

Scalable GW software for excited electrons using OpenAtom

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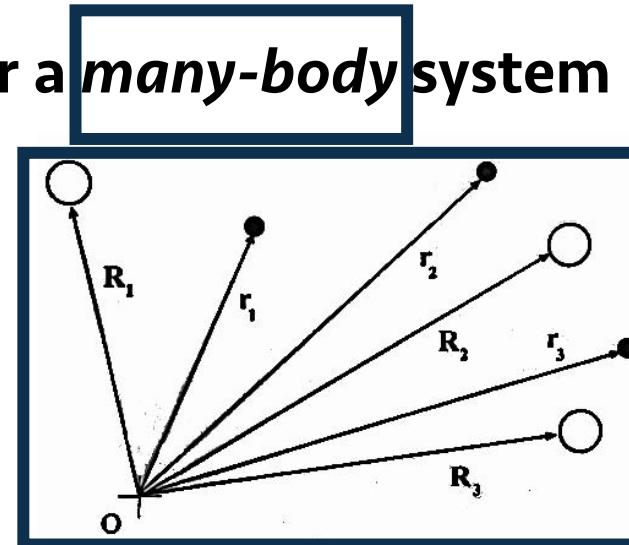
Yale



Electronic structure calculations

- Time independent Schrodinger equation for a **many-body** system

$$i\hbar \frac{\partial}{\partial t} |\Psi(t)\rangle = \hat{H} |\Psi(t)\rangle$$



Many \mathbf{R}_i & \mathbf{r}_j

- Density functional theory (DFT) simplifies this to **one-body** problem

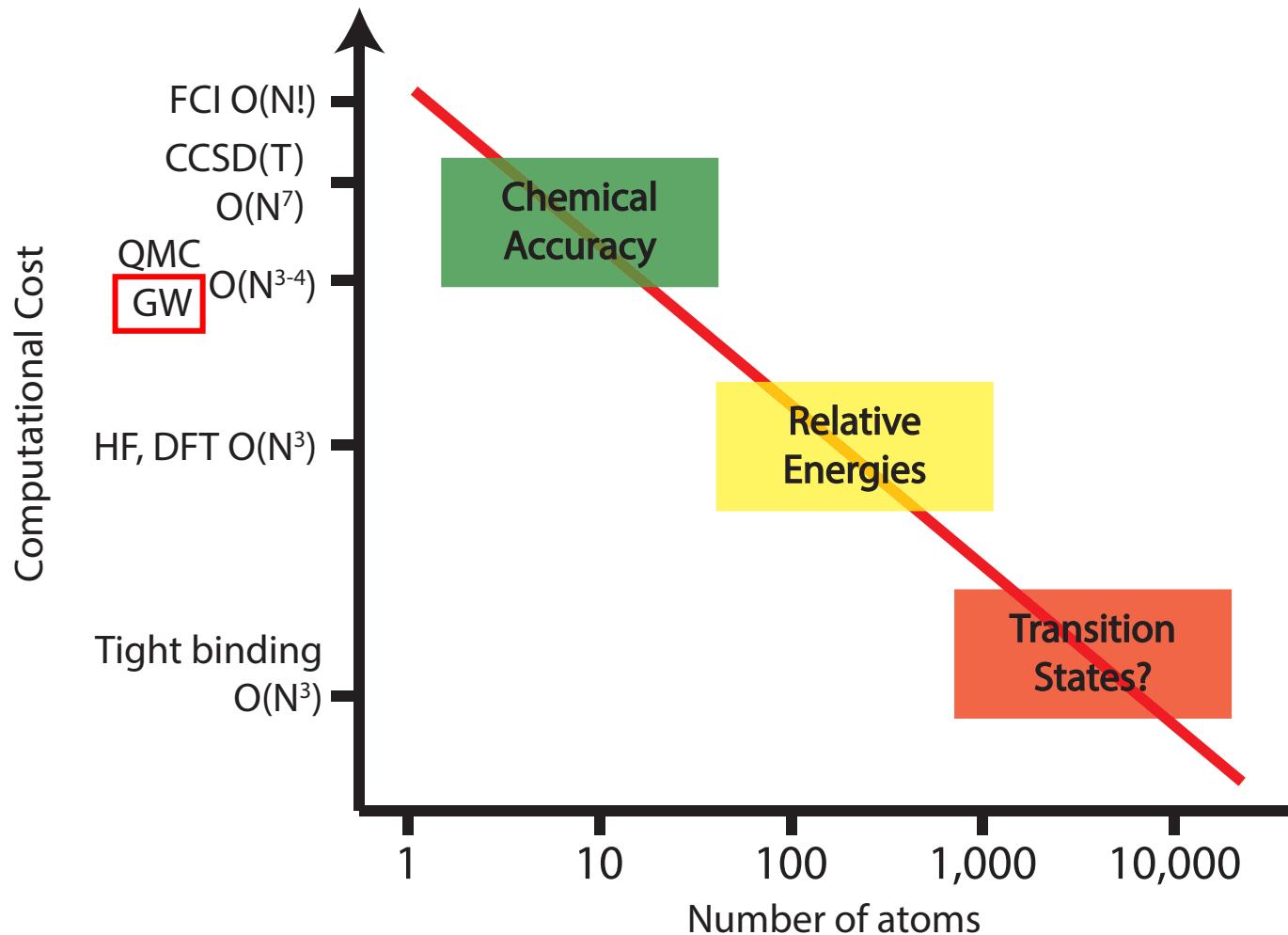
$$\left[-\frac{\nabla^2}{2} + V_{ion}(r) + V_H(r) + V_{xc}(r) \right] \psi_j(r) = \epsilon_j \psi_j(r)$$

$$V_{xc}(r) = \frac{\delta E_{xc}}{\delta n(r)}$$

Solve for wavefunctions $\psi_j(r)$ and energies ϵ_j

Comparison of the methods

Exact Schrödinger Equation



$$V_{xc}(r) = \frac{\delta E_{xc}}{\delta n(r)}$$

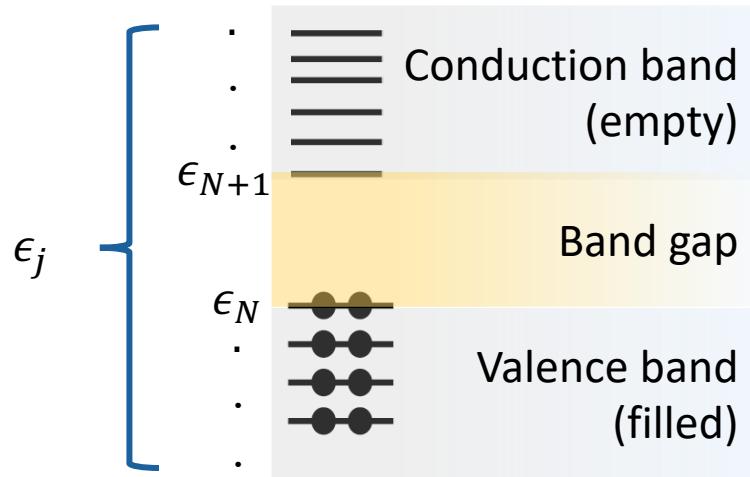
A large collection of quantum chemistry method names, many with parameters, is displayed in a cloud-like arrangement. Some of the visible labels include:

- LM81, PW92, SAOP, PW91, V5LYP, LB9483, VP86, MCY06, B2PLYP, BMK04, MO5-2X, BR89, mPW, MO!
- EB08, PBEsol, PBE, LYP, B3LYP, X3LYP, PW92, BNL05, SAOP, LM81, PW91, V5LYP, LB9483, VP86, MCY06, B2PLYP, BMK04, MO5-2X, BR89, mPW, MO!
- FT97, WI, GL76, B97-2, KT2, rPBE, TPSSh, revPBE, PBEO, BOP, PBEOP, Bh3LYP, HSE, M06-2X, B97, B97-HF, PKZB99, rB86, DK87, vBH, OPTX, PL81, Ihf, SOGGA, BRC89, PK06, EDF1, B3LYP, X3LYP, PW92, BNL05, SAOP, LM81, PW91, V5LYP, LB9483, VP86, MCY06, B2PLYP, BMK04, MO5-2X, BR89, mPW, MO!
- W1, GL76, B97-2, KT2, rPBE, TPSSh, revPBE, PBEO, BOP, PBEOP, Bh3LYP, HSE, M06-2X, B97, B97-HF, PKZB99, rB86, DK87, vBH, OPTX, PL81, Ihf, SOGGA, BRC89, PK06, EDF1, B3LYP, X3LYP, PW92, BNL05, SAOP, LM81, PW91, V5LYP, LB9483, VP86, MCY06, B2PLYP, BMK04, MO5-2X, BR89, mPW, MO!
- WC06, wB97XD, FT97, WI, GL76, B97-2, KT2, rPBE, TPSSh, revPBE, PBEO, BOP, PBEOP, Bh3LYP, HSE, M06-2X, B97, B97-HF, PKZB99, rB86, DK87, vBH, OPTX, PL81, Ihf, SOGGA, BRC89, PK06, EDF1, B3LYP, X3LYP, PW92, BNL05, SAOP, LM81, PW91, V5LYP, LB9483, VP86, MCY06, B2PLYP, BMK04, MO5-2X, BR89, mPW, MO!
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- B2PLYP, BMK04, MO5-2X, BR89, mPW, MO!
- BMK04, MO5-2X, BR89, mPW, MO!
- mPW, MO!

DFT problem with excitations

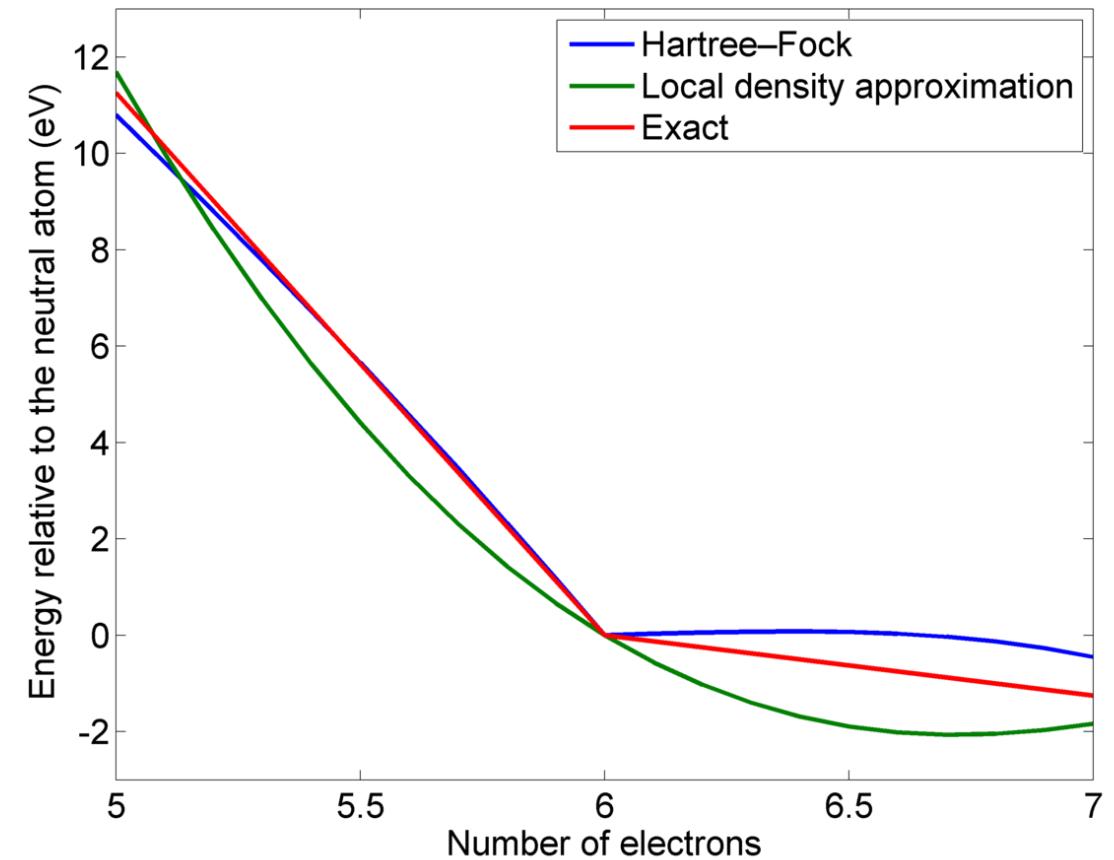
$$\text{DFT: } \left[-\frac{\nabla^2}{2} + V_{ion}(r) + V_H(r) + V_{xc}(r) \right] \psi_j(r) = \epsilon_j \psi_j(r)$$

ground state



Janak's theorem

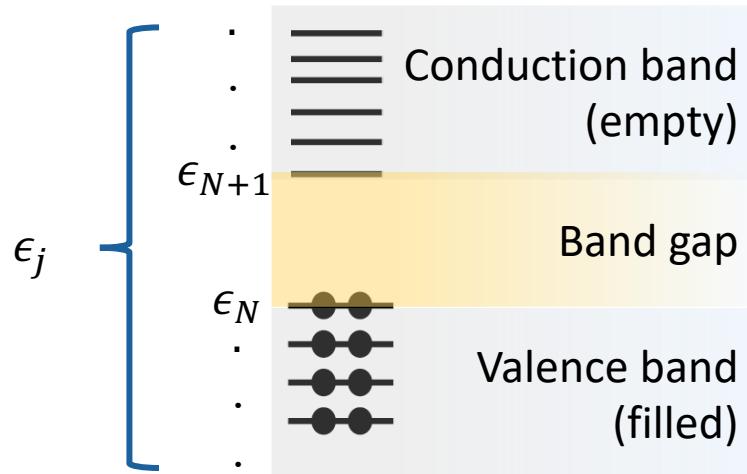
$$E_{gap} = \frac{\partial E}{\partial N} \Big|_{N+\delta} - \frac{\partial E}{\partial N} \Big|_{N-\delta} = \epsilon_{N+1} - \epsilon_N$$



DFT problem with excitations

$$\text{DFT: } \left[-\frac{\nabla^2}{2} + V_{ion}(r) + V_H(r) + V_{xc}(r) \right] \psi_j(r) = \epsilon_j \psi_j(r)$$

ground state



$$E_{gap} = \frac{\partial E}{\partial N} \Big|_{N+\delta} - \frac{\partial E}{\partial N} \Big|_{N-\delta} = \epsilon_{N+1} - \epsilon_N$$

Why band gap/exitations in a material is important?

- Metallic, semiconducting or insulating?
- Light-matter interactions in general
- A lot of engineering implications: PV, lasers, luminescence ...

Band gaps (eV)

Material	DFT	GW	Expt.
Diamond	3.9	5.6*	5.48
Si	0.5	1.3*	1.17
LiCl	6.0	9.1*	9.4
SrTiO ₃	2.0	3.4-3.8	3.25

GW method

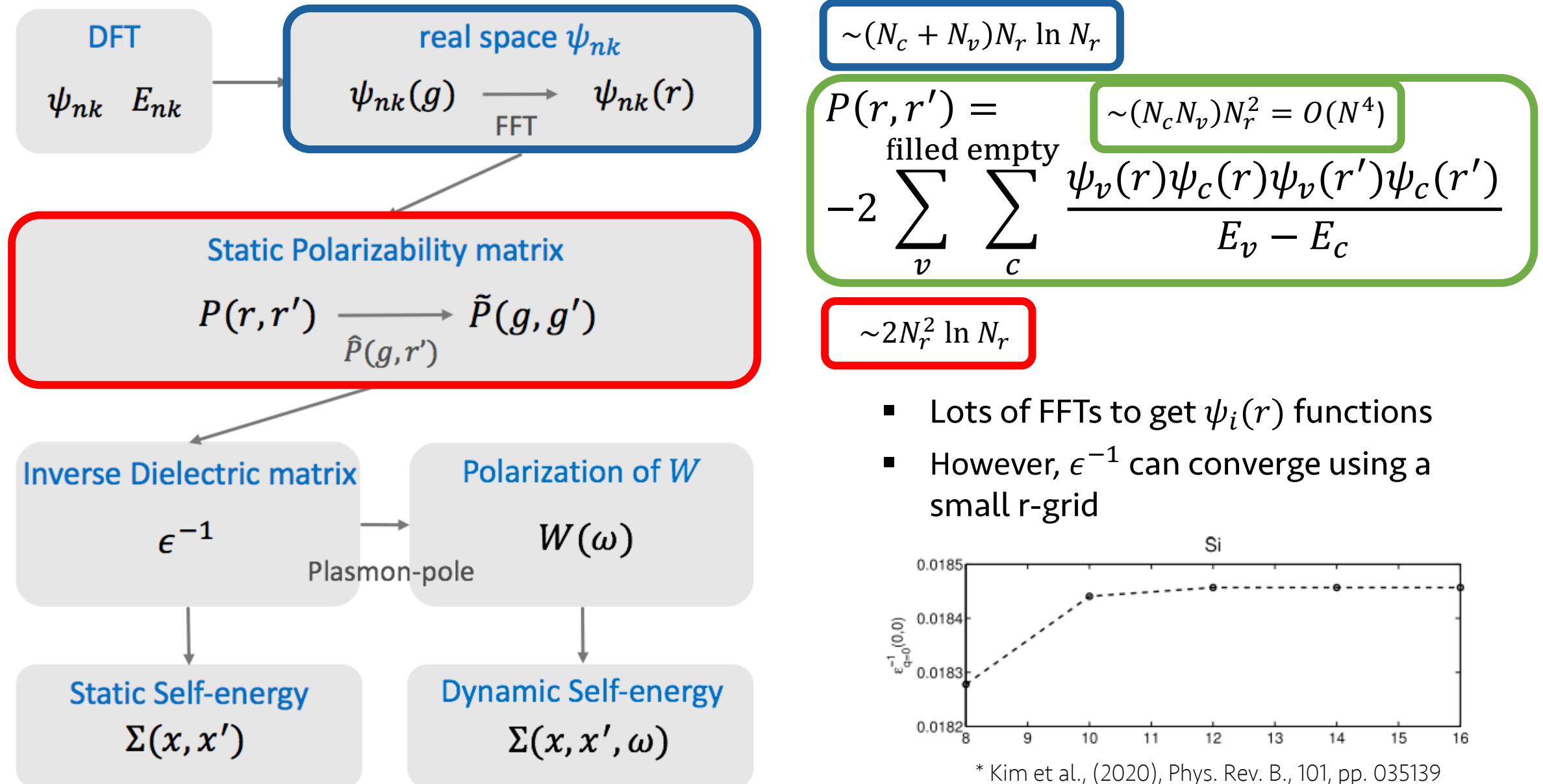
Challenges

- Memory intensive
- Much larger number of conduction bands: Huge number of FFTs
- Large and dense matrix multiplications
- Unfavorable scaling $O(N^4)$

Goal

- Efficient and highly scalable GW software
- $O(N^3)$ scaling method

What is expensive in GW?



$O(N^3)$ algorithm (CTSP) for P

CTSP: Complex time shredded propagator

$$P_{r,r'} = -2 \sum_v^{N_{occ}} \sum_c^{N_{unocc}} \frac{\psi_{r,v}^* \psi_{r,c} \psi_{r',c}^* \psi_{r',v}}{E_c - E_v} \quad N_r^2 N_{unocc} N_{occ} \sim N^4$$

$$X_{r,r'} = \sum_i^{N_a} \sum_j^{N_b} \frac{A_{r,r'} B_{r,r'}}{w + a_i - b_j}$$

(1) Laplace transform:

$$\frac{1}{E_c - E_v} = \int_0^\infty e^{-(E_c - E_v)\tau} d\tau = \int_0^\infty e^{-E_c\tau} e^{E_v\tau} d\tau = \int_0^\infty f(\tau) e^{-\tau} d\tau$$

(2) Gauss-Laguerre quadrature: $\int_0^\infty f(\tau) e^{-\tau} d\tau \approx \sum_k^{N_q} \omega_k f(\tau_k)$

$$N_r^2 N_q (N_{unocc} + N_{occ}) \sim N^3$$

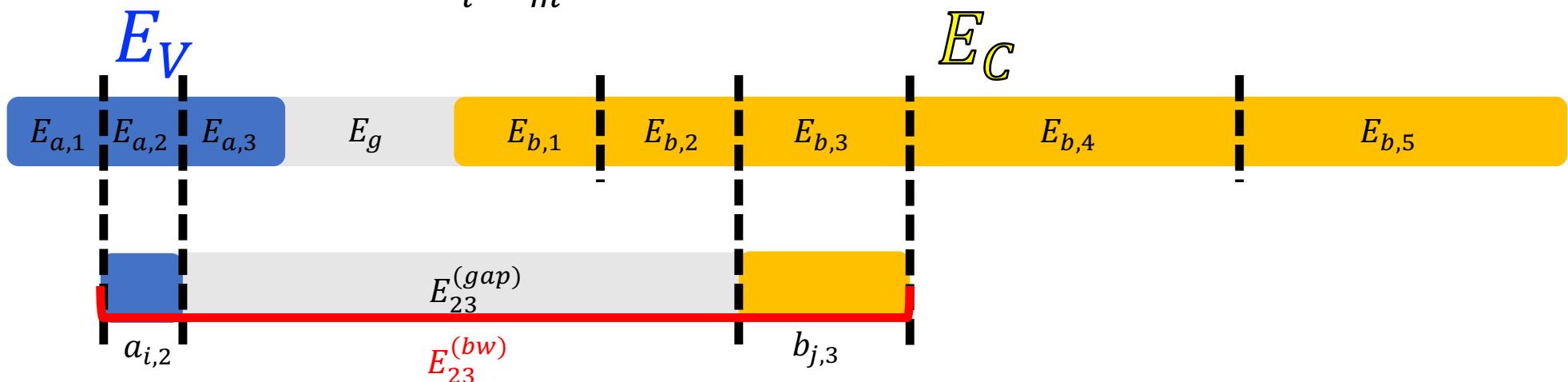
$$N^4 \xrightarrow{} N^3$$

$O(N^3)$ algorithm (CTSP) for P

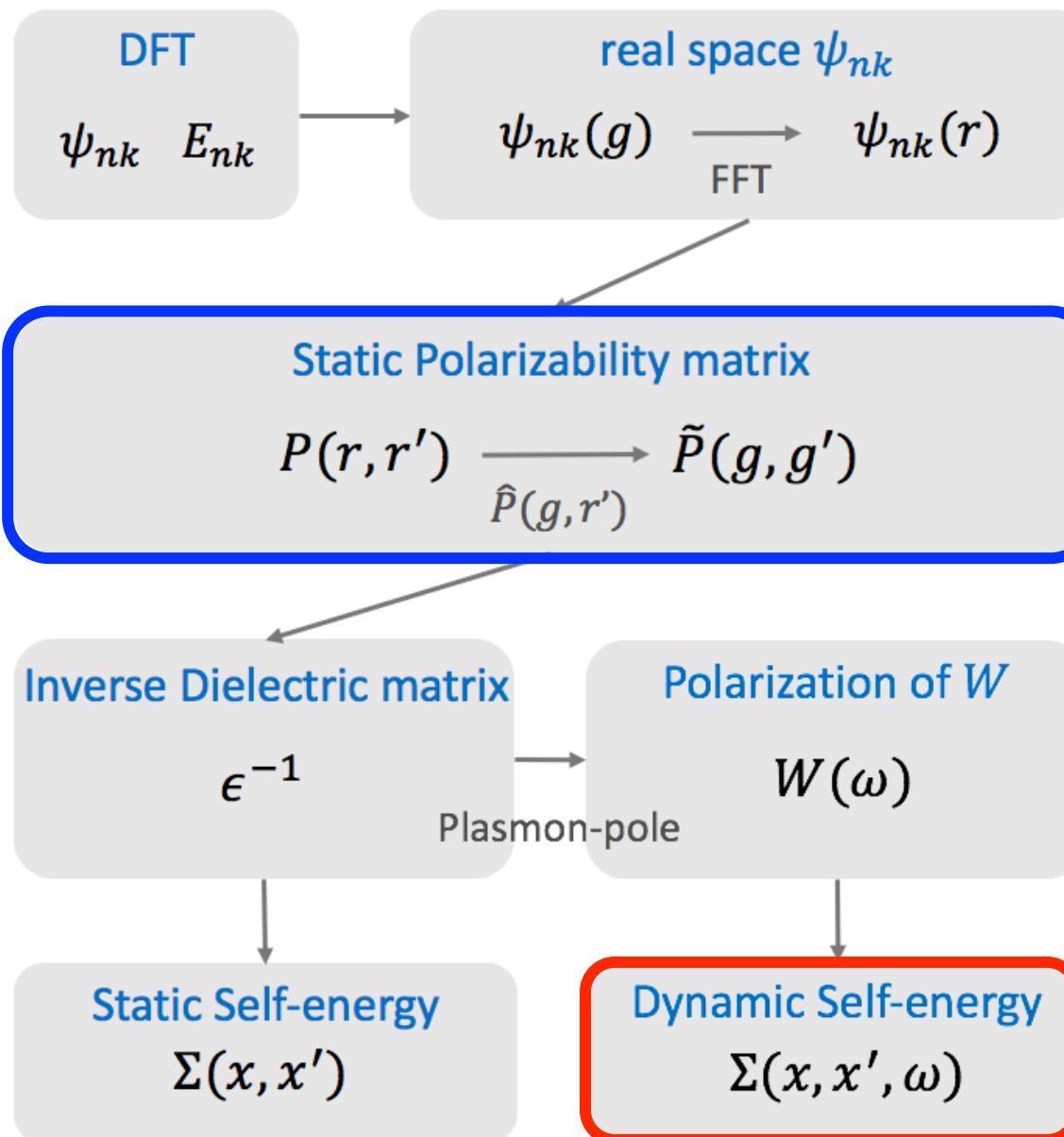
$$\begin{aligned}
 P_{r,r'} &= -2 \sum_v^{N_{occ}} \sum_c^{N_{unocc}} \psi_{r,v}^* \psi_{r,c} \psi_{r',c}^* \psi_{r',v} \sum_k^{N_q} \omega_k f(\tau_k) \\
 &= \sum_k^{N_q} \omega_k \left[\sum_v^{N_{occ}} \psi_{r,v} \psi_{r',v}^* e^{E_v \tau_k} \right] \left[\sum_c^{N_{unocc}} \psi_{r,c} \psi_{r',c}^* e^{-E_c \tau_k} \right]
 \end{aligned}$$

N_q (N_{unocc}+N_{occ}) N_r² ~ **N³**

(3) Energy windows: $P_{r,r'} = \sum_l^{N_{aw}} \sum_m^{N_{bw}} P_{r,r'}^{lm}$



Steps for typical GW calculations



Most expensive

- Real-space P
- $O(N^3)$ method

Also expensive - $O(N^4)$

$O(N^3)$ method for self-energy

$$\Sigma^\pm(\omega)_{r,r'}^{dyn} = \sum_{p,n} \frac{B_{r,r'}^p \psi_{rn} \psi_{r'n}^*}{\omega - E_n \pm \omega_p}$$

$B_{r,r'}^p$: residues

ω_p : energies of the poles of $W(r)_{r,r'}$

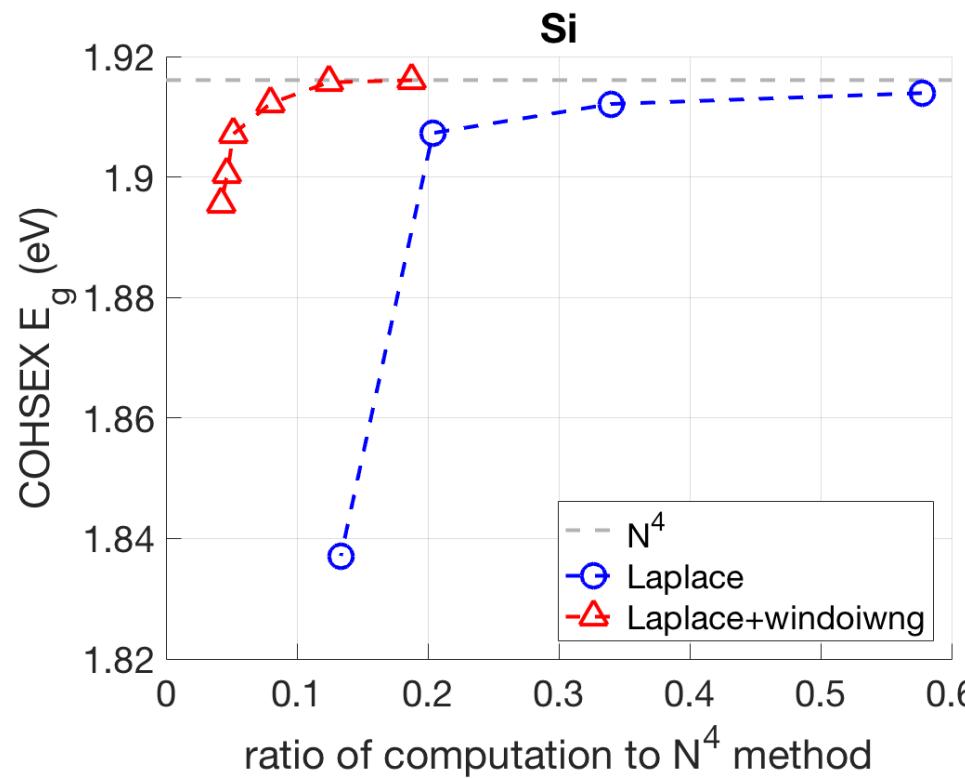
$$X_{r,r'} = \sum_i^{N_a} \sum_j^{N_b} \frac{A_{r,r'} B_{r,r'}}{w + a_i - b_j}$$

- $\omega - \epsilon_n \pm \omega_p = 0$ is possible: Gauss-Laguerre quadrature not applicable
- New quadrature is needed and was developed: [Hermite-Gauss-Laguerre quadrature](#)

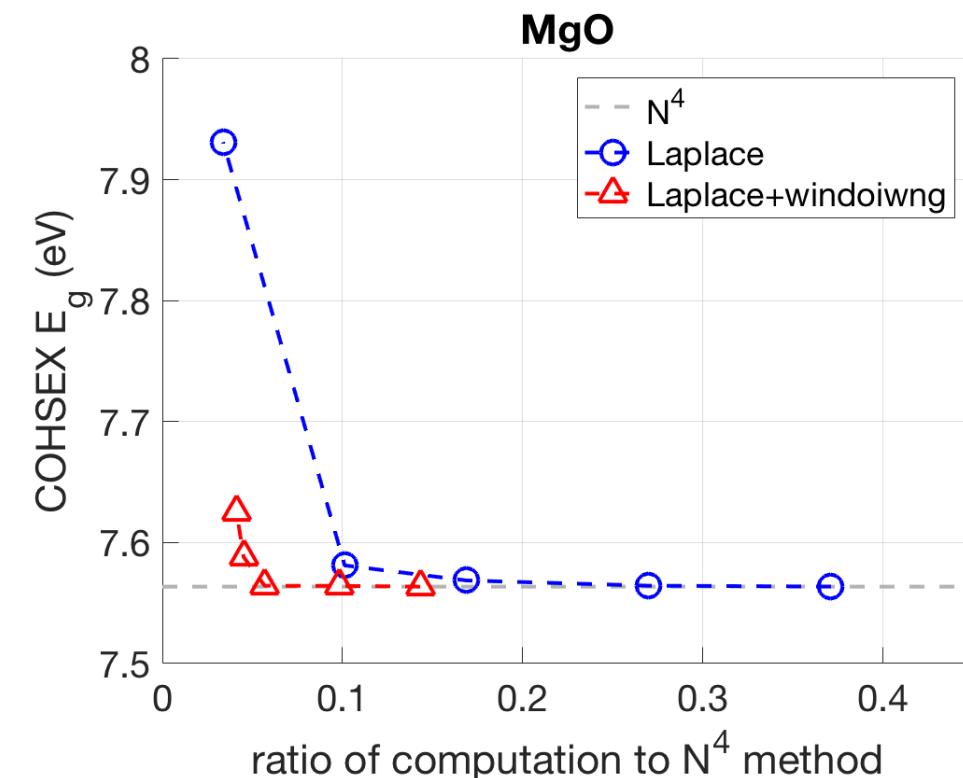
$$\frac{1}{\omega - E_n \pm \omega_p} = Im \int_0^\infty d\tau e^{-\tau - \tau^2/2} e^{i(\omega - E_n \pm \omega_p)\tau}$$

Results: Energy gap

- Si crystal (16 atoms)
- Number of bands: 399
- $N_{wv}=1, N_{wc}=4$

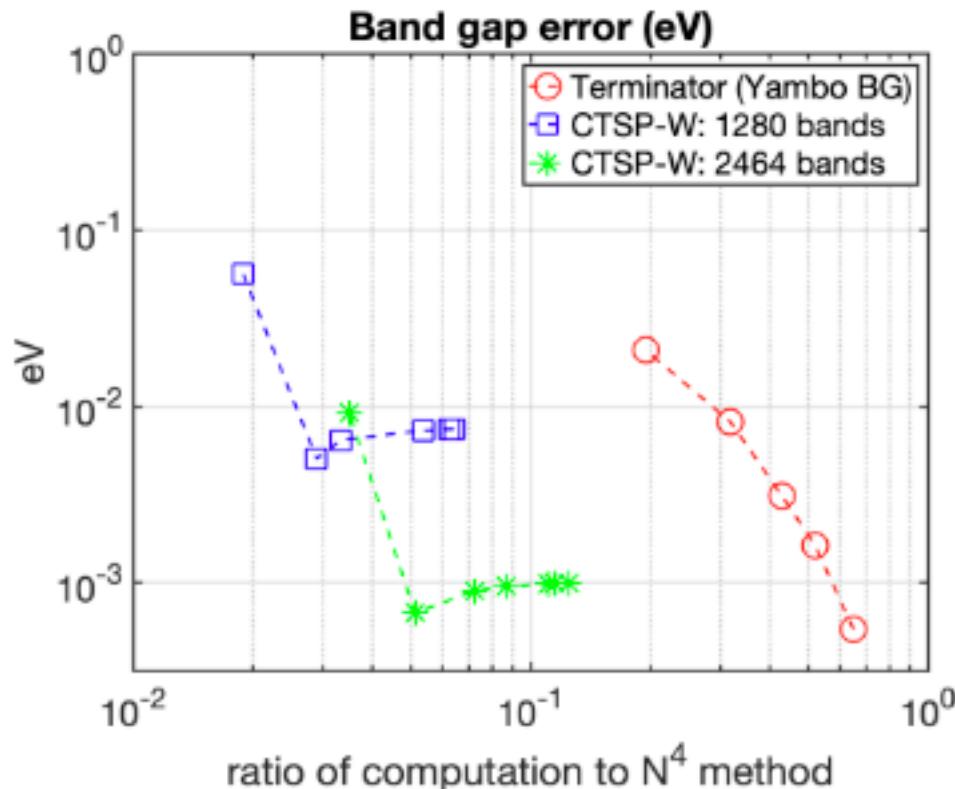


- MgO crystal (16 atoms)
- Number of bands: 433
- $N_{wv}=1, N_{wc}=4$



Performance against other codes

- Si crystal (16 atoms)
- Number of bands: 399
- $N_{pw}=15, N_{nw}=30$



* Kim et al., (2019), Comput. Phys. Commun., 244, pp. 427-441



<http://charm.cs.illinois.edu/OpenAtom/>

OpenAtom GW Parallel Scaling

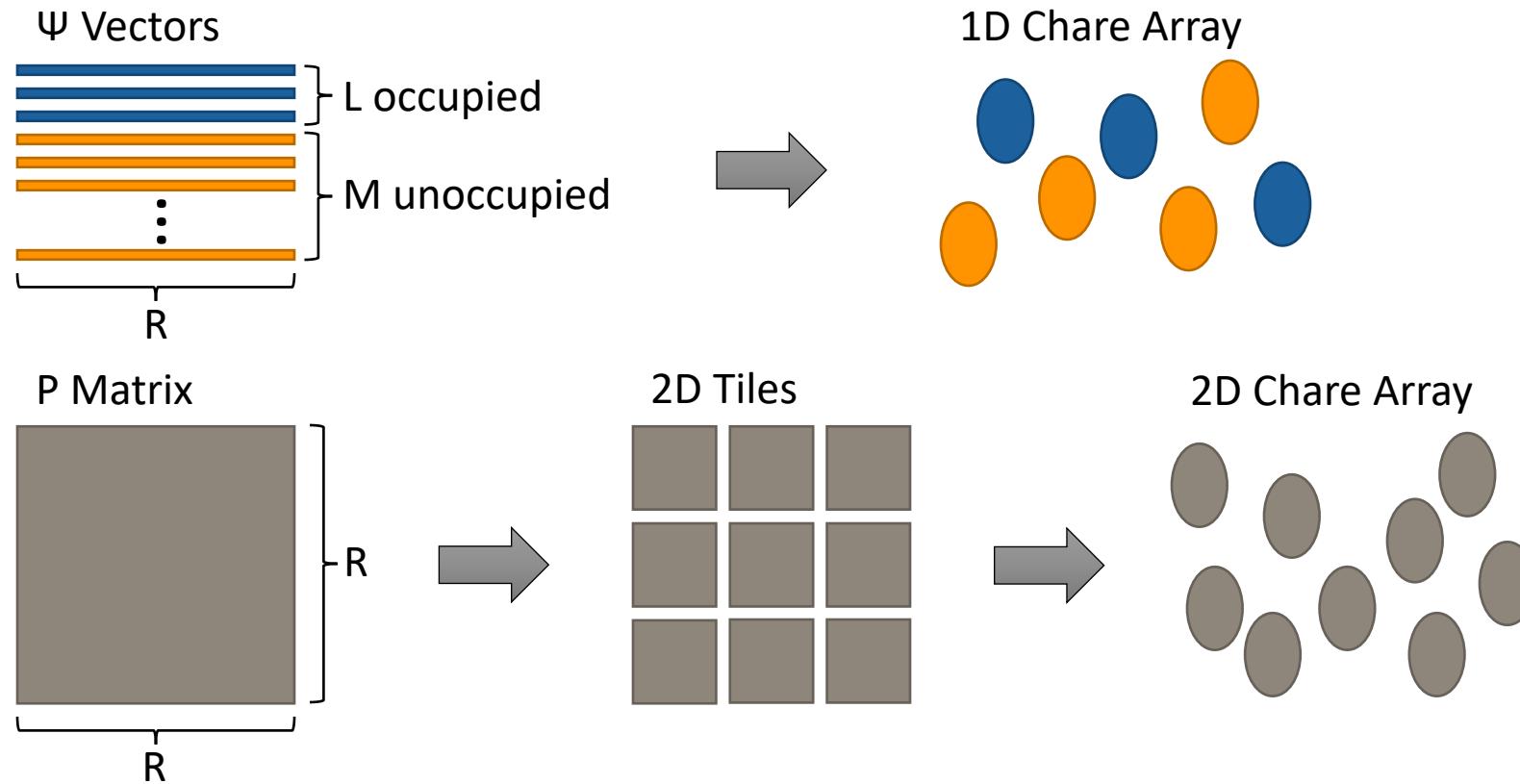
OpenAtom Team

GW-BSE Parallelization

Phase	Serial	Parallel
1 Compute P in Rspace (N^4 and N^3 methods)	Complete	Complete
2 FFT P to GSpace	Complete	Complete
3 Invert epsilon	Complete	Complete
4 Plasmon pole	Complete	Future Work
5 COHSEX Self-energy	Complete	Complete
6 Dynamic Self-energy	Complete	Future Work

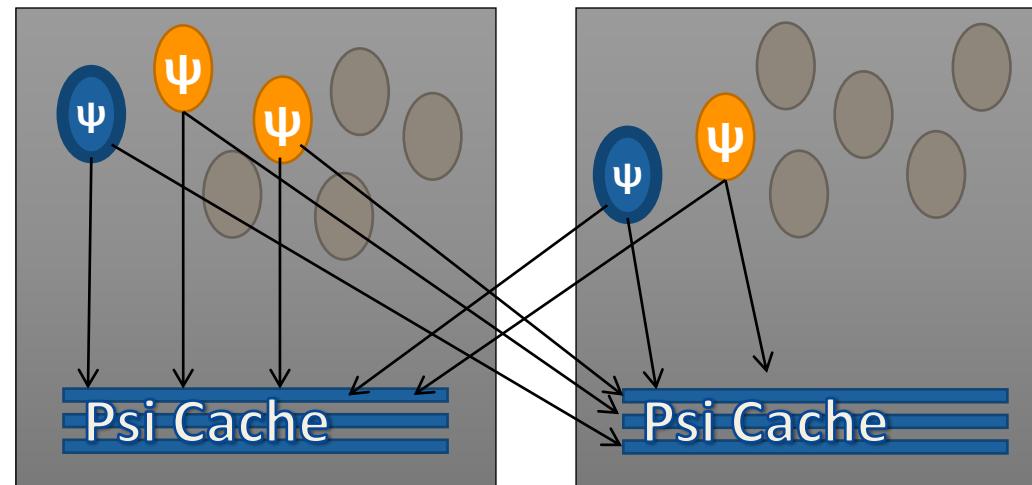
GW Phase-I

P Matrix Computation (N^4 and N^3 method)



Parallel Decomposition: Input state vectors

Duplicate occupied and unoccupied states on each node



Computation of Pmatrix using N³ method

- Outer loops are windows of occupied and unoccupied states
- Most expensive computation - ρ and ρ' matrices

```
for l = 1:Nvw
    for m = 1:Ncw
        for j = 1:Nquadlm
            calculate  $\rho^{kqlmj}$ 
            calculate  $\rho'^{kqlmj}$ 
             $P[r,r'] += \rho^{kqlmj}[r,r'] \times \rho'^{kqlmj}[r,r']$ 
```

Computation ρ matrix (Using occupied states)

- State vectors are represented with ψ
 - Number of occupied states = L, each state has N elements
 - All occupied states can be represented as a matrix $\Psi_v[1:L][1:N]$)

$\rho^{kqlmj} \rightarrow$ Add elements of outer product of $\Psi_v[1:L]$

for l=1:L

 for r=1:N

 for r'=1:N

$\rho^{kqlmj} [r,r'] += \Psi_v[l]^T[r] \times \Psi_v[l][r']$



$\rho^{kqlmj} \rightarrow$ Same as **ZGEMM** of all Ψ_v and all Ψ_v^T
ZGEMM ($\Psi_v^T[1:N][1:L]$, $\Psi_v[1:L][1:N]$)
(i.e matrix multiply)

for r=1:N

 for r'=1:N

 for l=1:L

$\rho^{kqlmj} [r,r'] += \Psi_v^T[r][l] \times \Psi_v[l][r']$

Computation ρ' matrix (Using unoccupied states)

- Number of unoccupied states = M, each state has N elements
- All unoccupied states can be represented as a matrix $\Psi_C[1:M][1:N]$

ρ^{kqlmj} -> Add elements of outer product of $\Psi_C[1:M]$

```
for m=1:M  
  for r=1:N  
    for r'=1:N  
       $\rho'^{kqlmj} [r,r'] += \Psi_C[m]^T[r] \times \Psi_C[m][r']$ 
```

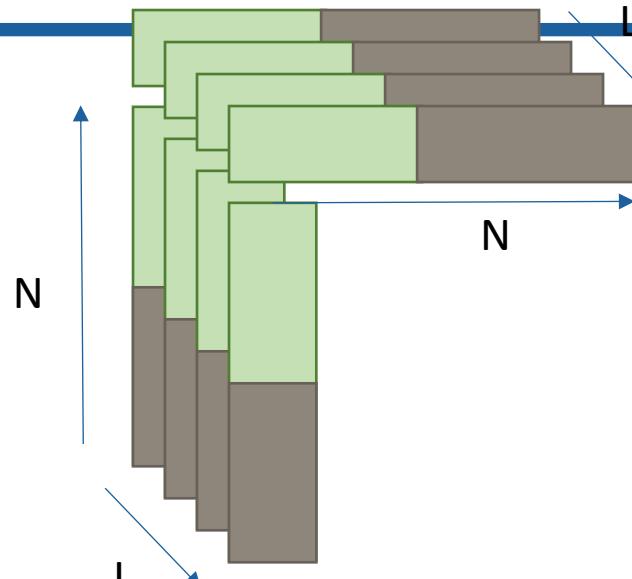


ρ^{kqlmj} -> Same as **ZGEMM** of all Ψ_C and all Ψ_C^T
ZGEMM ($\Psi_C^T[1:N][1:M]$, $\Psi_C[1:M][1:N]$)
(i.e matrix multiply)

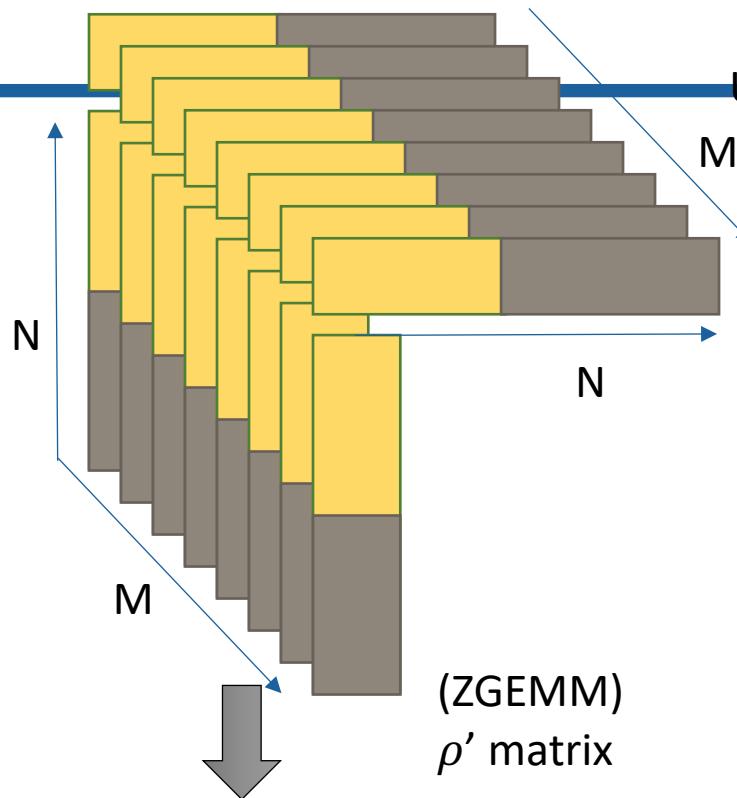
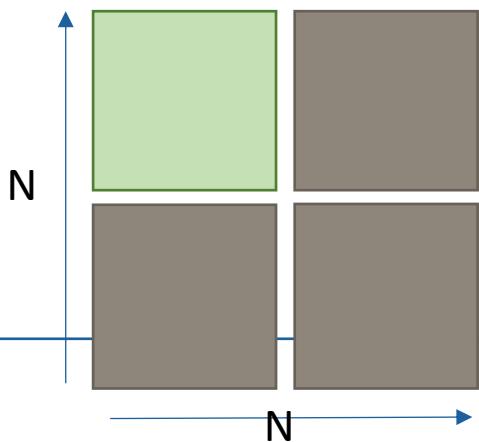
```
for r=1:N  
  for r'=1:N  
    for m=1:M  
       $\rho'^{kqlmj} [r,r'] += \Psi_C^T[r][m] \times \Psi_C[m][r']$ 
```

Computation of P-matrix (tiled) (N^3)

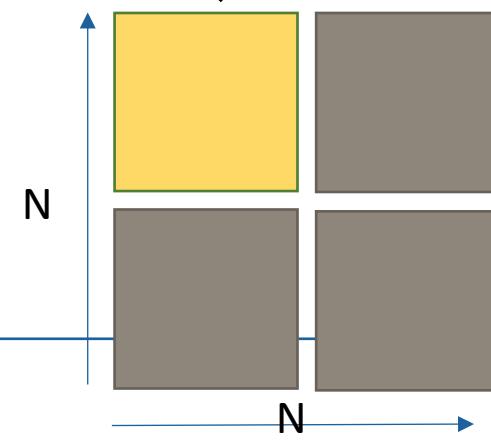
Occupied states $\Psi_V(1:L)$



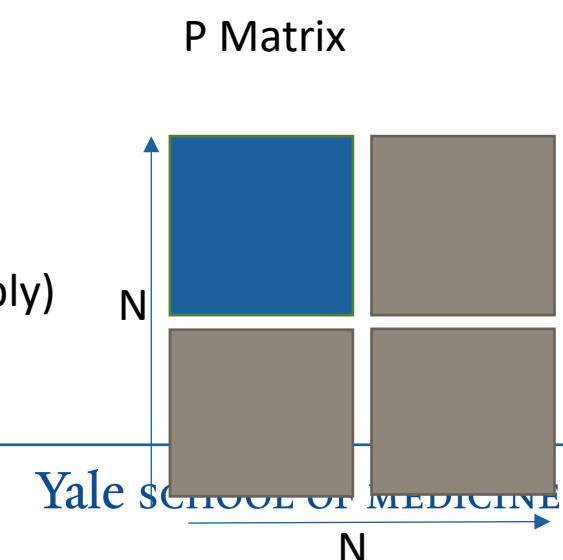
(ZGEMM)
 ρ matrix



(ZGEMM)
 ρ' matrix



(Element-wise multiply)
of ρ & ρ' matrix

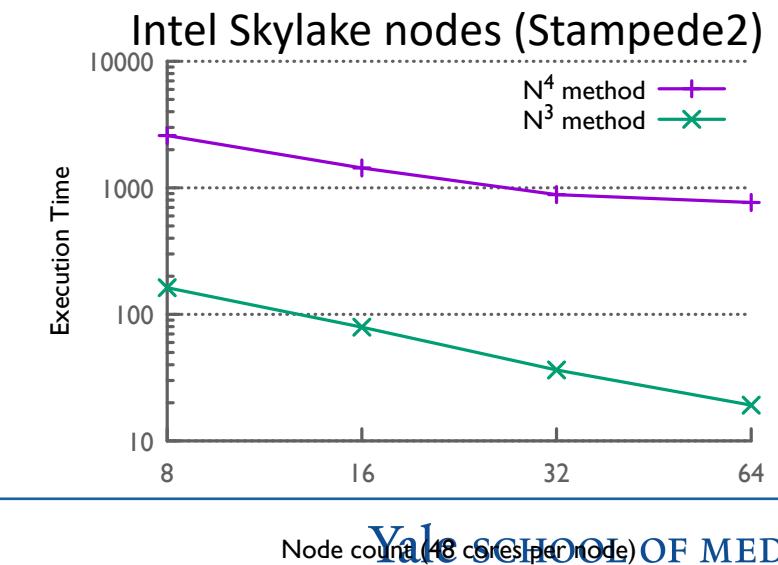
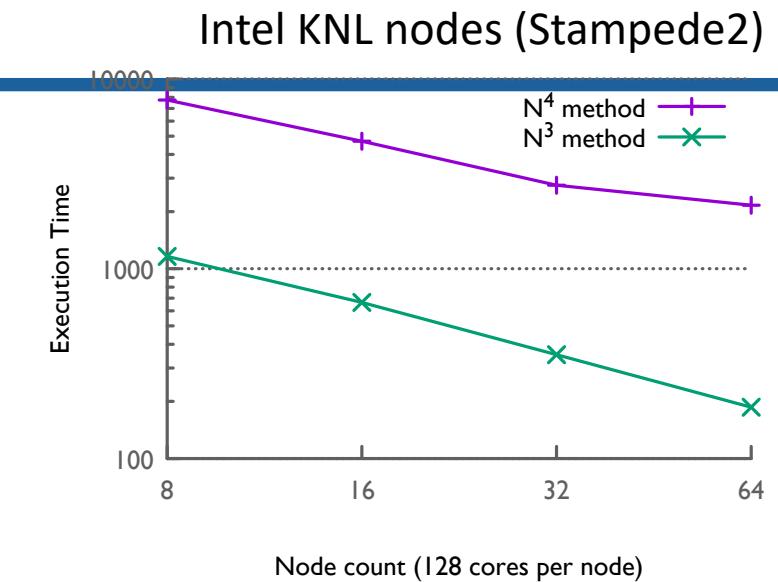


P Matrix

N

Performance of N³ method

- N³ method is an order faster than N⁴ method for Si108 atoms dataset
 - 20k X 20k output matrix size
- Scales well on Intel KNL and SkyLake nodes
- Future scaling results for larger datasets



Questions?
