓  $c2c \rightarrow Cmca-12$  : ~ 32 GPa
- ✓  $Cmca-12 \rightarrow csIV$  : ~ 63 GPa

# Isotope effect



PRL **129**, 035501 (2022),  
 Loubeyre, Occelli, Dumas

# Isotope effect



PRL **129**, 035501 (2022),  
 Loubeyre, Occelli, Dumas

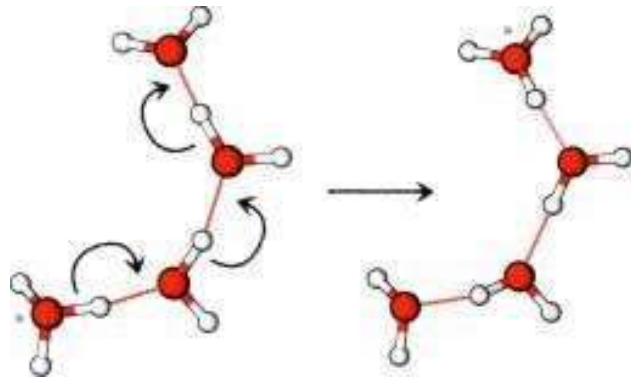
Nature Physics **19**, 845 (2023),  
 Monacelli, Casula, Nakano,  
 Sorella, Mauri

# Hydrogen wrap-up

- Combining QMC with SCHA
- Importance of **anharmonic contributions** enhanced by NQE to determine the phase diagram of **hydrogen**
- In solid hydrogen, anharmonicity strongly affects the molecular-to-atomic phase transition (molecular crystals more anharmonic than atomic crystals)
- First-order phase transition (associated with direct gap closure) numerically found **around 410 GPa between molecular phases**
- **Large isotope effect in the transitions**
- **Atomic phases (superconductivity?) pushed well above 500 Gpa**

Reference: Nature Physics **19**, 845 (2023), Monacelli, Casula, Nakano, Sorella, Mauri

Exploring properties of **hydrogen bond** in protonated water clusters

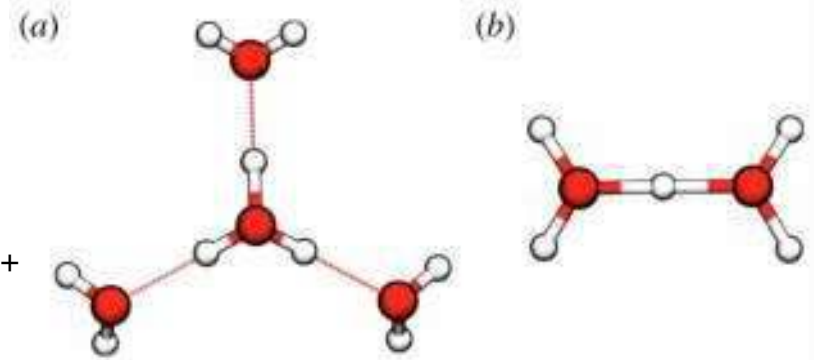


Hydrogen bond network defect (by excess proton) to study **proton hopping**

## Two limiting species exist

(a) *Eigen*  $\text{H}_9\text{O}_4^+$  : localized  $\text{H}^+$

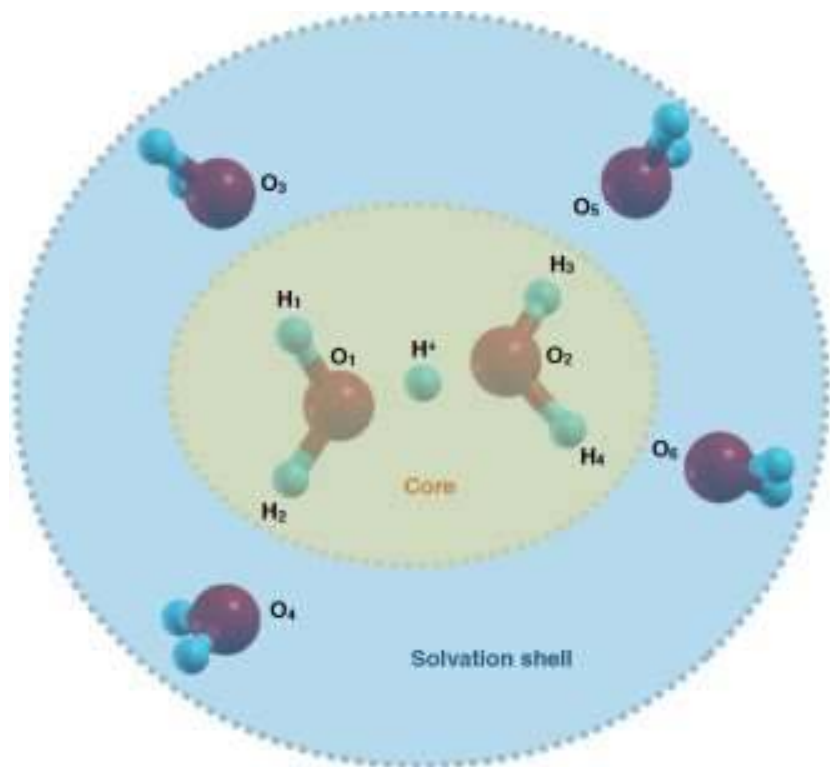
(b) *Zundel*  $\text{H}_5\text{O}_2^+$  : delocalized / shared  $\text{H}^+$



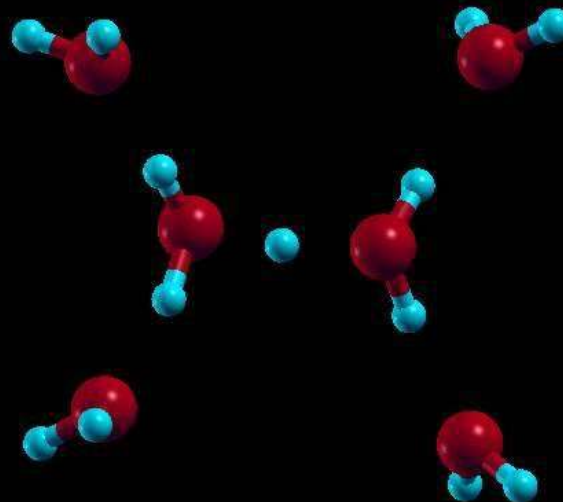
**What is their role in proton diffusion?**

**Broader definition necessary to explain IR experiments?**

(*Nature Chemistry* **10**, 932 (2018))



T=50 K



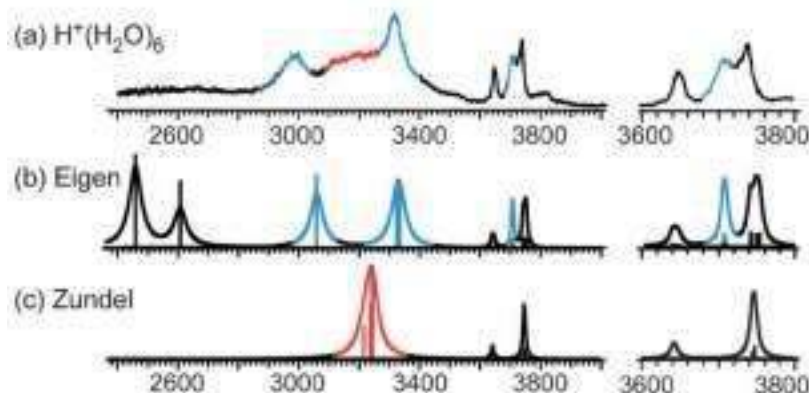
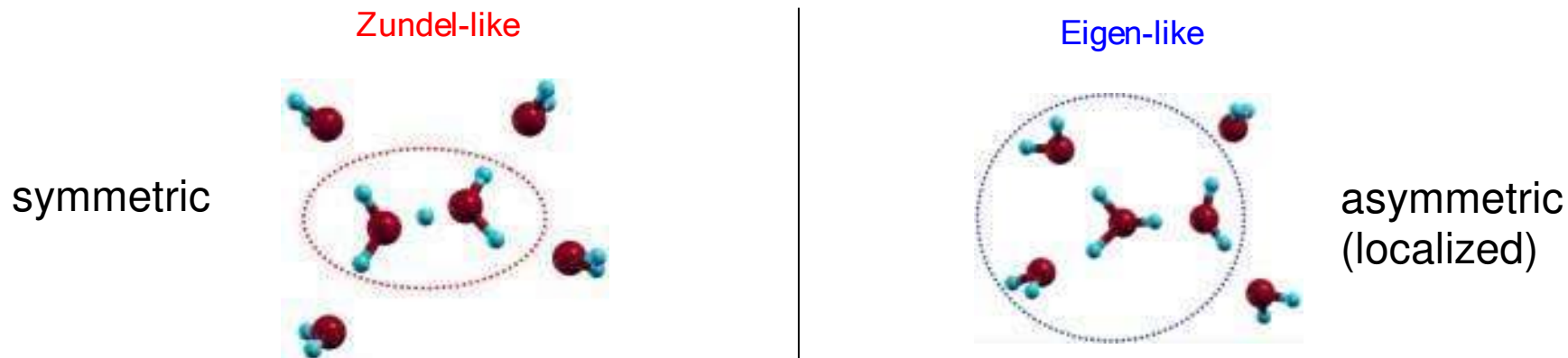
“realistic” cluster to simulate proton defect in water:  
**protonated water hexamer  $H_{13}O_6^+$**

Lapid, Agmon, Petersen, Voth, J. Chem. Phys. **122**, 014506 (2005)



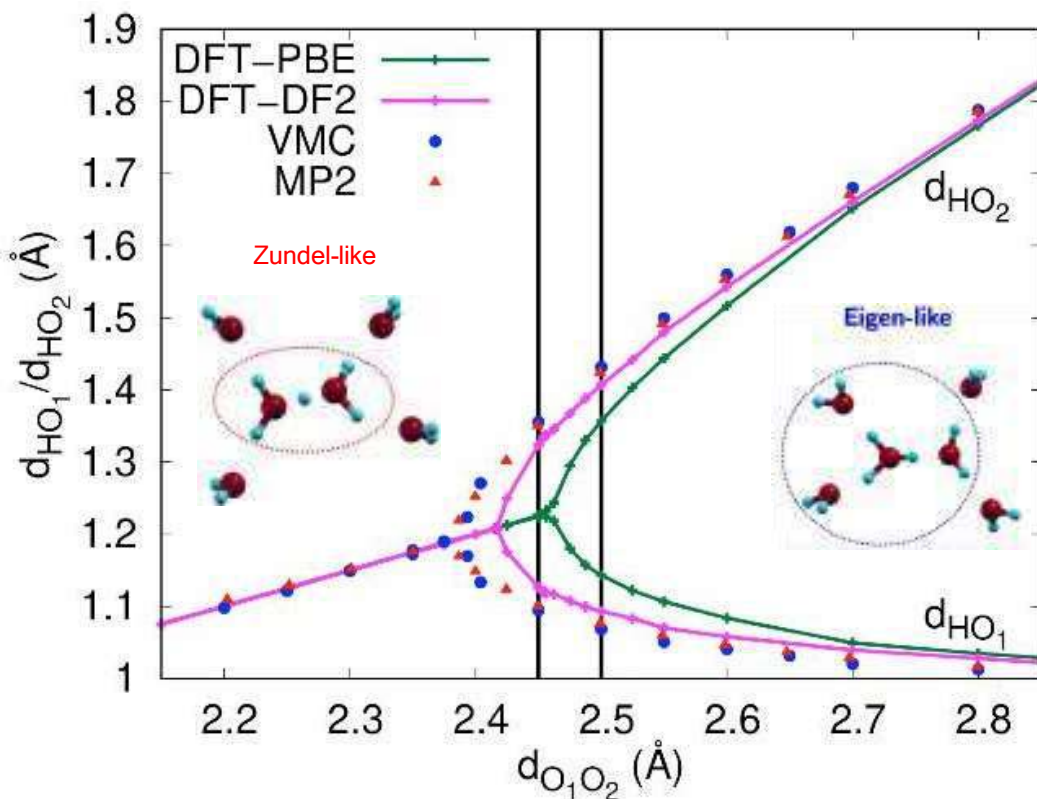
# Protonated water hexamer

Smallest system to include both Zundel and Eigen structures.



Infrared photodissociation spectroscopy: K. Mizuse *et. al*, PCCP **13**, 7129 (2011)

Broadband 2D IR spectroscopy: Fournier, Carpenter, Lewis, Tokmakoff, Nat. Chem. **10**, 932 (2018).

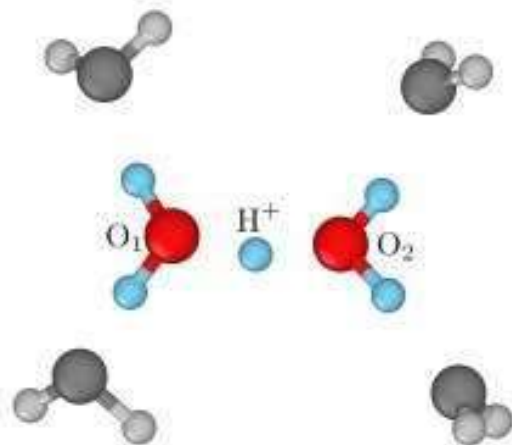


energies are in K

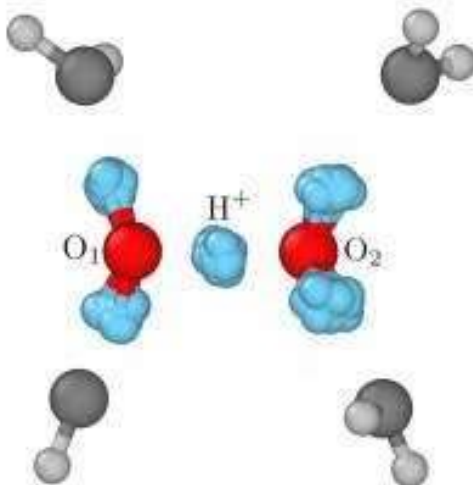
$d_{O_1O_2}$	2.45 Å	2.50 Å
DFT-PBE	0	96
DFT-DF2	39	483
VMC	195 +/- 25	562 +/- 27
DMC	222 +/- 56	389 +/- 64
MP2	85	327
CCSD(T)	141	431

At the most relevant OO distances, *barriers are of the order of room temperature!*  
Short OO distance, H symmetrized; large OO distance, H localized

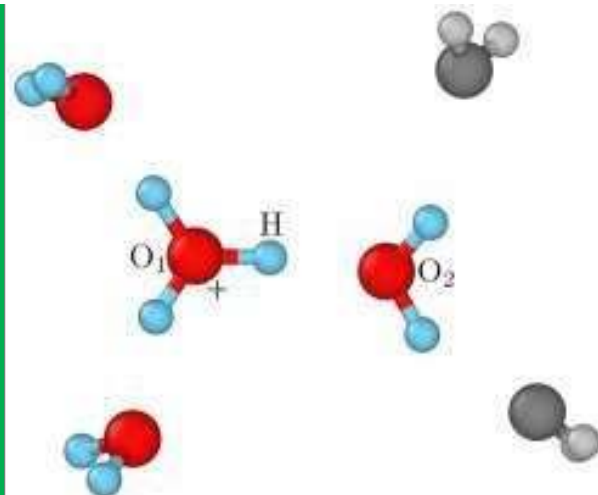
# Three “species”



short Zundel



elongated Zundel



distorted Eigen

$$d_{O_1O_2} \leq d_{\text{symm}} \approx 2.38 \text{ \AA}$$

Around equilibrium volume

$$d_{O_1O_2} > 2.5 \text{ \AA}$$

No barrier  
Proton equally shared

Small barrier (< 500 K)  
Proton equally shared  
due to *zero-point energy*

Larger barrier (> 500 K)  
Proton localized  
*more classical behavior*

Dereka *et al.*,  
Science **371**, 160 (2021)

# What is the effect of temperature?

## Scheme followed:

1. **very accurate treatment of the electronic part**  
→ Quantum Monte Carlo at the variational level
2. **include thermal effects**  
→ Langevin Dynamics at finite temperature
3. **propagate equations of motion for quantum nuclei**  
→ Path Integral + Langevin Dynamics (PILD)

Algorithm to combine QMC with PILD →

**Path Integral Ornstein-Uhlenbeck Dynamics (PIOUD)**

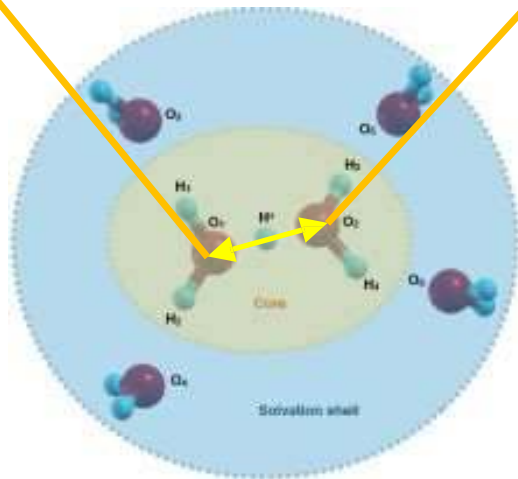
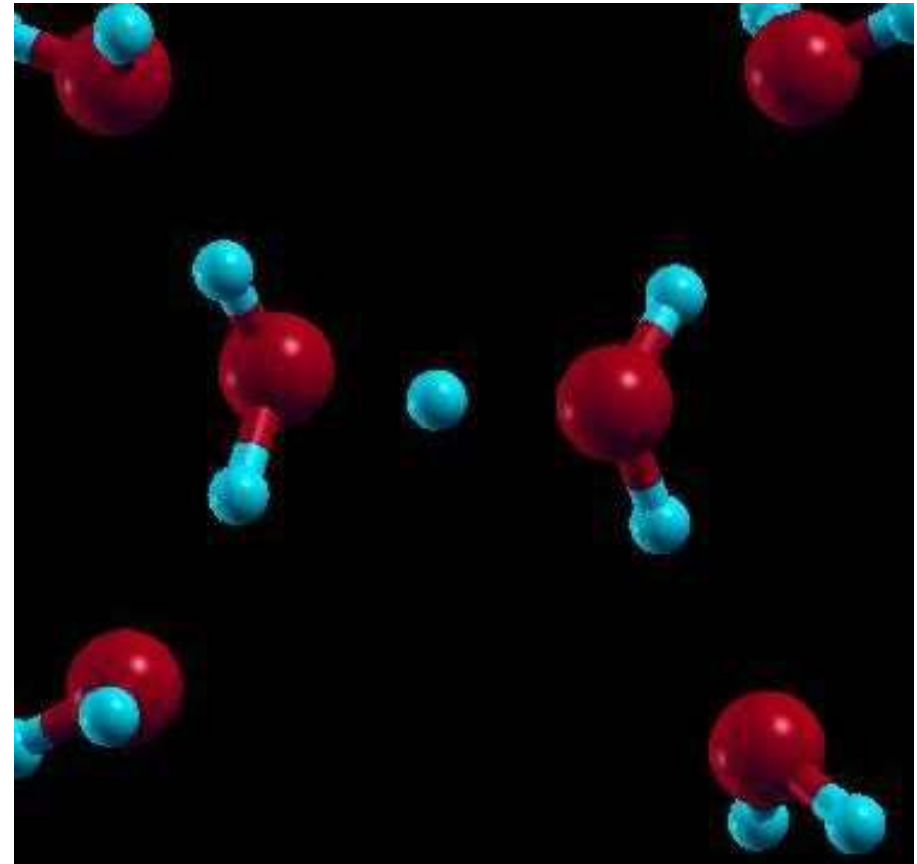
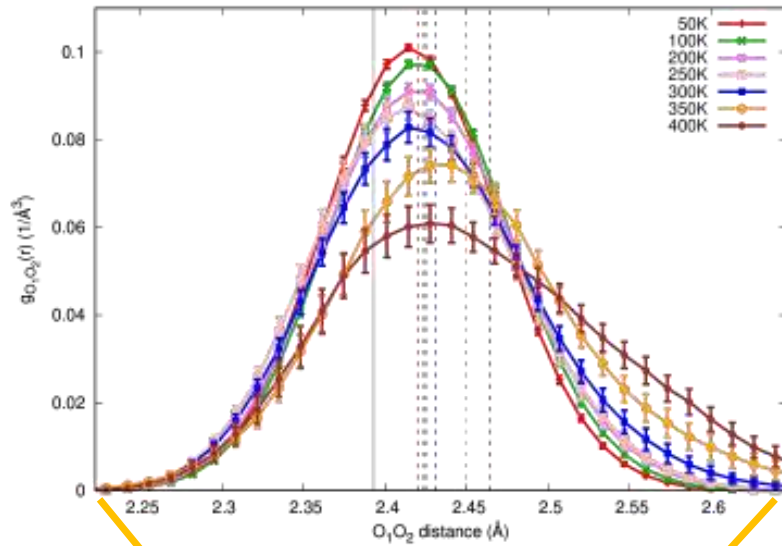
Mouhat *et al.*, J. Chem. Theory Comput. **13**, 2400 (2017)

	quantum simulations			classical simulations	
$T$ (K)	$N_{\text{beads}}$	$N_{\text{iterations}}$	$t_{\text{iteration}}$ (h)	$N_{\text{iterations}}$	$t_{\text{iteration}}$ (h)
50	128	35282	119.4 <sup>1</sup>	-	-
100	128	52184	24.4 <sup>2</sup>	21454	42.0 <sup>2</sup>
150	64	11218	-	-	-
200	64	32553	95.7 <sup>1</sup>	20478	103.6 <sup>1</sup>
250	32	23912	92.2 <sup>1</sup>	24154	123.5 <sup>1</sup>
300	32	31929	106.3 <sup>1</sup>	22656	109.9 <sup>1</sup>
350	32	18489	102.4 <sup>1</sup>	26481	130.5 <sup>1</sup>
400	32	23026	120.9 <sup>1</sup>	27517	134.0 <sup>1</sup>

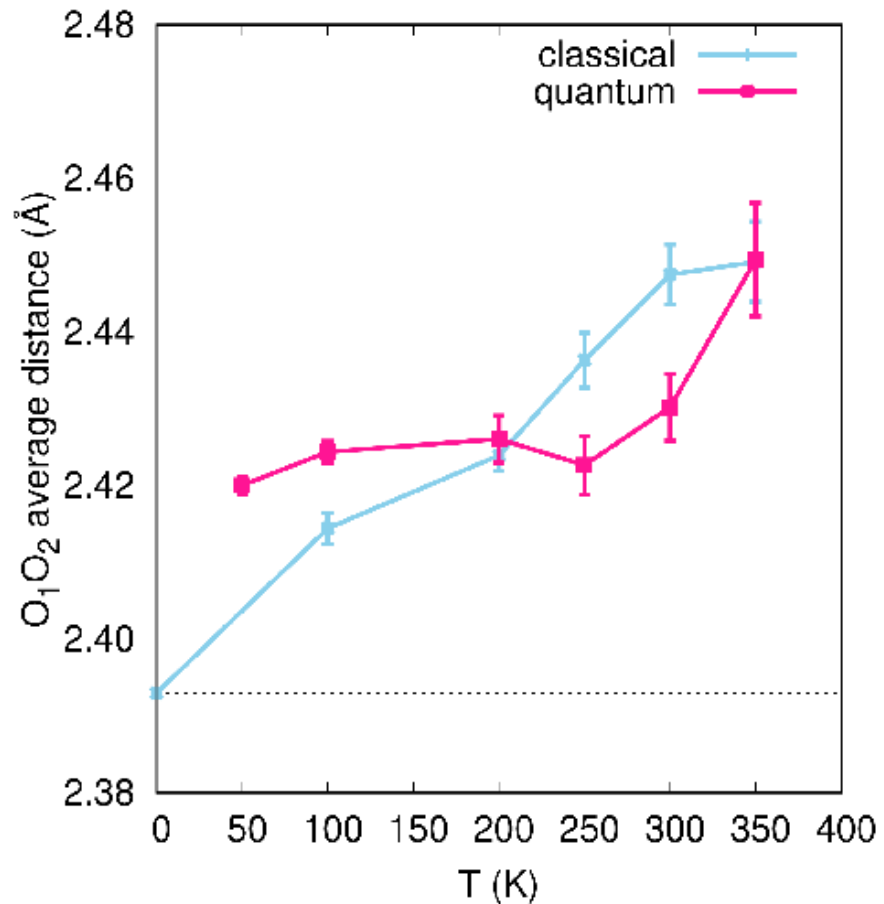
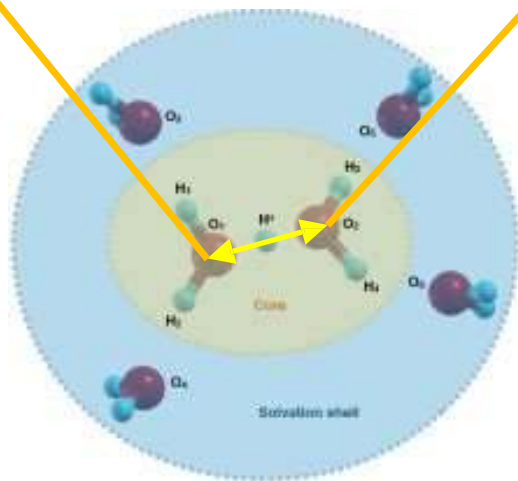
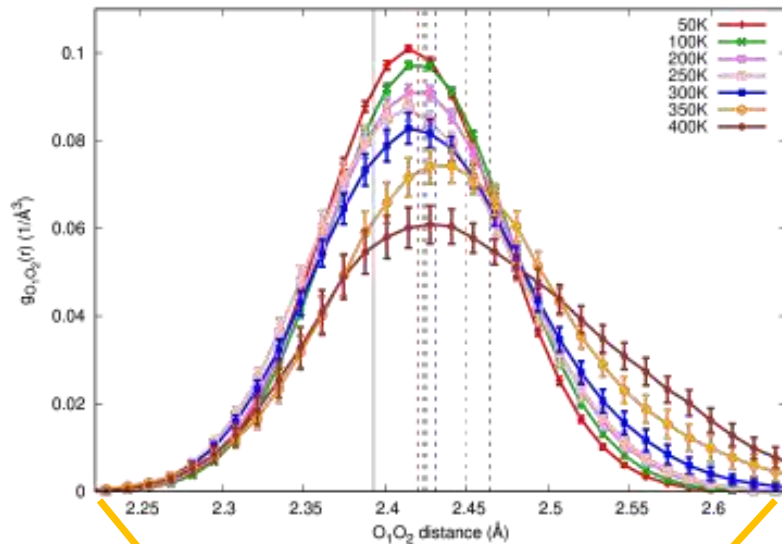
1: 68-core Intel Xeon Phi 7250 CPU (Knights Landing) nodes at 1.40 GHz

2: dual-processor (2x64 cores) AMD Rome (Epyc) compute nodes at 2.6 GHz

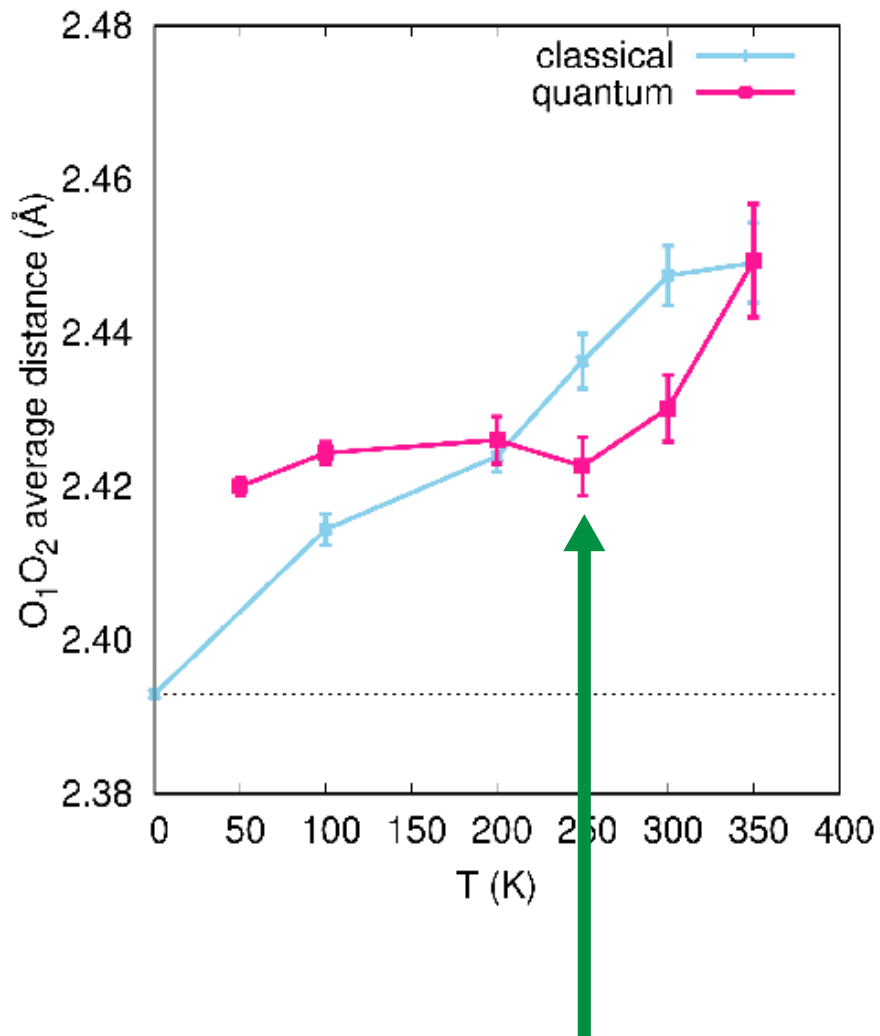
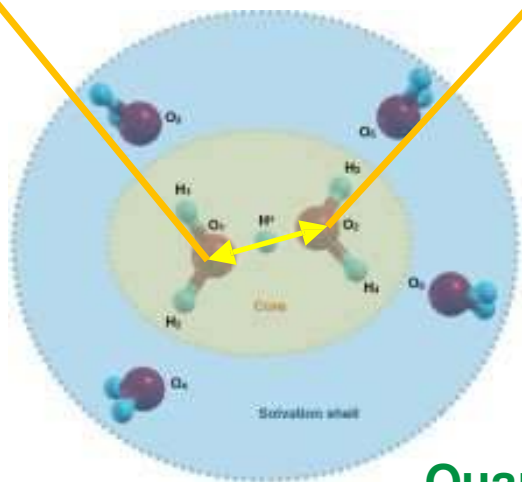
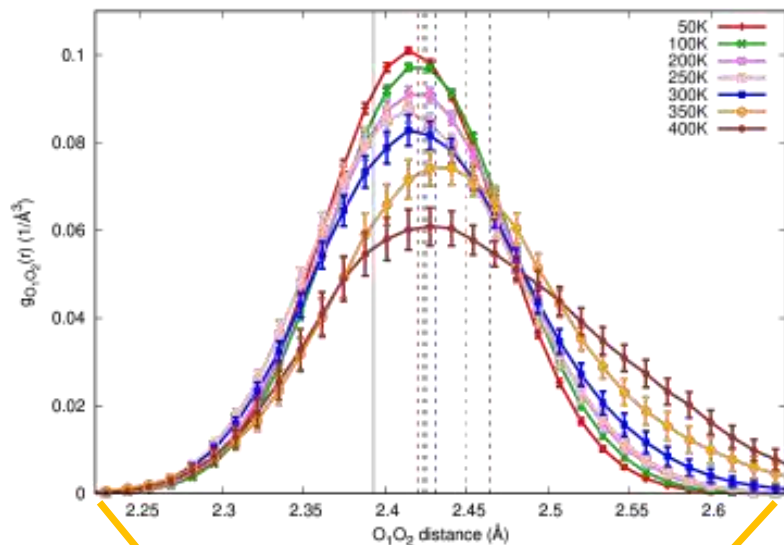
# Core size of protonated water hexamer



# Core size of protonated water hexamer



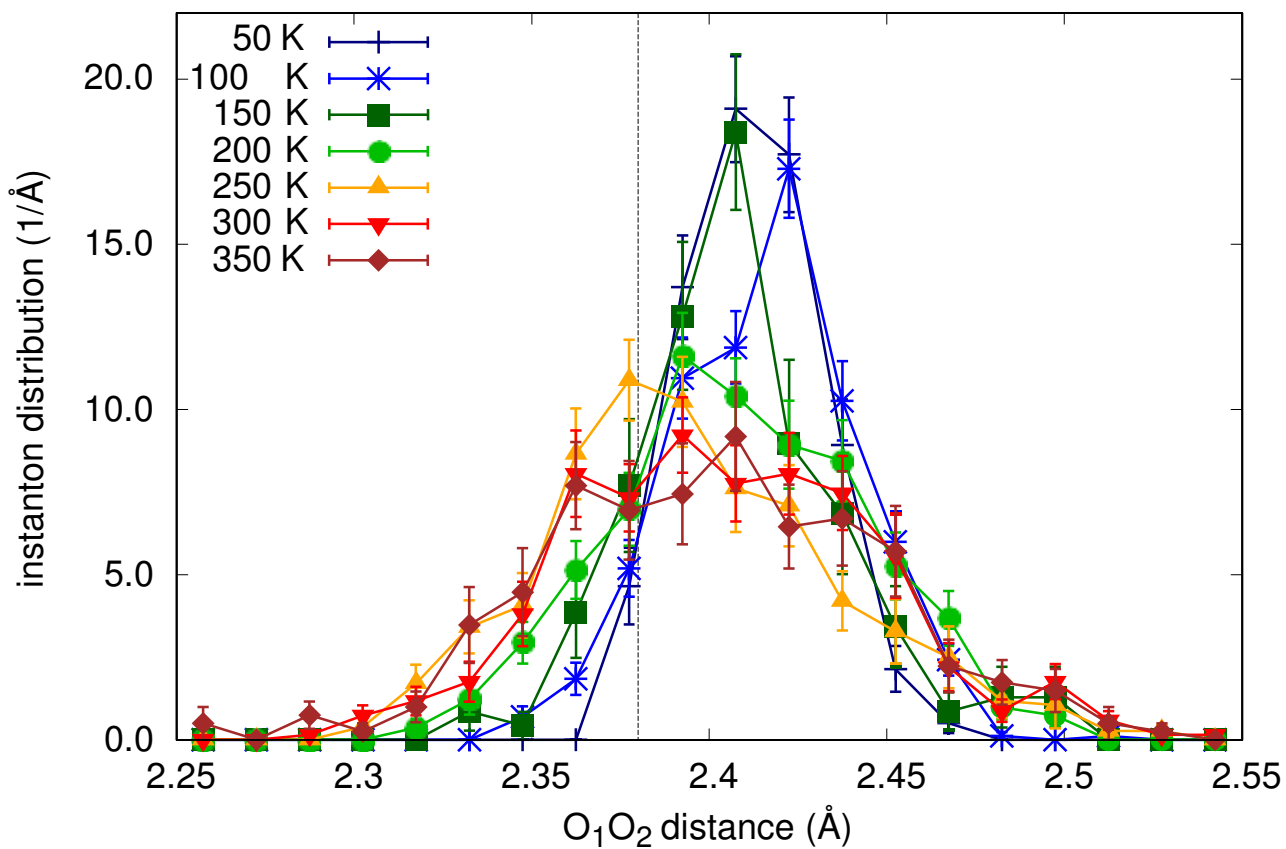
# Core size of protonated water hexamer



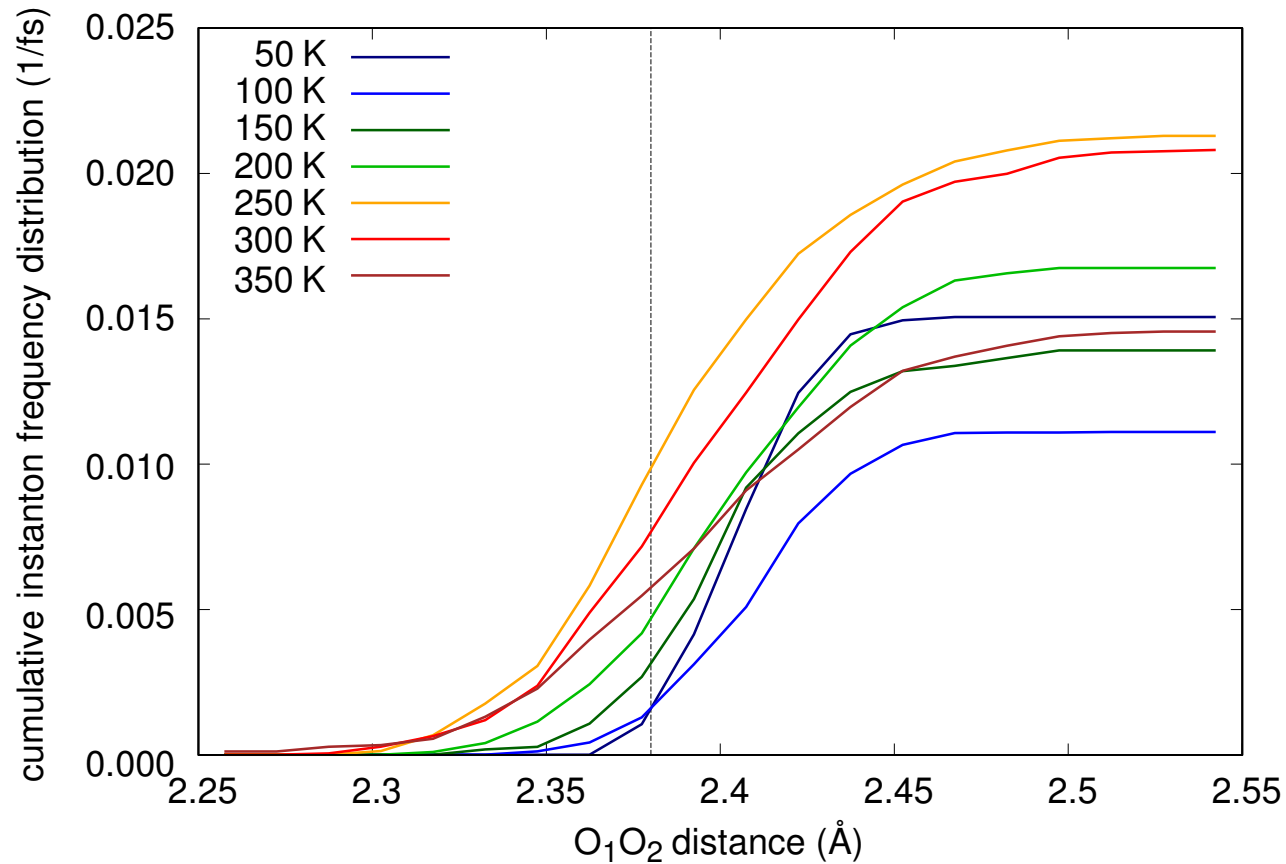
**Quantum effects make H-bond robust in temperature**



Instanton statistics: **instanton distribution**

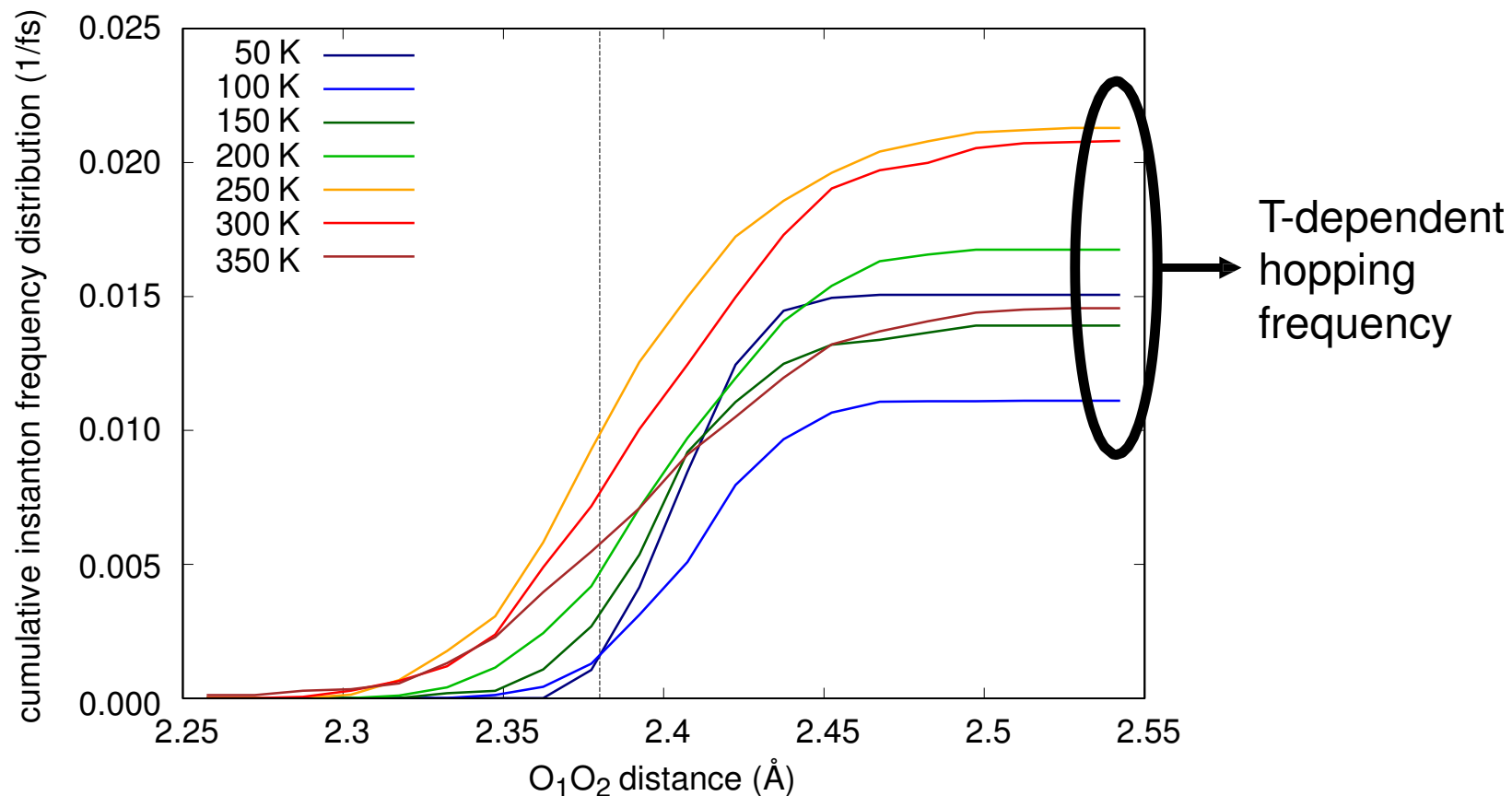


Instanton statistics: **cumulative frequency distribution**



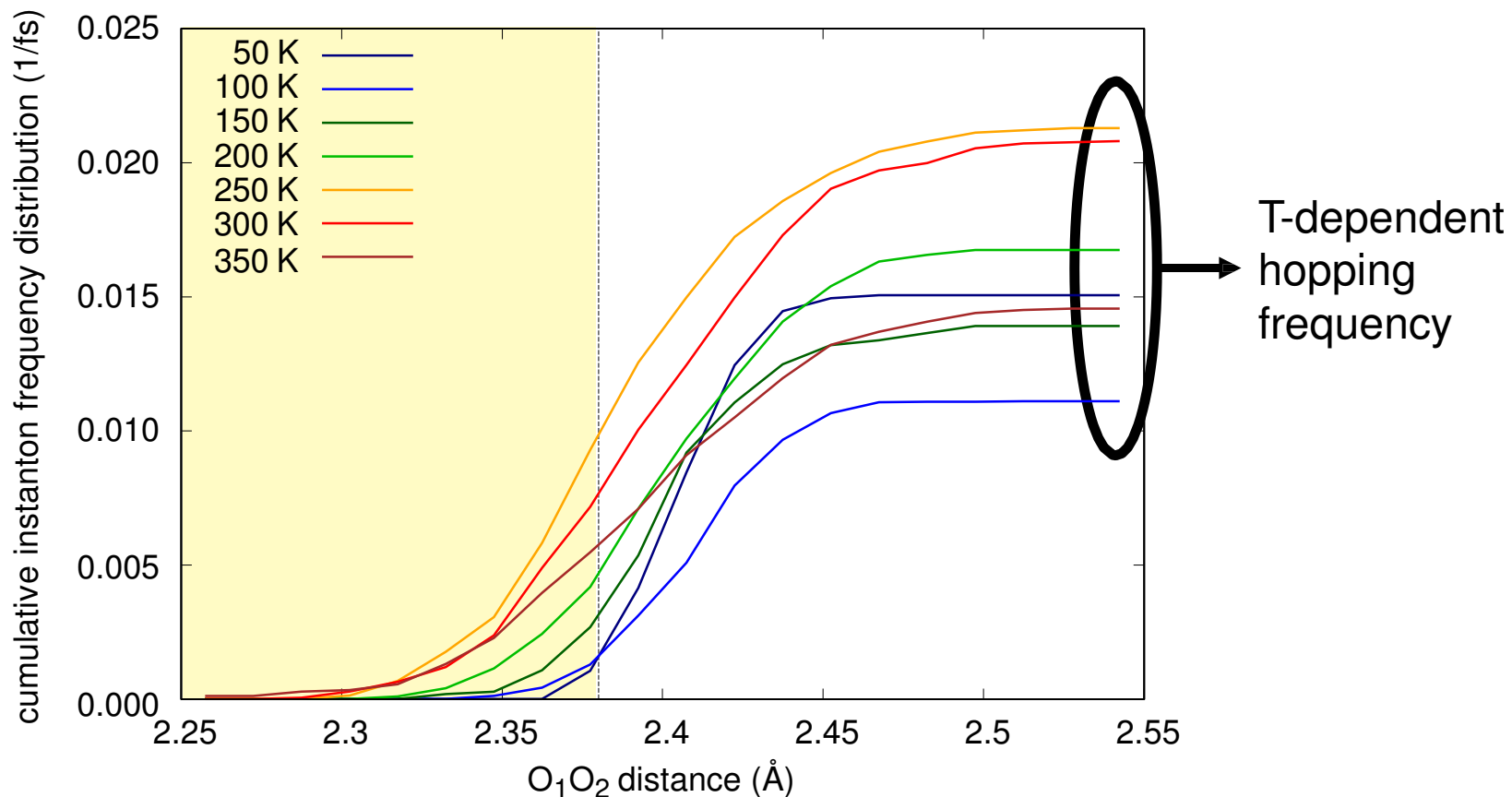
# Proton hopping frequency

Instanton statistics: **cumulative frequency distribution**



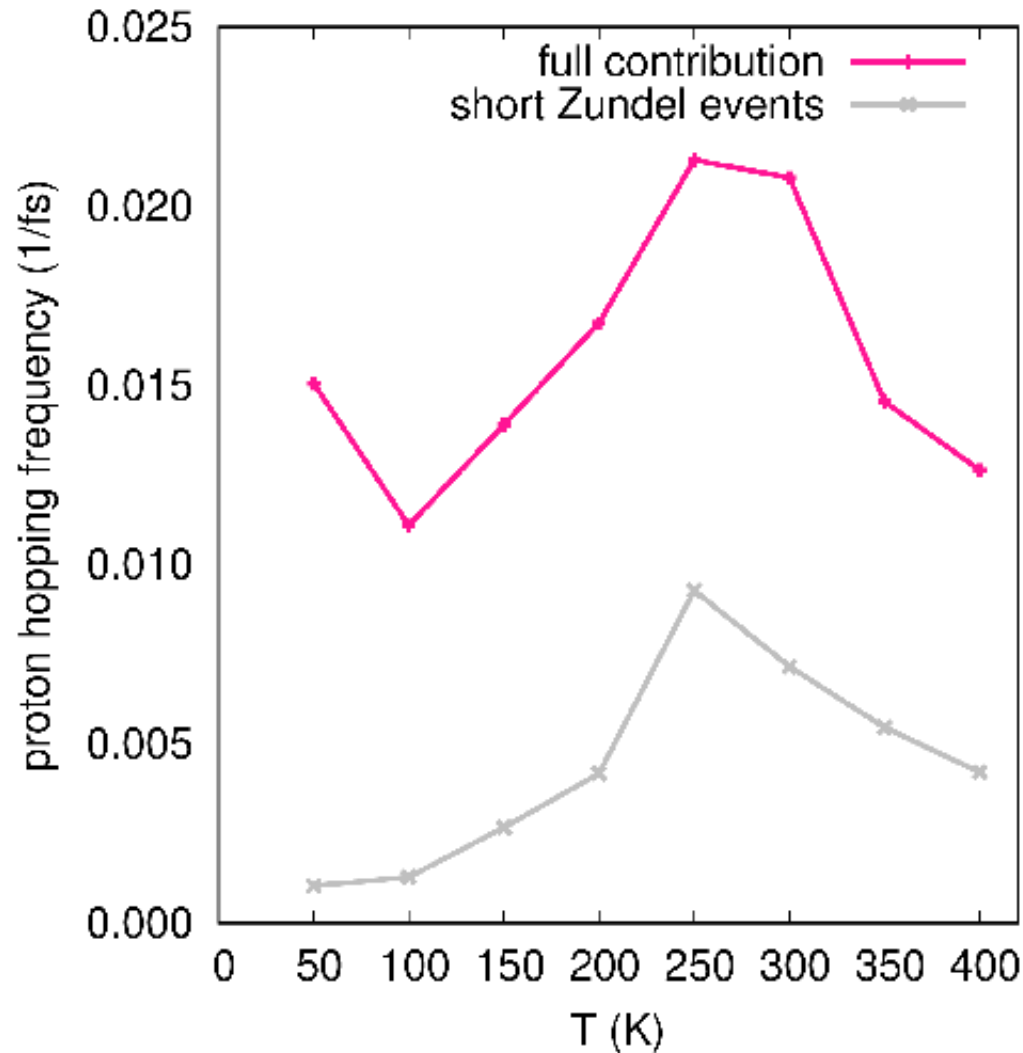
# Proton hopping frequency

Instanton statistics: **cumulative frequency distribution**

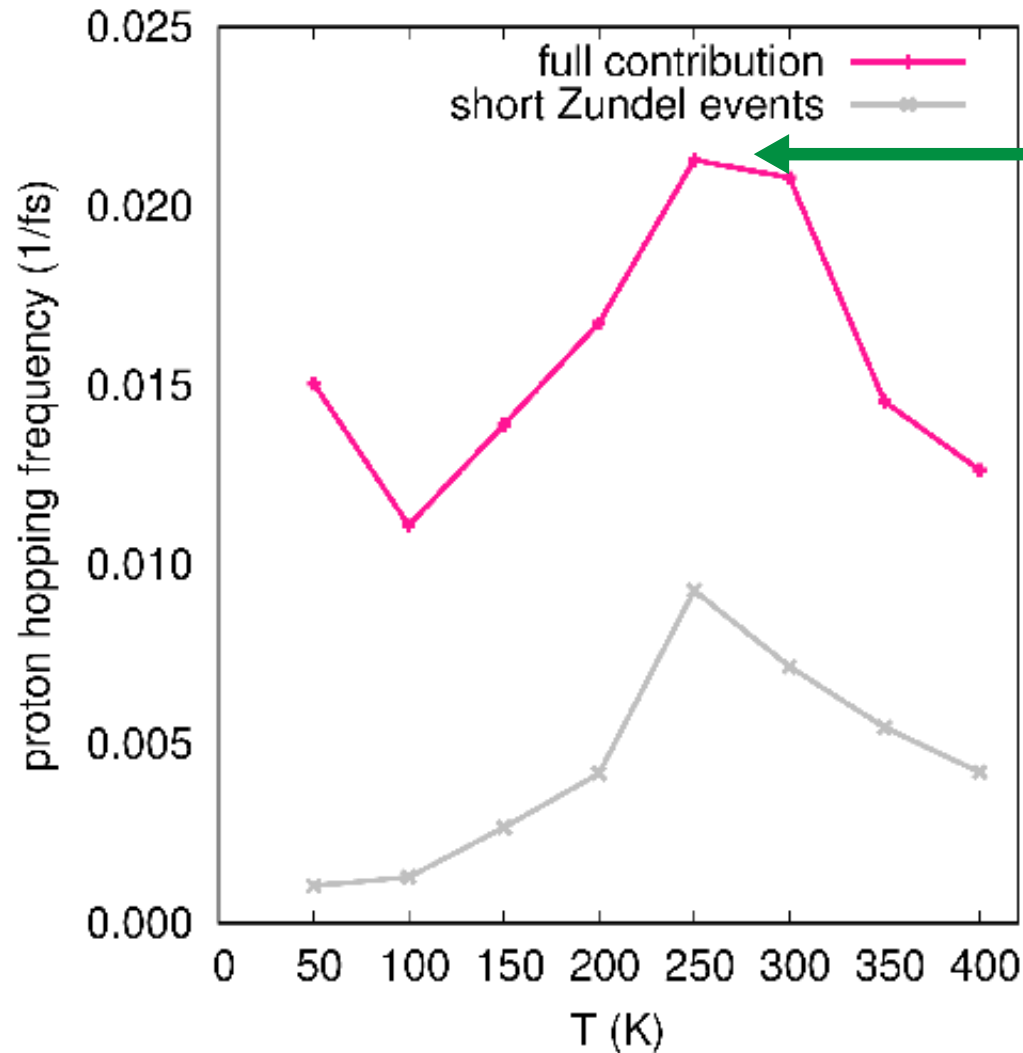


Contribution of the short Zundel (symmetric H) configurations to proton transfer

# Proton hopping frequency

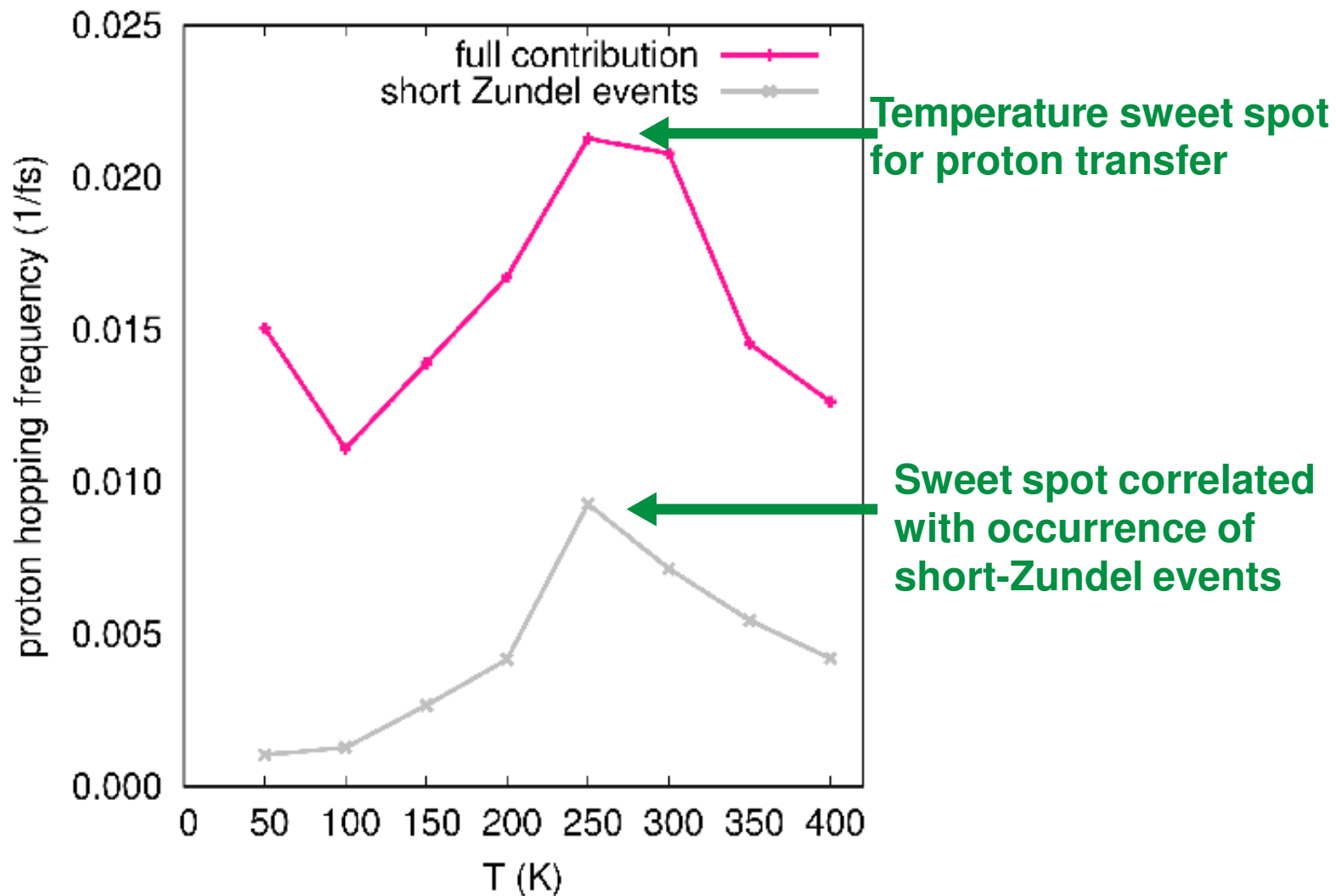


# Proton hopping frequency

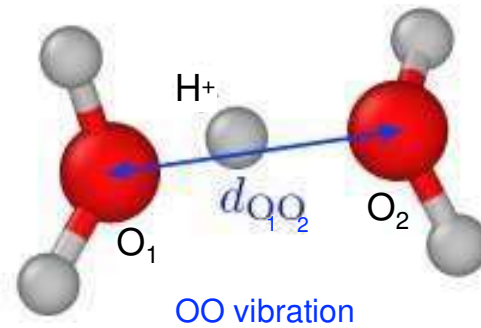
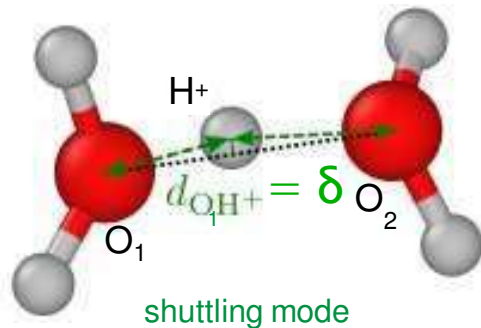


Temperature sweet spot  
for proton transfer

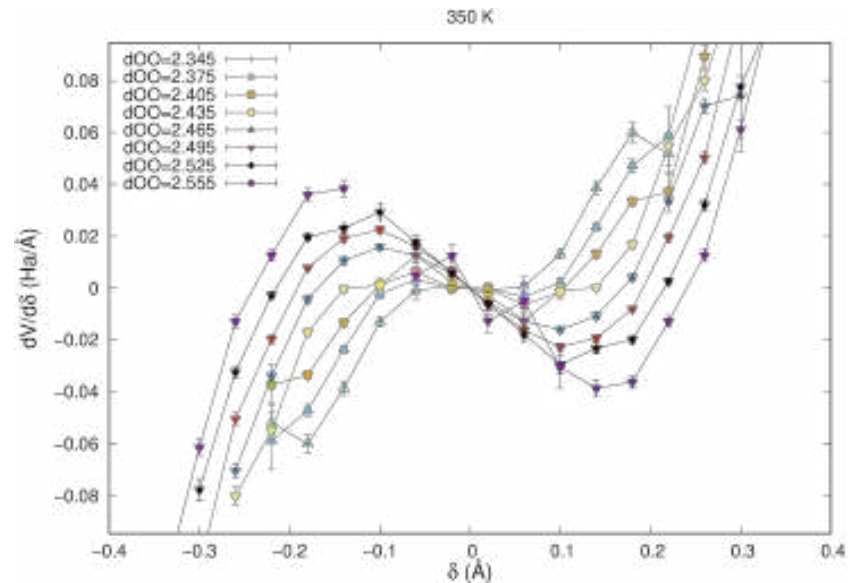
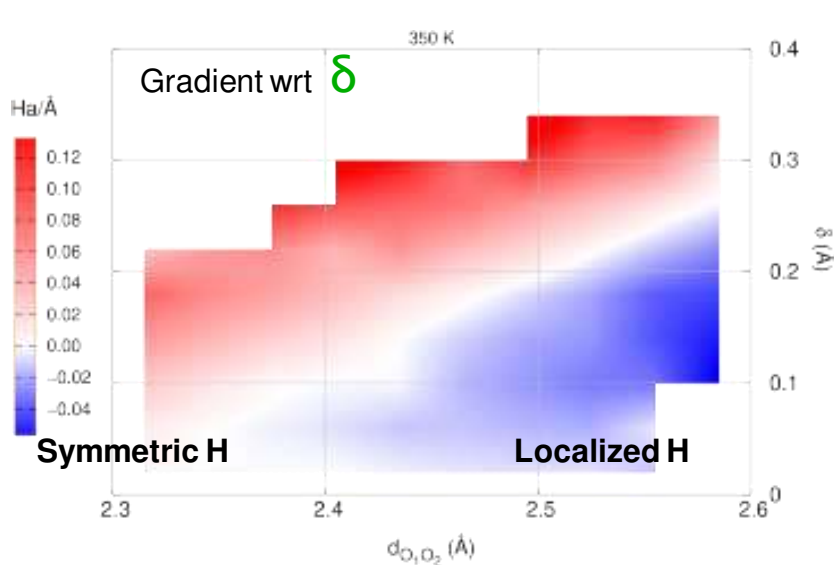
# Proton hopping frequency



Two relevant degrees of freedom:



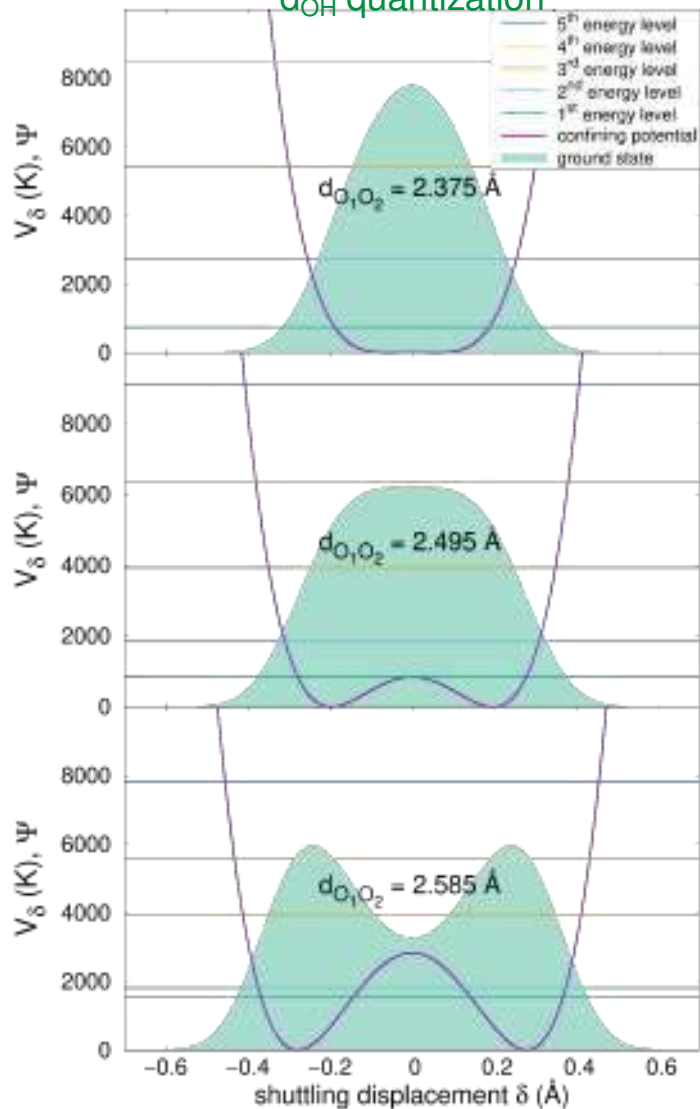
$V_{2D}(d_{OO}, \delta)$  potential reconstructed from VMC-driven classical MD data





# Zero point energy (ZPE) variation

$d_{\text{OH}}$  quantization



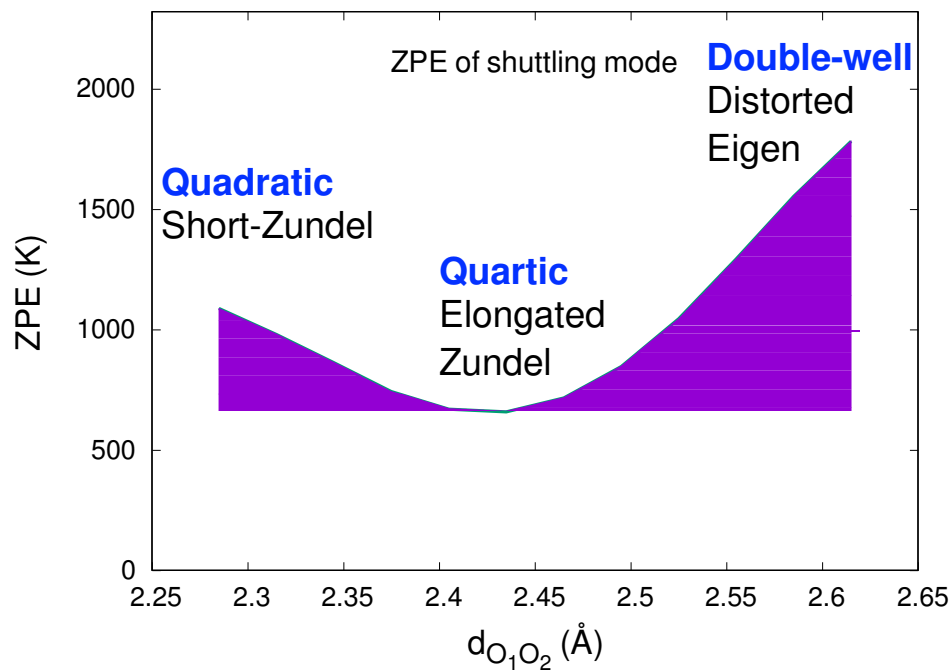
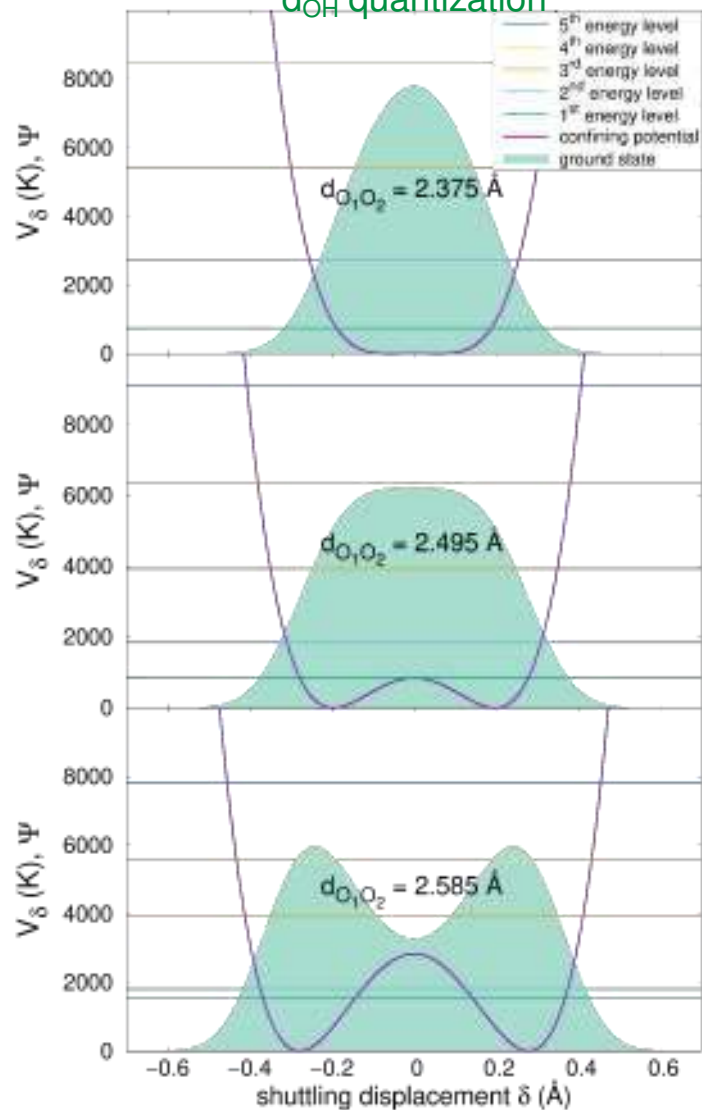
Short-Zundel

Elongated-Zundel

Distorted-Eigen

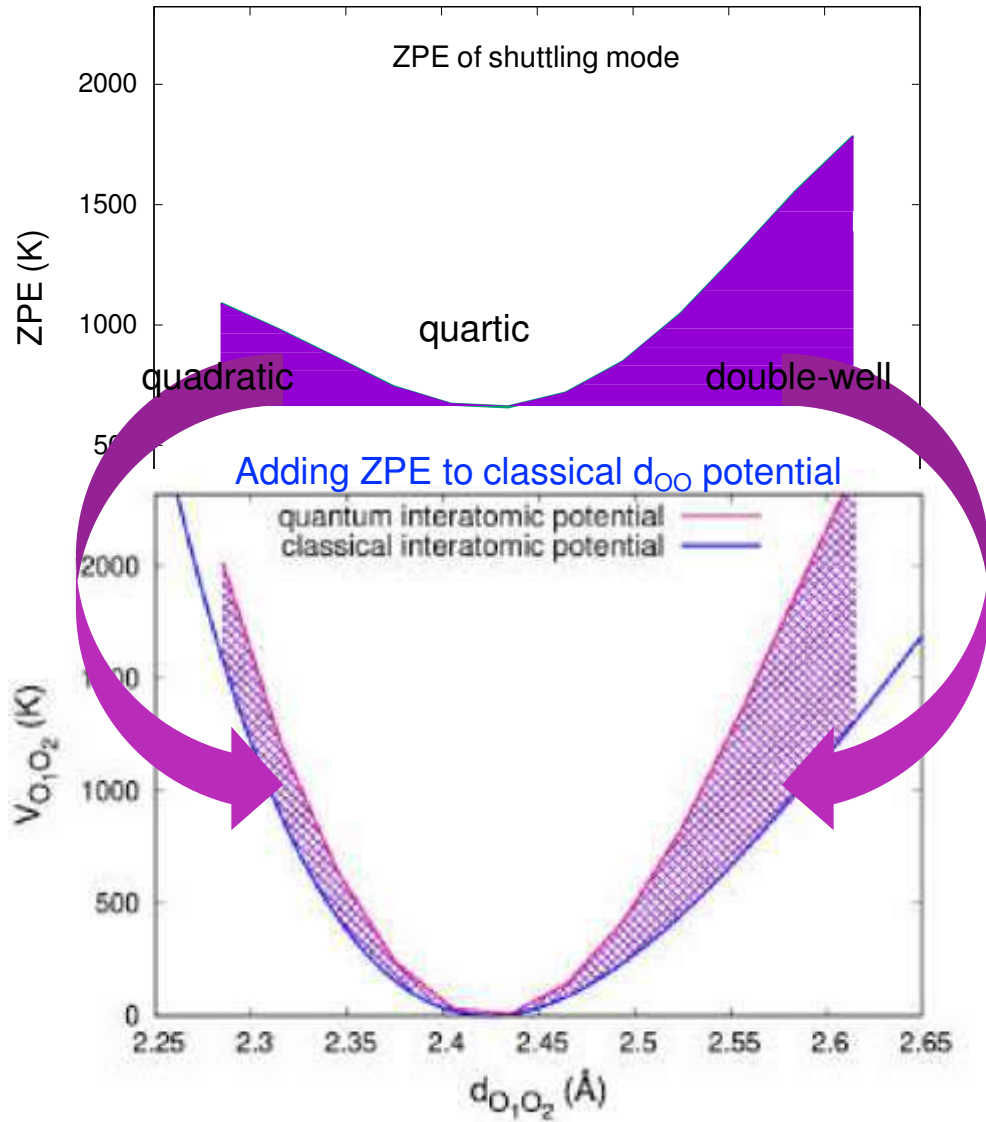
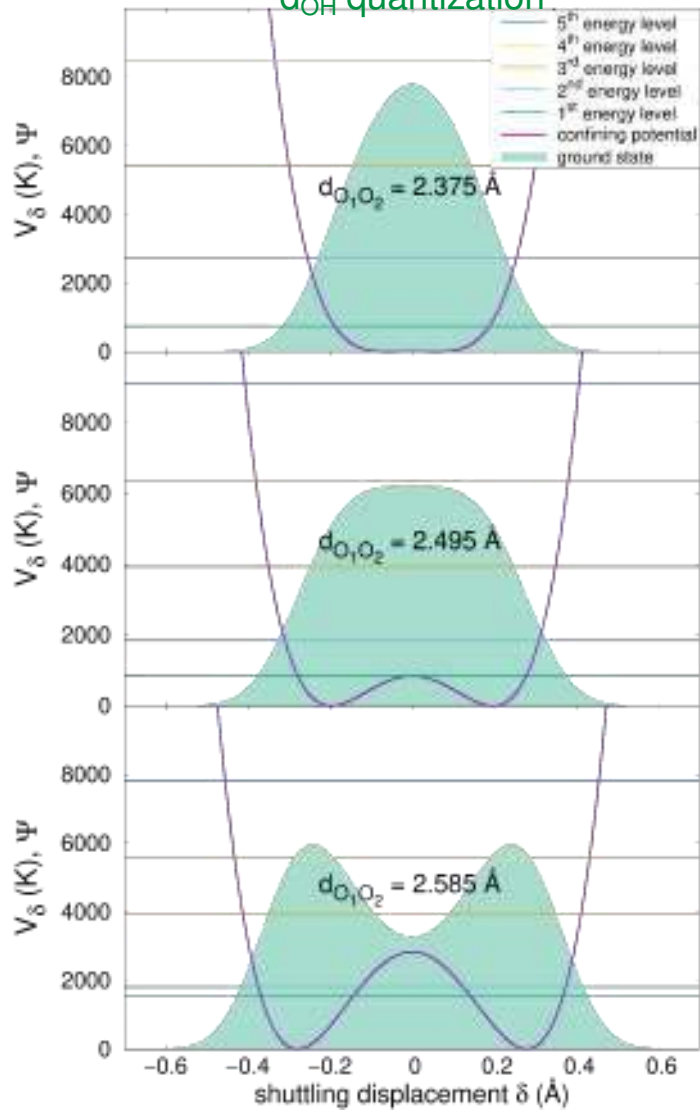
# Zero point energy (ZPE) variation

$d_{OH}$  quantization

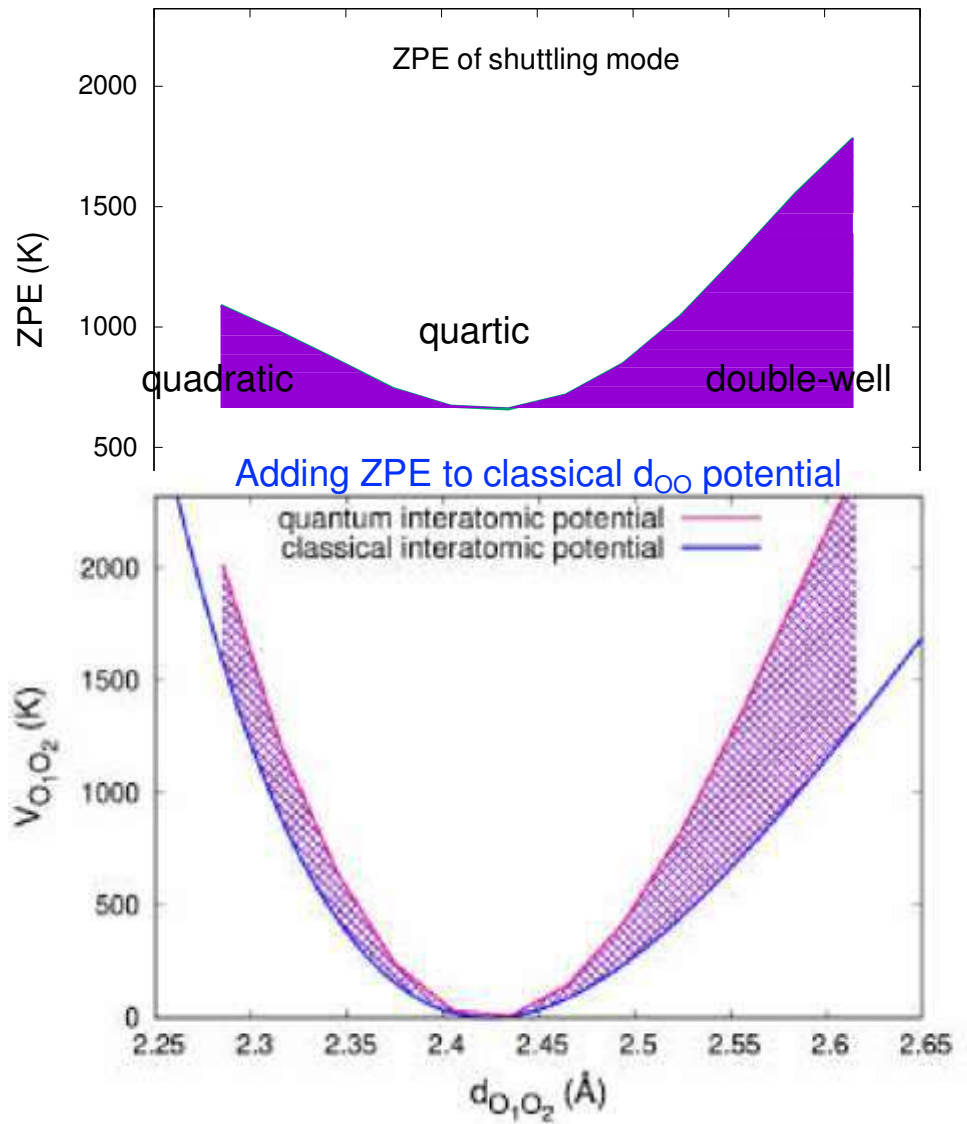
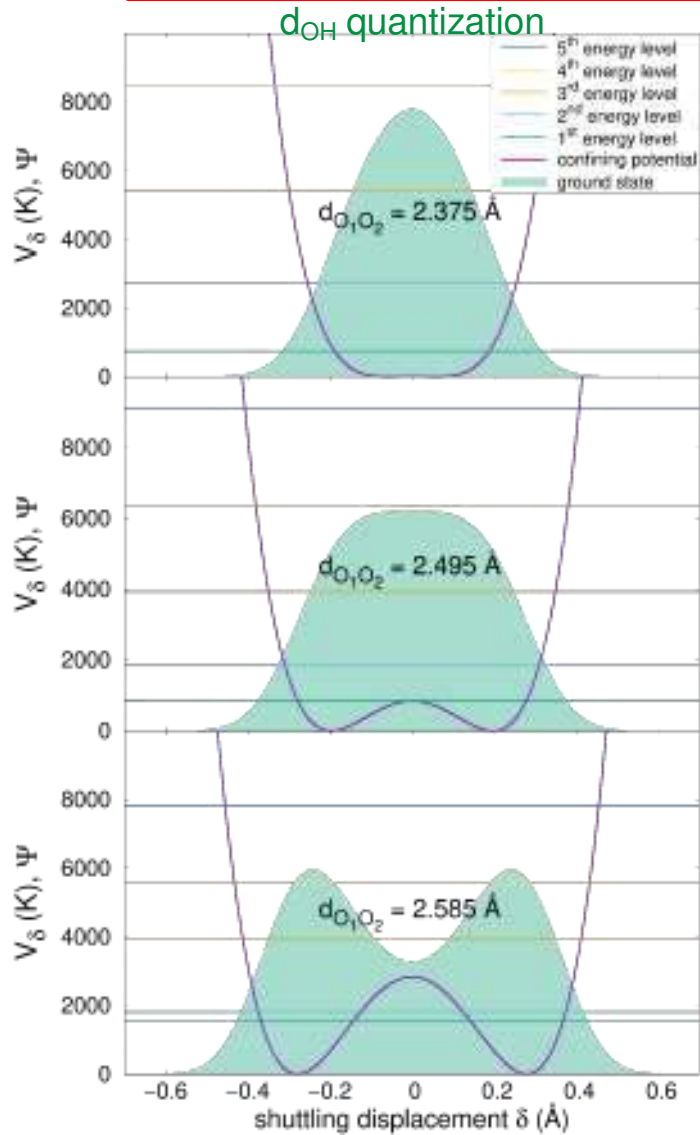


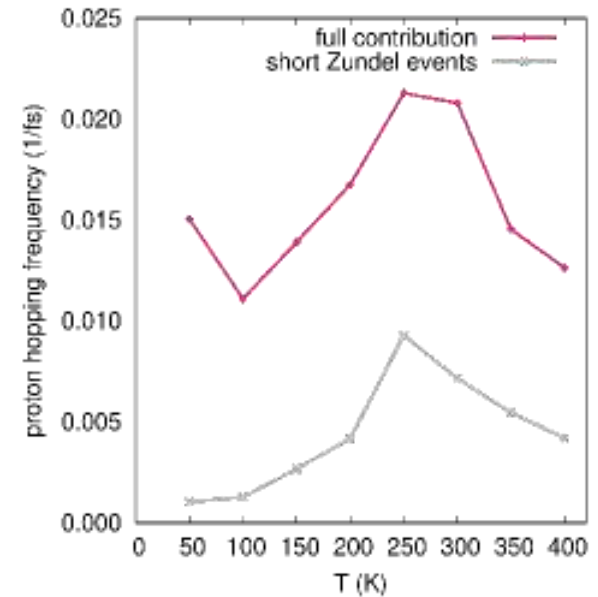
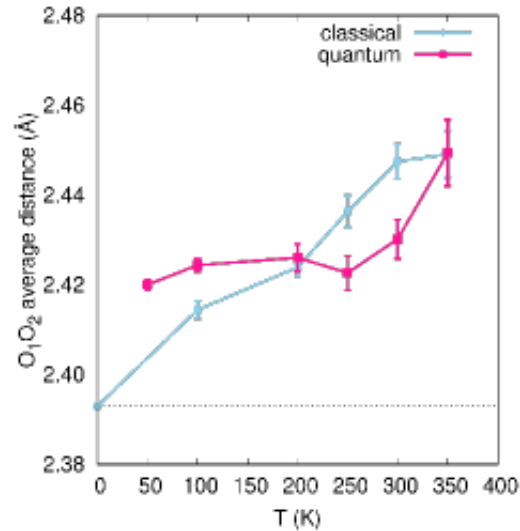
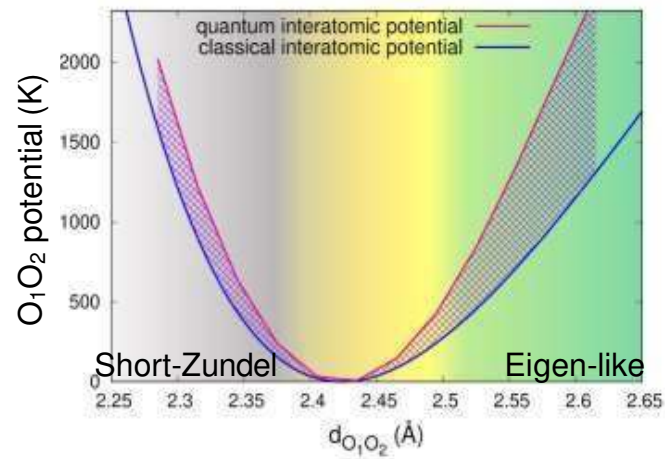
# Zero point energy (ZPE) variation

$d_{OH}$  quantization



# Zero point energy (ZPE) variation





- Eigen-like configurations penalized by ZPE in favor of Short-Zundel (importance of short-H bond highlighted by Dereka *et al.*, Science **371**, 160 (2021))
- Resulting potential explains low thermal expansion of the Zundel-core
- Synergistic interplay between T and ZPE leads to sweet spot in proton transfer

Reference: F. Mouhat, M. Peria, T. Morresi, R. Vuilleumier, A. M. Saitta, M. Casula, Nature Communications **14**, 6930 (2023)

- Different combinations of QMC with methods treating quantum nuclei (QMC+SCHA, QMC+PIMD) to predict phase diagram and structural properties of hydrogen-rich compounds
- ML techniques combined with QMC forces very promising to provide reliable force fields, which can then be used in SCHA or molecular dynamics for anharmonic phonon analysis

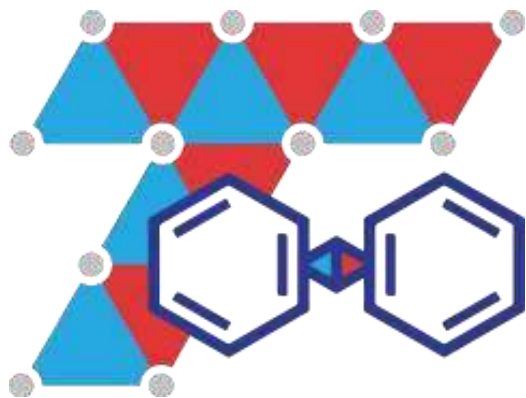
QMC and ML for PES determination: very recent works!

Ryczko, Krogel, Tamblyn, *Machine Learning Diffusion Monte Carlo Energy Densities*, arXiv preprint arXiv:2205.04547 (2022)

Niu, Yang, Jensen, Holzmann, Pierleoni, and Ceperley, *Stable solid molecular hydrogen above 900K from a machine-learned potential trained with diffusion Quantum Monte Carlo*, arXiv preprint arXiv:2209.00658 (2022)

Tirelli, Tenti, Nakano, and Sorella, *High-pressure hydrogen by machine learning and quantum Monte Carlo*, Physical Review B **106**, L041 05 (2022)

Tenti, Tirelli, Nakano, Casula and Sorella, *Principal deuterium Hugoniot via Quantum Monte Carlo and  $\Delta$ -learning*, arXiv:2301.03570



**Github repository:**

<https://github.com/sissaschool/turborvb>

Open source under GPL-3.0

**Manual:** [https://sissaschool.github.io/turborvb\\_website/](https://sissaschool.github.io/turborvb_website/)

Sandro Sorella



Kosuke Nakano



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- CINECA (Italy)
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Sandro Sorella



Kosuke Nakano



Francesco Mauri



Matteo Peria



Félix Mouhat



Rodolphe  
Vuilleumier



A. Marco Saitta