

eQE: The embedded Quantum ESPRESSO software package

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MolSSI workshop at UB 2018

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Est. 2012

Embedding is the future present

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The playing field as I see it

- Moore's law forces us to go parallel
- (Super)computer architectures typically provide
 - Compute nodes (12-24 procs/node)
 - Infiniband
 - Coprocessors
- The cloud (**probably the future**)
 - Low on CPU, high on GPU
 - Google colaboratory / Google cloud: python + tensorflow
 - Not aware of any QC/CMT code tailored to AWS

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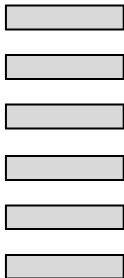
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The role of Embedding

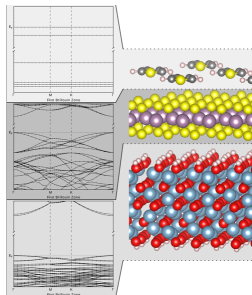
- Naturally work-parallel
- In some formulations also data-parallel
- Embedding is a paradigm:
 - Can embed mathematical quantities (ρ , Ψ , G)
 - Can embed QC/CMT codes

Embedding overlaps with current architectures

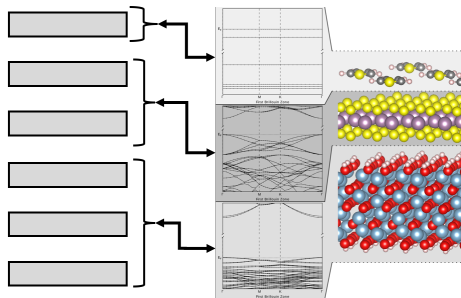
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Compute nodes

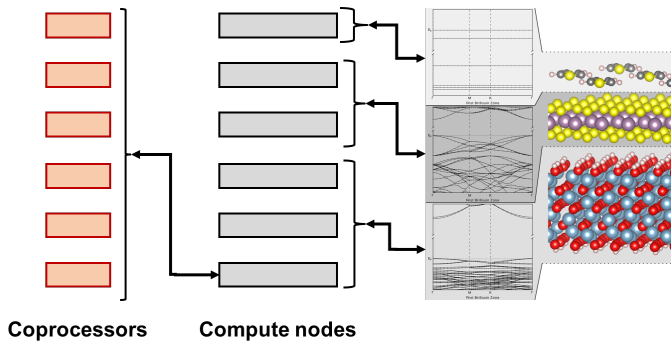


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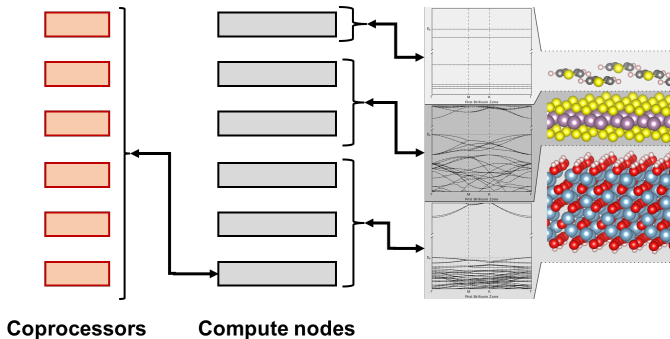


Compute nodes

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Embedding overlaps with current architectures



The method should:

- Broadcast as little data as possible across compute nodes
- Avoid computing zeros
 - Simple and easy basis set truncation
- Approach excited states and $e^- - N$ dynamics

Density Embedding (FDE) / Subsystem DFT

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- **Frozen Density Embedding (FDE):** Coupled Kohn–Sham equations for each subsystem

$$\frac{\delta E_{\text{FDE}}[\rho_I + \rho_{II}]}{\delta \rho_I} = 0 \rightarrow \left[-\frac{1}{2} \nabla^2 + v_{\text{KS}}^I(\mathbf{r}) + v_{\text{emb}}^I(\mathbf{r}) \right] \phi_{(i)_I}(\mathbf{r}) = \varepsilon_i^I \phi_{(i)_I}(\mathbf{r})$$

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Orbital-free DFT interaction between subsystems

... a slide from 2018 QE workshop. . .

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Homework :)

- Compute $T_s^{\text{nadd}}[\rho_I, \rho_{II}]$ in the Thomas-Fermi approximation, $T_s[\rho] = C_{TF} \int \rho^{5/3}(\mathbf{r}) d\mathbf{r}$
- Compute $E_x^{\text{nadd}}[\rho_I, \rho_{II}]$ in the Dirac approximation, $E_x[\rho] = C_x \int \rho^{4/3}(\mathbf{r}) d\mathbf{r}$
- Compute $E_H^{\text{nadd}}[\rho_I, \rho_{II}]$, $E_H[\rho] = \frac{1}{2} \int \int \rho(\mathbf{r}) \frac{\rho(\mathbf{r}')}{|\mathbf{r} - \mathbf{r}'|} d\mathbf{r} d\mathbf{r}'$

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... more homework!

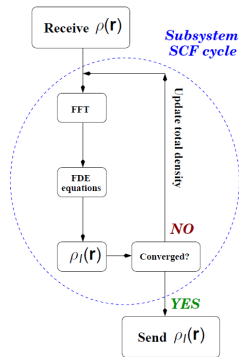
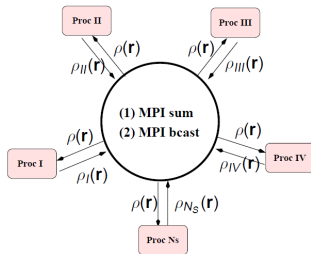
- T_s contribution to $v_{\text{emb}}(\mathbf{r})$
- E_x contribution to $v_{\text{emb}}(\mathbf{r})$
- E_H contribution to $v_{\text{emb}}(\mathbf{r})$



eqe.rutgers.edu



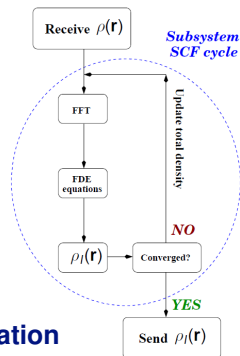
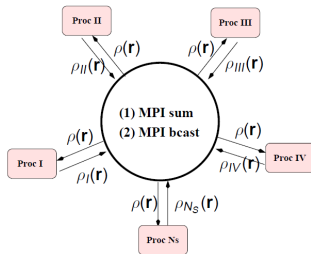
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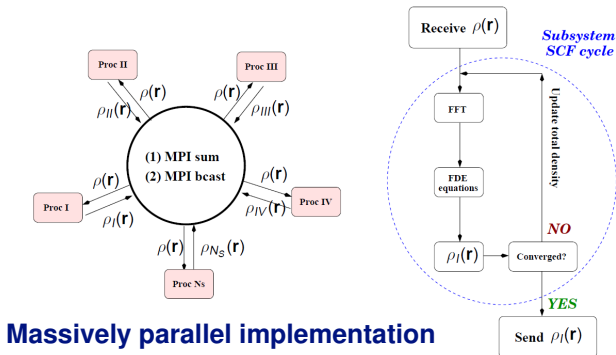
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Massively parallel implementation



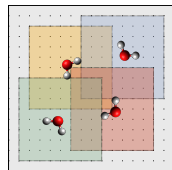
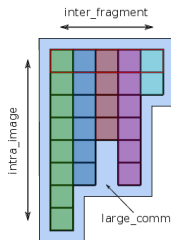


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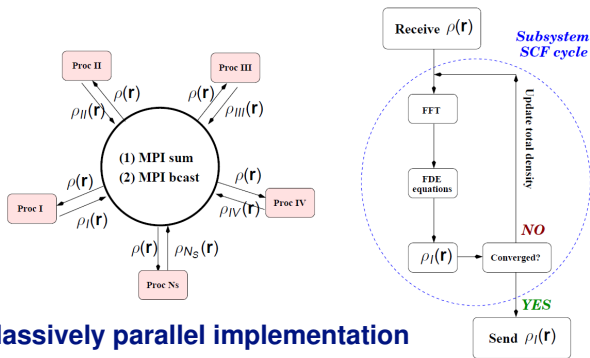
Rewrite the MPI module of QE

- Subsystem-specific # of CPUs
- Improved latencies (processes wait for others to complete)
- Nested DIIS for $\{\rho_I(\mathbf{r})\}$





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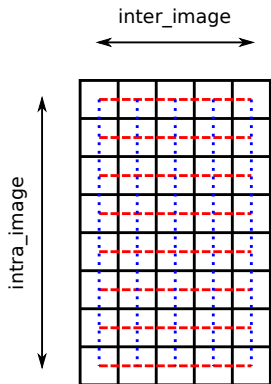
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BZ sampling (k -points)

- K -point sampling for (semi)conductors.
- Γ -point for molecules/insulators.

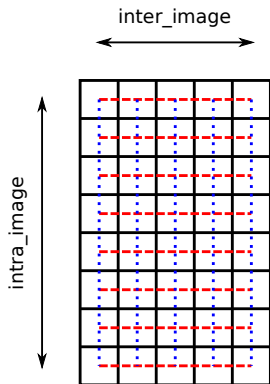
eQE: a note on parallelization

Regular QE

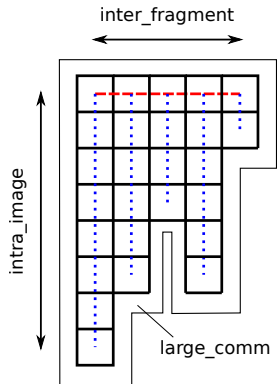


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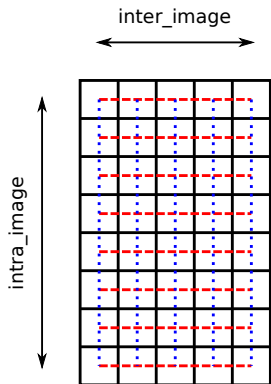


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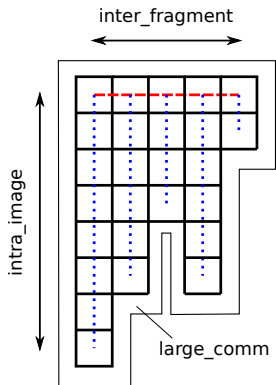


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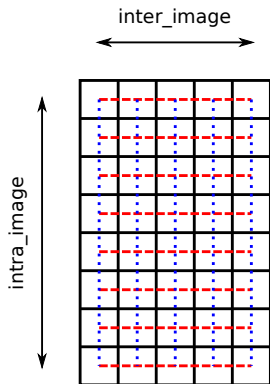


pros & cons

- distributed data communication
- non-polymorphic

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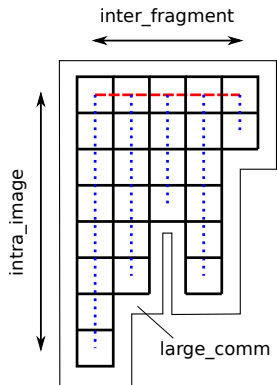
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eQE



pros & cons

- polymorphic
- gathered data communication

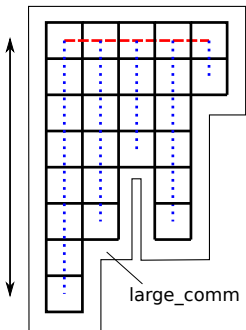
eQE: a note on coding it

eQE

inter_fragment



intra_image



```
! dfftp                                :: the fft descriptor of the subsystem electron cell
! dfftl                                :: the fft descriptor of the supersystem simulation cell
! rho%of_r(dfftp%nnr)                  :: the subsystem density in the subsystem cell
                                        (grid is distributed over the processes in intra_image_comm)
! rho_fde%of_r(dfftp%nnr)              :: the supersystem density in the subsystem cell
                                        (grid is distributed over the processes in intra_image_comm)
! rho_fde_large%of_r(dfftl%nnr)        :: the supersystem density in the supersystem cell
                                        (grid is distributed over the processes in large_comm)
! %of_g(:)                              :: same quantity in reciprocal space
! aux(dfftp%nnr)                        :: auxiliary vector of the subsystem cell real space
                                        (grid is distributed over the processes in intra_image_comm)
! gaux(ngm)                             :: auxiliary vector of the subsystem cell reciprocal space
! raux(nr1*nr2*nr3)                     :: subsystem cell real space auxiliary vector
                                        (whole grid is collected on the ionode proc of intra_image_comm)
! auxl(dfftl%nnr)                       :: auxiliary vector of the supersystem cell real space
                                        (grid is distributed over the processes in large_comm)
! gauxl(ngml)                           :: auxiliary vector of the supersystem cell reciprocal space
! rauxl(nr1*nr2*nr3l)                   :: supersystem (large) cell real space gathered auxiliary vector
                                        (whole grid is collected on the ionode proc of large_comm)
! f2l(nr1*nr2*nr3)                      :: subsystem cell to supersystem cell mapping vector.
```

Collect the subsystem density from all the intra_image processes into a single array (raux).

Copy each subsystem density into an array of the supersystem cell (rauxl), using mapping (f2l).

Allreduce rauxl across the processes in inter_fragment to build the supersystem density in the supersystem cell.

Using the f2l mapping, copy the supersystem density into each subsystem cell.

Distribute the supersystem density over all processes in the communicators spanning the supersystem and subsystem cells.

FFT to obtain the reciprocal space representation of the supersystem density in both the subsystem and the supersystem cells.

```
call grid_gather(rho_fde%of_r(:,is), raux)
```

```
if (ionode) then
```

```
    rauxl = 0.d0
    rauxl(f2l(:)) = raux(:)
```

```
call mp_sum(rauxl, inter_fragment_comm)
```

```
    raux = 0.d0
    raux(:) = rauxl(f2l(:))
```

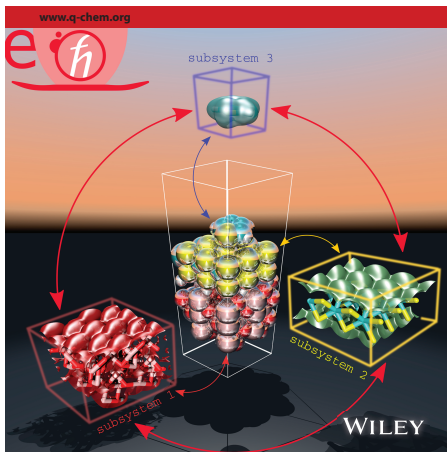
```
endif
```

```
call grid_scatter_large(rauxl, rho_fde_large%of_r(:,is))
call grid_scatter(raux, rho_fde%of_r(:,is))
```

```
gauxl(:) = cmplx(rho_fde_large%of_r(:,is), 0.d0, kind=dp)
call fwwft ('Custom', gauxl, dfftl)
rho_fde_large%of_g(1:ngml,is) = gauxl(nll(1:ngml))
```

```
gaux(:) = cmplx(rho_fde%of_r(:,is), 0.d0, kind=dp)
call fwwft ('Dense', gaux, dfftp)
```


International Journal of QUANTUM CHEMISTRY



eQE: An open-source density functional embedding theory code for the condensed phase
International Journal of Quantum Chemistry, **117**, e25401 (2017)

eQE Development: Hackathons are the key

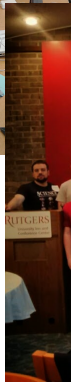
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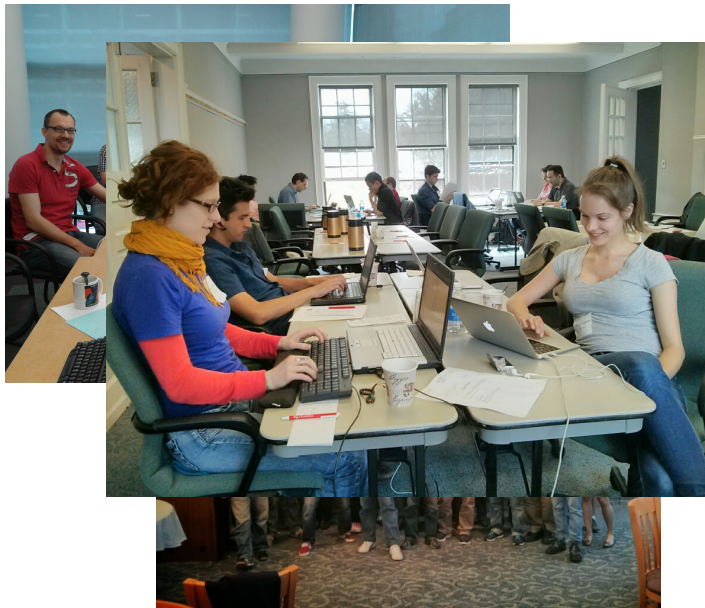
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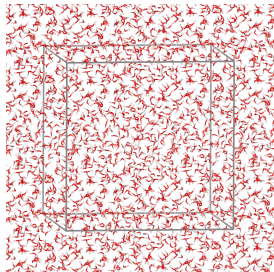


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eQE: Performance for molecular periodic systems

Water 1024



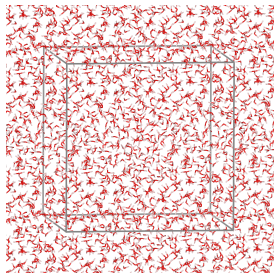
30726 Å³

Speedup compared to regular QE (all PBE)

24.5 ×

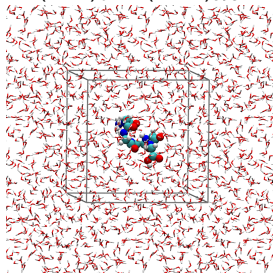
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30726 Å³

(GLY)₆ in (H₂O)₃₉₅



12656 Å³

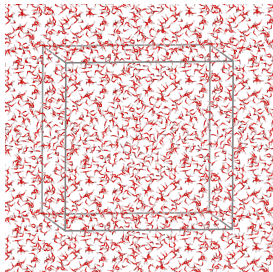
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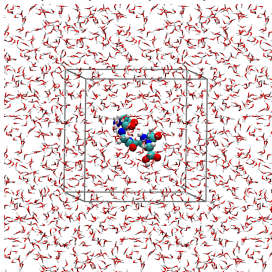
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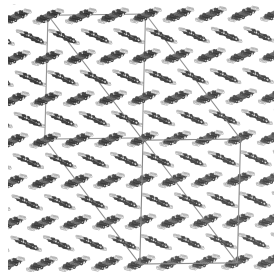
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Pentacene 3 × 3 × 3



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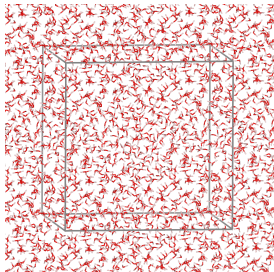
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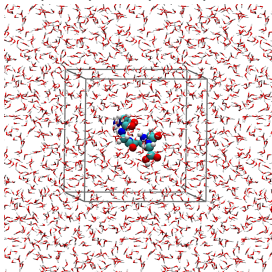
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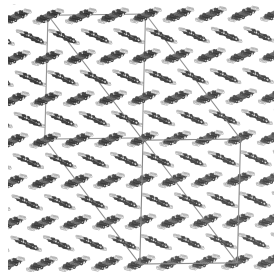
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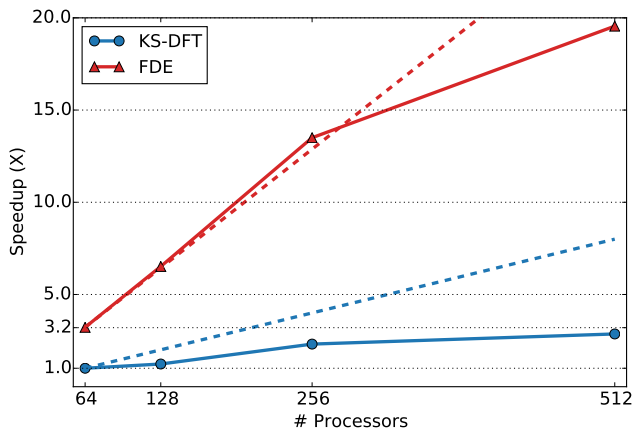
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Well over one order of magnitude speedup!

eQE vs QE: Parallel scaling for water 256

Water 256, 256 subsystems

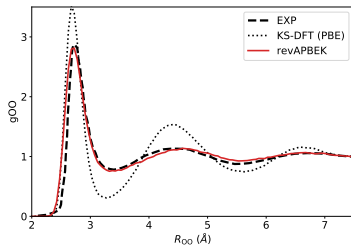


QE-eQE gap widens with increasing # of CPUs

Liquid Water – does eQE get the structure right?

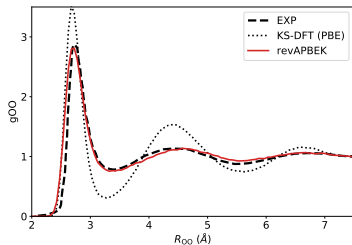
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Oxygen–Oxygen RDF

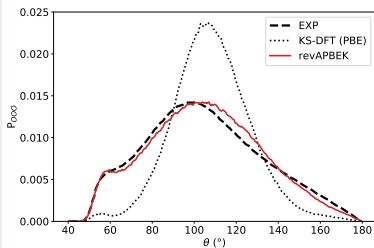


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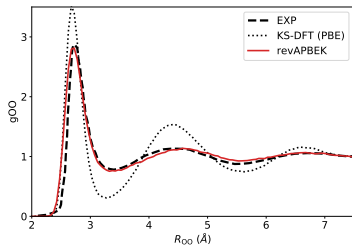


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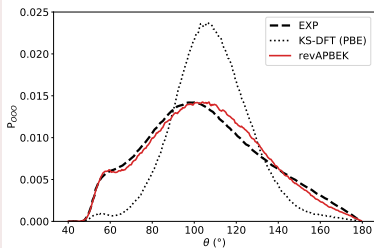


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O–O–O ADF



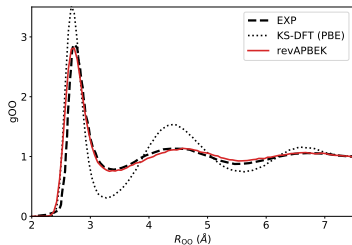
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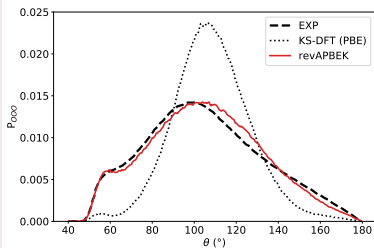
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Liquid Water – does eQE get the structure right?

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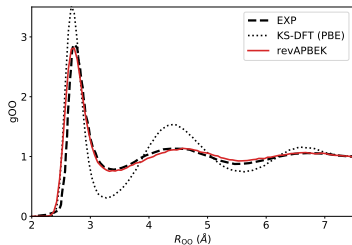
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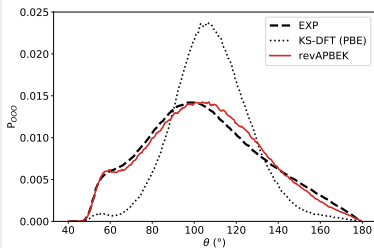
- eQE recovers correct structure
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- eQE recovers correct e^- structure
- **How about e^- excited states?**

Subsystem TDDFT and Related Methods

- effective excitations of active subsystem in environment (leads to "FDEu")
M.E. Casida, T.A. Wesolowski, *Int. J. Quant. Chem.* **96** (2004), 577; T.A. Wesolowski, *JACS* **126** (2004), 11444.
- general subsystem TDDFT formulation for delocalized excitations ("FDEc")
J. Neugebauer, *J. Chem. Phys.* **126** (2007), 134116; J. Neugebauer, *J. Chem. Phys.* **131** (2009), 084104
- derivation with focus on subsystem response functions
M. Pavanello, *J. Chem. Phys.* **138** (2013), 204118.
- fragment-based TDDFT in the context of partition DFT
M.A. Mosquera, D. Jensen, A. Wasserman, *Phys. Rev. Lett.* **111** (2013), 023001.
- time-dependent potential-functional theory for subsystems
C. Huang, F. Libisch, Q. Peng, E.A. Carter *J. Chem. Phys.* **140** (2014), 124113.
- real-time subsystem TDDFT
A. Krishtal, D. Ceresoli, M. Pavanello, *J. Chem. Phys.* **142** (2015), 154116.
- subsystem TDDFT with external orthogonality
D.V. Chulhai, L. Jensen, *Phys. Chem. Chem. Phys.* **18** (2016), 21032.

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The K_{IJ} coupling

$$K_{IJ}(\mathbf{r}_1, \mathbf{r}_2, t - t') = \frac{\delta(t - t')}{|\mathbf{r}_1 - \mathbf{r}_2|} + \frac{\delta^2 E_{xc}}{\delta\rho(\mathbf{r}_1, t)\delta\rho(\mathbf{r}_2, t')} + \frac{\delta^2 T_s}{\delta\rho(\mathbf{r}_1, t)\delta\rho(\mathbf{r}_2, t')}$$

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Subsystem TDDFT is a general theory for open systems
Let's apply it to liquid water!

The Optical Spectrum of Liquid Water

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Cooperation and Environment Characterize the Low-Lying Optical Spectrum of Liquid Water

J. Phys. Chem. Lett., 8 (20), pp 5077-5083 (2017)

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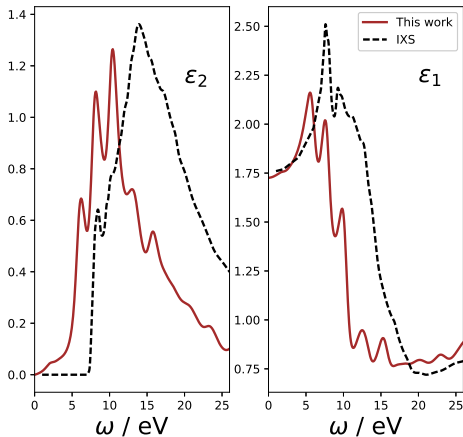
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Computation of ϵ

Optical Properties of Liquid Water: ϵ_1 & ϵ_2

Computation of ϵ

- 10 snapshots of water 64
- Average of 640 spectra

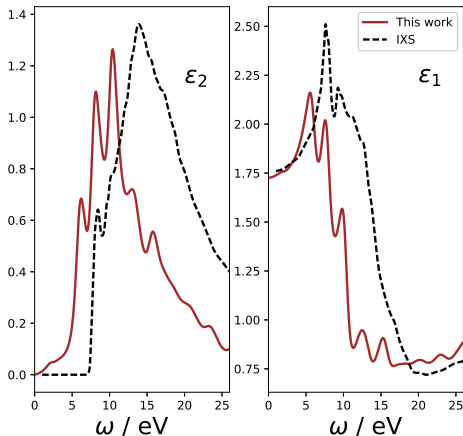


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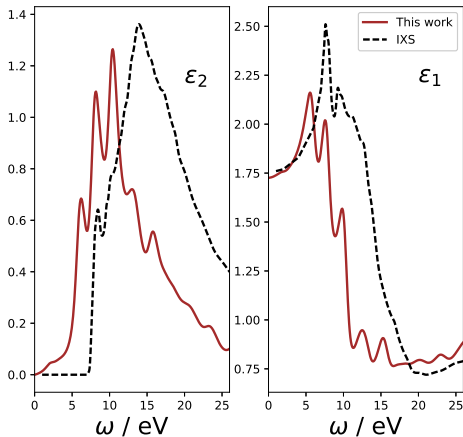
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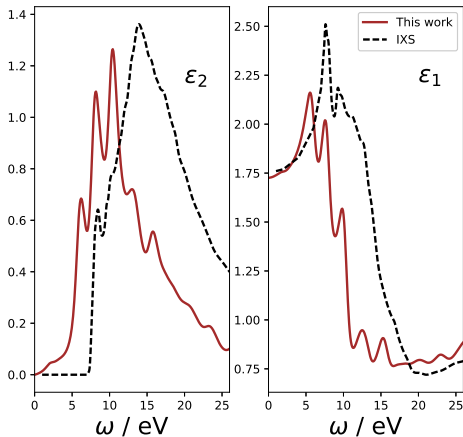
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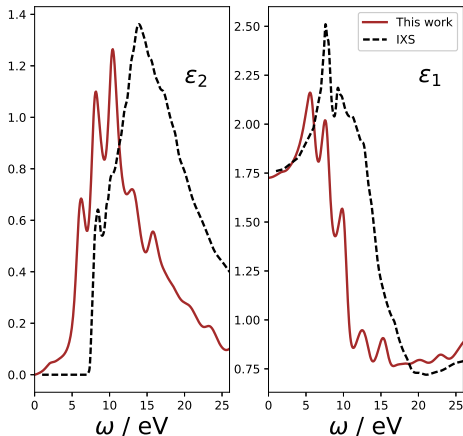
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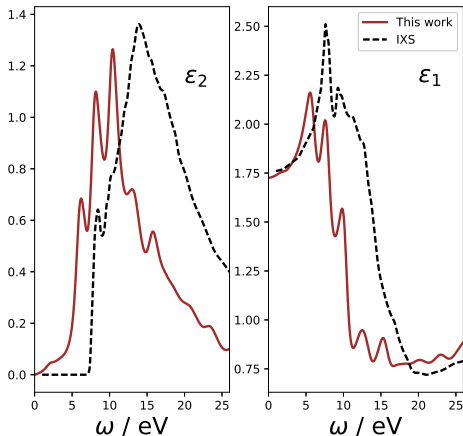
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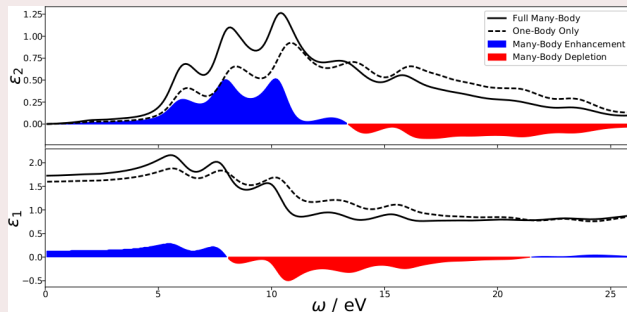
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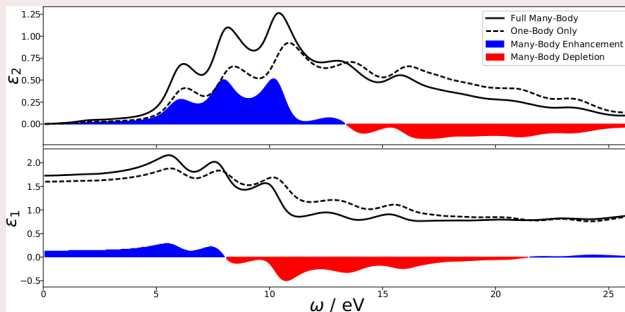
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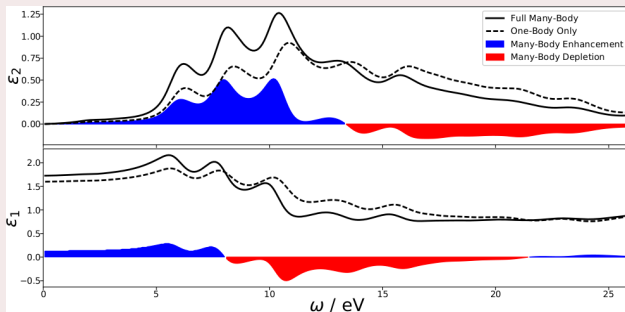
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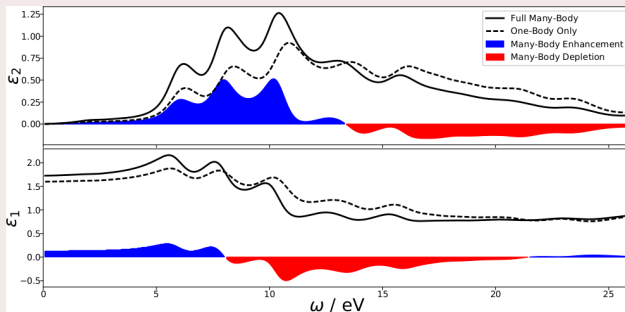
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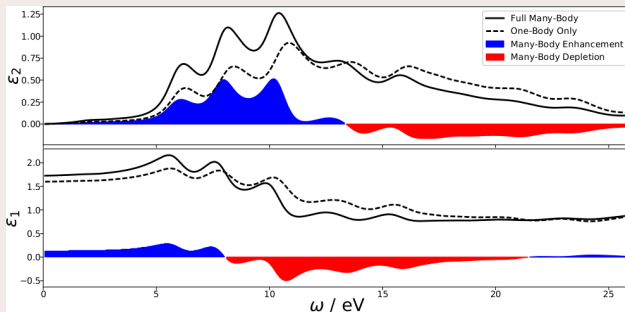
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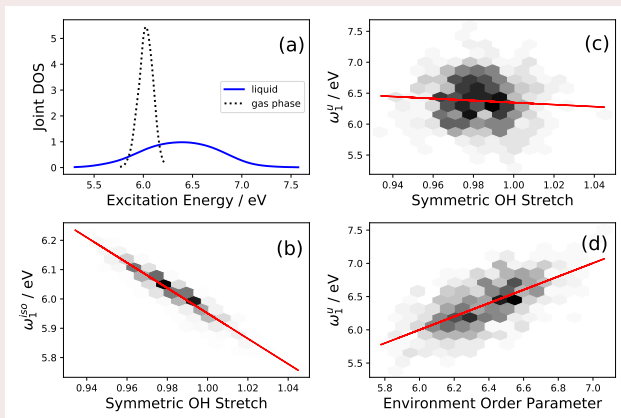
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First Absorption Band of Liquid Water: ω_1

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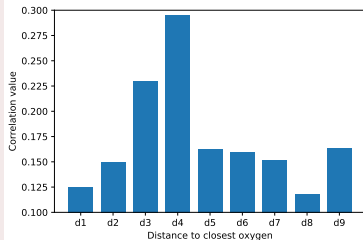
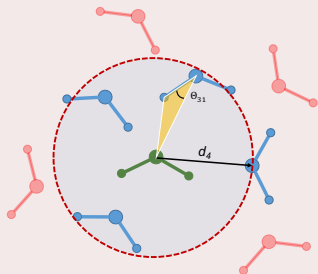


- Urbach tail entirely due to environment
- ω_1 and OH stretching do not correlate in the liquid
- Environment Order Parameter (**EOP**): Regression of 300+ descriptors
- Correlation of EOP to ω_1 is 0.65

Optical Properties of Liquid Water

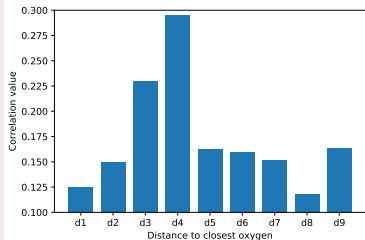
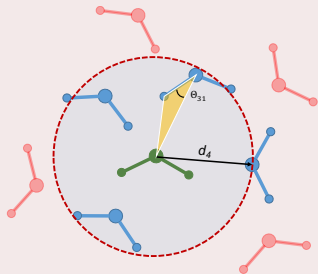
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Environment Order Parameter: Simplified depiction



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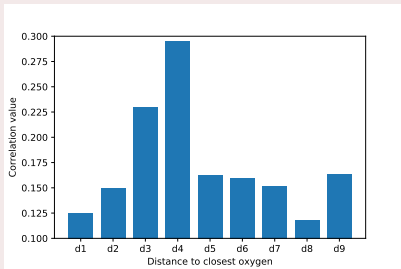
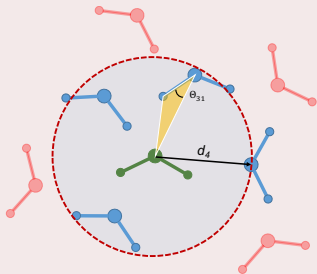
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What is “Environment Order Parameter” made of?

Optical Properties of Liquid Water

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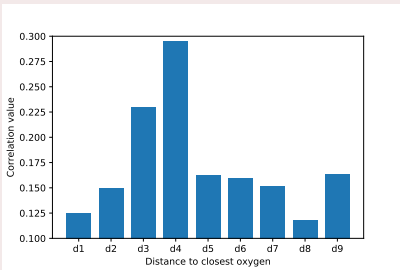
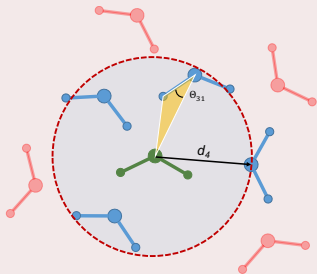


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Optical Properties of Liquid Water

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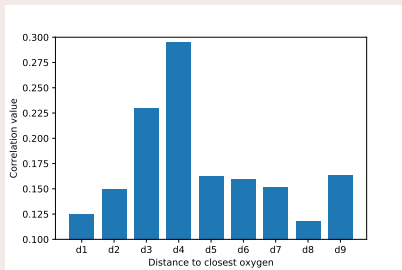
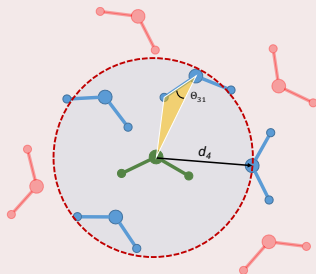


What is “Environment Order Parameter” made of?

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Optical Properties of Liquid Water

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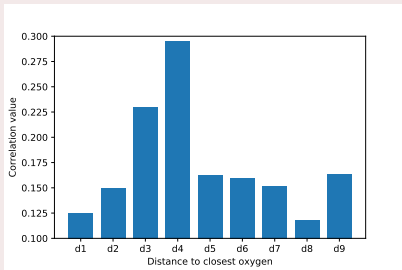
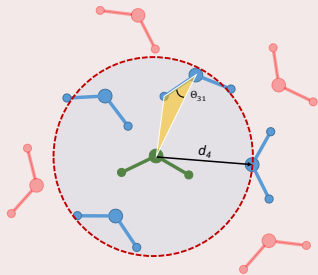


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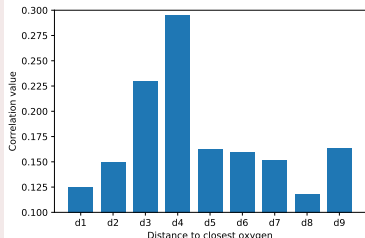
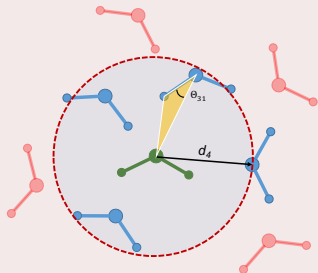


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... we have dissected liquid water...

Acknowledgments

Postdocs, Students & Collaborators

Current PRG members

Postdocs:

- Dr. Wenhui Mi
- Dr. Muhammed Acikgoz
- Dr. Pablo Ramos

Graduate Students:

- Rupali Chawla
- Alina Umerbekova
- Jack Maranhao

Funding:

- NSF CAREER
- DOE CTC

Alumni & Collaborators

Alumni:

- **Johannes Tölle (Münster University)**
- **Dr. Alessandro Genova (@ Kitware)**
- **Prof. Alisa Krishtal (@ NJIT)**
- **Dr. Debalina Sinha (@ L'Oreal)**

Collaborators:

- **Dr. Davide Ceresoli (CNR)**
- **Prof. Rob DiStasio (Cornell)**
- **Dr. Andre Gomes (CNRS)**
- **Prof. Oliviero Andreussi (North Texas)**
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