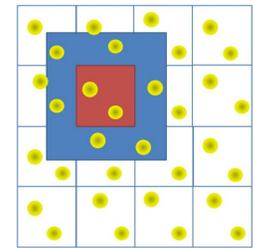


# Computational techniques for accelerating quantum molecular dynamics simulation of the solid electrolyte interface (SEI) in Li-ion batteries

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## Discontinuous Galerkin Method: Overview



Idea for discretization:

- Solve basis functions **adaptively** in the **local** domain
- Solve the **global** problem using the **Discontinuous Galerkin** method
- Results in **highly efficient, strictly local, systematically improvable, well conditioned** basis

$$E_{DG}(\{\psi_i\}) = \frac{1}{2} \sum_{i=1}^N \langle \nabla \psi_i, \nabla \psi_i \rangle_{\mathcal{T}} + \langle V_{\text{eff}}, \rho \rangle_{\mathcal{T}} + \sum_{i=1}^N \gamma_i \sum_{j=1}^N \langle (b_i, \psi_j)_{\mathcal{T}} \rangle^2 \quad \leftarrow \text{Kohn-Sham}$$

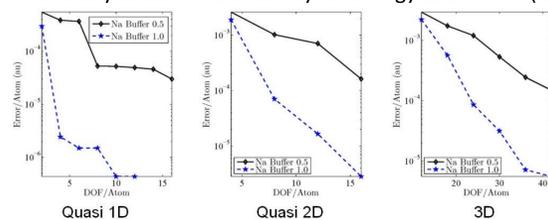
$$- \sum_{i=1}^N \langle \{ \{ \nabla \psi_i \} \} \cdot \{ \{ \psi_j \} \} \rangle_S + \frac{\alpha}{h} \sum_{i=1}^N \langle \{ \{ \psi_j \} \} \rangle_S \quad \leftarrow \text{New terms}$$

average and jump operators across surfaces  $S$ :

$$\{ \{ q \} \} = \frac{1}{2} (q_1 + q_2) \quad \text{on } S$$

$$[[ [u] ] ] = u_1 n_1 + u_2 n_2 \quad \text{on } S$$

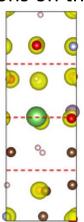
Previously established accuracy for energy calculation (for Na)



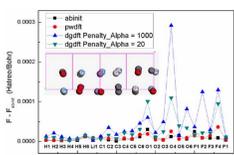
1e-3 Hartree/atom accuracy with **< 15** basis functions/atom

## Accuracy of Force; Pulay force

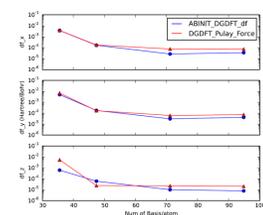
- Compare the accuracy of the Hellman-Feynman force to converged planewave reference (using ABINIT)
- Pulay force: force caused by the dependence of basis functions on the atomic positions



LiHCOFP-24



Accuracy of force,  $2e-4$  Hartree/Bohr with 15 ALB per atom

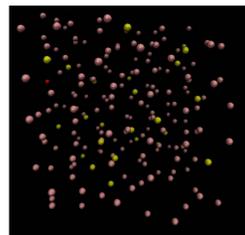


Disordered Si-216

Pulay force comparable to the total error of the force

1e-3 Hartree/Bohr accuracy with  $\sim 40$  basis functions/atom

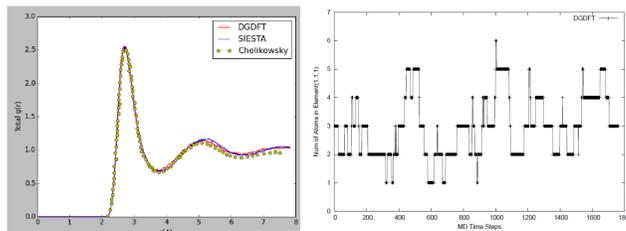
## Molecular Dynamics



Si<sub>0.12</sub>Al<sub>0.88</sub> alloy with 200 atoms

Parameters taken from [Ko-Chan-Kim-Chelikowsky, 2011]

- Temperature: 973K
- Nose-Hoover thermostat
- 51 basis per atom, 4x4x4 element partition
- $\Delta t = 2.4$  fs
- $E_{\text{cut}} = 10$  au
- Also compare with SIESTA.



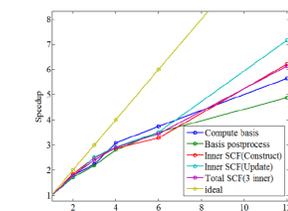
Total pair correlation function The number of atoms in the (1,1,1) element along the MD trajectory.

## OpenMP/MPI Parallelization

The **inter-element parallelization** has been done using MPI, with a rather general data structure for data communication and converting matrices to different formats (DG native, ScaLAPACK, PEXSI, Fourier, etc.)

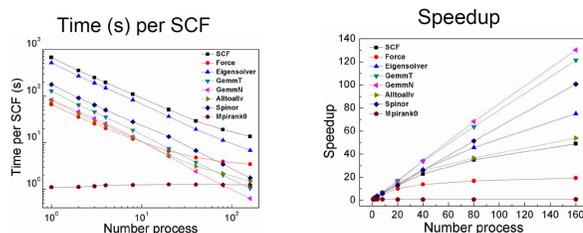
**Intra-element parallelization:** Reduce the computational time for generating the adaptive local basis functions in the local element, and the time for constructing the DG Hamiltonian matrix.

- OpenMP level (already used for MD simulation, etc.) Compatible with **next generation architecture**



Total SCF time reduced from **180.2** sec (OMP=1) to **29.4** sec (OMP=12)

- MPI level: Initial work for PWDFT: Can use more than 160 cores with **70 fold speedup** for generating the basis.



## A Posteriori Error Estimator

A posteriori error estimator:

- Measuring the accuracy of eigenvalues and densities without performing an expensive converged calculation, or benchmarking with another code.
- Optimal non-uniform allocation of basis functions for inhomogeneous systems.

$$\eta_{i,R,K}^2 = \gamma_1 (J_K) \left\| \left( -\frac{1}{2} \Delta + V_{\text{eff}} - \varepsilon_{i,J} \right) u_{i,J} \right\|_K^2 \quad \eta_{i,K}^2 = \eta_{i,R,K}^2 + \eta_{i,G,K}^2 + \eta_{i,V,K}^2$$

$$\eta_{i,G,K}^2 = \frac{1}{4} \sum_{F \subset \partial K} \gamma_2 (J_F) \left\| \llbracket \nabla u_{i,J} \rrbracket \right\|_F^2$$

$$\eta_{i,V,K}^2 = \frac{1}{4} \sum_{F \subset \partial K} \gamma_2 (J_F) \alpha^2 (J_F) \left\| \llbracket u_{i,J} \rrbracket \right\|_F^2 \quad \eta_i^2 = \sum_{K \in \mathcal{T}} \eta_{i,K}^2$$

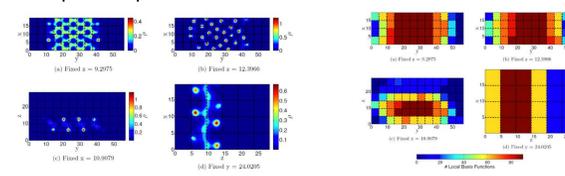
Measure the error in the energy norm

$$\|u\|_{E,\mathcal{T}}^2 := \sum_{K \in \mathcal{T}} \frac{1}{2} \|\nabla u_K\|^2 + \sum_{F \in \mathcal{S}} \alpha (J_F) \left\| \llbracket u \rrbracket \right\|_F^2$$

Under certain assumptions, we can show the reliability of the estimator ( $\xi_i, G_i$  are high order terms)

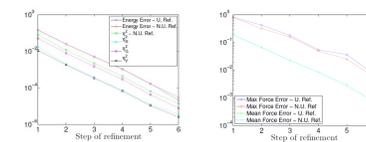
$$\|u_{i,J} - u_i\|_{E,\mathcal{T}} \lesssim \eta_i + (1 + \sqrt{\gamma_{1,J}}) \xi_i \quad |\lambda_i - \lambda_{i,J}| \lesssim \eta_i^2 + G_i$$

Example: Graphene oxide with 160 atoms



Non-uniform electron density

Adaptive refinement of basis

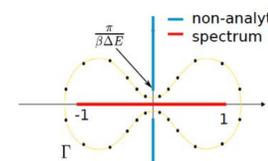


Non-uniform refinement improves the accuracy by orders of magnitude **without increasing** the number of basis functions.

## PEXSI

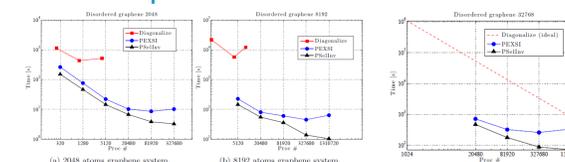
PEXSI: Pole **E**xpansion and **S**elective **I**nversion

**Accurate** evaluation of the electron density, energy, and atomic force with **at most  $O(N^2)$  scaling**.



$$\rho \approx \text{diag} \sum_{i=1}^Q \frac{\omega_i}{H - z_i I}$$

Two level parallelization



PEXSI applied to DG-generated graphene matrices.

## PEXSI

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Solving Kohn-Sham density functional theory II

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CGM interface

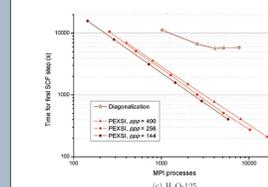
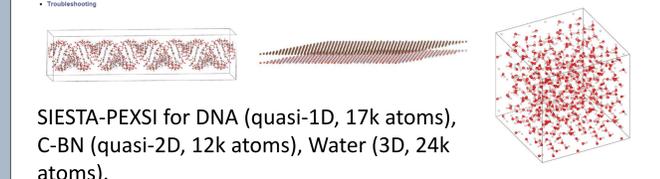
FORTRAN interface

Frequently asked questions

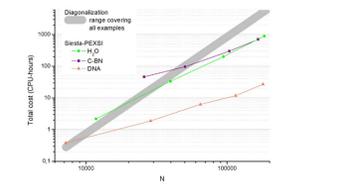
Translations

The PEXSI library:

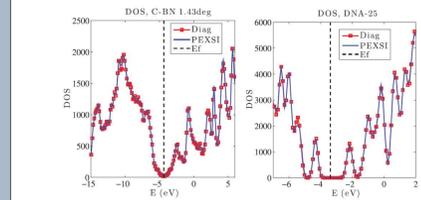
- Available online <http://pexsi.org/>
- BSD license
- Integrated with SIESTA for accelerating atomic-orbital based calculation
- Being integrated into CP2K and other electronic structure packages.
- Massively parallel to 10,000 – 100,000 processors on high performance computers



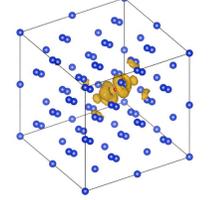
Wall clock time for water with 24K atoms



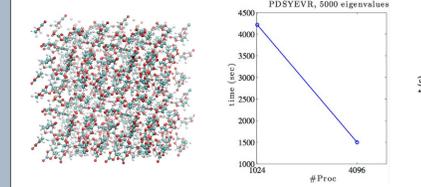
Total CPU work.



DOS generated from PEXSI is **nearly identical** to that obtained from diagonalization.

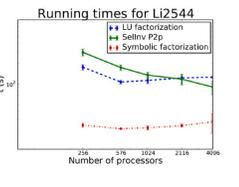


LDOS generated from PEXSI for SiH.



LiHCOFP-2544

Diagonalization time using pdsyevr



PEXSI time (per pole per  $\mu$  iteration)

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