Large-Scale Electronic Structure Theory in FHI-aims and ELSI

Volker Blum

MEMS Department, Duke University, Durham, NC <u>http://aims.pratt.duke.edu</u>





New Mathematics for the Exascale, IPAM, UCLA - March 27, 2023

Large-Scale Electronic Structure Theory in FHI-aims and ELSI



New Mathematics for the Exascale, IPAM, UCLA - March 27, 2023

Group (Present and Past)

Ab Initio Materials Simulations Group (Duke Univ.)





Zhao

Yi Yao



Raul Laasner

ENGINEERING





Huhn

(now Intel)



Tianlin Wang



(Duke University, Durham, NC, US/



Uthpala Herath





Naidel Caturello



Rayan

Victor Wen-zhe Yu



Chi Liu

Jack Morgenstein Jannik Eisenlohr Harrison York **Reyna Vrbensky Douglas Heine** Shreyas Karadi Daniel Duarte Wentao Zhang

Our (Long-Term) Approach: FHI-aims



<u>Vision:</u>

Quantum mechanics based simulations of real, complex molecules, materials and their properties without a priori precision and accuracy limitations.

→ Algorithmic choices and priorities:

- All-electron
- Non-periodic and periodic systems on equal footing
- Scalability to large systems (thousands of atoms) without precision limitations
- Seamless scalability from laptop to massively parallel and/or new HPC architectures
- Density functional theory and correlated methods (RPA, GW, CC via CC4S...)

Critical choice

• Numeric atom-centered basis functions (accurate representation of occupied orbitals and densities)

Stewardship: MSIP e.V. (non-profit organization, purpose: basic science) Advisory board, very active community

FHI-aims Code



FHI-aims team and collaborators: Matthias Scheffler (Berlin), Sebastian Kokott (Berlin), Mariana Rossi (Hamburg), Xinguo Ren (Beijing), Karsten Reuter (Berlin), over 150 individuals with contributions to the project. Development in Berlin, Duke, UNC, Beijing, Helsinki, Warwick, Cardiff, Dresden, Dalhousie, etc.

Coordinators: Blum, Kokott, Rossi, Scheffler

Alaa Akkoush, Heiko Appel, Victor Atalla, Kurt Baarmann, Carsten Baldauf, Alexej Bagrets, Jörg Behler, Daniel Berger, Josh Berryman, Sheng Bi, Benedikt Biedermann, Bjoern Bieniek, Volker Blum, Saeed Bohloul, Tiago Botari, Connor Box, Danilo Brambila, Gabriel Bramley, Daniel Bultrini, Christian Carbogno, Fabio Caruso, Marco Casadei, Michele Ceriotti, Wael Chibani, Sucismita Chutia, Francisco Antonio Delesma, Fabio Della Sala, Maria Dragoumi, Andreas Dolfen, Marc Dvorak, Simon Erker, Ferdinand Evers, Eduardo Fabiano, Matt Farrow, Nicola Ferri, Karen Fidanyan, Jakob Filser, Lukas Gallandi, Ralf Gehrke, Luca Ghiringhelli, Mark Glass, Vivekanand Gobre, Dorothea Golze, Matthias Gramzow, Patrick Guetlein, Stefan Gutzeit, Volker Haigis, Felix Hanke, Paula Havu, Ville Havu, Joscha Hekele, Olle Hellman, Jan Hermann, Oliver Hofmann, Johannes Hoja, Xiaojuan Hu, William Huhn, Lukas Hörmann, Arvid Ihrig, Timo Jacob, Adam Jackson, Svenja Janke, Ran Jia, Rainer Johanni, Erin Johnson, Werner Jürgens, Matthias Kahk, Yosuke Kanai, Levi Keller, Matthias Kick, Woo Youn Kim, Jan Kloppenburg, Alexander Knoll, Florian Knoop, Franz Knuth, Simone Koecher, Gabrielle Koknat, Sebastian Kokott, Raul Laasner, Lucas Lang, Bjoern Lange, Marvin Lechner, Susi Lehtola, Maja-Olivia Lenz, Sergey Levchenko, Alan Lewis, Jiachen Li, Xinzheng Li, Kailai Lin, Xinyi Lin, Konstantin Lion, Yair Litman, Chi Liu, Andrew Logsdail, Andreas Marek, Thomas Markovich, Reinhard Maurer, Florian Merz, Joerg Meyer, Wenhui Mi, Evgeny Moerman, Christoph Muschielok, Mohammad Nakhaee, Lydia Nemec, Norbert Nemec, Kane O'Donnell, Harald Oberhofer, Berk Onat, Alberto Otero de la Rosa, Ramon L. Panades-Barrueta, Eszter Pos, Alastair Price, Thomas Purcell, Nathaniel Raimbault, Karsten Rasim, Xinguo Ren, Karsten Reuter, Norina Richter, Stefan Ringe, Patrick Rinke, Herzain Rivera, Matti Ropo, Mariana Rossi, Tuomas Rossi, Adrienn Ruzsinszky, Nikita Rybin, Georg Michelitsch, Andrea Sanfilippo, Matthias Scheffler, Markus Schneider, Christoph Schober, Franziska Schubert, Honghui Shang, Tonghao Shen, Markus Sinstein, Justin Clifford Smith, Ari-Pekka Soikkeli, Ruyi Song, Aloysius Soon, Pavel Stishenko, Muhammad Tahir, Alexandre Tkatchenko, Thomas Theis, Alvaro Vazquez Mayagoitia, Suzy Wallace, Tianlin Wang, Yanyong Wang, Jürgen Wieferink, Scott Woodley, Jianhang Xu, Yong Xu, Yi Yao, Mina Yoon, Ted Yu, Victor Yu, Zhenkun Yuan, Marios Zacharias, Guo-Xu Zhang, Igor Ying Zhang, Wenxing Zhang, Rundong Zhao, Ruiyi Zhou, Yuanyuan Zhou, Tong Zhu



... and, with absolute certainty, more! Thank you!

ELSI: Connecting Electronic Structure Codes and Solvers



ELSI: Connecting Electronic Structure Codes and Solvers



Open-Source Graphical Interface for Materials Science

https://gims.mslp.org

Browser-based graphical interface - no installation, open to more codes.



MatD³: Individualized Materials Database Software

Raul Laasner, Xiaochen Du, Aditya Tanikanti, Connor Clayton, Marco Govoni, Giulia Galli, Volker Blum "MatD³: A Database and Online Presentation Package for Research Data Supporting Materials Discovery, Design, and Dissemination,"

Journal of Open-Source Software, Vol. 5, No. 45, 1945 (2020). DOI: 10.21105/joss.01945



NSF DMR

1728921.

1729297,

1729383

CECAM Electronic Structure Library

Electronic Structure Theory underpins a broad swath of science, with "engines" that live for decades: Much of our infrastructure is shared.



Oliveira et al., J. Chem. Phys. 153, 024117 (2020).

Electronic Structure Software Development: Advancing the Modular Paradigm

https://www.cecam.org/workshop-details/1194

February 19 - March 1, 2024

CECAM-HQ, Lausanne, Switzerland





Save the Date!

2 days of strategy / high-level discussions, 10 days of actual coding in Lausanne.

Standard Electronic Structure Theory

$$\begin{bmatrix} -\frac{\nabla^2}{2} + v_{\text{ext}}(\boldsymbol{r}) + v_{\text{es}}(\boldsymbol{r}) + v_{\text{xc}}(\boldsymbol{r}) \end{bmatrix} \psi_k(\boldsymbol{r}) = \epsilon_k \psi_k(\boldsymbol{r})$$
 Kohn-Sham
I965

Standard Electronic Structure Theory

$$\left[-\frac{\nabla^2}{2} + v_{\text{ext}}(\boldsymbol{r}) + v_{\text{es}}(\boldsymbol{r}) + v_{\text{xc}}(\boldsymbol{r})\right]\psi_k(\boldsymbol{r}) = \epsilon_k\psi_k(\boldsymbol{r}) \qquad \text{Kohn-Sham}$$
1965

"As (almost) everyone does":

I. Pick basis set $\{|arphi_i
angle\}$:

$$\psi_k(m{r}) = \sum_i c_{ki} \varphi_i(m{r})$$

→generalized eigenvalue problem:

$$\underline{\underline{h}}\,\underline{\underline{c}}_k = \epsilon_k\,\underline{\underline{s}}\,\underline{\underline{c}}_k$$

$$\begin{split} h_{ij} &= \langle \varphi_i | \hat{h}_{\rm KS} | \varphi_j \rangle \\ s_{ij} &= \langle \varphi_i | \varphi_j \rangle \end{split}$$

Standard Electronic Structure Theory

$$\begin{bmatrix} -\frac{\nabla^2}{2} + v_{\text{ext}}(\boldsymbol{r}) + v_{\text{es}}(\boldsymbol{r}) + v_{\text{xc}}(\boldsymbol{r}) \end{bmatrix} \psi_k(\boldsymbol{r}) = \epsilon_k \psi_k(\boldsymbol{r})$$
 Kohn-Sham 1965

"As (almost) everyone does":

I. Pick basis set $\{|arphi_i
angle\}$:

$$\psi_k(m{r}) = \sum_i c_{ki} \varphi_i(m{r})$$

→generalized eigenvalue problem:

$$\underline{\underline{h}}\,\underline{\underline{c}}_{k} = \epsilon_{k}\,\underline{\underline{s}}\,\underline{\underline{c}}_{k}$$

$$\begin{split} h_{ij} &= \langle \varphi_i | \hat{h}_{\rm KS} | \varphi_j \rangle \\ s_{ij} &= \langle \varphi_i | \varphi_j \rangle \end{split}$$

2. Self-consistency:



$$arphi_{i[lm]}(oldsymbol{r}) = rac{u_i(r)}{r} \cdot Y_{lm}(\Omega)$$

• $u_i(r)$: Flexible choice - "Anything you like."

<u>Many popular implementations:</u> DMol³ (Delley), FPLO (Eschrig et *al.*), PLATO (Horsfield et *al.*), PAOs (Siesta, Conquest, OpenMX², Fireball, ABACUS, ...)

$$arphi_{i[lm]}(m{r}) = rac{u_i(r)}{r} \cdot Y_{lm}(\Omega)$$

• $u_i(r)$: Flexible choice - "Anything you like."

<u>Many popular implementations:</u> DMol³ (Delley), FPLO (Eschrig et *al.*), PLATO (Horsfield *et al.*), PAOs (Siesta, Conquest, OpenMX², Fireball, ABACUS, ...)

$$\left[-\frac{1}{2}\frac{d^2}{dr^2} + \frac{l(l+1)}{r^2} + v_i(r) + v_{\rm cut}(r)\right]u_i(r) = \epsilon_i u_i(r)$$

$$arphi_{i[lm]}(m{r}) = rac{u_i(r)}{r} \cdot Y_{lm}(\Omega)$$

• $u_i(r)$: Flexible choice - "Anything you like."

<u>Many popular implementations:</u> DMol³ (Delley), FPLO (Eschrig et al.), PLATO (Horsfield et al.), PAOs (Siesta, Conquest, OpenMX², Fireball, ABACUS, ...)



$$arphi_{i[lm]}(oldsymbol{r}) = rac{u_i(r)}{r} \cdot Y_{lm}(\Omega)$$

• $u_i(r)$: Flexible choice - "Anything you like."

Many popular implementations: DMol³ (Delley), FPLO (Eschrig et al.), PLATO (Horsfield et al.), PAOs (Siesta, Conquest, OpenMX², Fireball, ABACUS, ...)



... and straightforward to substitute scalar- or fully-relativistic analogues

$$arphi_{i[lm]}(oldsymbol{r}) = rac{u_i(r)}{r} \cdot Y_{lm}(\Omega)$$

• $u_i(r)$: Flexible choice - "Anything you like."

<u>Many popular implementations:</u> DMol³ (Delley), FPLO (Eschrig et *al.*), PLATO (Horsfield *et al.*), PAOs (Siesta, Conquest, OpenMX², Fireball, ABACUS, ...)

- → Localized; "naturally" all-electron
- → The choice of <u>efficient</u> and of <u>enough</u> radial functions is obviously important
- → We have a "basis set library" list of basis functions for all elements (1-102), from fast qualitative to meV-converged total energies (LDA/GGA/ mGGA/hybrid DFA's)

V. Blum, R. Gehrke, F. Hanke, P. Havu, V. Havu, X. Ren, K. Reuter and M. Scheffler, "Ab Initio Molecular Simulations with Numeric Atom-Centered Orbitals", Computer Physics Communications **180**, 2175-2196 (2009)



Precision in Community Wide Benchmark - "Delta Test"

Reproducibility in Density-Functional Calculations of Solids, K. Lejaeghere, ... 68 coauthors! ..., S. Cottenier, Science 351, aad3000 (2016). <u>https://molmod.ugent.be/deltacodesdft</u>

E(V) for 71 elemental solids - 15 codes, all-electron & 40 pseudopot'l sets



Precision in Community Wide Benchmark - "Delta Test"

Reproducibility in Density-Functional Calculations of Solids, K. Lejaeghere, ... 68 coauthors! ..., S. Cottenier, Science 351, aad3000 (2016). <u>https://molmod.ugent.be/deltacodesdft</u>

E(V) for 71 elemental solids - 15 codes, all-electron & 40 pseudopot'l sets

FHI-aims: Test carried out independently by Dr. Marcin Dulak, DTU (Copenhagen)



Precision in Community Wide Benchmark - "Delta Test"

Reproducibility in Density-Functional Calculations of Solids, K. Lejaeghere, ... 68 coauthors! ..., S. Cottenier, Science **351**, aad3000 (2016). <u>https://molmod.ugent.be/deltacodesdft</u>

E(V) for 71 elemental solids - 15 codes, all-electron & 40 pseudopot'l sets

Code	Basis	Electron treatment	Delta (meV)
Wien2k 13.1	LAPW/APW+lo	All-electron	0
FHI-aims 081213*	NAO, tier2	All-electron (scalar rel. atomic ZORA)	0.2
Exciting (dev.)	LAPW+xlo	All-electron	0.2
Quantum Espresso 5.1	plane waves	SSSP accuracy (mixed NC/US/PAW library)	0.3
VASP 5.2.12	plane waves	PAW 2015	0.3
FHI-aims 081213*	NAO, tier2	All-electron (scalar rel., scaled ZORA)	0.3
ELK 3.1.5	APW+lo	All-electron	0.3
			*Populto: Marcin

. . .

*Results: Marcin Dulak, DTU (Copenhagen)

Example - Bi-Doping of Layered HOIS, Hybrid DFT

Predicted Observable High-precision atomic structure, energies and energy differences Energy band structures for large, complex systems









MAX-PLANCK-GESELLSCHAFT

Example - Bi-Doping of Layered HOIS, Hybrid DFT











MAX-PLANCK-GESELLSCHAF

Example - Bi-Doping of Layered HOIS, Hybrid DFT



MAX-PLANCK-GESELLSCHAFT

This Calculation Was Not Cheap ... But Valuable

Example: Bi-doped (PEA)₂Pbl₄ I,504 atoms HSE06+SOC, all-electron High precision no tricks!



Dr.Yi Yao



Gabrielle Koknat





Stampede2 Supercomputer - 18 PFlop/s NSF XSEDE / Texas Advanced Computing Center No. 35, Top500 List of Supercomputers, June 2021

> Extreme Science and Engineering Discovery Environment

This computation: 216 compute nodes (out of ~6,000 total), ~4 hours

Drastically optimized hybrid DFT implementation (2020-22): F. Merz (Lenovo), M. Rampp (Max Planck Computing and Data Facility, Munich) S. Kokott, C. Carbogno, M. Scheffler (Fritz Haber Institute, Berlin) Y.Yao, V. Blum (Duke University)

The Other Parallelism - Split Communicators

FHI-aims is a subroutine call, which can work cleanly with split MP communicators

```
program multi_aims
[...]
call initialize_mpi()
[...]
call MPI_Comm_split(mpi_comm_global,sub_class,sub_id,mpi_comm_subtask,ierr)
[...]
mpi_comm_global = mpi_comm_subtask
myid = sub_id
n_tasks = sub_tasks
[...]
call change_directory(subfolder)
[...]
 if (myid == 0) then
   call aims(mpi_comm_global,myunit,use_mpi)
 else
   call aims(mpi_comm_global,6,use_mpi)
 end if
[...]
 call MPI_Comm_free(mpi_comm_subtask,ierr)
[...]
call finalize_mpi()
```

8,192 Full Geometry Relaxations, Split MPI Communicator

RESEARCH ARTICLE

ADVANCED OPTICAL MATERIALS www.advopticalmat.de

Chiral Perovskite Nanoplatelets with Tunable Circularly Polarized Luminescence in the Strong Confinement Regime

Qinxuan Cao, Ruyi Song, Christopher C. S. Chan, Zhiyu Wang, Pui Ying Wong, Kam Sing Wong, Volker Blum,* and Haipeng Lu*

Adv. Optical Mater. 2023, 2203125 - DOI: 10.1002/adom.202203125

4,096 monolayer flake conformations + 4,096 bilayer flake conformations. 106 atoms & 116 atoms each, periodic slabs Full relaxation, DFT-PBE+TS, light settings, Perlmutter, batches of 1,024 structures each



 \rightarrow 5 low-energy models: spin-orbit coupled band structures, spin texture calculations.



Typical Scaling - $O(N^3)$ Wall



<u>Generic</u> problem for any Kohn-Sham DFT code ... solution strategies?

ELSI - Infrastructure for High-Performance "Solvers"

<u>Nucleus</u>: Emilio Artacho, 2014: "Dear all, There will be a workshop in CECAM at Lausanne ... aiming to kick-start an electronic structure library. ... I hope you are interested"

ELSI - Infrastructure for High-Performance "Solvers"

<u>Nucleus</u>: Emilio Artacho, 2014: "Dear all, There will be a workshop in CECAM at Lausanne ... aiming to kick-start an electronic structure library. ... I hope you are interested"

Electronic Structure Library:



Micael Oliveira, Yann Pouillon, Fabiano Corsetti, Nick Papior, Alin Elena, Martin Lüders, Damien Caliste, many more. https://esl.cecam.org https://gitlab.com/ElectronicStructureLibrary

ELSI - Infrastructure for High-Performance "Solvers"

<u>Nucleus</u>: Emilio Artacho, 2014: "Dear all, There will be a workshop in CECAM at Lausanne ... aiming to kick-start an electronic structure library. ... I hope you are interested"

Electronic Structure Library:



Micael Oliveira, Yann Pouillon, Fabiano Corsetti, Nick Papior, Alin Elena, Martin Lüders, Damien Caliste, many more. https://esl.cecam.org https://gitlab.com/ElectronicStructureLibrary

<u>Electronic Structure Infrastructure (ELSI): NSF-SI2 - ACI-1450280:</u> Volker Blum, Jianfeng Lu, Lin Lin, Chao Yang, Alvaro Vazquez-Mayagoitia, Fabiano Corsetti

Why ELSI Works:









Victor Yu Yingzhou Will Huhn Jonathan (now ANL) Li (Duke) (now ANL) Moussa (MolSSI)



Yi Yao Ruyi Song (Duke) (Duke)



Many Scalable Solution to Kohn-Sham Problem

$$\underline{\underline{h}}\,\underline{\underline{c}}_k = \epsilon_k\,\underline{\underline{s}}\,\underline{\underline{c}}_k$$

Different use cases (basis sets, physics), different "solvers". Solve (eigenvectors, $O(N^3)$) or circumvent (density matrix)?

Many Scalable Solution to Kohn-Sham Problem

$$\underline{\underline{h}} \, \underline{\underline{c}}_k = \epsilon_k \, \underline{\underline{s}} \, \underline{\underline{c}}_k$$

Different use cases (basis sets, physics), different "solvers". Solve (eigenvectors, $O(N^3)$) or circumvent (density matrix)?



General

N_{basis} >> N_{ev}

Nonmetallic systems

can depend on XC



ELSI: Connecting Electronic Structure Codes and Solvers



ELSI: Connecting Electronic Structure Codes and Solvers



- Designed for rapid integration into a variety of electronic structure codes
- Compatible with common workflows
 - Single self-consistent field (SCF)
 - Multiple SCF cycles (geometry relaxation or molecular dynamics)
- Supports density matrix solvers and eigensolvers on equal footing
- Technical settings adjustable for experienced users
- Object-oriented: Concurrent instances
 - python interface (elsipy)

<u>Currently supported "solvers":</u>

- Lapack
- ELPA
- EigenExa
- MAGMA
- PEXSI
- NTPoly
- libOMM
- SLEPc-SIPS
- BSEPACK
- ChaSE E. de Napoli et al.

Distributed-Parallel GPU Solver: ELPA2-GPU

V.W.-z.Yu, J. Moussa, P. Kůs, A. Marek, P. Messmer, M.Yoon, H. Lederer, V. Blum, Comp. Phys. Commun. 262, 107808 (2021).





Approach:

- cuBLAS / CUDA / MPI (all cores/node, no OpenMP)
- cuBLAS offloading wherever possible
- NVidia Multi-Process Service (MPS); data transfer, computation overlapped
- New (rewritten) CUDA kernel for tridiagonal-to-banded back transformation
 - $(\boldsymbol{I} \tau \boldsymbol{v} \boldsymbol{v}^*) \boldsymbol{x} = \boldsymbol{x} \tau \boldsymbol{v} (\boldsymbol{v}^* \boldsymbol{x}).$



Fig. 4. Workflow of the Householder transformation CUDA kernel. The semi-bandwidth is b = 4. Four Householder transformations are applied to the local eigenvector matrix with $N_R = 7$ rows and $N_C = 6$ columns. As indicated by the block index (blockIdx.x) and thread index (threadIdx.x), a CUDA block works on a column of the eigenvector matrix, while a thread within a block works on a single element. From the *n*-th iteration to the (n - 1)-th iteration, the work set of the eigenvector matrix is shifted upward by one element.

Victor Yu (now ANL)

Jonathan Moussa (MoISSI)

Distributed-Parallel GPU Solver: ELPA2-GPU

V.W.-z.Yu, J. Moussa, P. Kůs, A. Marek, P. Messmer, M.Yoon, H. Lederer, V. Blum, Comp. Phys. Commun. 262, 107808 (2021).

Kus et al., 2019: GPU port of ELPA1 - however, 2-stage solver approach not efficient?

2-stage symmetric band reduction:



... in past, expected to scale to larger core / MPI rank counts than ELPA1. ... competitive advantage if M eigenpairs < N (dimension) sought.

Net Result: Speedup, Extended Scaling by ELPA2-GPU



FHI-aims+ELSI Coupled with Google TPUs



J. Chem. Theory Comput. 2023, 19, 1, 25-32

pubs.acs.org/JCTC

Letter

Large Scale Quantum Chemistry with Tensor Processing Units

Ryan Pederson,* John Kozlowski, Ruyi Song, Jackson Beall, Martin Ganahl, Markus Hauru, Adam G. M. Lewis, Yi Yao, Shrestha Basu Mallick, Volker Blum, and Guifre Vidal







Prototype: Disk transfer of ELSI CSC stored matrices

FHI-aims+ELSI Coupled with Google TPUs

J. Chem. Theory Comput. 2023, 19, 1, 25-32



 H_2O clusters up to 30,981 atoms





FIG. 4. Convergence trajectory of an end-to-end dynamic precision DFT calculation on a $(H_2O)_{10327}$ cluster. The absolute total energy differences between subsequent DFT iterations, i and i - 1, are plotted (top). The corresponding difference in real-space densities within the L¹ norm is plotted (bottom).

Solvers Aren't Everything - Far From Exact Theory for Large Systems



Experimental E_{a} (eV)

Experimental E_{q} (eV)

Localized "Resolution of Identity" (RI) for Two-Electron Terms

$$(ij|kl) = \int d^3r d^3r' \frac{\varphi_i(\boldsymbol{r})\varphi_j(\boldsymbol{r}')\varphi_k(\boldsymbol{r})\varphi_l(\boldsymbol{r}')}{|\boldsymbol{r}-\boldsymbol{r}'|}$$

$$arphi_i(m{r})arphi_j(m{r}) = \sum_{\mu} C^{\mu}_{ij} P_{\mu}(m{r})$$
 $C^{\mu}_{ij} = \sum_{
u} (ij|
u) V^{-1}_{
u\mu}$

Problem: Full RI-V delocalizes C across entire system

In FHI-aims: Ihrig, Wieferink, Zhang, Ropo, Ren, Rinke, Scheffler, Blum, New J. Phys. 17, 093020 (2015)

Localized "Resolution of Identity" (RI) for Two-Electron Terms

$$(ij|kl) = \int d^3r d^3r' \frac{\varphi_i(\boldsymbol{r})\varphi_j(\boldsymbol{r}')\varphi_k(\boldsymbol{r})\varphi_l(\boldsymbol{r}')}{|\boldsymbol{r}-\boldsymbol{r}'|}$$

$$arphi_i(m{r})arphi_j(m{r}) = \sum_{\mu} C^{\mu}_{ij} P_{\mu}(m{r})$$
 $C^{\mu}_{ij} = \sum_{
u} (ij|
u) V^{-1}_{
u\mu}$

Problem: Full RI-V delocalizes C across entire system

Solution: For each C_{ij}^{μ} , restrict μ only to atoms *I* and *J* at which *i* and *j* are centered.



In FHI-aims: Ihrig, Wieferink, Zhang, Ropo, Ren, Rinke, Scheffler, Blum, New J. Phys. 17, 093020 (2015)

Hybrid DFT in FHI-aims 2015

<u>Ihrig, Wieferink</u>, Zhang, Ropo, Ren, Rinke, Scheffler, Blum, New J. Phys. **17**, 093020 (2015) Levchenko, Ren, Wieferink, Rinke, Johanni, Blum, Scheffler, Comp. Phys. Commun. **192**, 60-69 (2015).



... proved incredibly useful, but not enough. Can we be faster, larger?

Hybrid DFT in FHI-aims 2023

Florian Merz¹, Andreas Marek², **Sebastian Kokott**³, Christian Carbogno³, Yi Yao^{3,5}, Mariana Rossi⁴, Markus Rampp², Matthias Scheffler³, and Volker Blum⁵

Charge Localization

Saline Liquide = Na⁺ + Cl⁻ + (H₂O)₃₆₀ PBE0(α =0.5), T=300K In green: Highest occ. state localized at Cl



Band Gaps/Defect Levels phenylethylammonium lead iodide $PEA_{64}(Pb_{29}Bi_2] |_{128}$ =1503 atoms HSE06 + pSOCHaipeng Lu, Gabrielle Koknat et al., submitted (2022)

Heriprocal Space

¹Lenovo HPC Innovation Center, Stuttgart ²Max Planck Computing and Data Facility, Garching ³The NOMAD Laboratory at the FHI-MPG and IRIS-HU, Berlin ⁴MPI for the Structure and Dynamics of Matter, Hamburg ⁵Duke University, Durham, North Carolina, USA



Code Improvements (Hard Work But Effective)

$$(ij|kl) = \int d^3r d^3r' rac{arphi_i(m{r})arphi_j(m{r}')arphi_k(m{r})arphi_l(m{r}')}{|m{r}-m{r}'|}$$

$$arphi_i(m{r})arphi_j(m{r}) = \sum_\mu C^\mu_{ij} P_\mu(m{r})$$

$$C^{\mu}_{ij} = \sum_{\nu} (ij|\nu) V^{-1}_{\nu\mu}$$

CPUs only!

- MPI-3 intra-node shared memory arrays
 - Facilitate data redistribution via one-sided MPI routines; e.g. Coulomb matrix
- Compression of the RI-coefficients; exploiting sparsity in real-space
 - Same screening mechanism as for Coulomb matrix (2015)
- Auto-tuning mechanism for blocking the data
 - Minimize communication, maximize memory/node usage
- Additional parallelization layers
 - Finer granulation on the level of basis functions (previously: on the level of atoms)
- Auto-tuning for an optimal workload balance

GaAs supercell, 512 atoms: HSE06, tight settings



Drastic Scalability Improvements*

GaAs supercells: HSE06, tight settings



*Not so simple. Our 2015 implementation had already seen some years of work by several very smart and focused individuals.











So Are We There Yet?

HSE06+SOC. No tricks.



Anonymous reviewer:

Lu, Koknat et al., submitted (2022).

"Finally, I actually worry that in some cases the supercell is not large enough despite its large number of atoms. In particular, for the Bi2 case shown in Fig. 3B, within the utilized supercell the Bi atoms are actually second-nearest neighbors with each other, likely indicating that the supercell is too small. A hint of this can be seen in Fig. 3D, which shows that the defect orbitals are not flat as expected but show some dispersion."

I'm not sure what to say.

So How About 3,383 Atoms.

Lu, Koknat et al., submitted (2023).

HSE06+SOC. Still no tricks.



Electronic structure of the (6x6)-Bi₂ \Box structure.

Summary





Efficient, scalable first-principles approach to structure, electron band structure, relativity in complex materials.

Significant investment in large scale eigenvalue / density matrix solver strategies. Library infrastructure for electronic structure theory.

Very large-scale hybrid DFT, now feasible.





Argonne

ALCF











XSEDE Extreme Science and Engineering Discovery Environment





Performance: Solver Benchmarks on Equal Footing



Victor Yu

http://www.nersc.gov/edison



Edison Cray XC30

Processor: Intel Ivy Bridge Interconnect: Cray Aries

5,586 compute nodes134,064 processing cores2.57 Petaflops

Cori-Haswell Cray XC40

Processor: Intel Haswell Interconnect: Cray Aries

2,388 compute nodes76,416 processing cores2.81 Petaflops

http://www.nersc.gov/cori



Cori-KNL Cray XC40

Processor: Intel Knights Landing Interconnect: Cray Aries

9,688 compute nodes658,784 processing cores29.5 Petaflops

Performance: Solver Benchmarks on Equal Footing



Example: FHI-aims Basis Sets - ELPA vs. PEXSI



<u>PEXSI: Semilocal DFT, $O(N) - O(N^2)$ for large systems</u>

Lin et al., Commun. Math. Sci. 7, 755 (2009); Lin et al., J. Phys.: Condens. Matter 25, 295501 (2013); Lin et al., J. Phys: Condens. Matter 26, 305503 (2014)

Performance: Solver Benchmarks on Equal Footing



Example: Siesta Basis Sets - ELPA vs. PEXSI



<u>PEXSI: Semilocal DFT, $O(N) - O(N^2)$ for large systems</u>

Lin et al., Commun. Math. Sci. 7, 755 (2009); Lin et al., J. Phys.: Condens. Matter 25, 295501 (2013); Lin et al., J. Phys: Condens. Matter 26, 305503 (2014)

Frozen Core Constrained Eigensolver in ELSI

diagonal

$$H = \begin{bmatrix} I_{cc} & I_{cv} \\ I_{vc} & I_{vv} \end{bmatrix}$$

$$S = \begin{bmatrix} S_{cc} & S_{cv} \\ S_{vc} & S_{vv} \end{bmatrix}$$

Frozen core approach - known for ~8 decades.

Fairly recent summary: Koepernik/Eschrig (1999)

Assume:

- I. H_{cc} diagonal (good assumption)
- 2. S_{cc} = identity
- $\mathbf{3}. \boldsymbol{H}_{\mathrm{vc}} = \boldsymbol{S}_{\mathrm{vc}} \boldsymbol{H}_{\mathrm{cc}},$
 - $H_{\rm cv} = H_{\rm cc} S_{\rm cv}.$

$$\tilde{\boldsymbol{H}}_{\rm vv} = \boldsymbol{L}_{\rm vv}^{-1} (\boldsymbol{H}_{\rm vv} - \boldsymbol{S}_{\rm vc} \boldsymbol{H}_{\rm cc} \boldsymbol{S}_{\rm cv}) (\boldsymbol{L}_{\rm vv}^*)^{-1}$$

 $egin{aligned} m{H}_{ ext{cc}}m{C}_{ ext{cc}} &= m{S}_{ ext{cc}}m{C}_{ ext{cc}}m{\Sigma}_{ ext{cc}}, \ m{ ilde{m{H}}}_{ ext{vv}}m{ ilde{m{C}}}_{ ext{vv}} &= m{ ilde{m{S}}}_{ ext{vv}}m{ ilde{m{C}}}_{ ext{vv}}m{\Sigma}_{ ext{vv}} \end{aligned}$

... separate core, valence problems; core diagonal.

Frozen Core Constrained Eigensolver in ELSI

V.W.-z.Yu, J. Moussa, V. Blum, J. Chem. Phys. 154, 224107 (2021).

<u>Problem</u>: ELPA hard to beat by lower scaling solvers below many 1,000s of atoms.Way out?

<u>FHI-aims code (also others)</u> - deliberately "all electron" (no shape approximation to potential; high precision)



Victor Yu Jo (now ANL) (

Jonathan Moussa (MoISSI)



Extended valence states, localized deep core states on equal footing

Advantage - no irrevocable approximations. However: Core states practically known.



Frozen Core Eigensolver: Speedup



Overall speedup, CsPbBr3 supercell (2,560 atoms)



V.W.-z.Yu, J. Moussa, V. Blum, J. Chem. Phys. 154, 224107 (2021).

Next Steps: Mixed Precision (Single-precision ELPA)



Self-Consistency: Frozen Core + Mixed Precision



Eigenvalue Problem(s) in Electronic Structure Theory



Dopant level, Bi/(PEA)₂PbI₄ I,504 atom supercell Hybrid DFT, FHI-aims code Stampede2 (NSF XSEDE) **Generalized Kohn-Sham Equations**

$$\begin{pmatrix} \hat{t} + \hat{v}_{KS}[n(r)] \end{pmatrix} |\psi_k\rangle = \epsilon_k |\psi_k\rangle$$

$$n(r) = \sum_k f_k |\psi_k(r)|^2 \checkmark$$

$$\psi_{k}(r) \approx \sum_{i} c_{ki} \varphi_{i}(r)$$
$$\underline{\underline{H}} \underline{\underline{C}}_{k} = \epsilon_{k} \underline{\underline{S}} \underline{\underline{C}}_{k}$$

N=33,000-40,000 basis functions M=13,698 electrons / eigenstates

Limited by Eigenvalue Problem