
Real-space finite difference method for $O(N)$ first-principles molecular dynamics with plane waves accuracy

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Outline

- **O(N) approach for real-space finite differences
Density Functional Theory**
- **Adaptive localization regions**
- **Accuracy**
- **Forces**
- **Molecular Dynamics**
- **Calculating unoccupied states**
- **Applications**

Ab initio electronic structure calculations

2 main categories of numerical approaches

- **Basis set made of atomic orbitals**
 - Assume solution of general problem can be well represented in such a basis
 - Usually expended in terms of Gaussians
 - Small number of degrees of freedom/electron
 - Hard to improve accuracy by basis set expansion
- **General numerical discretization**
 - No a priori assumption on solution
 - Plane Waves, Finite differences, Finite Elements,...
 - No bias
 - Large number of degrees of freedom/electron

O(N) algorithm for Density Functional Theory calculations

- DFT Energy functional formulated for general non-orthogonal orbitals [Galli and Parrinello, PRL, 1992]

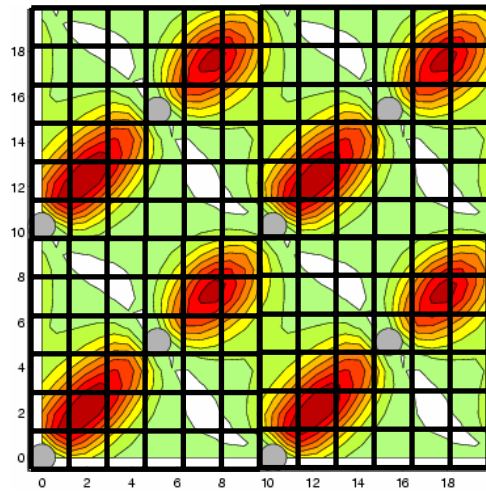
$$E_{KS} = \sum_{i,j=1}^N (S^{-1})_{ij} \int_{\Omega} \phi_i(r) \Delta \phi_j(r) + F[\rho] + \sum_{i,j=1}^N 2(S^{-1})_{ij} \int_{\Omega} \phi_i(r) (V_{ext} \phi_j)(r)$$

- Real-space discretization on uniform mesh: Mehrstellen (compact) Finite Difference, $O(h^4)$ [Briggs et al., PRB, 1996]
- Minimize Energy functional under **localization constraints for the wave-functions**: Iterative block algorithm based on steepest descent directions
 - Preconditioning: Multigrid [JLF and Bernholc, PRB (2000)]
 - Extrapolation scheme [D.G. Anderson, J. ACM 12 (1965)]
- Choose Localization regions large enough so that **truncation error < discretization error**

General method in picture...

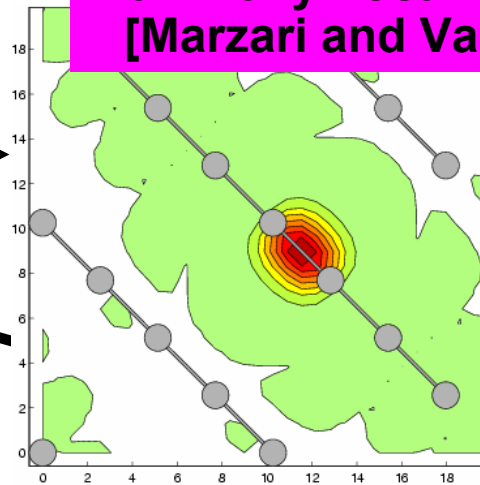
Example: silicon bulk, 64 atoms, Γ point, 128 occupied orbitals

Contour plots in 2D slice (atoms projections in grey)



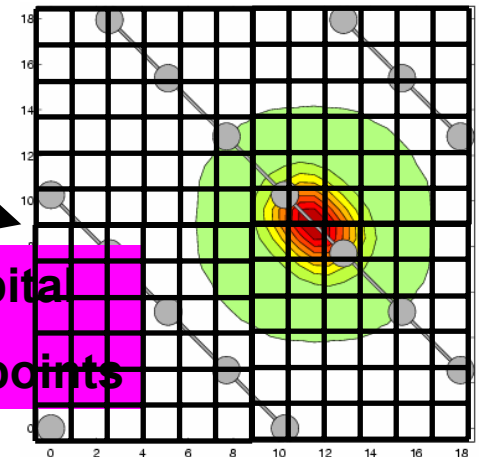
One eigenfunction

Maximally Localized Wannier function
[Marzari and Vanderbilt, PRB (1997)]



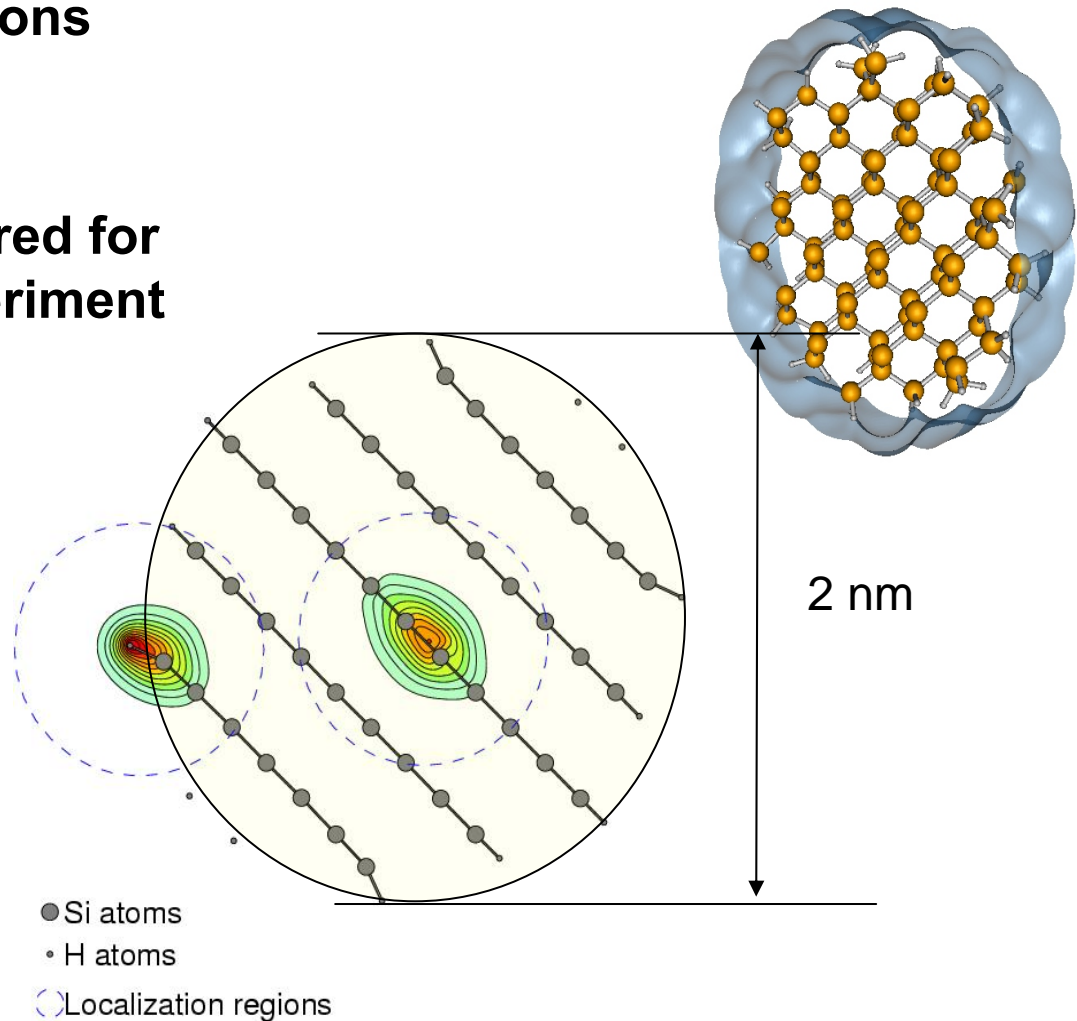
$$\phi_i = \sum_{j=1}^N c_{ij} \psi_j$$

Strictly localized orbital
Non-zero at O(1) grid points



Application: Silicon nanowires

- Plane Waves calculations
“possible” up to 3 nm
diameter only
- Larger diameter required for
comparison with experiment

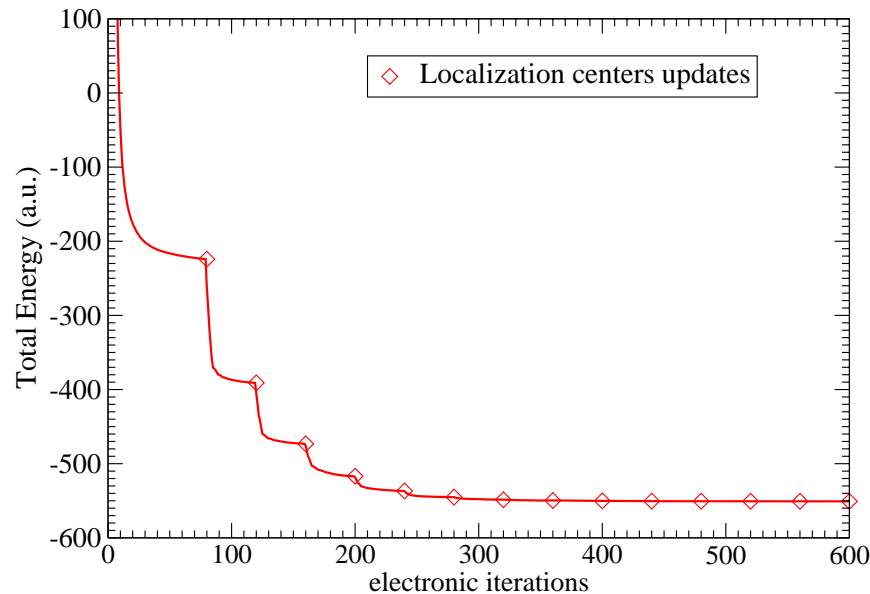


Adaptive Localization regions

- **How to define localization regions?**
 - Usual approach: a few orbitals centered on each atom
- **Adaptive Localization Centers (ALC)** to enhance accuracy and enable energy conserving microcanonical Molecular Dynamics
 - Localization regions are re-centered at charge center after every MD step
 - References: [JLF & F. Gygi, CPC 162 (2004), PRB (2006)]
- **Adapting Localization Region sizes to get accurate unoccupied/partially occupied states**

ALC algorithm convergence

- Disordered Deuterium, 992 atoms
- Start with LR centered on atoms
- Recenter Localization regions at charge center every 40 steps



Born-Oppenheimer molecular dynamics with ALC

- Evaluate center of charge of each localized orbital

$$Q_i^{(k-1)} = \langle \phi_i^{(k-1)} | X | \phi_i^{(k-1)} \rangle, \quad i = 1, \dots, N$$

- Define localization centers $Q_i^{(k)}$ by extrapolation from 2 previous steps:

$$Q_i^{(k)} = 2Q_i^{(k-1)} - Q_i^{(k-2)}, \quad i = 1, \dots, N$$

- Initialize trial orbitals by extrapolation from 2 previous steps:

$$\phi_i^{(k)} = 2\phi_i^{(k-1)} - \phi_i^{(k-2)}, \quad i = 1, \dots, N$$

- Optimize localized non-orthogonal orbital for LR centered at $Q_i^{(k)}$, $i=1, \dots, N$ until convergence criterion satisfied

- Move atoms according to Verlet scheme:

$$R_I^{(k+1)} = 2R_I^{(k)} - R_I^{(k-1)} + F_I^{(k)} (\Delta t)^2 / M_I$$

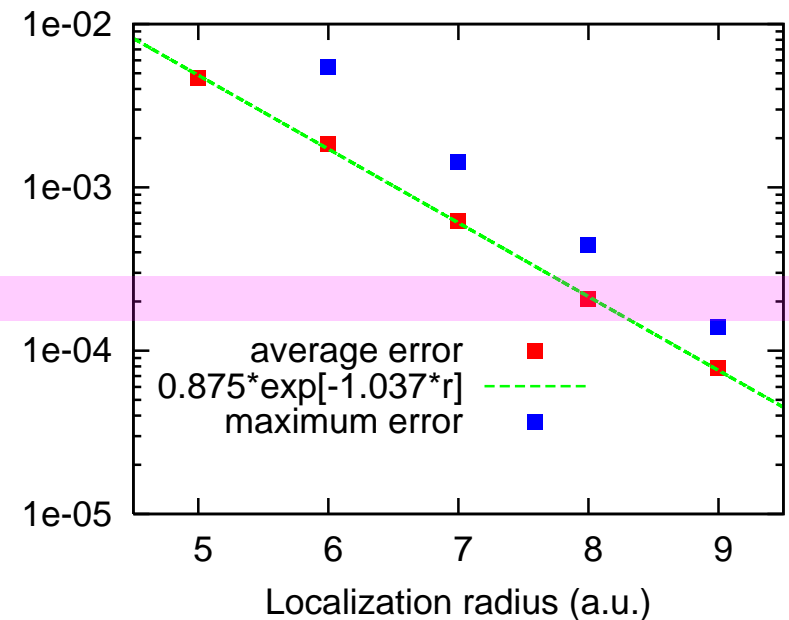
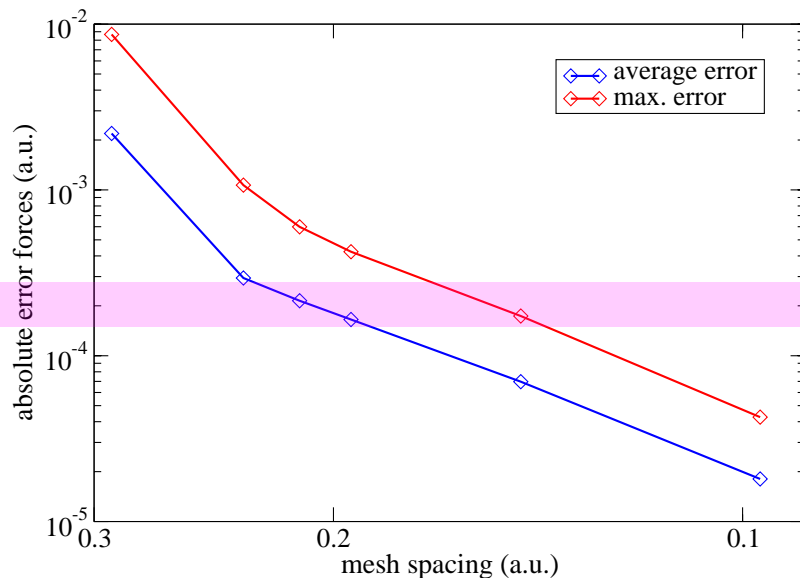
Forces computation

$$\frac{dE}{dR_{k,\alpha}} = \frac{\partial E}{\partial R_{k,\alpha}} + \sum_{j=1}^N \frac{\delta E}{\delta \phi_j} \frac{d\phi_j}{dR_{k,\alpha}} + \sum_{k=1}^N \sum_{\beta=1}^3 \frac{\delta E}{\delta Q_{k,\beta}} \frac{dQ_{k,\beta}}{dR_{k,\alpha}}$$

- **1st term: Same algorithm used for $O(N^3)$ calculations**
 - Compute energy for small virtual displacements (with frozen electronic wave functions)
 - Compute forces (derivatives) by Finite Differences
- **2nd term: vanishes for $Rc \rightarrow \infty$. Neglected and included in error**
- **3rd term: "Pulay-like", Q_k =localization center, not very sensitive to position: very flat energy surface. Neglected and included in error.**

Discretization vs. truncation (localization)

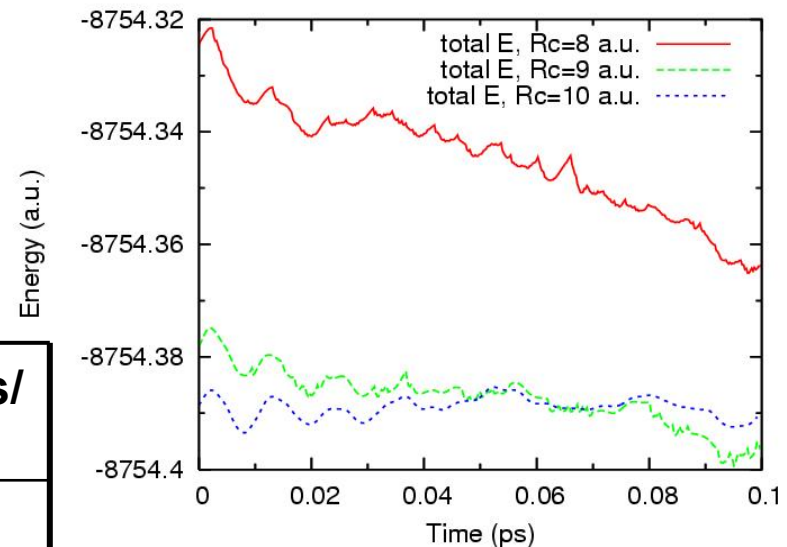
- Liquid water sample, 54 molecules



Molecular dynamics: liquid water, 512 molecules

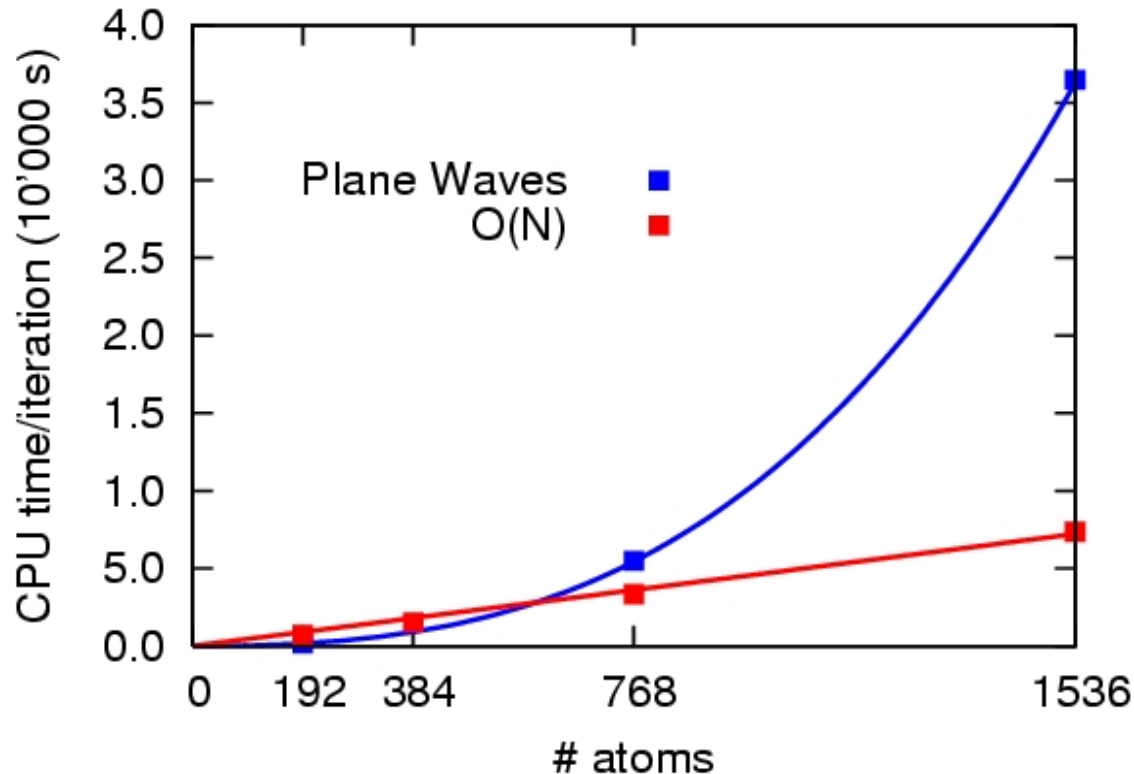
- Adaptive localization regions follow the dynamics: adapt localization center at each MD step
- Energy conservation is critical to avoid any bias due to numerical approximation

LR radius (Bohr)	Energy drift (K/ps)	# SC iterations/ MD step
8	-47	29
9	-22	23
10	$-1 < \dots < 1$	14



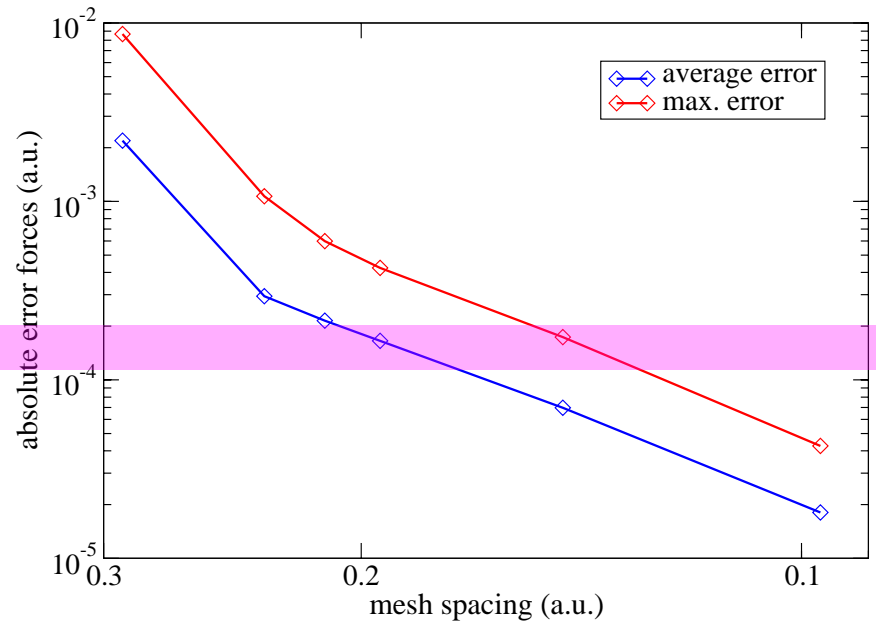
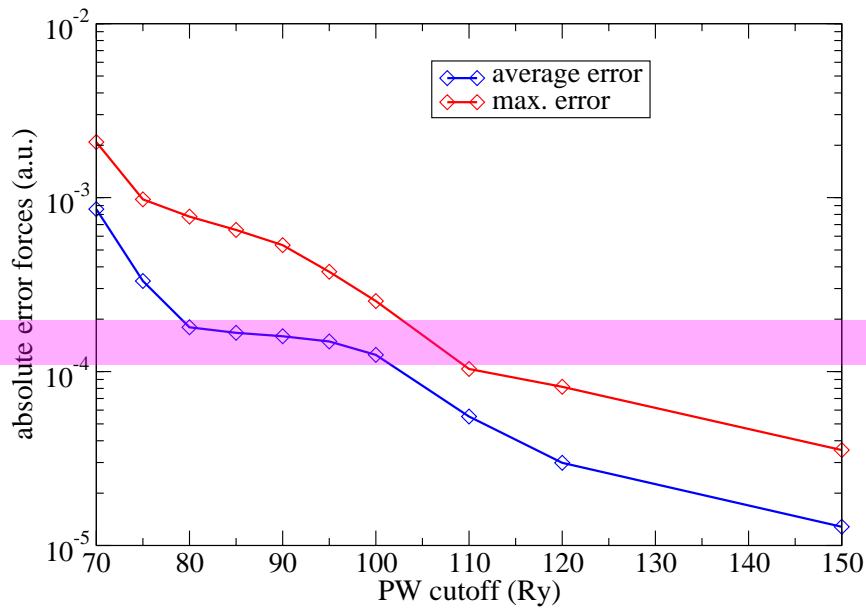
Effective linear scaling

- $O(N)$ scaling, liquid H_2O
- **Equivalent accuracy!**



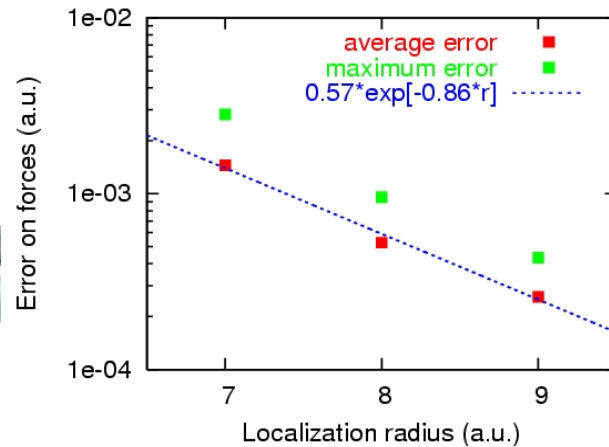
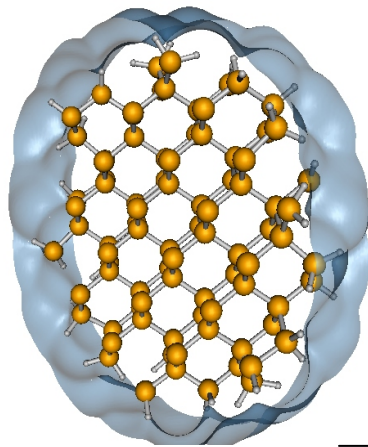
JLF & F. Gygi, Phys Rev B (2006)

Equivalent cutoff for Finite Difference



→ 80 Ry \sim h=0.2 Bohr

Application: Silicon nanowires

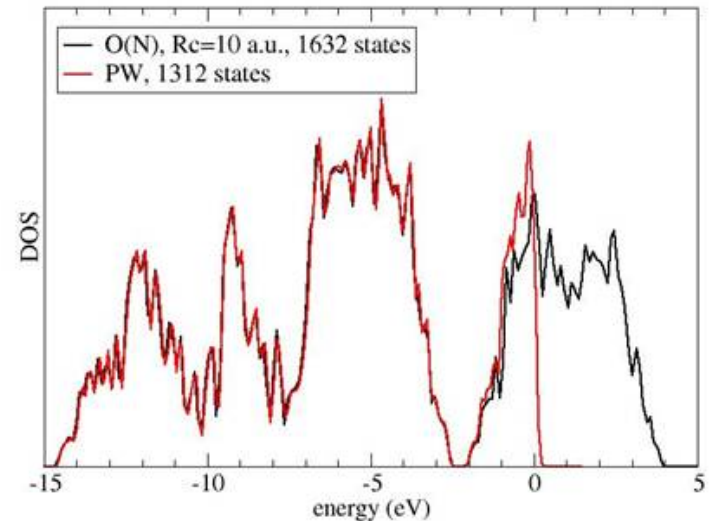
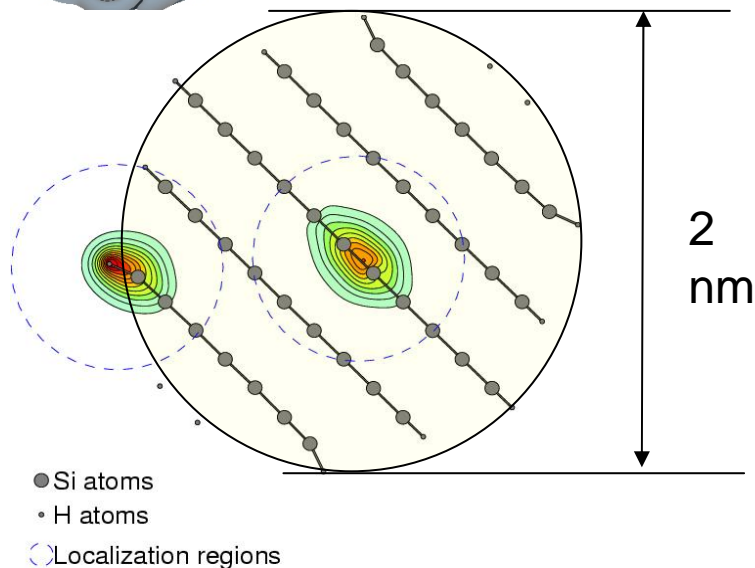


520 Si + 144 H

localization radius 10 a.u.

510 empty states

Comparison with Plane Waves

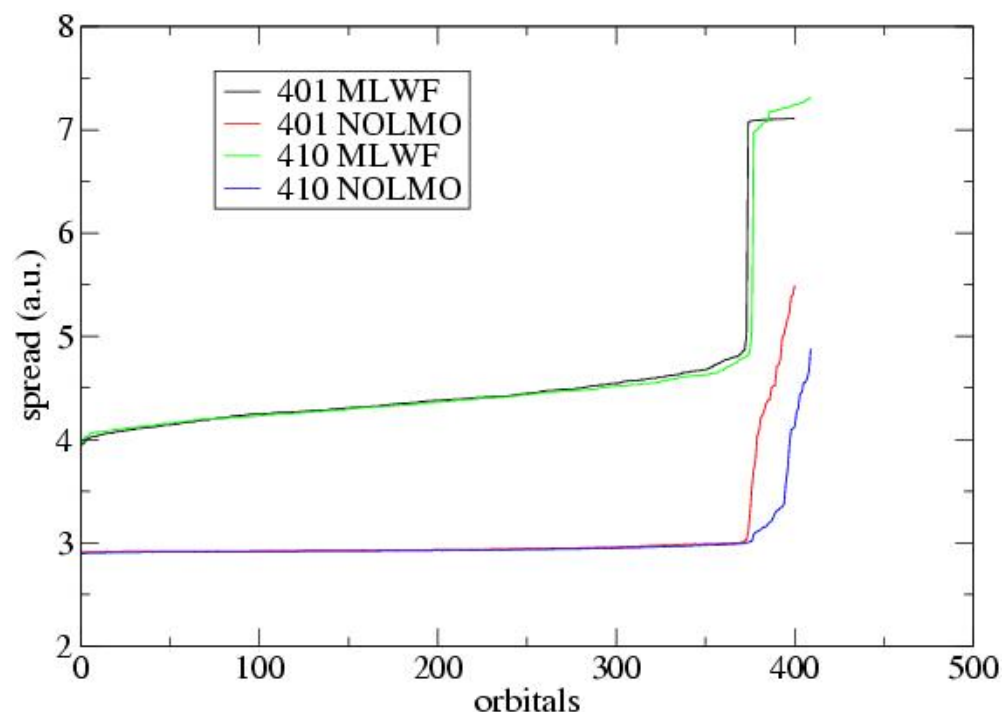


O(N) successes

- **O(N) works well when the system has a relatively large band gap**
- **A nice and well defined electronic structure representation in terms of Maximally Localized Wannier functions is available — We have a one-to-one mapping between Localization Regions and Maximally Localized Wannier functions**
- **Unoccupied Orbitals sometimes added to avoid local minimas or enhance accuracy (more degrees of freedom!)**

Computing unoccupied states accurately

- Sometimes we need information about unoccupied or partially occupied states — metals...
- They are likely to be less localized than the MLWF associated to covalent bonds

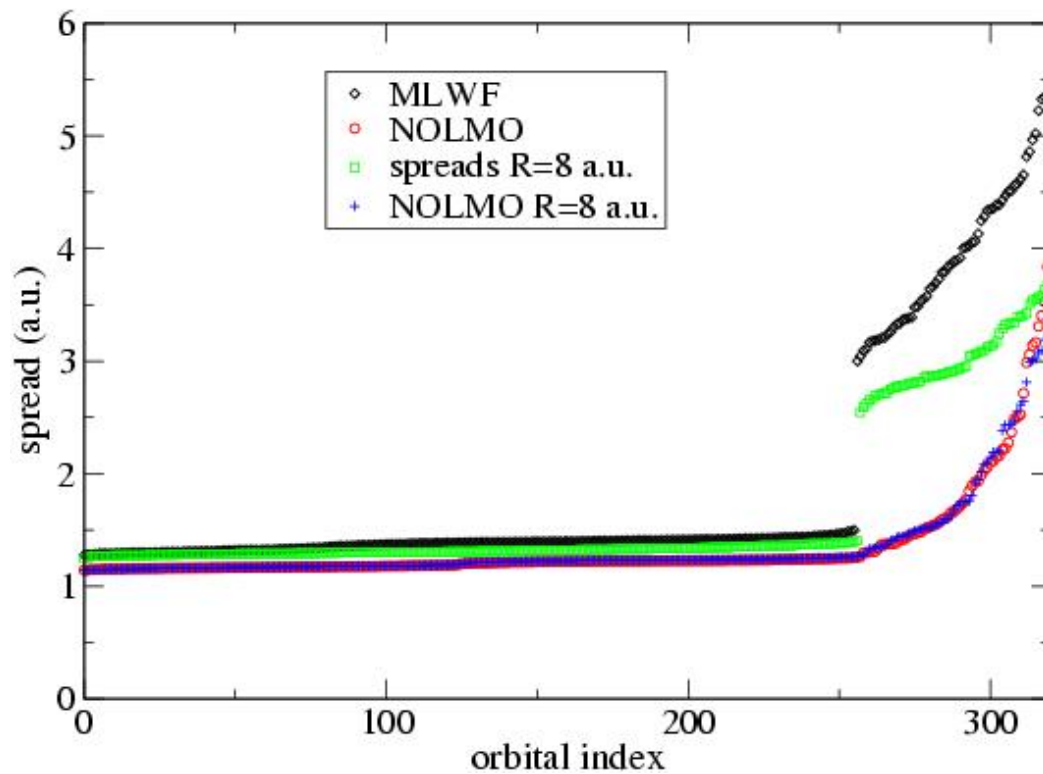


Al₂₅₆, Γ -point

MLWF: Maximally Localized Wannier Functions

NOLMO: Non-Orthogonal Localized Molecular Orbitals

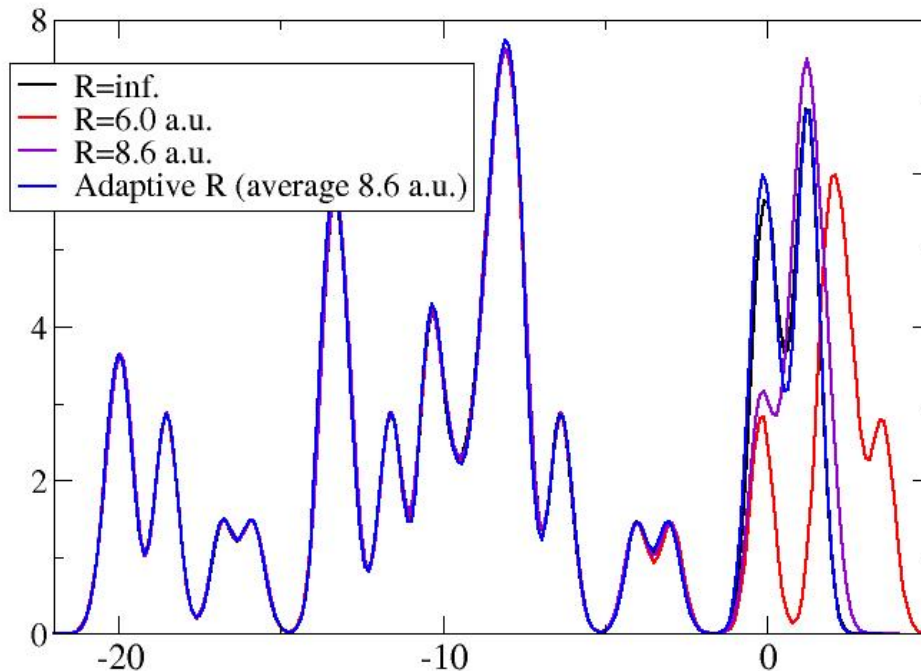
Orbitals Spreads: $(\text{H}_2\text{O})_{64}$



Algorithm for fully adaptive Localization Regions

- Start with a uniform localization radius
- Run a few iterations to get a reasonable ground state
- Evaluate individual spreads $\left\langle \phi_i \left| \left(X - \langle \phi_i | X | \phi_i \rangle \right)^2 \right| \phi_i \right\rangle^{1/2}$
- Rescale localization region radii s.t.
 - The radius of each region is proportional to the spread of each orbital
 - The total volume of all the localization regions is a fixed value V_0
 - We use the spreads of the Nonorthogonal Localized orbitals
 - linear combination of non-orthogonal orbitals that minimizes the total spread without orthogonality or localization constraint — to define V_0

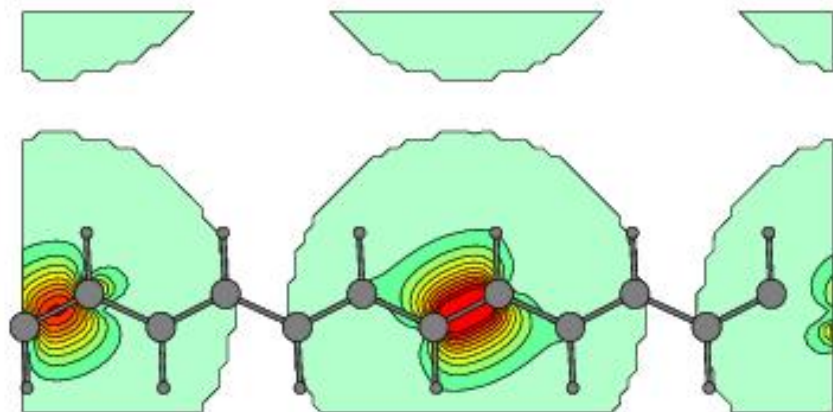
Density of States: example of polyacetylene



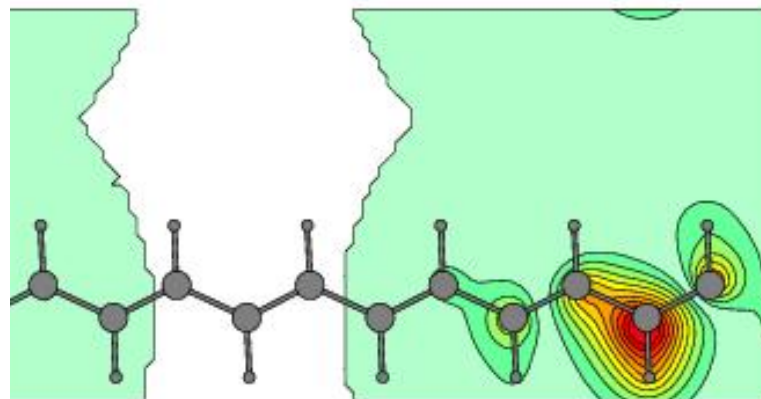
$C_{12}H_{12}$: 30 occupied states + 12 unoccupied states

Localized orbitals

2 localized orbitals with radius 6 a.u.



1 orbital with radius 10.6 a.u.



Concluding remarks

- **Finite Difference approach provides appropriate framework to achieve Plane waves accuracy and linear scaling using localized orbitals**
- **Flexible adaptive localization regions enables**
 - **Higher accuracy**
 - **Molecular dynamics**
 - **Calculation of excited states**

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