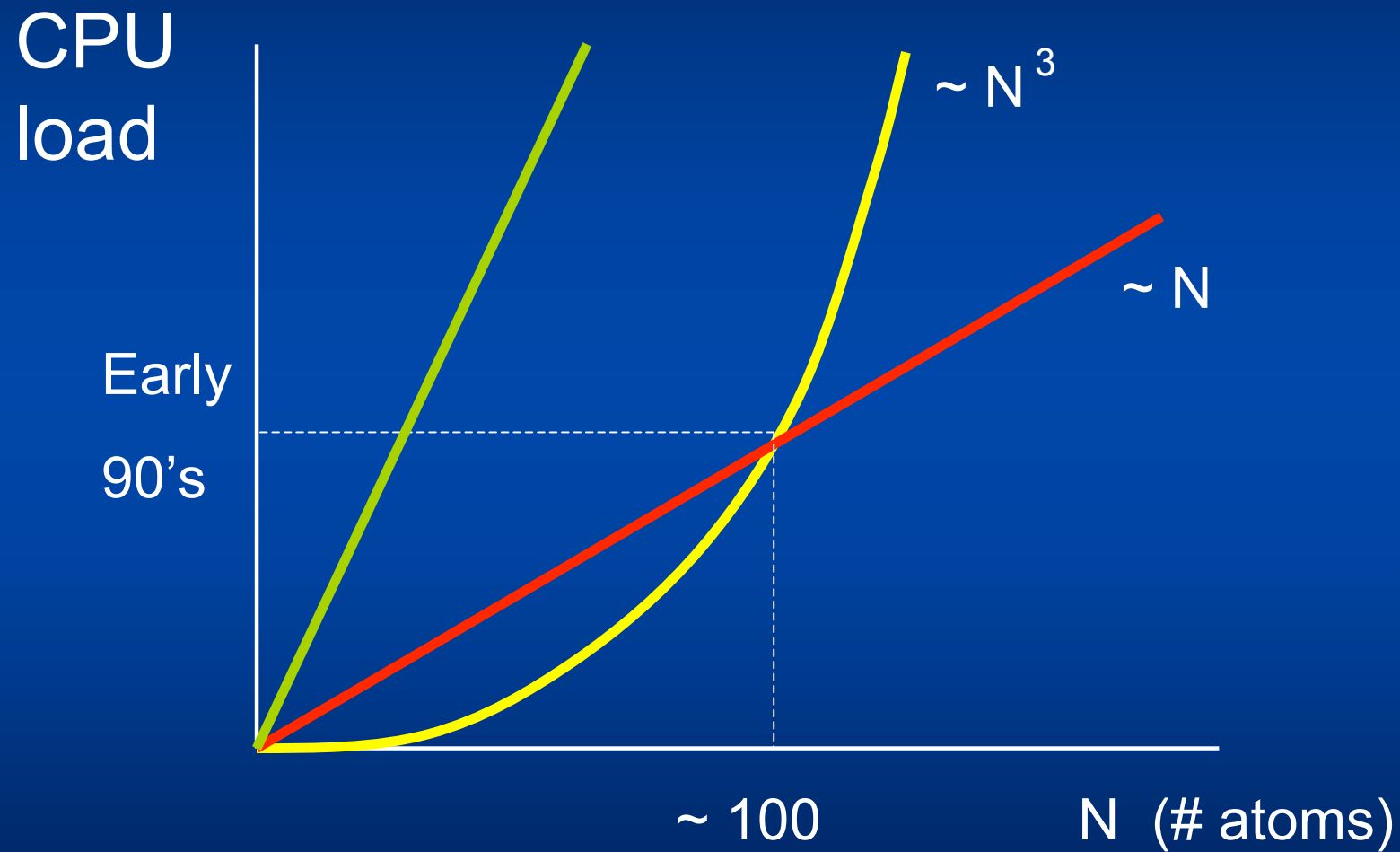


# ***Linear scaling solvers based on Wannier-like functions***

P. Ordejón

Institut de Ciència de Materials de Barcelona (CSIC)

# *Linear scaling = Order(N)*



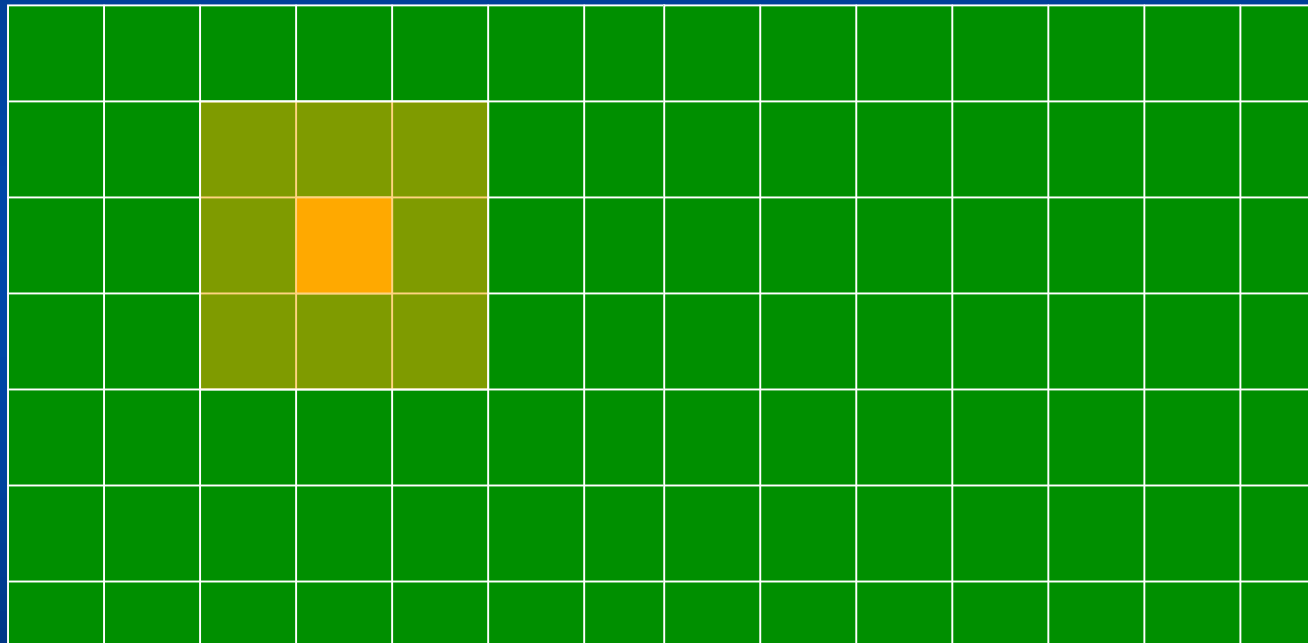
# *Order-N DFT*

1. Find density and hamiltonian (80% of code)
2. Find “eigenvectors” and energy (20% of code)
3. Iterate SCF loop

*Steps 1 and 3 spared in tight-binding schemes*

# *Key to $O(N)$ : locality*

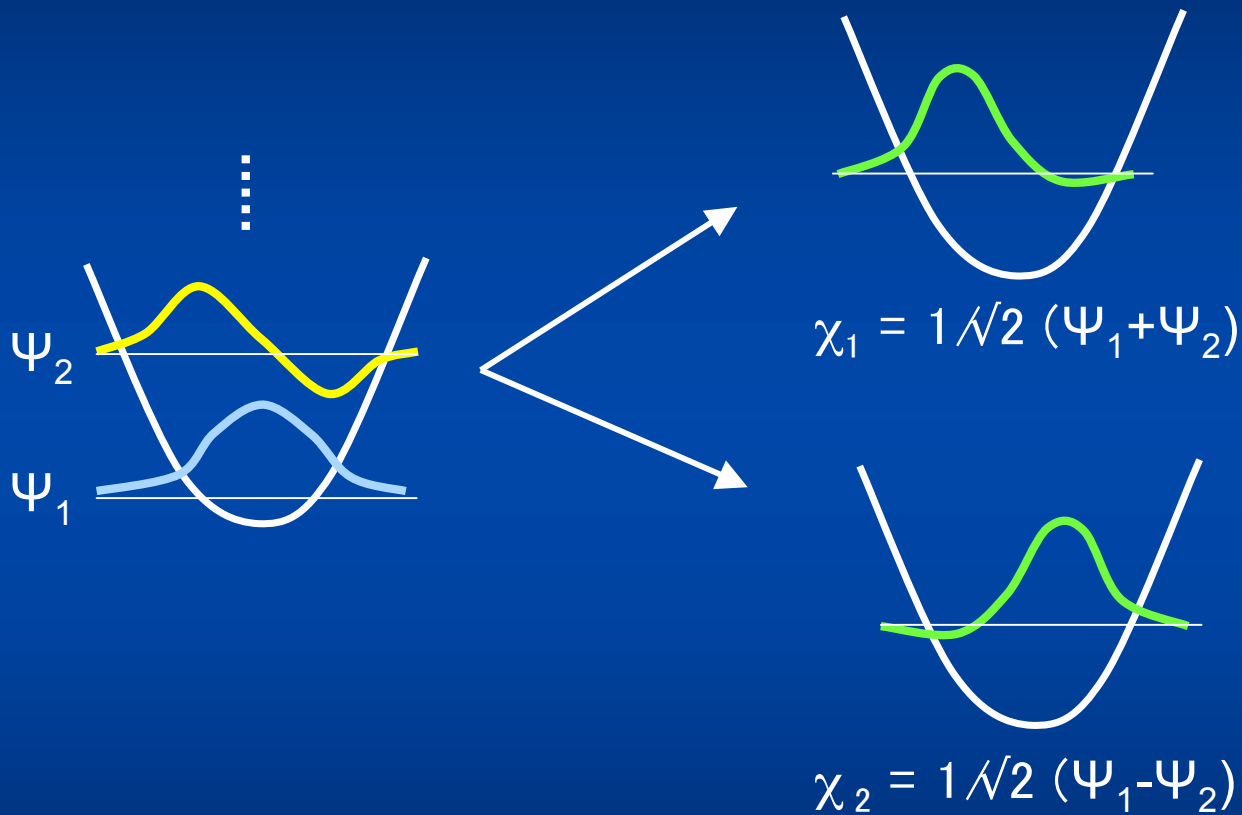
*Large system*



**“Divide and conquer”** W. Yang, *Phys. Rev. Lett.* 66, 1438 (1992)

**“Nearsightedness”** W. Kohn, *Phys. Rev. Lett.* 76, 3168 (1996)

# Locality of Wave Functions



Wannier functions (crystals)

Localized Molecular Orbitals (molecules)

# Locality of Wave Functions

Energy:

$$E = \langle \psi_1 | H | \psi_1 \rangle + \langle \psi_2 | H | \psi_2 \rangle = \text{Tr}_{occ} \mathbf{H}$$

Unitary Transformation:

$$| \psi_1 \rangle \leftarrow | \chi_1 \rangle$$

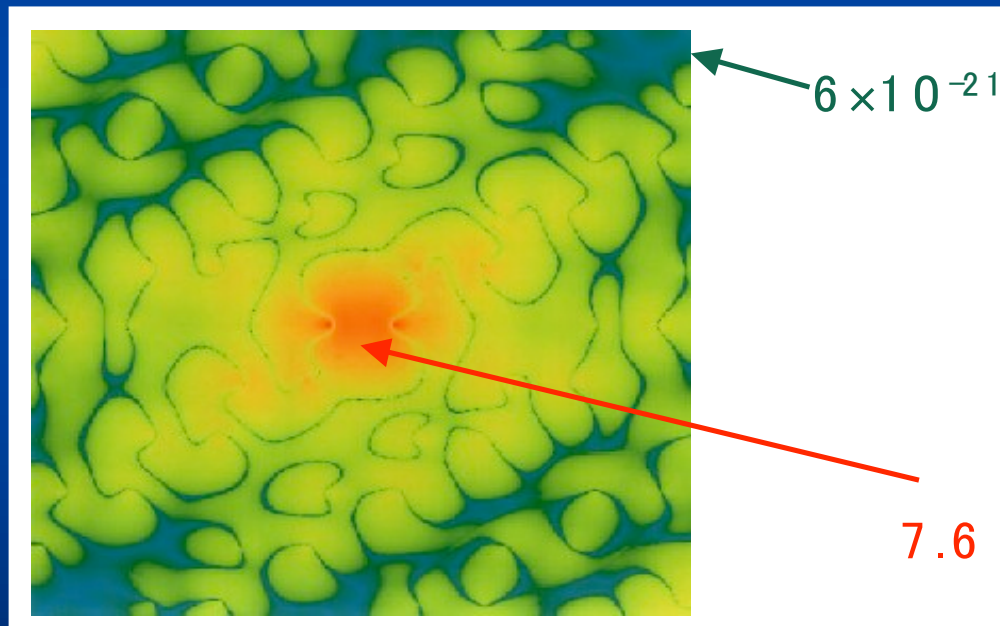
$$E = \text{Tr}_{occ} \mathbf{H} = \langle \chi_1 | H | \chi_1 \rangle + \langle \chi_2 | H | \chi_2 \rangle$$

We do NOT need eigenstates!

We can compute energy with Loc. Wavefuncs.

# *Locality of Wave Functions*

Exponential localization (insulators):

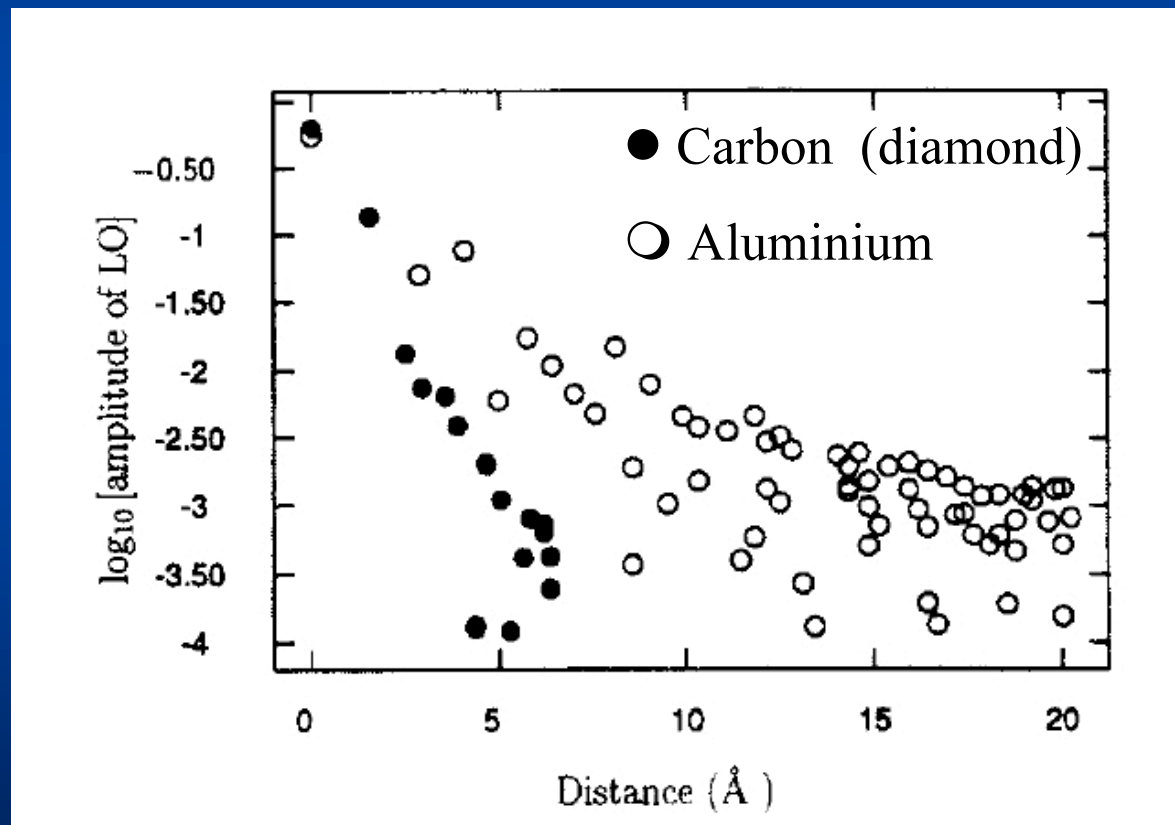


Wannier function in Carbon (diamond)

Drabold et al.

# Locality of Wave Functions

Insulators vs Metals:

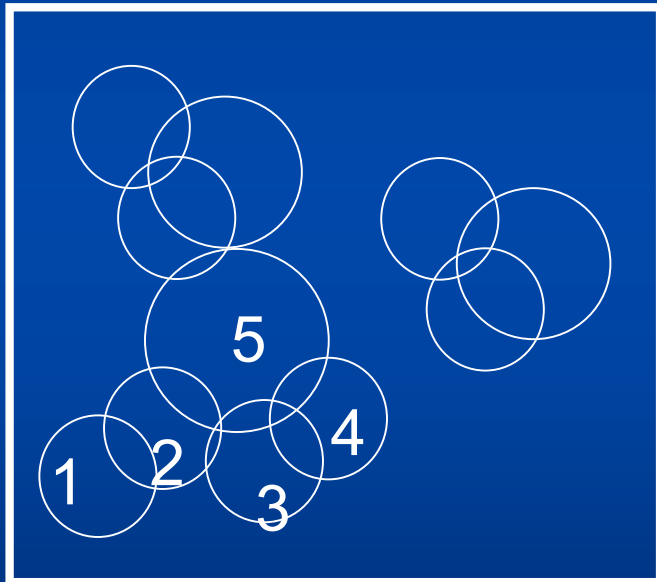


Goedecker & Teter, PRB 51, 9455 (1995)



# Linear Scaling

## Localization + Truncation



- Sparse Matrices

$$H_{ij} = \langle \mathbf{r}_i | H | \mathbf{r}_j \rangle$$

- Truncation errors

$$E_g \propto \frac{1}{\alpha}$$

In systems with a gap.  
Decay rate  $\alpha$  depends on gap  $E_g$

# *Linear Scaling Approaches*

**(Localized) object which is computed:**

- wave functions



- density matrix



**Approach to obtain the solution:**

- minimization

- projection

- spectral

**Reviews on  $O(N)$  Methods:** Goedecker, RMP '98

Ordejón, Comp. Mat. Sci.'98

# *Basis sets for linear-scaling DFT*

- *LCAO: - Gaussian based + QC machinery*

*M. Challacombe, G. Scuseria, M. Head-Gordon ...*

- Numerical atomic orbitals (NAO)*

*SIESTA*

*S. Kenny & A Horsfield (PLATO)*

*OpenMX*

- *Hybrid PW – Localized orbitals*

- Gaussians J. Hutter, M. Parrinello*

- “Localized PWs”*

*C. Skylaris, P. Haynes & M. Payne*

- *B-splines in 3D grid*

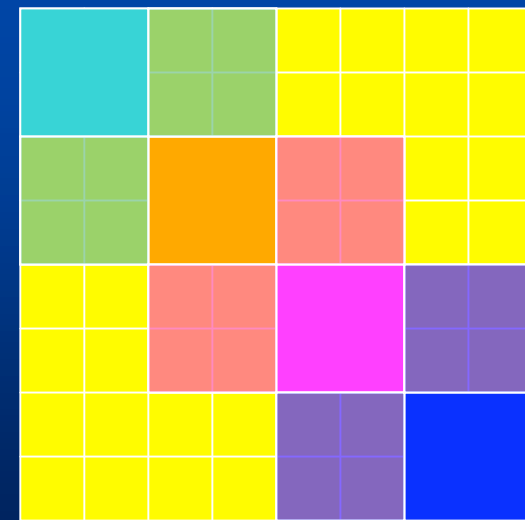
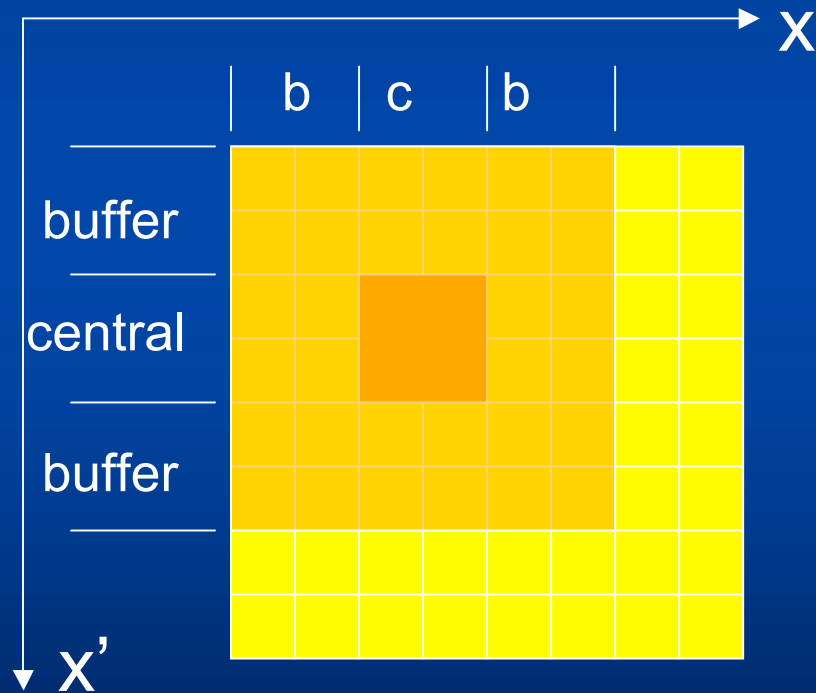
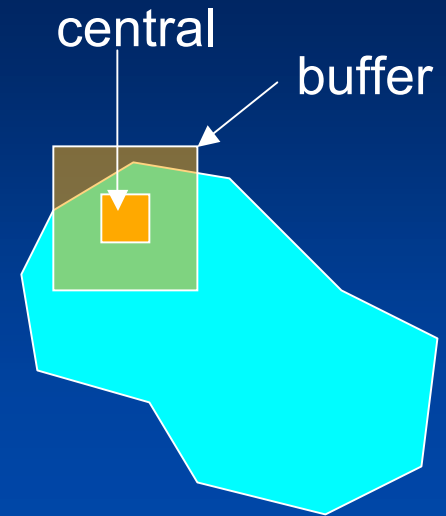
*D. Bowler & M. Gillan*

- *Finite-differences (nearly  $O(N)$ )*

*J. Bernholc*

# Divide and conquer

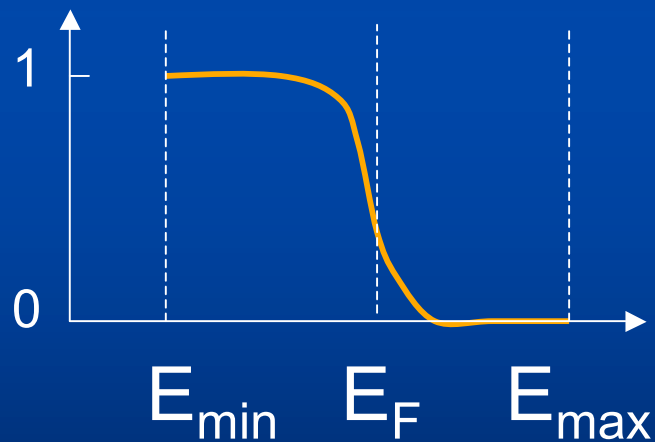
Weitao Yang (1992)



# Fermi operator/projector

Goedecker & Colombo (1994)

$$f(E) = 1/(1+e^{E/kT}) \approx \sum_n c_n E^n$$



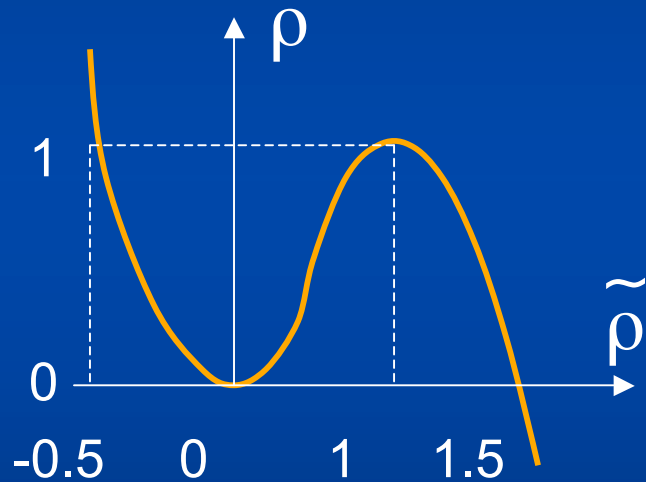
$$\hat{F} \approx \sum c_n \hat{H}^n$$

$$E_{\text{tot}} = \text{Tr}[\hat{F} \hat{H}]$$

$$N_{\text{tot}} = \text{Tr}[\hat{F}]$$

# Density matrix functional

Li, Nunes & Vanderbilt (1993)



$$\rho_{\mu\nu} = 3 \tilde{\rho}_{\mu\nu}^2 - 2 \tilde{\rho}_{\mu\nu}^3$$

$$E_{\text{tot}}(\tilde{\rho}_{\mu\nu}) = \sum_{\mu\nu} \rho_{\mu\nu} H_{\nu\mu} = \min$$

# Wannier $O(N)$ functional

- Mauri, Galli & Car, PRB 47, 9973 (1993)
- Ordejón et al, PRB 48, 14646 (1993)

$$S_{ij} = \langle \psi_i | \psi_j \rangle \quad | \psi'_k \rangle = \sum_j | \psi_j \rangle S_{jk}^{-1/2}$$

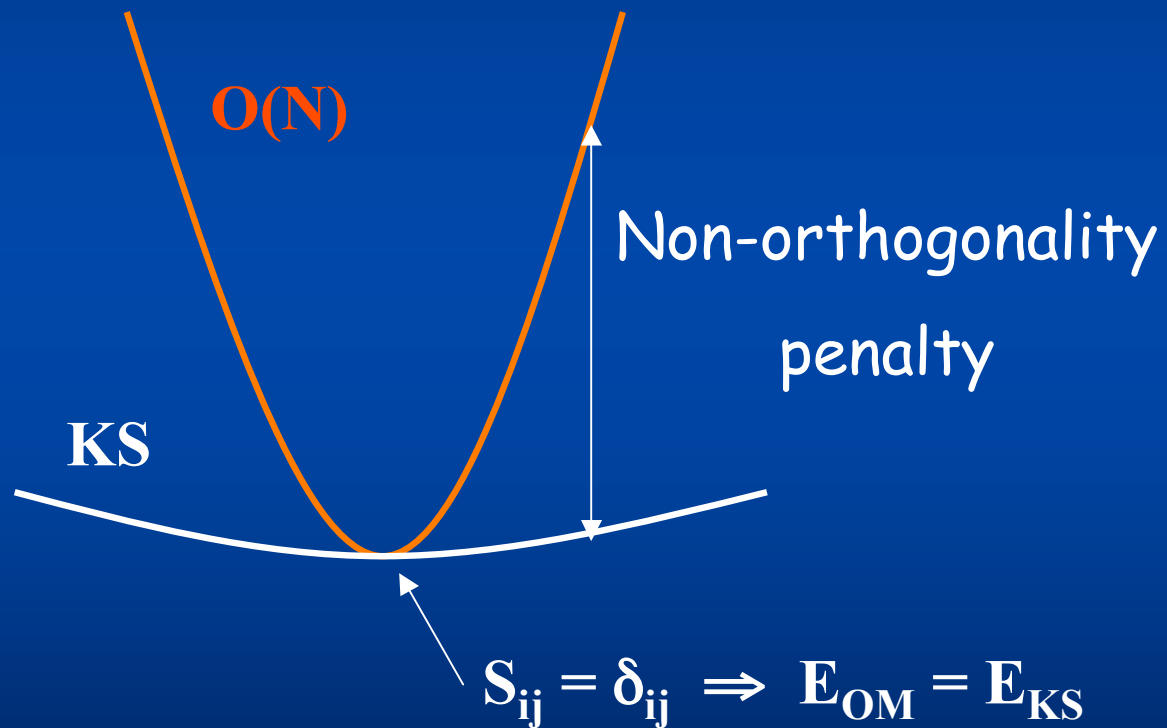
$$\begin{aligned} E_{KS} &= \sum_k \langle \psi'_k | \hat{H} | \psi'_k \rangle \\ &= \sum_{ijk} S_{ki}^{-1/2} \langle \psi_i | \hat{H} | \psi_j \rangle S_{jk}^{-1/2} \end{aligned}$$

$$= \text{Tr}_{\text{occ}}[ S^{-1} H ] \quad \text{Kohn-Sham}$$

$$E_{OM} = \text{Tr}_{\text{occ}}[ (2I-S) H ] \quad \text{Order-N}$$

$$= \text{Tr}_{\text{occ}}[ H ] + \text{Tr}_{\text{occ}}[(I-S) H ]$$

# Order-N vs KS functionals





# Chemical potential

Kim, Mauri & Galli, PRB **52**, 1640 (1995)

$$\rho(\mathbf{r}) = 2\sum_{ij} \psi_i(\mathbf{r}) (2\delta_{ij} - S_{ij}) \psi_j(\mathbf{r})$$

$$E_{\text{OM}} = \text{Tr}_{\text{occ}} [ (2\mathbf{I} - \mathbf{S}) \mathbf{H} ] \quad \# \text{ states} = \# \text{ electron pairs}$$

$\Rightarrow$  Local minima

$$E_{\text{KMG}} = \text{Tr}_{\text{occ}+} [ (2\mathbf{I} - \mathbf{S}) (\mathbf{H} - \eta \mathbf{S}) ] \quad \# \text{ states} > \# \text{ electron pairs}$$

$\eta$  = chemical potential (Fermi energy)

$$E_i > \eta \quad \Rightarrow \quad |\psi_i| \approx 0$$

$$E_i < \eta \quad \Rightarrow \quad |\psi_i| \approx 1$$

## Difficulties

Stability of  $N(\eta)$

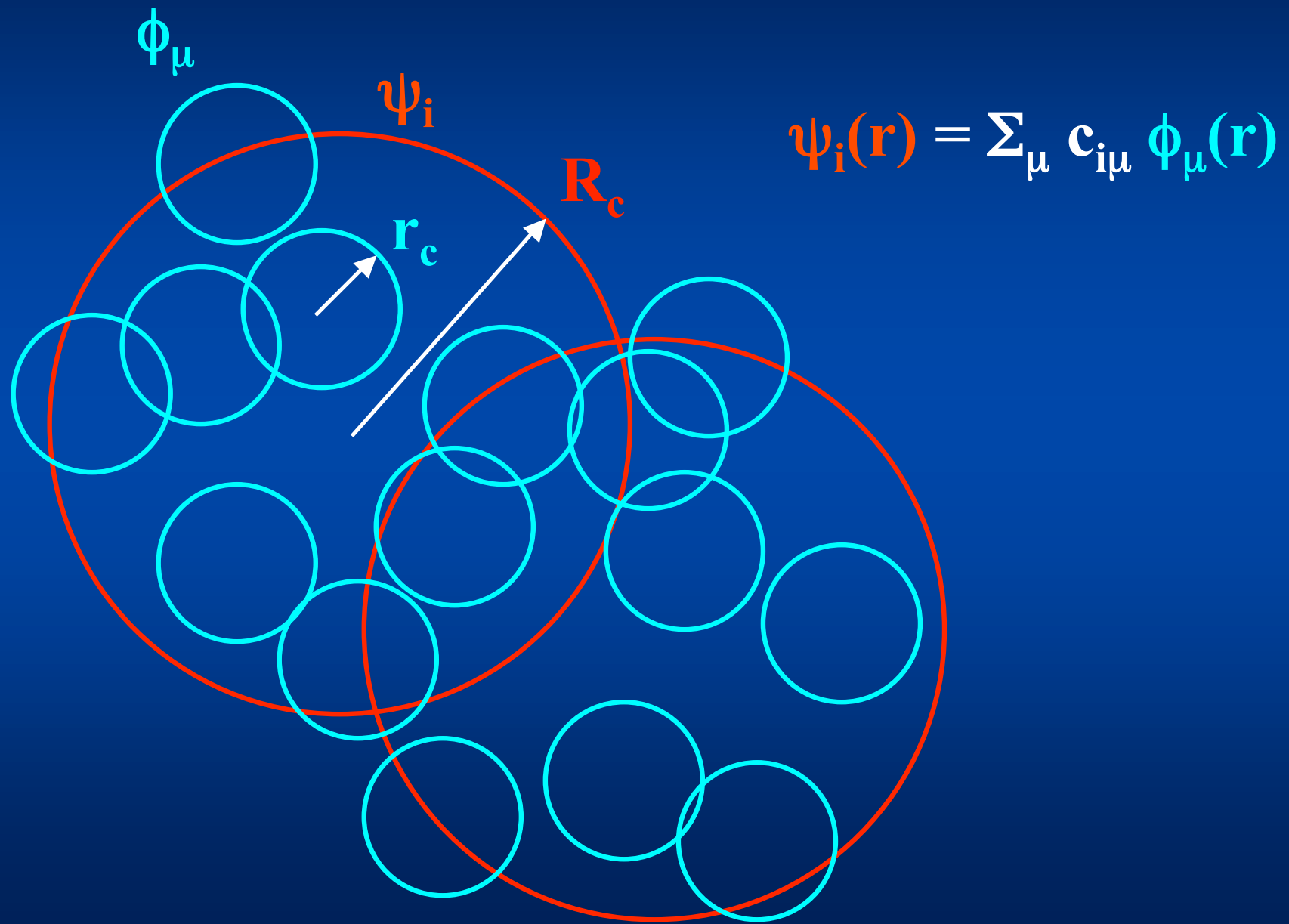
First minimization of  $E_{\text{KMG}}$

## Solutions

Initial diagonalization / Estimate of  $\eta$

Reuse previous solutions

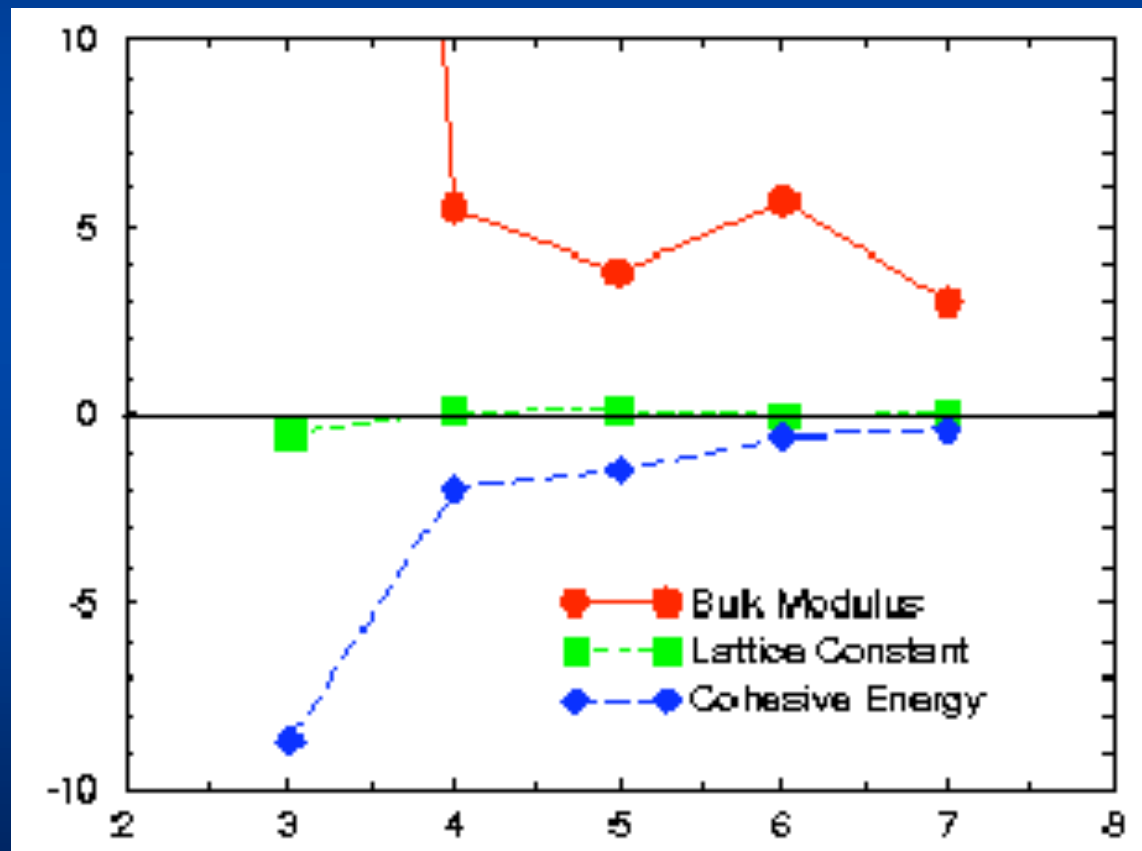
# Orbital localization



# Convergence with localisation radius

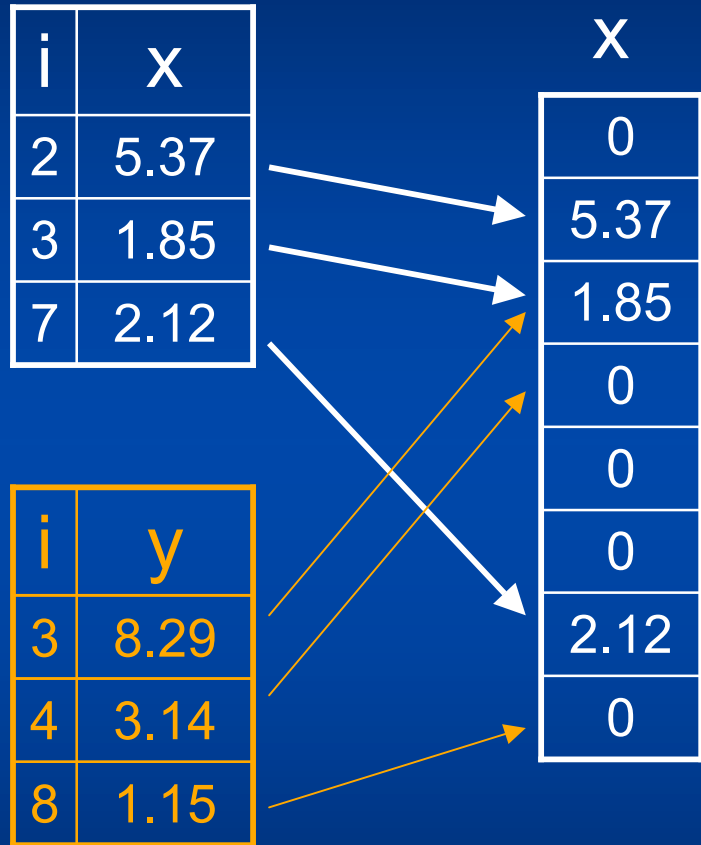
Si supercell, 512 atoms

Relative  
Error  
(%)



$R_c$  (Ang)

# Sparse vectors and matrices



$$8.29 \times 1.85 = 15.34$$

$$3.14 \times 0 = 0$$

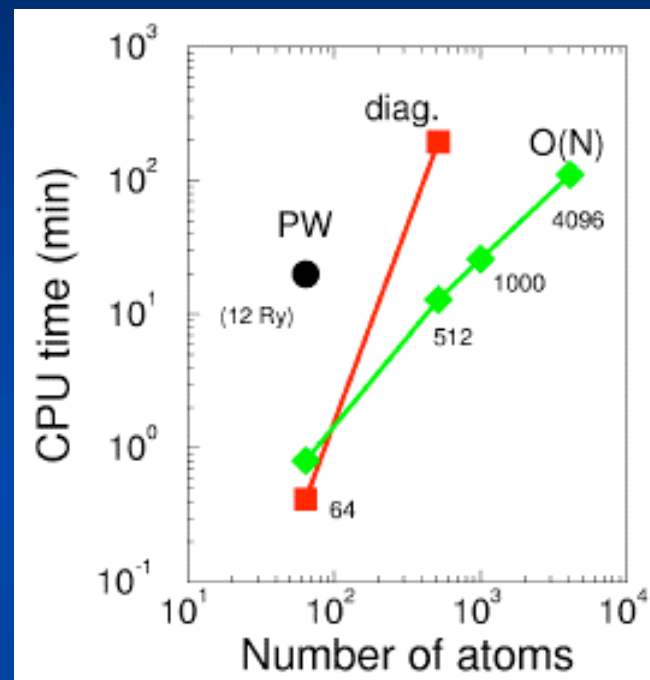
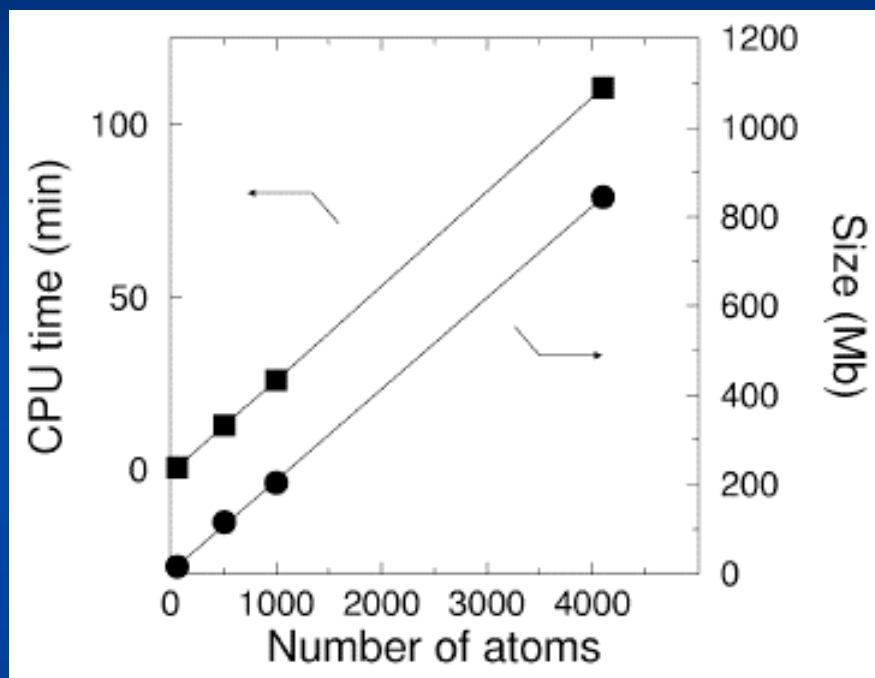
$$1.15 \times 0 = 0$$

$$\text{Sum} \quad 15.34$$

Restore to zero  $x_i \neq 0$  only

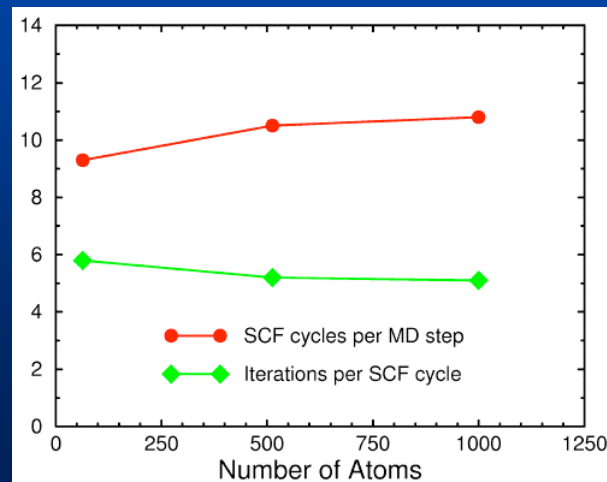
# Actual linear scaling

c-Si supercells, single- $\zeta$



Single Pentium III 800 MHz. 1 Gb RAM

**132.000 atoms in 64 nodes**



# ***Linear scaling solver: practicalities in SIESTA***

P. Ordejón

Institut de Ciència de Materials de Barcelona (CSIC)

# Order-N in SIESTA (1)

SCF



Calculate Hamiltonian

Minimize  $E_{KS}$  with respect to WFs (GC minimization)

Build new charge density from WFs

# Energy Functional Minimization

- **Start from initial LWFs** (from scratch or from previous step)

$$\chi_i(\mathbf{r}) = \sum_{\mu} c_{i\mu} \phi_{\mu}(\mathbf{r})$$

- **Minimize Energy Functional w.r.t.  $c_{i\mu}$**

$$E_{\text{OM}} = \text{Tr}_{\text{occ}} [ (2\mathbf{I}-\mathbf{S}) \mathbf{H} ] \quad \text{or}$$

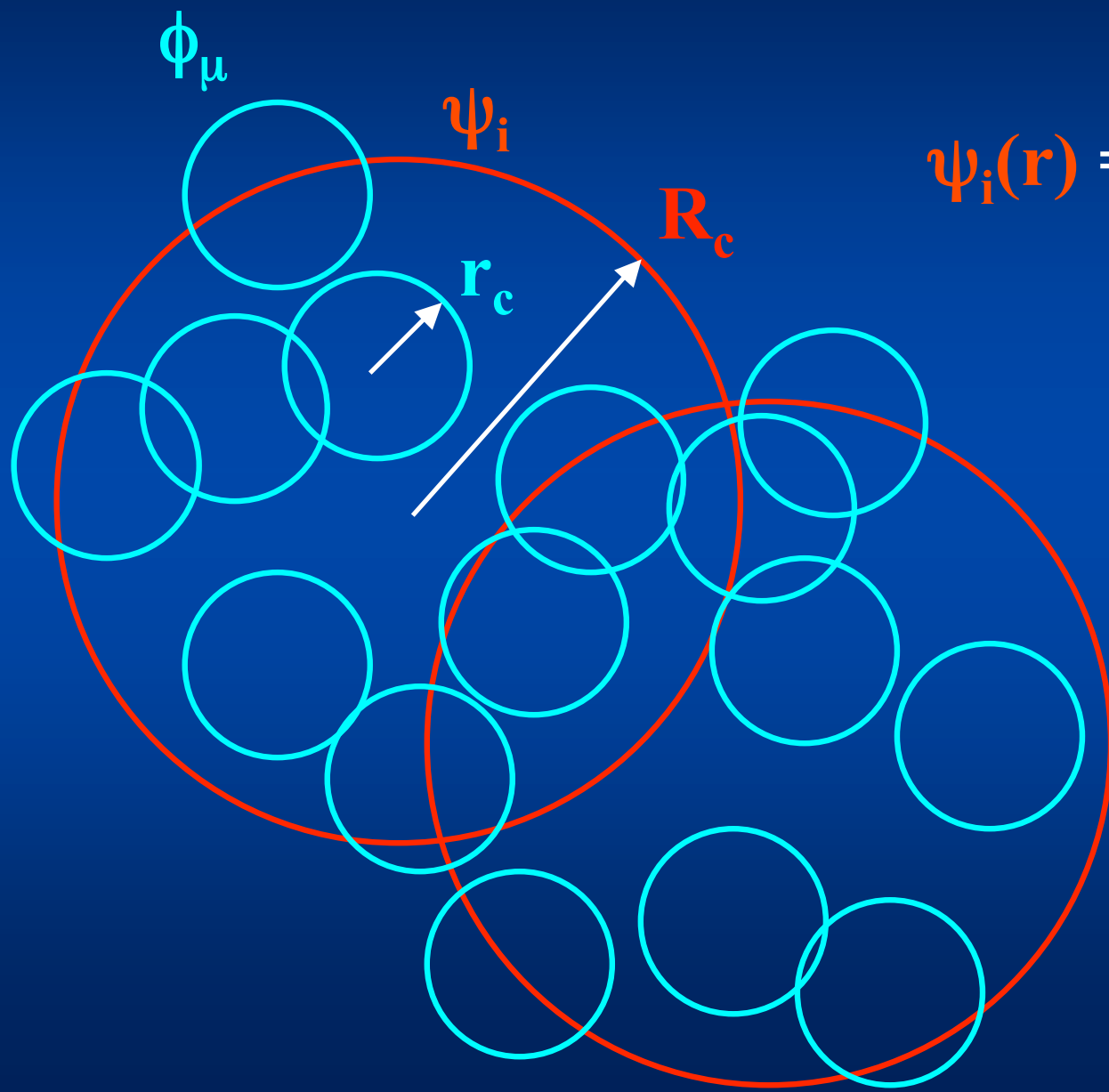
$$E_{\text{KMG}} = \text{Tr}_{\text{occ}+} [ (2\mathbf{I}-\mathbf{S}) (\mathbf{H}-\eta\mathbf{S}) ]$$

- **Obtain new density**


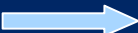
$$\rho(\mathbf{r}) = 2\sum_{ij} \psi_i(\mathbf{r}) (2\delta_{ij}-S_{ij}) \psi_j(\mathbf{r})$$



# Orbital localization



$$\psi_i(\mathbf{r}) = \sum_{\mu} c_{i\mu} \phi_{\mu}(\mathbf{r})$$



  


```
siesta: iscf = 7
Eharris(eV) = -1868.7292 E_KS(eV) = -1868.9207 dDmax = 0.0072
```

```
ordern: enum = 32.0000
cgwf: iter = 1 grad = -0.000017 Eb(Ry) = -16.103689
cgwf: iter = 2 grad = -0.000041 Eb(Ry) = -16.103690
cgwf: iter = 3 grad = -0.000005 Eb(Ry) = -16.103690
cgwf: iter = 4 grad = -0.000008 Eb(Ry) = -16.103691
cgwf: iter = 5 grad = -0.000006 Eb(Ry) = -16.103691
cgwf: iter = 6 grad = -0.000001 Eb(Ry) = -16.103691
cgwf: iter = 7 grad = -0.000001 Eb(Ry) = -16.103691
cgwf: iter = 8 grad = -0.000001 Eb(Ry) = -16.103691
cgwf: iter = 9 grad = -0.000001 Eb(Ry) = -16.103691
cgwf: iter = 10 grad = 0.000000 Eb(Ry) = -16.103691
```

```
cgwf: CG tolerance reached
```

```
denmat: qtot (before DM normalization) = 32.0000
ordern: qtot (after DM normalization) = 32.0000
```



  


```
siesta: iscf = 8
Eharris(eV) = -1868.7291 E_KS(eV) = -1868.8286 dDmax = 0.0046
```

```
ordern: enum = 32.0000
cgwf: iter = 1 grad = -0.000001 Eb(Ry) = -16.100366
cgwf: iter = 2 grad = -0.000001 Eb(Ry) = -16.100366
cgwf: iter = 3 grad = 0.000000 Eb(Ry) = -16.100366
```

```
cgwf: CG tolerance reached
```

```
denmat: qtot (before DM normalization) = 32.0000
ordern: qtot (after DM normalization) = 32.0000
```


  


```
siesta: iscf = 9
Eharris(eV) = -1868.7290 E_KS(eV) = -1868.6741 dDmax = 0.0030
```

```
ordern: enum = 32.0000
cgwf: iter = 1 grad = -0.000001 Eb(Ry) = -16.096840
cgwf: iter = 2 grad = -0.000002 Eb(Ry) = -16.096840
cgwf: iter = 3 grad = 0.000000 Eb(Ry) = -16.096840
```

```
cgwf: CG tolerance reached
```

```
denmat: qtot (before DM normalization) = 32.0000
ordern: qtot (after DM normalization) = 32.0000
```



```
siesta: iscf = 10
Eharris(eV) = -1868.7290 E_KS(eV) = -1868.7273 dDmax = 0.0003
```

# Order-N in SIESTA (2)

- Practical problems:
  - Minimization of E versus WFs:
    - First minimization is hard!!! (~1000 CG iterations)
    - Next minimizations are much faster (next SCF and MD steps)
    - ALWAYS save SystemName.LWF and SystemName.DM files!!!!
  - The Chemical Potential (in Kim's functional):
    - Data on input (ON.Eta). Problem: can change during SCF and dynamics.
    - Possibility to estimate the chemical potential in  $O(N)$  operations
    - If chosen ON.Eta is inside a band (conduction or valence), the minimization often becomes unstable and diverges
    - Solution I: use chemical potential estimated on the run
    - Solution II: do a previous diagonalization

## Example of instability related to a wrong chemical potential

```
cgwf: iter = 1      grad =      -1.328841      Eb (Ry) =      -2.582441
cgwf: iter = 2      grad =      -3.867501      Eb (Ry) =      -2.710455
cgwf: iter = 3      grad = -3309930340.938110    Eb (Ry) =     -6532.475547
cgwf: iter = 4      grad = *****          Eb (Ry) = *****
cgwf: iter = 5      grad = -NaN                Eb (Ry) = *****
```

# Order-N in SIESTA (3)

- SolutionMethod OrderN
- ON.Functional  
Ordejón-Mauri or Kim (def)
- ON.MaxNumIter  
Max. iterations in CG minim. (WFs)
- ON.Etol  
Tolerance in the energy minimization  
$$2(E_n - E_{n-1}) / (E_n + E_{n-1}) < \text{ON.Etol}$$
- ON.RcLWF  
Localisation radius of WFs

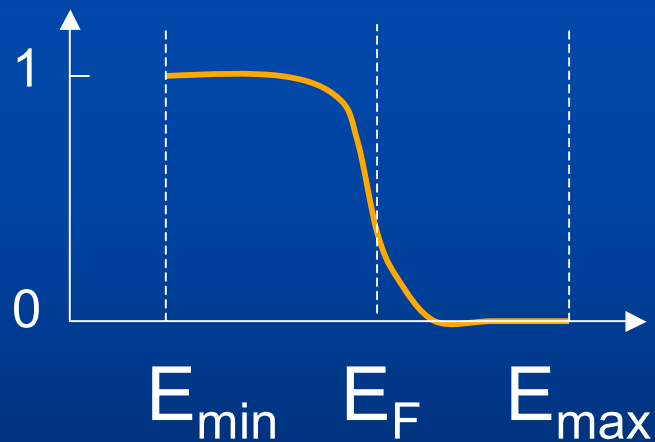
# Order-N in SIESTA (4)

- ON.Eta (energy units)  
Chemical Potential (Kim)  
Shift of Hamiltonian (Ordejon-Mauri)
- ON.ChemicalPotential
- ON.ChemicalPotentialUse
- ON.ChemicalPotentialRc
- ON.ChemicalPotentialTemperature
- ON.ChemicalPotentialOrder

# Fermi operator/projector

Goedecker & Colombo (1994)

$$f(E) = 1/(1+e^{E/kT}) \approx \sum_n c_n E^n$$



$$\hat{F} \approx \sum c_n \hat{H}^n$$

$$E_{\text{tot}} = \text{Tr}[\hat{F} \hat{H}]$$

$$N_{\text{tot}} = \text{Tr}[\hat{F}]$$