# Space-Filling Curves for Real-Space Pseudopotential Density Functional Theory Calculations

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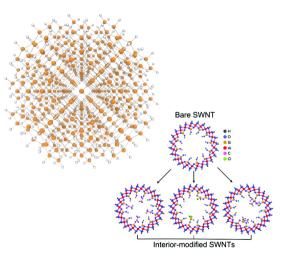
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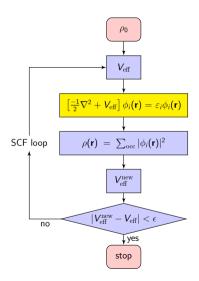
APS March Meeting (F19.4) March 16, 2021

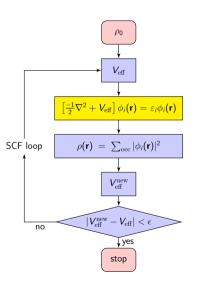


### Motivation – electronic structure of large systems

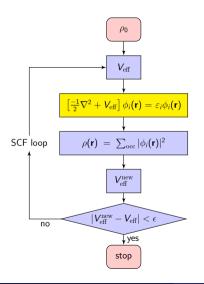
- Silicon nanocrystals
  - Optoelectronics
  - Quantum computers
  - 10 nm in diameter  $\sim$  20,000 atoms
- Nanotubes
  - Catalysis
  - Water desalination
  - ullet 20 nm in length  $\sim$  5,000 atoms







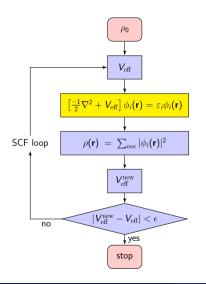
Key to large systems: An efficient eigensolver



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#### Observation

A converged charge density (rather than individual wfns) is enough to advance the SCF iteration



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#### Chebyshev-filtered subspace iteration

- Filtering
- Orthonormalization
- Rayleigh-Ritz refinement

### Chebyshev filtering requires many MatVecs

• H is not stored, accessed via Hv

H: Hamiltonian matrix

v: wave functions

• Cost  $\sim O(Nsm)$ 

N: number of grid points

s: number of states

m: degree of the filter

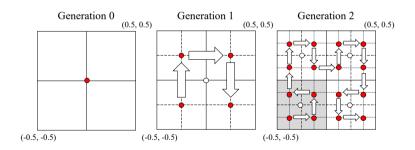
 Faster Hv → more efficient eigensolver :)

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Algorithm 1 Chebyshev filtering
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1: procedure W = \text{ChebyFilter}(H, V, m, \varepsilon_F, \lambda_{\text{ub}}, \lambda_{\text{lb}})
2: e = (\lambda_{\text{ub}} - \varepsilon_F)/2
3: c = (\lambda_{\text{ub}} + \varepsilon_F)/2
4: \sigma = e/(c - \lambda_{\text{lb}})
5: \tau = 2/\sigma
6: W = (HV - cV)(\sigma/e)
7: for i = 2 \rightarrow m do
8: \sigma_{new} = 1/(\tau - \sigma)
9: W_t = (HV - cV)(2\sigma_{\text{new}}/e) - (\sigma\sigma_{\text{new}})V
10: V = W
11: W = W_t
12: \sigma = \sigma_{\text{new}}
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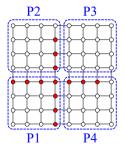
### Space-filling curves for faster Hv

- One-dimensional representation of multi-dimensional space
- Self-similarity
- We use Hilbert space-filling curves

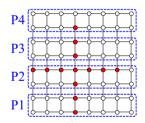


## Space-filling curves for real-space grid partitioning

- Good locality of grid points
  - Lower communication overhead
  - More load-balancing



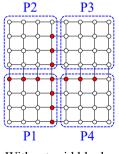
Partitioning using Hilbert curves



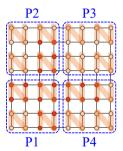
Partitioning using **simple** Cartesian ordering (SCO)

## Space-filling curves for real-space grid partitioning

- Use of grid blocks
  - Blockwise operations (vectorization)
  - More efficient indexing



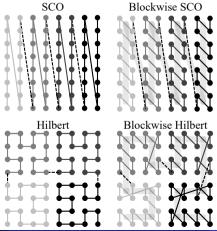
Without grid blocks



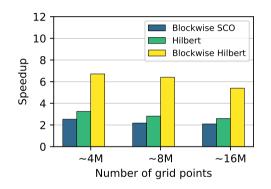
With grid blocks (blockwise)

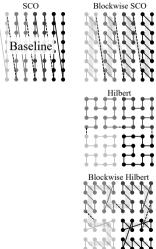
### Four grid partitioning schemes

- Hilbert ordering or simple Cartesian ordering (SCO)
- non-blockwise or blockwise



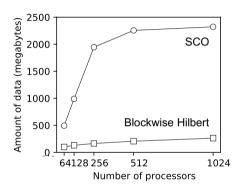
#### Results – speedup

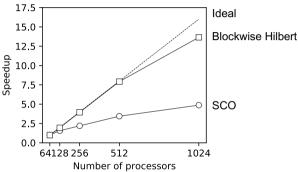




- Blockwise ops → improved vectorization
- ullet Hilbert curves o improved communication

### Results – scalability

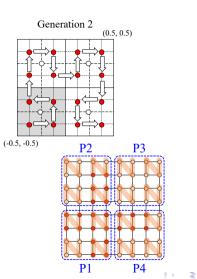




- Less data to transfer and more load-balancing
- Better scalability

### Summary

- Space-filling curves for real-space pseudopotential DFT calculations (e.g., PARSEC code)
  - Hilbert curves
  - Blockwise opertions
- Reduced communication between processors, increased opportunity for vectorization, and improved scalability of the filtering step



PARSEC (http://real-space.org/)

### Acknowledgements



Center for Computational Materials



Dr. Ariel Biller



U.S. DEPARTMENT OF ENERGY

Office of Science



National Energy Research Scientific Computing Center

