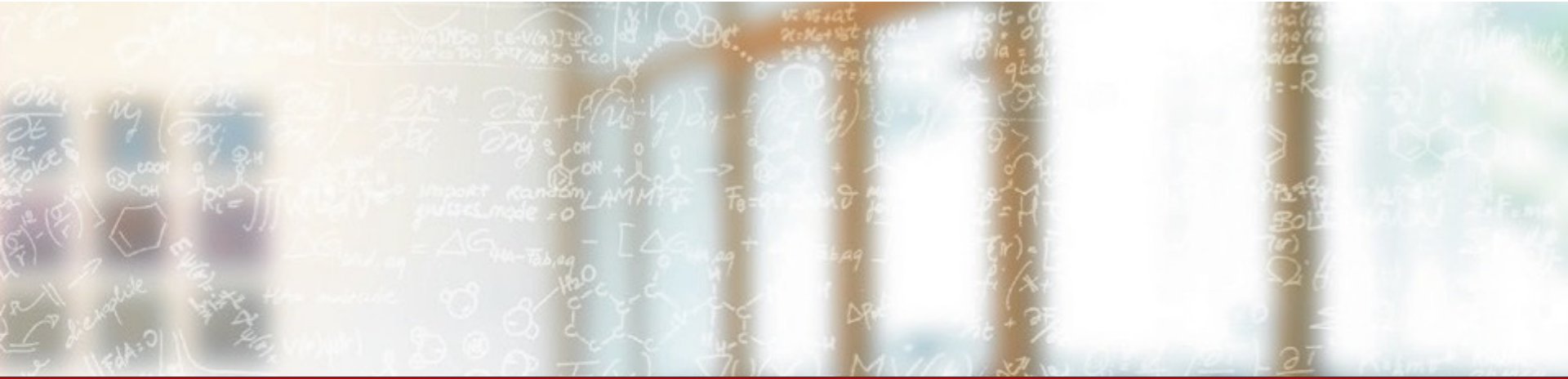




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# Domain specific libraries

Material science codes on innovative HPC architectures

Anton Kozhevnikov, CSCS

December 5, 2016



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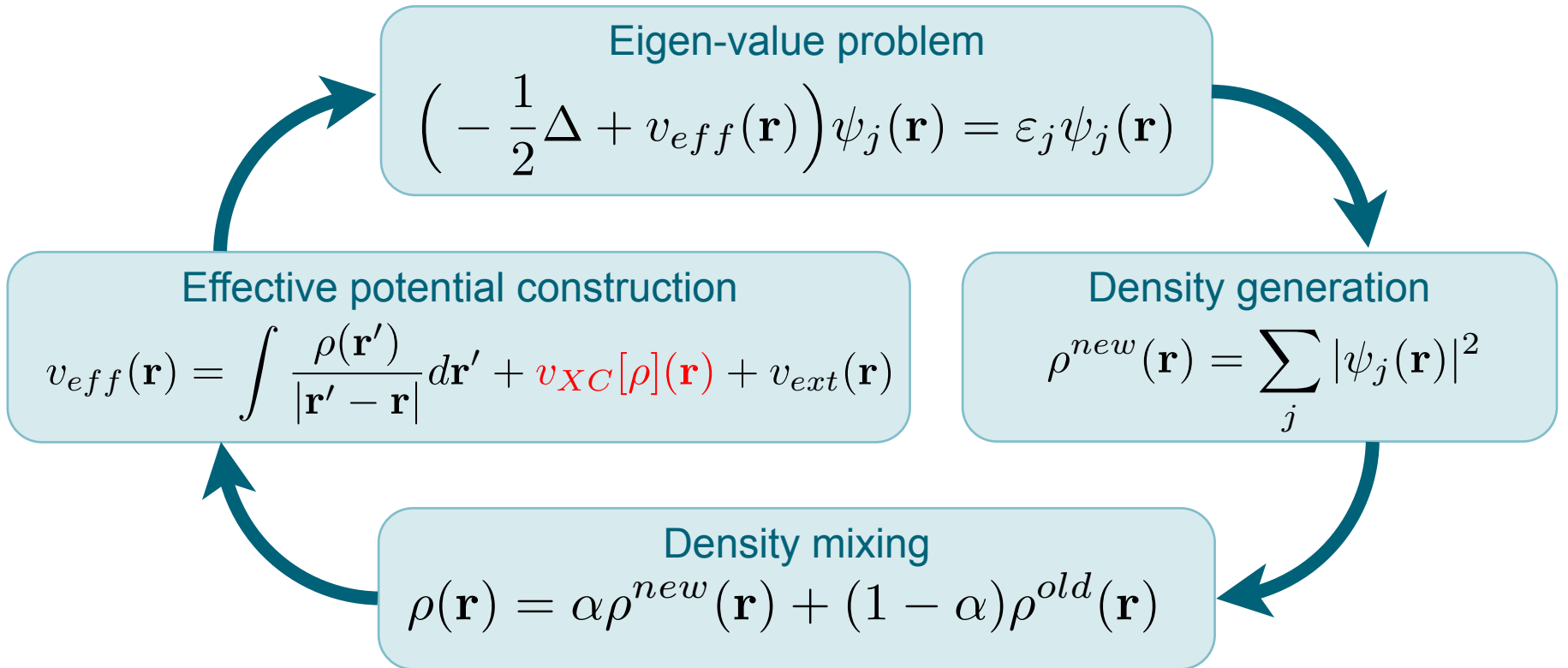
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# Part 1: Introduction

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# Kohn-Shame equations



## Output:

wave-functions  $\psi_j(\mathbf{r})$  and eigen energies  $\varepsilon_j$   
charge density  $\rho(\mathbf{r})$  and magnetization  $\mathbf{m}(\mathbf{r})$   
total energy  $E_{tot}$  and atomic forces  $\mathbf{F}_\alpha$

## Derived objects:

Spectral functions  
Linear response functions  
Phonons, thermodynamic functions  
Parameters of lattice models

# Basis expansion

- Expand Kohn-Sham wave functions in a convenient basis set:

$$\psi_j(\mathbf{r}) = \sum_{\mu} C_{\mu j} \phi_{\mu}(\mathbf{r})$$

- Convert differential equation to an eigen-value problem:

$$\mathbf{H}\mathbf{C}_j = \varepsilon_j \mathbf{O}\mathbf{C}_j$$

where

$$H_{\mu\mu'} = \int \phi_{\mu}^*(\mathbf{r}) \left( -\frac{1}{2}\Delta + v_{eff}(\mathbf{r}) \right) \phi_{\mu'}(\mathbf{r}) d\mathbf{r}$$

$$O_{\mu\mu'} = \int \phi_{\mu}^*(\mathbf{r}) \phi_{\mu'}(\mathbf{r}) d\mathbf{r}$$

# Electronic structure codes

Code	Basis set
Quantum ESPRESSO VASP ABINIT PEtot CPMD QBOX CASTEP	plane-waves
SIESTA CRYSTAL FHI-AIMS FPLO OpenMX TB-LMTO	localized atom-centered orbitals
CP2K	gaussians + plane-waves
BigDFT	wavelets
WIEN2k FLEUR Exciting Eik	linearized augmented plane-waves
GPAW Octopus	real space grid / plane waves / atomic orbitals

# Plane-wave basis

Plane-wave with the wave-vector  $\mathbf{G}$

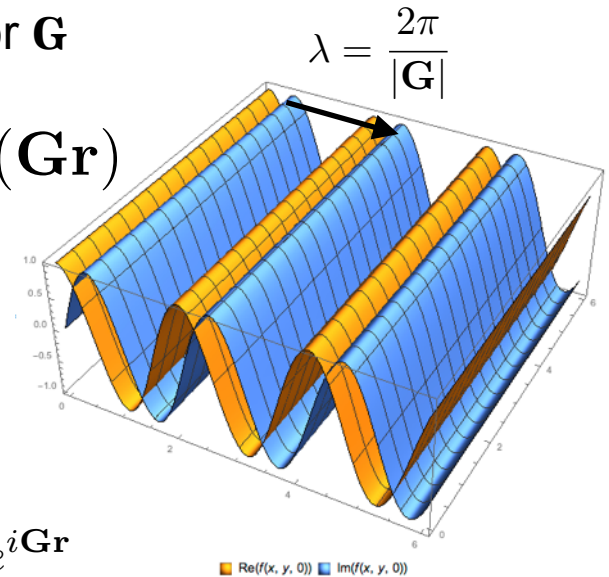
$$e^{i\mathbf{G}\mathbf{r}} = e^{i(xG_x + yG_y + zG_z)} = \cos(\mathbf{G}\mathbf{r}) + i \sin(\mathbf{G}\mathbf{r})$$

- Complete orthogonal basis
- Eigen-functions of the Laplace operator

$$\left( \frac{\partial^2}{\partial^2 x} + \frac{\partial^2}{\partial^2 y} + \frac{\partial^2}{\partial^2 z} \right) e^{i\mathbf{G}\mathbf{r}} = -G^2 e^{i\mathbf{G}\mathbf{r}}$$

- Fourier transformations can be rapidly evaluated with FFT
- Real-space integrals between periodic functions are represented as sums

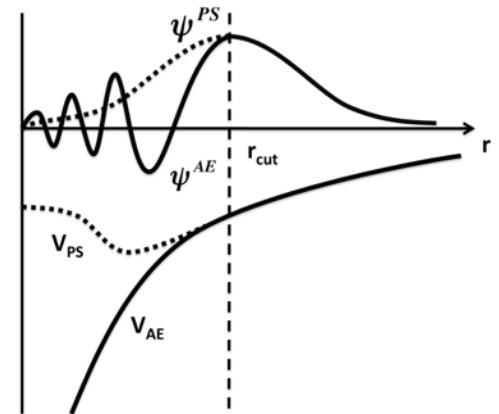
$$\int f^*(\mathbf{r})g(\mathbf{r})d\mathbf{r} = \frac{\Omega}{N} \sum_j f^*(\mathbf{r}_j)g(\mathbf{r}_j) = \sum_{\mathbf{G}} \tilde{f}^*(\mathbf{G})g(\mathbf{G})$$



# Pseudopotential

- Plane-wave basis requires a pseudopotential
- Unlike the true (all-electron) potential, pseudopotential has an additional non-local term:

$$\hat{V}_{\text{PS}} = V_{\text{loc}}(\mathbf{r}) + \sum_{\alpha} \sum_{\xi\xi'} |\beta_{\xi}^{\alpha}\rangle D_{\xi\xi'}^{\alpha} \langle\beta_{\xi'}^{\alpha}|$$



- Action of the pseudopotential on the wave-function:

$$\hat{V}_{\text{PS}}\psi(\mathbf{r}) = V_{\text{loc}}(\mathbf{r})\psi(\mathbf{r}) + \sum_{\alpha} \sum_{\xi\xi'} \beta_{\xi}^{\alpha}(\mathbf{r}) D_{\xi\xi'}^{\alpha} \int \beta_{\xi'}^{\alpha}(\mathbf{r})\psi(\mathbf{r}) d\mathbf{r}$$

# Eigen-value problem

$$\mathbf{H}\tilde{\psi}_j = \varepsilon_j\tilde{\psi}_j \quad \text{in case of norm-conserving pseudopotential}$$

$$\mathbf{H}\tilde{\psi}_j = \varepsilon_j\mathbf{S}\tilde{\psi}_j \quad \text{in case of ultrasoft pseudopotential}$$

- **H** and **S** are dense Hermitian matrices of large dimension ( $\sim 1000$  PW / atom).



# Eigen-value problem

$$\mathbf{H}\tilde{\psi}_j = \varepsilon_j\tilde{\psi}_j \quad \text{in case of norm-conserving pseudopotential}$$

$$\mathbf{H}\tilde{\psi}_j = \varepsilon_j\mathbf{S}\tilde{\psi}_j \quad \text{in case of ultrasoft pseudopotential}$$

- **H** and **S** are dense Hermitian matrices of large dimension ( $\sim 1000$  PW / atom).
- Iterative subspace diagonalization methods are used.
  - Conjugate gradient
  - Davidson algorithm
  - RMM-DIIS
  - LOBPCG
  - Chebyshev filtering method
  - ...

# Hamiltonian operator application

- Any iterative solver requires  $\hat{H}|\psi\rangle$  operation

# Hamiltonian operator application

- Any iterative solver requires  $\hat{H}|\psi\rangle$  operation
- Result of Hamiltonian application

$$\tilde{h}_{\psi_j} = \mathbf{H}\tilde{\psi}_j = \int e^{-i\mathbf{G}\mathbf{r}} \hat{H}\psi_j(\mathbf{r})d\mathbf{r}$$

# Hamiltonian operator application

- Any iterative solver requires  $\hat{H}|\psi\rangle$  operation
- Result of Hamiltonian application

$$\tilde{h}_{\psi_j} = \mathbf{H}\tilde{\psi}_j = \int e^{-i\mathbf{G}\mathbf{r}} \hat{H}\psi_j(\mathbf{r})d\mathbf{r}$$

- Hamiltonian operator with pseudopotential

$$\hat{H} = -\frac{1}{2}\Delta + v_{eff}(\mathbf{r}) + \sum_{\alpha} \sum_{\xi\xi'} |\beta_{\xi}^{\alpha}\rangle D_{\xi\xi'}^{\alpha} \langle\beta_{\xi'}^{\alpha}|$$

# Hamiltonian operator application

Application of the local part of potential ( $V_{loc}$  kernel)

$$\tilde{\psi}_j(\mathbf{G}) \xrightarrow{FFT^{-1}} \psi_j(\mathbf{r}) \rightarrow v_{eff}(\mathbf{r})\psi_j(\mathbf{r}) \xrightarrow{FFT} \tilde{h}_{\psi_j}(\mathbf{G})$$

# Hamiltonian operator application

Application of the local part of potential ( $V_{loc}$  kernel)

$$\tilde{\psi}_j(\mathbf{G}) \xrightarrow{FFT^{-1}} \psi_j(\mathbf{r}) \rightarrow v_{eff}(\mathbf{r})\psi_j(\mathbf{r}) \xrightarrow{FFT} \tilde{h}_{\psi_j}(\mathbf{G})$$

```
do j = 1, num_psi
  ! transform psi to real-space domain
  call inverse_fft(psi(:,j), psi_of_r(:))
  ! multiply by effective potential
  do ir = 1, num_r_points
    psi_of_r(ir) = psi_of_r(ir) * veff(ir)
  end do
  ! tranform back to PW domain
  call forward_fft(psi_of_r(:), hpsi(:,j))
end do
```

Two FFTs for each wave-function!

# Hamiltonian operator application

Application of Laplace operator

$$-\frac{1}{2}\Delta\psi_j(\mathbf{r}) = \sum_{\mathbf{G}} \left( -\frac{1}{2}\Delta e^{i\mathbf{G}\mathbf{r}} \right) \tilde{\psi}_j(\mathbf{G}) = \sum_{\mathbf{G}} e^{i\mathbf{G}\mathbf{r}} \frac{G^2}{2} \tilde{\psi}_j(\mathbf{G})$$

# Hamiltonian operator application

Application of Laplace operator

$$-\frac{1}{2}\Delta\psi_j(\mathbf{r}) = \sum_{\mathbf{G}} \left( -\frac{1}{2}\Delta e^{i\mathbf{G}\mathbf{r}} \right) \tilde{\psi}_j(\mathbf{G}) = \sum_{\mathbf{G}} e^{i\mathbf{G}\mathbf{r}} \frac{G^2}{2} \tilde{\psi}_j(\mathbf{G})$$

```
do j = 1, num_psi
  ! add kinetic energy contribution
  do ig = 1, num_gvec
    hpsi(ig, j) = hpsi(ig, j) + pw_ekin(ig) * psi(ig, j)
  end do
end do
```



# Hamiltonian operator application

Application of non-local part of potential:  $\sum_{\alpha\xi\xi'} |\beta_\xi^\alpha\rangle D_{\xi\xi'}^\alpha \langle\beta_{\xi'}^\alpha|$

$$\sum_{\alpha\xi} \beta_\xi^\alpha(\mathbf{G}) \sum_{\xi'} D_{\xi\xi'}^\alpha \sum_{\mathbf{G}'} \beta_{\xi'}^{\alpha*}(\mathbf{G}') \tilde{\psi}_j(\mathbf{G}') \rightarrow \tilde{h}_{\psi_j}(\mathbf{G})$$

Diagram illustrating the application of the non-local part of the potential operator. The expression is annotated with red brackets and labels indicating the order of operations:

- zgemm#1**: A red bracket under the innermost sum over  $\mathbf{G}'$ , indicating the first operation.
- zgemm#2**: A red bracket under the middle sum over  $\xi'$ , indicating the second operation.
- zgemm#3**: A red bracket under the entire expression, indicating the final operation.

# Hamiltonian operator application

Application of non-local part of potential:  $\sum_{\alpha\xi\xi'} |\beta_\xi^\alpha\rangle D_{\xi\xi'}^\alpha \langle\beta_{\xi'}^\alpha|$

$$\sum_{\alpha\xi} \beta_\xi^\alpha(\mathbf{G}) \sum_{\xi'} D_{\xi\xi'}^\alpha \sum_{\mathbf{G}'} \beta_{\xi'}^{\alpha*}(\mathbf{G}') \tilde{\psi}_j(\mathbf{G}') \rightarrow \tilde{h}_{\psi_j}(\mathbf{G})$$

Diagram illustrating the application of the non-local part of the potential operator. The expression is:  $\sum_{\alpha\xi} \beta_\xi^\alpha(\mathbf{G}) \sum_{\xi'} D_{\xi\xi'}^\alpha \sum_{\mathbf{G}'} \beta_{\xi'}^{\alpha*}(\mathbf{G}') \tilde{\psi}_j(\mathbf{G}') \rightarrow \tilde{h}_{\psi_j}(\mathbf{G})$ . Red brackets indicate the order of operations: **zgemm#1** (innermost,  $\sum_{\mathbf{G}'}$ ), **zgemm#2** (middle,  $\sum_{\xi'}$ ), and **zgemm#3** (outermost,  $\sum_{\alpha\xi}$ ).

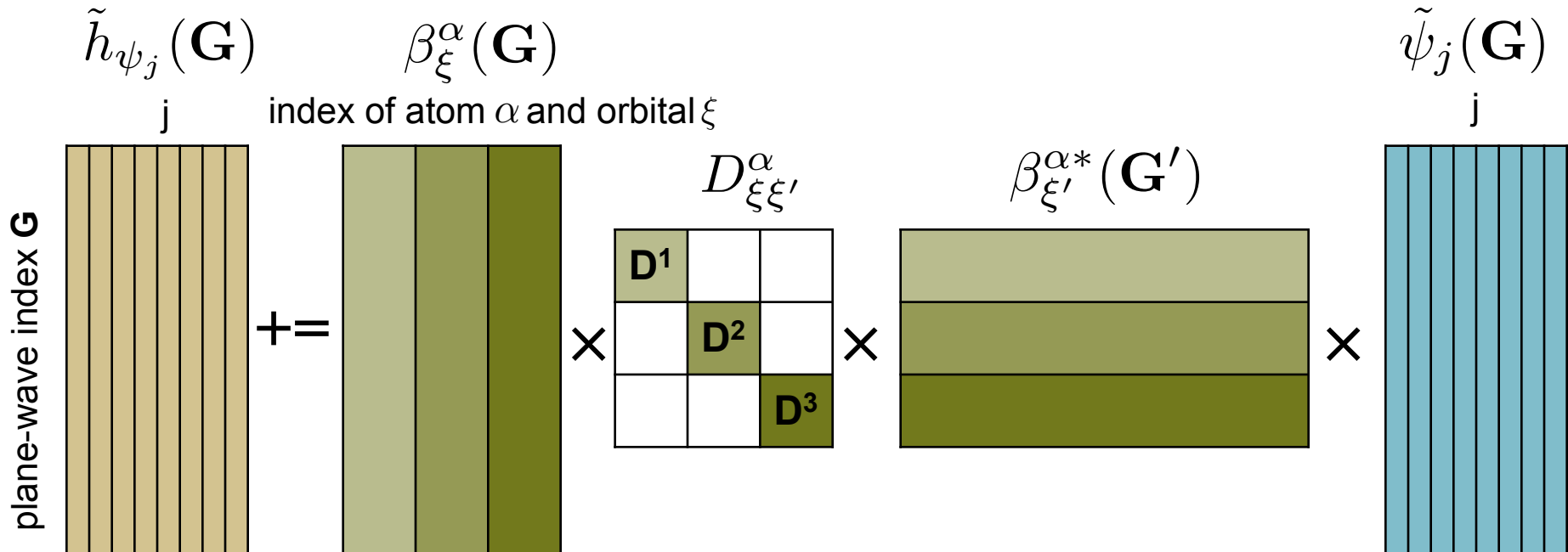
```
! compute <beta|psi>
call zgemm('C', 'N', num_beta_tot, num_psi, num_pw, beta_pw, psi, beta_psi)
! apply block-diagonal D matrix
do ia = 1, num_atoms
  call zgemm('N', 'N', num_beta(ia), num_psi, num_beta(ia),
            D(:, :, ia), beta_psi(offset(ia), 1), d_beta_psi(offset(ia), 1))
end do
! compute beta*D*<beta|psi>
call zgemm('N', 'N', num_pw, num_psi, num_beta_tot, beta_pw, d_beta_psi, hpsi)
```

# Hamiltonian operator application

Application of non-local part of potential:  $\sum_{\alpha\xi\xi'} |\beta_\xi^\alpha\rangle D_{\xi\xi'}^\alpha \langle\beta_{\xi'}^\alpha|$

$$\sum_{\alpha\xi} \beta_\xi^\alpha(\mathbf{G}) \sum_{\xi'} D_{\xi\xi'}^\alpha \sum_{\mathbf{G}'} \beta_{\xi'}^{\alpha*}(\mathbf{G}') \tilde{\psi}_j(\mathbf{G}') \rightarrow \tilde{h}_{\psi_j}(\mathbf{G})$$

zgemm#1 (under  $\mathbf{G}'$ )  
zgemm#2 (under  $\xi'$  and  $\mathbf{G}'$ )  
zgemm#3 (under  $\alpha\xi$ ,  $\xi'$ , and  $\mathbf{G}'$ )



# Davidson iterative solver

- We want to compute  $\mathbf{H}\tilde{\psi}_j = \varepsilon_j\tilde{\psi}_j$
- We know how to compute  $\tilde{h}_{\psi_j} = \mathbf{H}\tilde{\psi}_j$

# Davidson iterative solver

- We want to compute  $\mathbf{H}\tilde{\psi}_j = \varepsilon_j\tilde{\psi}_j$
- We know how to compute  $\tilde{h}_{\psi_j} = \mathbf{H}\tilde{\psi}_j$

Key idea of Davidson iterative solver: start with a subspace spanned by a guess to  $\psi_j$  and expand it with preconditioned residuals

# Davidson iterative solver

- Initialize the trial basis set:

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

# Davidson iterative solver

- Initialize the trial basis set:
- Apply Hamiltonian to the basis functions:

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

$$\tilde{h}_{\phi_j^m} = \mathbf{H}\tilde{\phi}_j^m$$

# Davidson iterative solver

- Initialize the trial basis set:
- Apply Hamiltonian to the basis functions:
- Compute reduced Hamiltonian matrix:

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

$$\tilde{h}_{\phi_j^m} = \mathbf{H}\tilde{\phi}_j^m$$

$$h_{jj'}^m = \sum_{\mathbf{G}} \tilde{\phi}_j^{m*}(\mathbf{G}) \tilde{h}_{\phi_{j'}}^m(\mathbf{G})$$



# Davidson iterative solver

- Initialize the trial basis set:
- Apply Hamiltonian to the basis functions:
- Compute reduced Hamiltonian matrix:
- Diagonalize reduced Hamiltonian matrix and get N lowest eigen pairs:

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

$$\tilde{h}_{\phi_j^m} = \mathbf{H}\tilde{\phi}_j^m$$

$$h_{jj'}^m = \sum_{\mathbf{G}} \tilde{\phi}_j^{m*}(\mathbf{G}) \tilde{h}_{\phi_{j'}}^m(\mathbf{G})$$

$$\mathbf{h}^m \mathbf{Z}^m = \epsilon_j \mathbf{Z}^m$$

# Davidson iterative solver

- Initialize the trial basis set:
- Apply Hamiltonian to the basis functions:
- Compute reduced Hamiltonian matrix:
- Diagonalize reduced Hamiltonian matrix and get N lowest eigen pairs:
- Compute residuals ( $R_j = \hat{H}\psi_j - \epsilon_j\psi_j$ ):

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

$$\tilde{h}_{\phi_j^m} = \mathbf{H}\tilde{\phi}_j^m$$

$$h_{jj'}^m = \sum_{\mathbf{G}} \tilde{\phi}_j^{m*}(\mathbf{G}) \tilde{h}_{\phi_{j'}}^m(\mathbf{G})$$

$$\mathbf{h}^m \mathbf{Z}^m = \epsilon_j \mathbf{Z}^m$$

$$\tilde{R}_j^m = \tilde{h}_{\phi_j^m} \mathbf{Z}^m - \epsilon_j \tilde{\phi}_j^m \mathbf{Z}^m$$

# Davidson iterative solver

- Initialize the trial basis set:
- Apply Hamiltonian to the basis functions:
- Compute reduced Hamiltonian matrix:
- Diagonalize reduced Hamiltonian matrix and get N lowest eigen pairs:
- Compute residuals ( $R_j = \hat{H}\psi_j - \epsilon_j\psi_j$ ):
- Apply preconditioner to the unconverged residuals, orthogonalize and add the resulting functions to the basis:

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

$$\tilde{h}_{\phi_j^m} = \mathbf{H}\tilde{\phi}_j^m$$

$$h_{jj'}^m = \sum_{\mathbf{G}} \tilde{\phi}_j^{m*}(\mathbf{G}) \tilde{h}_{\phi_{j'}}^m(\mathbf{G})$$

$$\mathbf{h}^m \mathbf{Z}^m = \epsilon_j \mathbf{Z}^m$$

$$\tilde{R}_j^m = \tilde{h}_{\phi_j^m} \mathbf{Z}^m - \epsilon_j \tilde{\phi}_j^m \mathbf{Z}^m$$

$$\{\tilde{\phi}_j^{m+1}\} = \{\tilde{\phi}_j^m\} \oplus \{P\tilde{R}_j^m\}$$

# Davidson iterative solver

- Initialize the trial basis set:
- Apply Hamiltonian to the basis functions:
- Compute reduced Hamiltonian matrix:
- Diagonalize reduced Hamiltonian matrix and get N lowest eigen pairs:
- Compute residuals ( $R_j = \hat{H}\psi_j - \epsilon_j\psi_j$ ):
- Apply preconditioner to the unconverged residuals, orthogonalize and add the resulting functions to the basis:
- Recompute the wave-functions:

$$\tilde{\phi}_j^0 \leftarrow \tilde{\psi}_j$$

$$\tilde{h}_{\phi_j^m} = \mathbf{H}\tilde{\phi}_j^m$$

$$h_{jj'}^m = \sum_{\mathbf{G}} \tilde{\phi}_j^{m*}(\mathbf{G}) \tilde{h}_{\phi_{j'}}^m(\mathbf{G})$$

$$\mathbf{h}^m \mathbf{Z}^m = \epsilon_j \mathbf{Z}^m$$

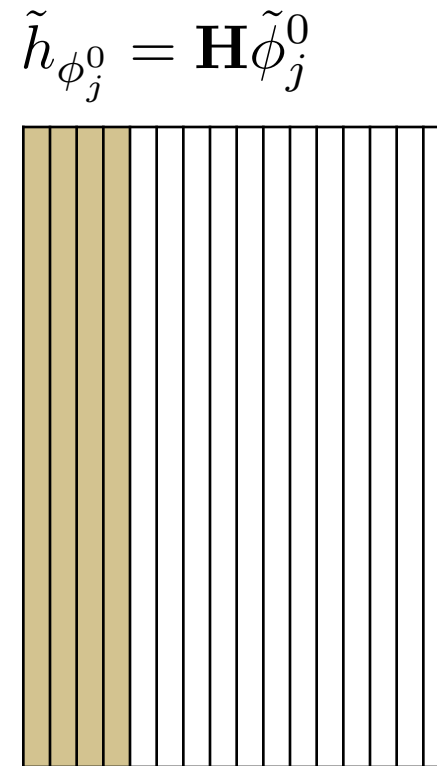
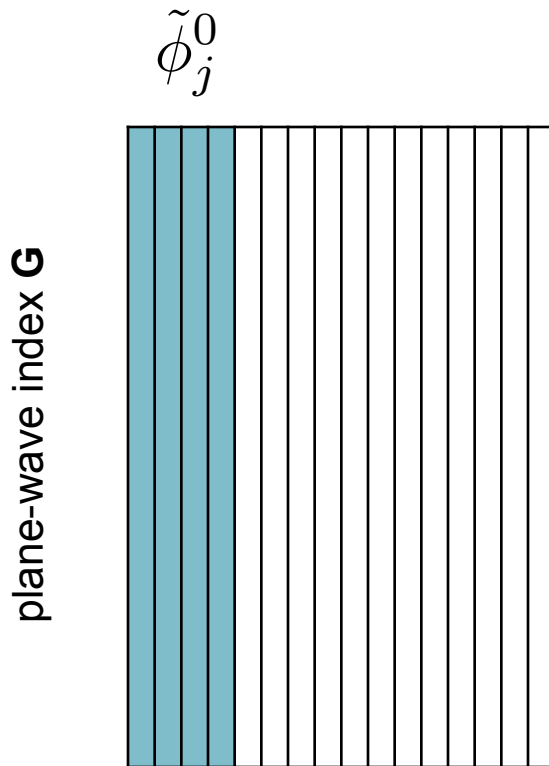
$$\tilde{R}_j^m = \tilde{h}_{\phi_j^m} \mathbf{Z}^m - \epsilon_j \tilde{\phi}_j^m \mathbf{Z}^m$$

$$\{\tilde{\phi}_j^{m+1}\} = \{\tilde{\phi}_j^m\} \oplus \{P\tilde{R}_j^m\}$$

$$\tilde{\psi}_j = \tilde{\phi}_j^m \mathbf{Z}^m$$

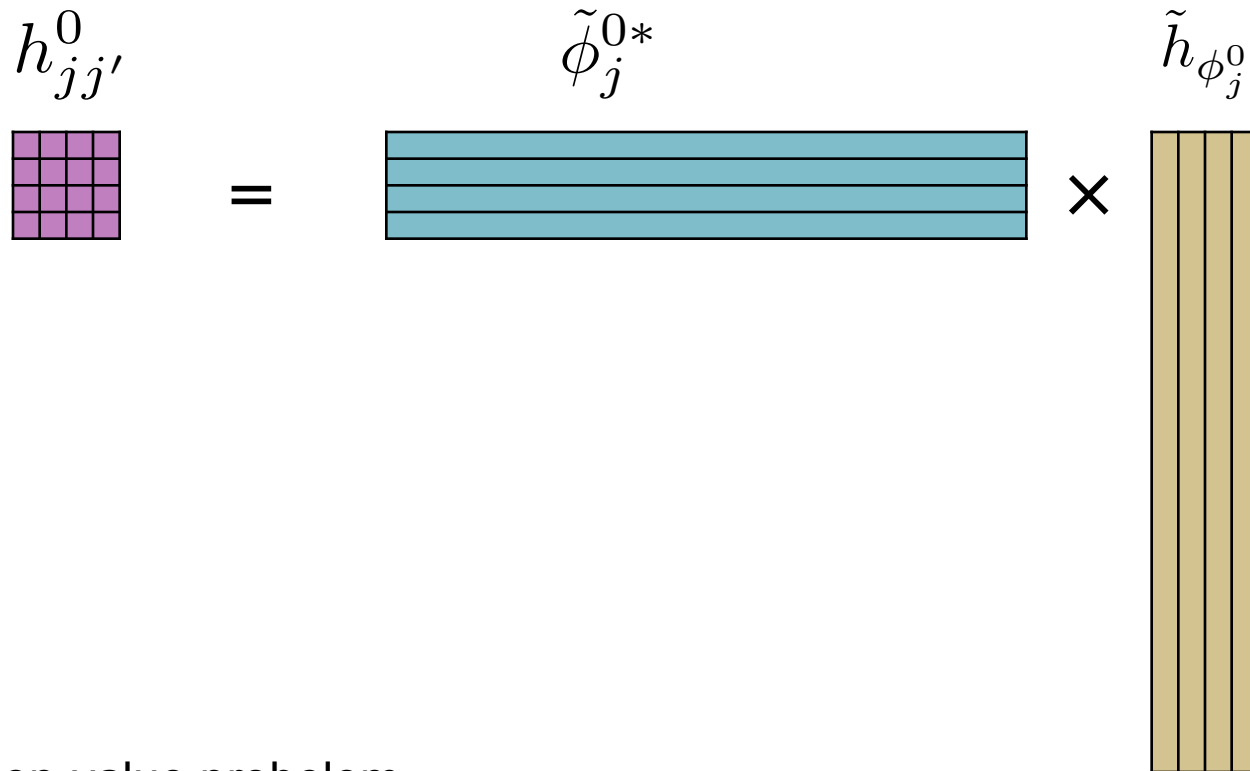
# Davidson iterative solver

- Initialize subspace basis functions and apply Hamiltonian

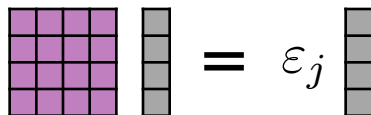


# Davidson iterative solver

- Compute reduced Hamiltonian matrix

$$h_{jj'}^0 = \tilde{\phi}_j^{0*} \tilde{h}_{\phi_j^0}$$


- Compute eigen-value problem

$$h_{jj'}^0 \mathbf{v}_j = \epsilon_j \mathbf{v}_j$$


# Davidson iterative solver

- Compute residuals

$$\tilde{R}_j^0 = \tilde{h}_{\phi_j}^0 \mathbf{Z}^0 - \tilde{\phi}_j^0 \mathbf{Z}^0 \epsilon_j \delta_{jj'}$$

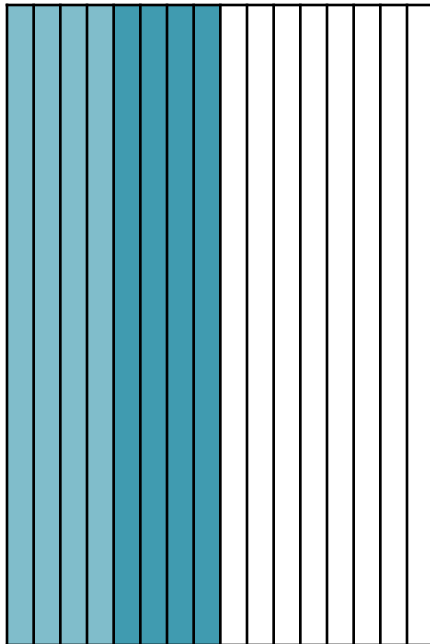
- Apply preconditioner:  $P\tilde{R}_j^0(\mathbf{G}) = (H_{\mathbf{G}\mathbf{G}} - \varepsilon_j)^{-1} \tilde{R}_j^0(\mathbf{G})$

# Davidson iterative solver

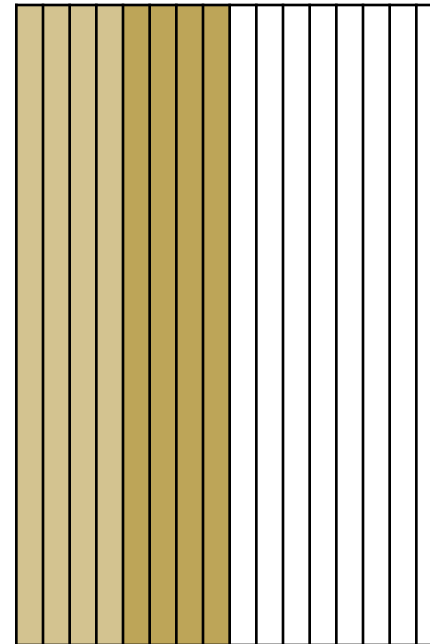
- Expand variational space and apply Hamiltonian to new basis functions

$$\tilde{\phi}_j^1 = \tilde{\phi}_j^0 \oplus P\tilde{R}_j^0$$

plane-wave index  $\mathbf{G}$



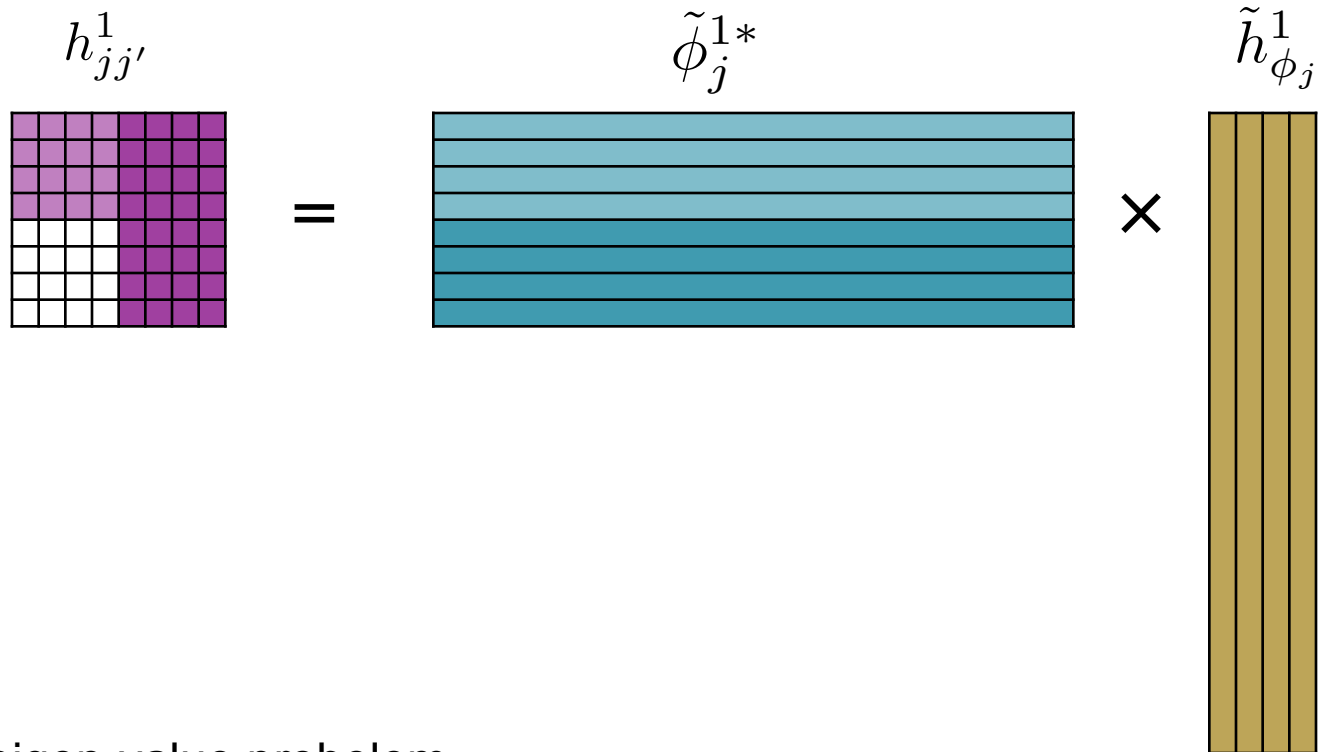
$$\tilde{h}_{\phi_j^1} = \mathbf{H}\tilde{\phi}_j^1$$



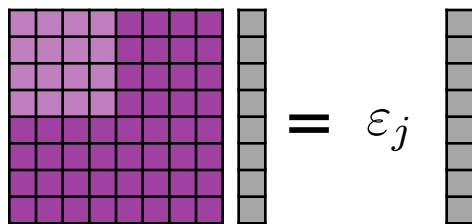


# Davidson iterative solver

- Compute reduced Hamiltonian matrix



- Compute eigen-value problem



# Davidson iterative solver

- Compute residuals

$$\tilde{R}_j^1 = \tilde{h}_{\phi_j}^1 \times \mathbf{Z}^1 - \tilde{\phi}_j^1 \times \mathbf{Z}^1 \times \epsilon_j \delta_{jj'}$$

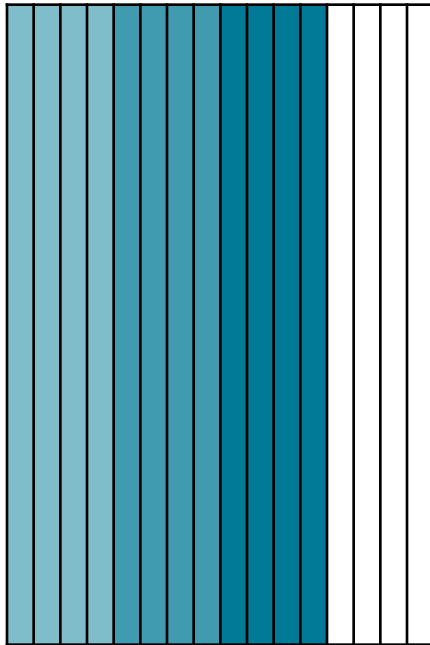
- Apply preconditioner:  $P\tilde{R}_j^1(\mathbf{G}) = (H_{\mathbf{G}\mathbf{G}} - \epsilon_j)^{-1} \tilde{R}_j^1(\mathbf{G})$

# Davidson iterative solver

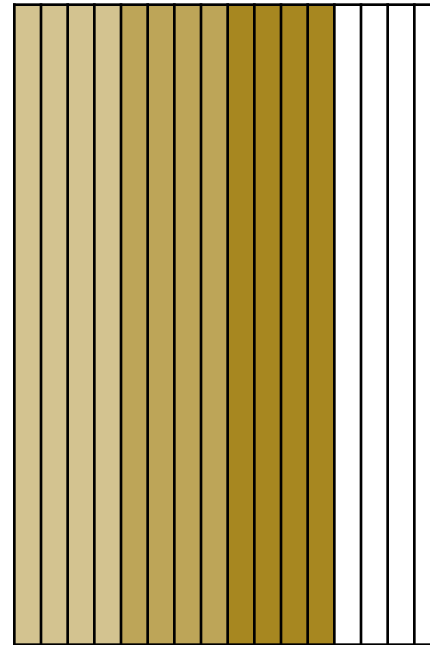
- Continue to expand variational space

$$\tilde{\phi}_j^2 = \tilde{\phi}_j^1 \oplus P\tilde{R}_j^1$$

plane-wave index **G**



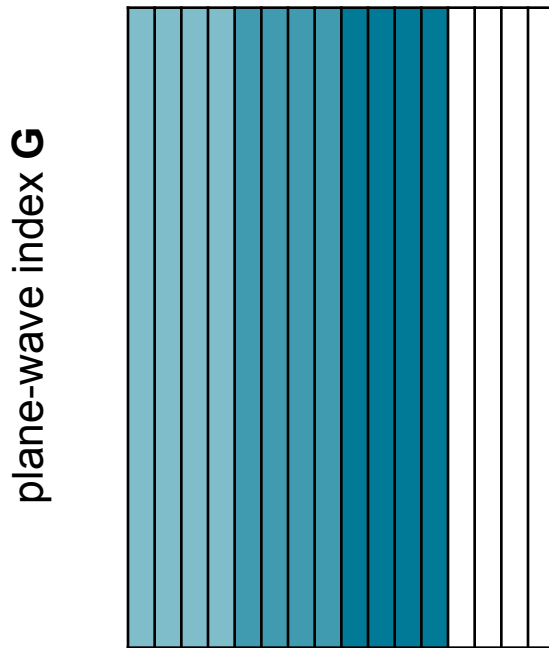
$$\tilde{h}_{\phi_j^2} = \mathbf{H}\tilde{\phi}_j^2$$



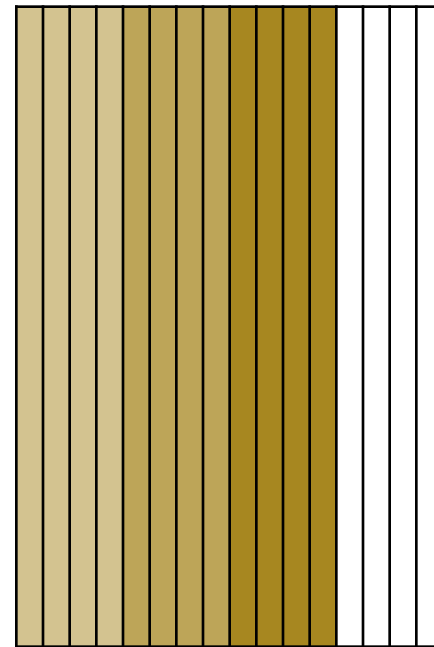
# Davidson iterative solver

- Continue to expand variational space

$$\tilde{\phi}_j^2 = \tilde{\phi}_j^1 \oplus P\tilde{R}_j^1$$



$$\tilde{h}_{\phi_j^2} = \mathbf{H}\tilde{\phi}_j^2$$



Iterate until the convergence (all residuals are zero) is reached

# Davidson iterative solver

- Recompute the wave-functions

$$\tilde{\psi}_j = \tilde{\phi}_j^m \times \mathbf{Z}^m$$

- Take  $\varepsilon_j$  from the last subspace diagonalization



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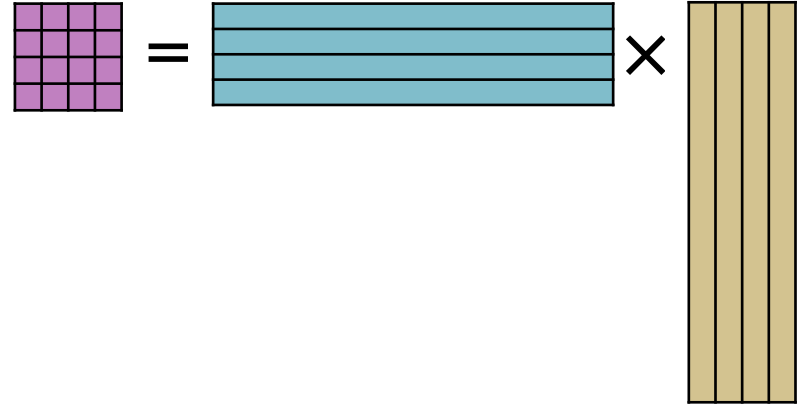
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## Part 2: Implementation details

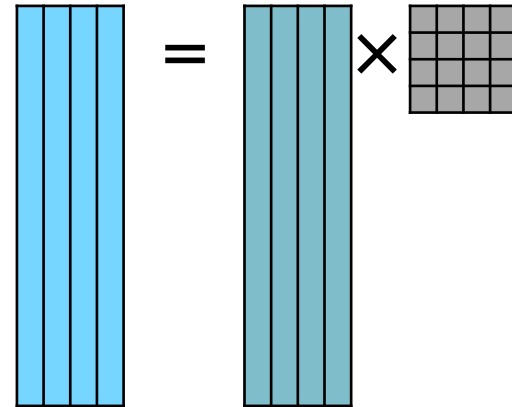
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# Common operations

- FFTs ( $V_{loc}$  kernel, density summation)
- Subspace Hamiltonian construction



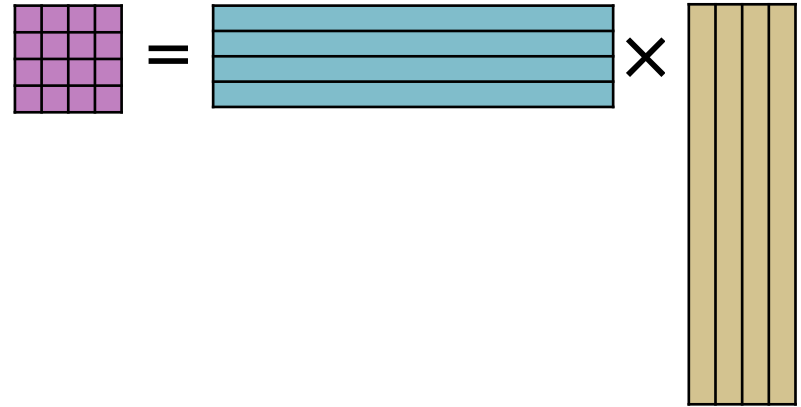
- Wave-functions and residuals update



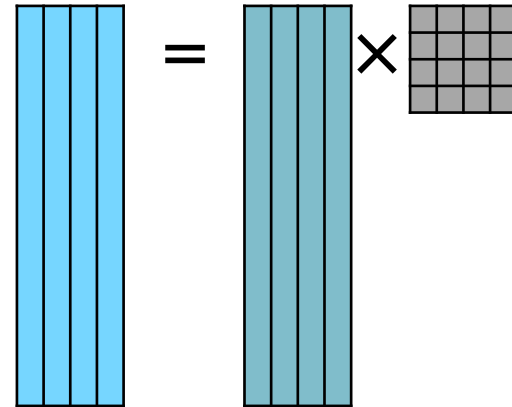
- Wave-function orthogonalization

# Common operations

- FFTs ( $V_{loc}$  kernel, density summation)
- Subspace Hamiltonian construction



- Wave-functions and residuals update



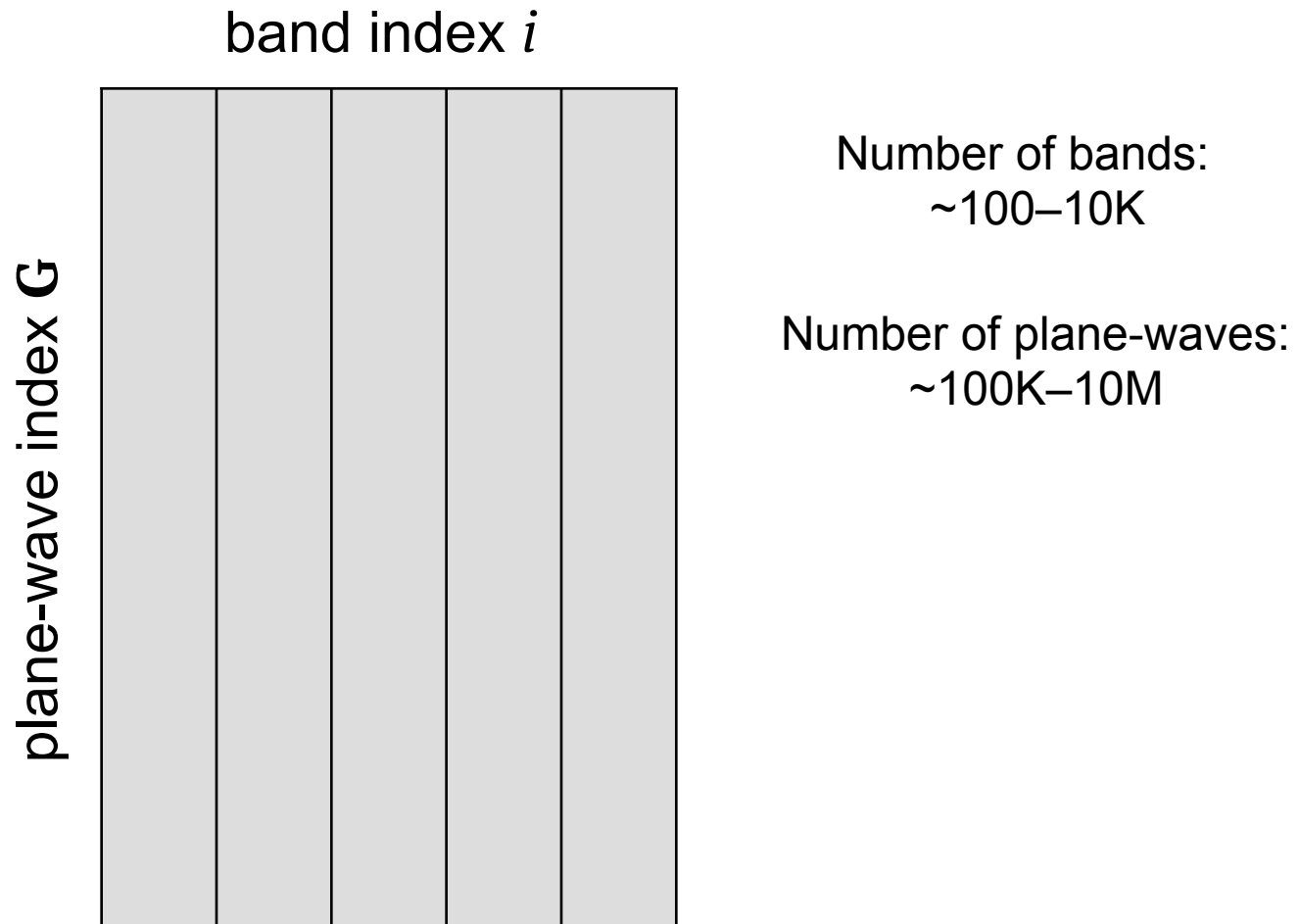
- Wave-function orthogonalization

**Need scalable parallel implementation!**



# Wave-function storage and distribution

Wave-functions  $\Psi_i(\mathbf{G})$  are stored as a matrix: each column of the matrix represents a single wave-function.



# Wave-function storage and distribution

How to distribute the matrix of plane-wave coefficients?

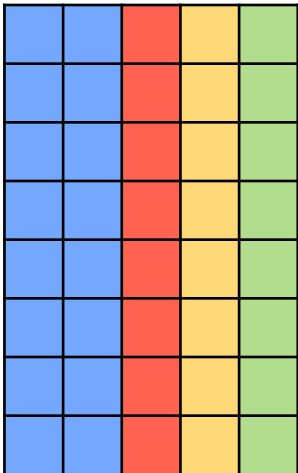
# Wave-function storage and distribution

How to distribute the matrix of plane-wave coefficients?

Split bands

band index  $i$

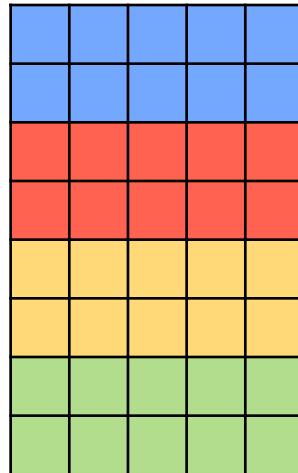
plane-wave index  $\mathbf{G}$



Split  $\mathbf{G}$ -vectors

band index  $i$

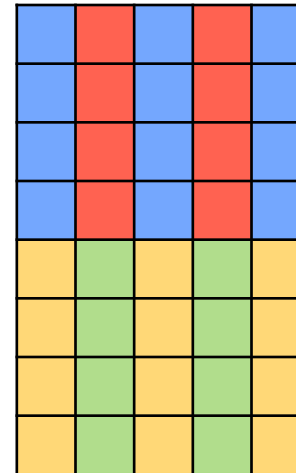
plane-wave index  $\mathbf{G}$



Split bands and  $\mathbf{G}$ -vectors

band index  $i$

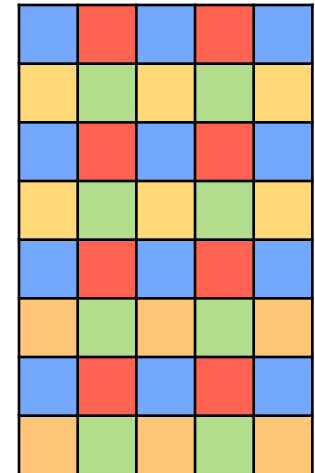
plane-wave index  $\mathbf{G}$



2D block-cyclic distribution

band index  $i$

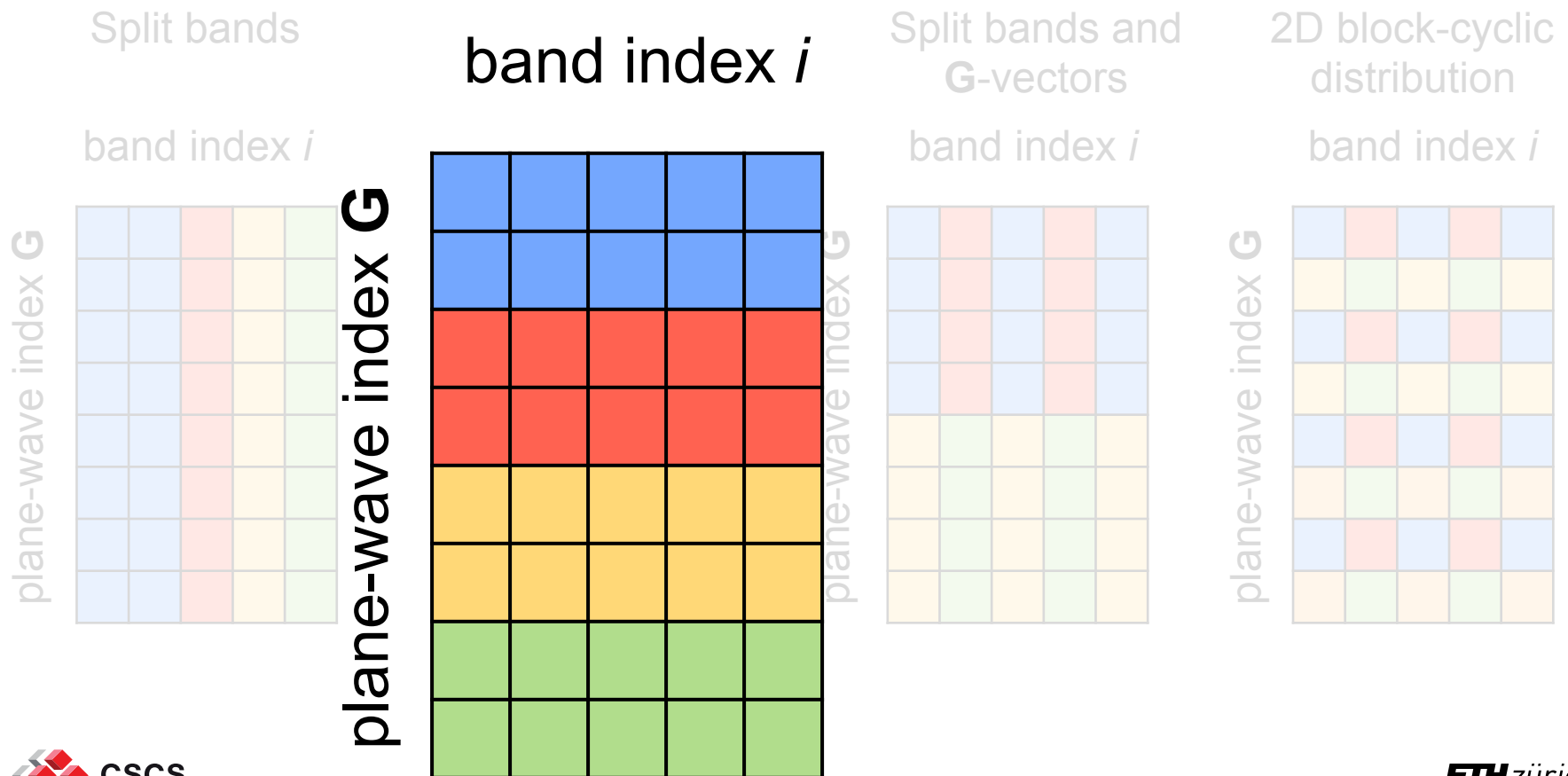
plane-wave index  $\mathbf{G}$



# Wave-function storage and distribution

How to distribute the matrix of plane-wave coefficients?

## Split $\mathbf{G}$ -vectors



# FFT kernel

do  $i=1, N_b$

$$\Psi_i(\mathbf{G}) \xrightarrow{FFT^{-1}} \Psi_i(\mathbf{r}) \rightarrow \Psi_i(\mathbf{r}) \cdot V_{loc}(\mathbf{r}) \xrightarrow{FFT} [\Psi_i V](\mathbf{G})$$

enddo

# FFT kernel

do  $i=1, N_b$

$$\Psi_i(\mathbf{G}) \xrightarrow{FFT^{-1}} \Psi_i(\mathbf{r}) \rightarrow \Psi_i(\mathbf{r}) \cdot V_{loc}(\mathbf{r}) \xrightarrow{FFT} [\Psi_i V](\mathbf{G})$$

enddo

Wave-functions in the plane-wave domain are defined inside a sphere with a given energy cutoff:

$$\Psi_i(\mathbf{G}) \neq 0 \text{ for } |\mathbf{G}| \leq G_{max}; \quad \frac{G_{max}^2}{2} = E_{cut}$$

# FFT kernel

do  $i=1, N_b$

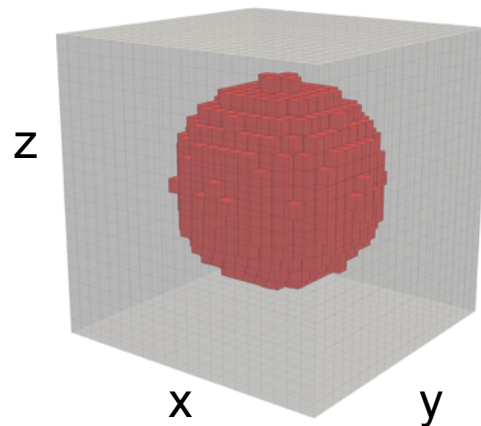
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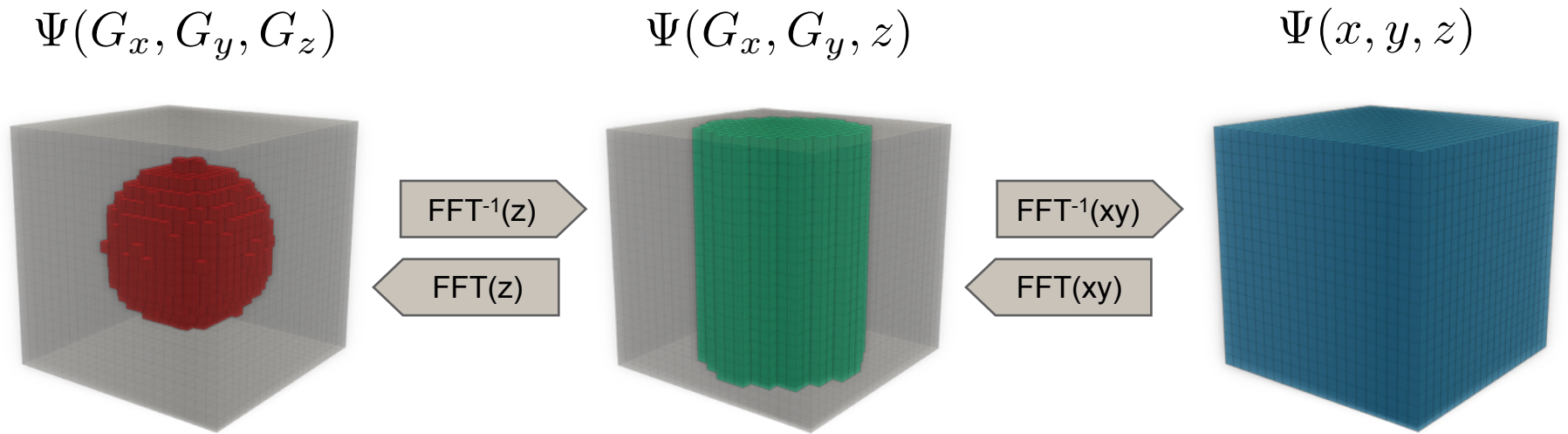
$$\Psi_i(\mathbf{G}) \neq 0 \text{ for } |\mathbf{G}| \leq G_{max}; \quad \frac{G_{max}^2}{2} = E_{cut}$$

FFT box for the  $V_{loc}$  kernel typically circumscribes a sphere of radius  $2G_{max}$ .



# FFT decomposition to 1D and 2D

The full 3D transformation is decomposed into a 1D transformation along the z-direction and a 2D transformation in the xy-plane:



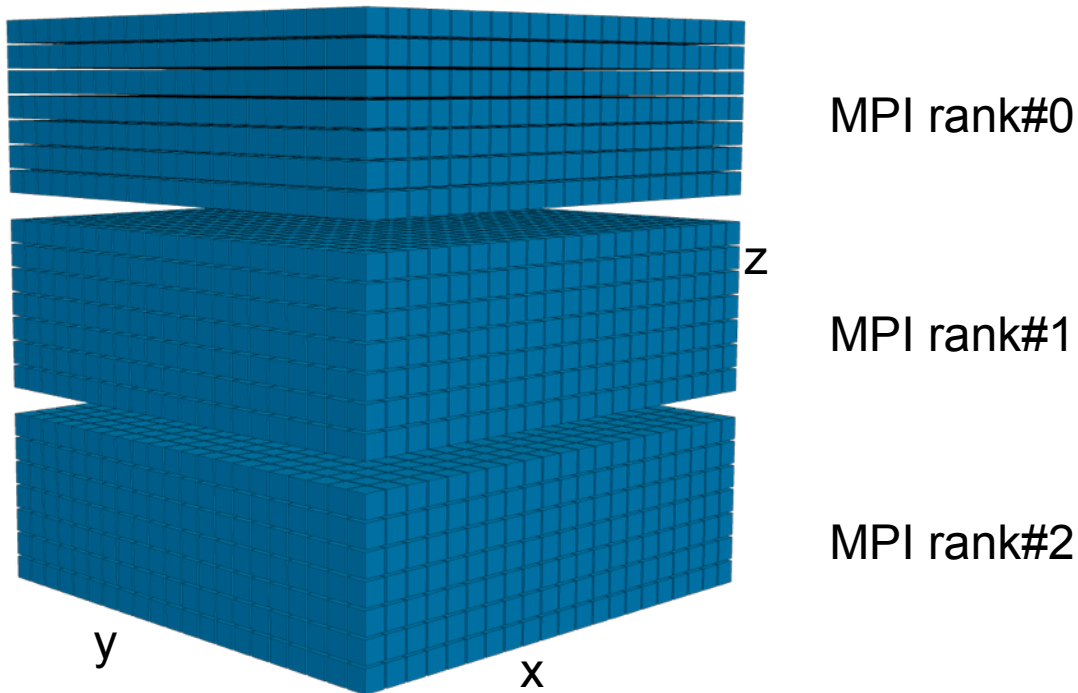


# FFT parallelization

# FFT parallelization

- In real space

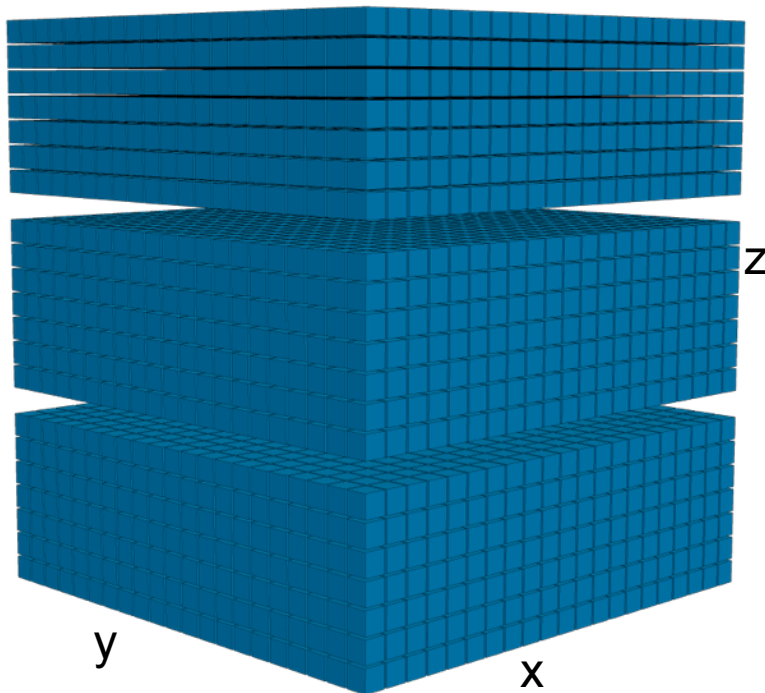
z-dimension of the FFT buffer is split among MPI ranks



# FFT parallelization

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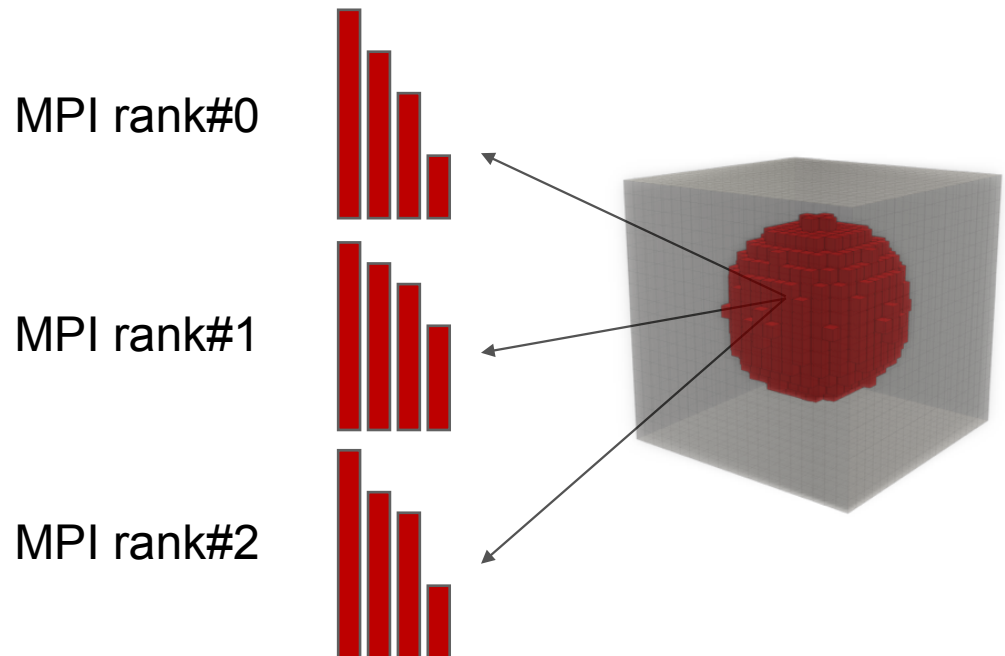
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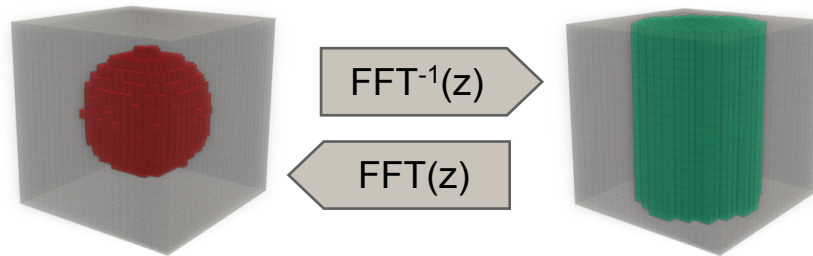
- In reciprocal space

z-sticks of the G-vector sphere are distributed among MPI ranks such that:

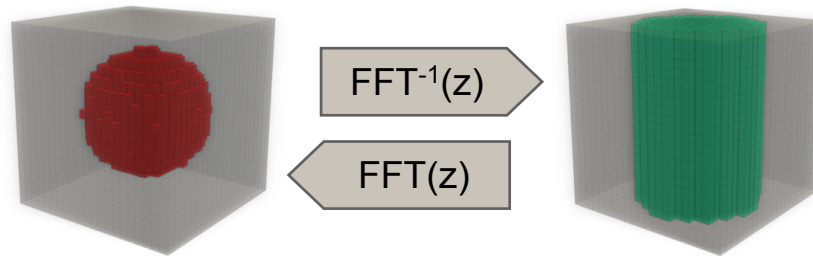
- local number of z-sticks is roughly equivalent
- sum of lengths of z-sticks (local number of G-vectors) is roughly equivalent



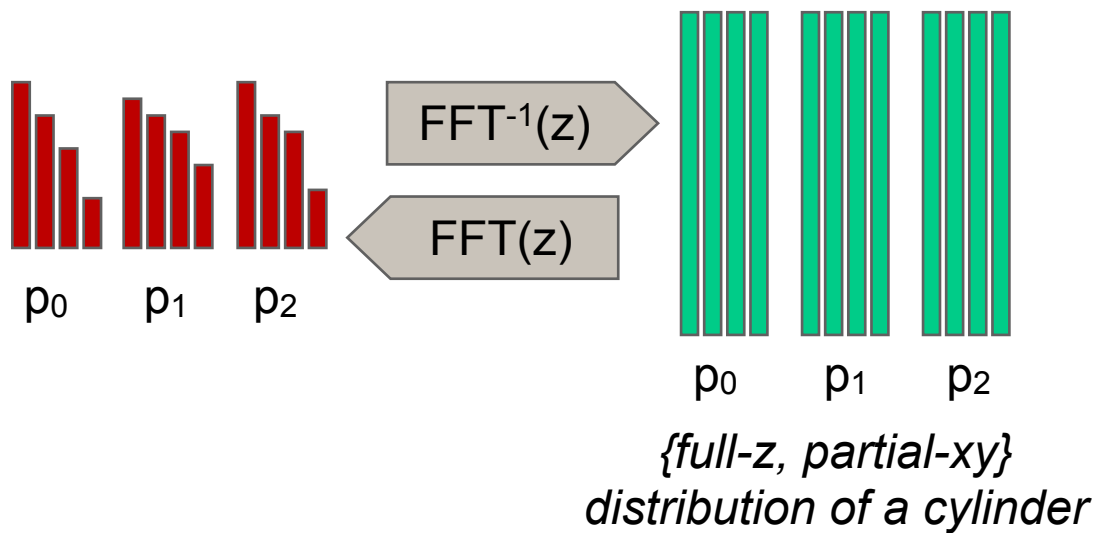
# Parallel transformation of z-sticks



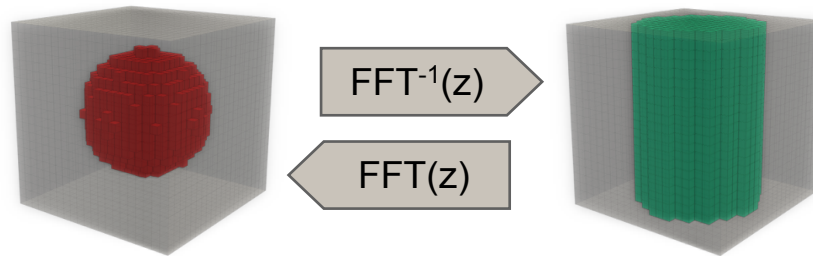
# Parallel transformation of z-sticks



- each rank executes 1D transformations of the local fraction of z-sticks

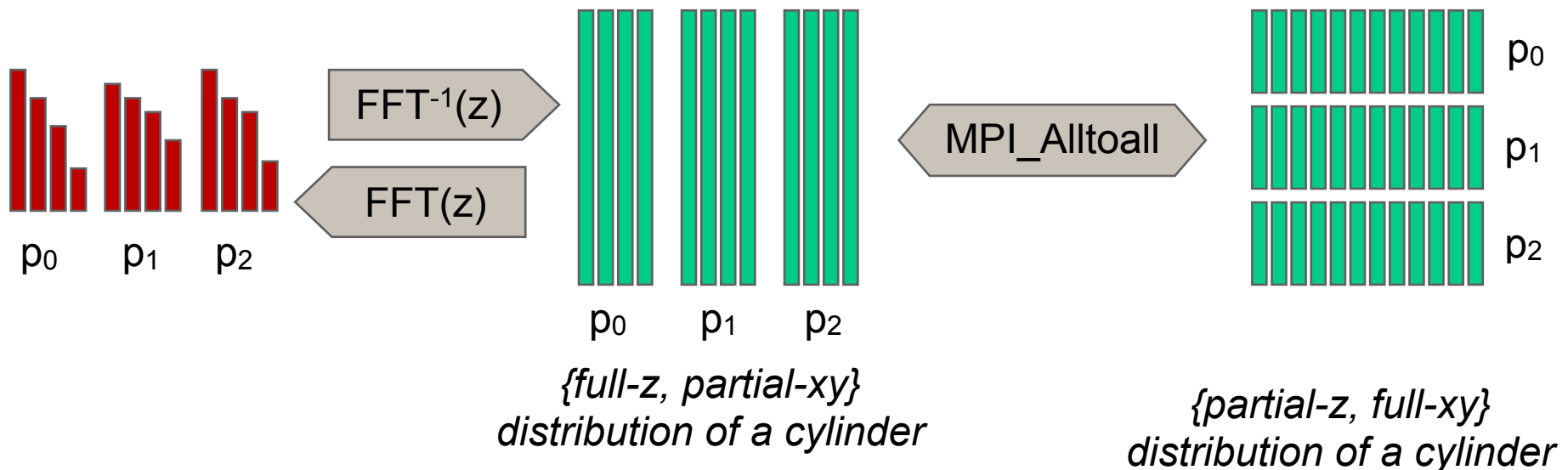


# Parallel transformation of z-sticks



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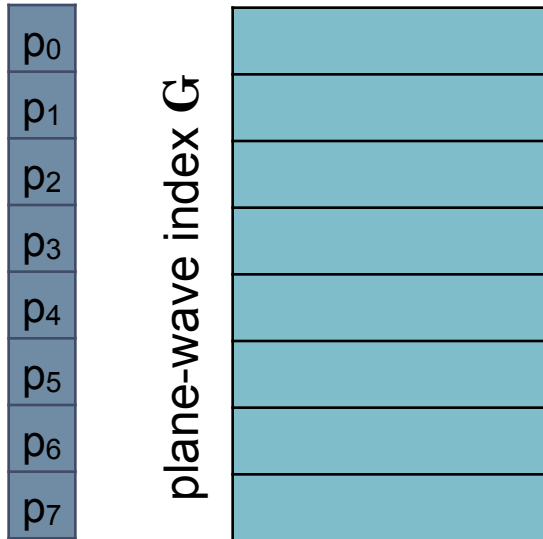
- z-sticks are swapped between MPI ranks using `MPI_Alltoall`



# Data redistribution

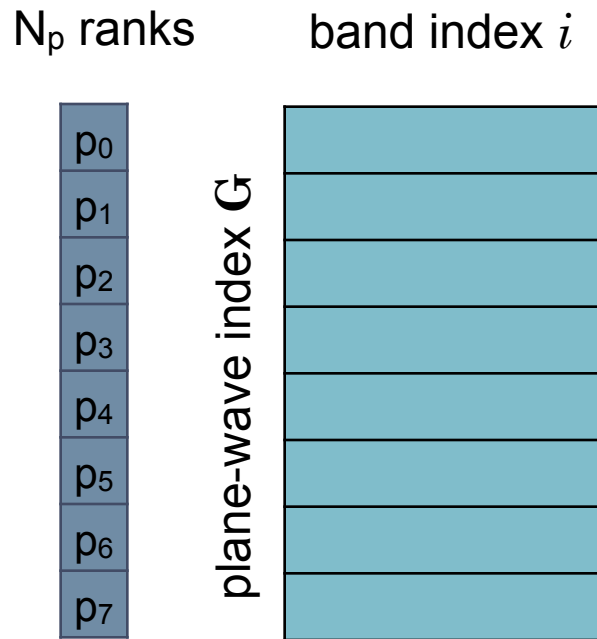
$N_p$  ranks

band index  $i$



# Data redistribution

- Using all available MPI ranks for a single FFT is not efficient!





# Data redistribution

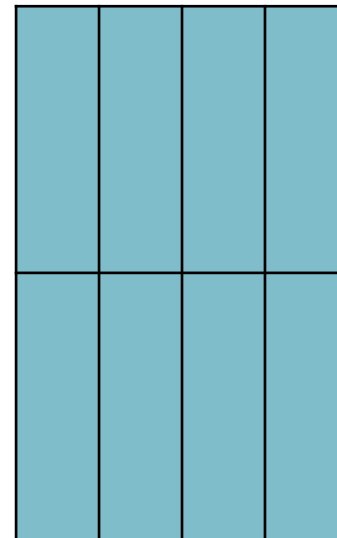
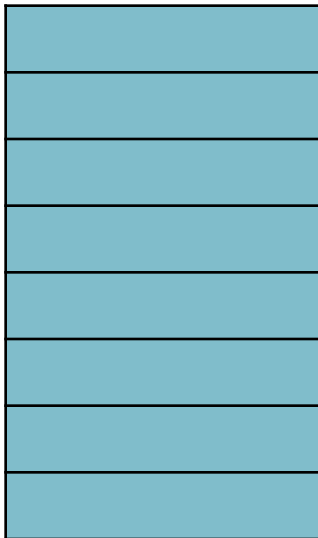
- Using all available MPI ranks for a single FFT is not efficient!
- Remap wave-functions to a 2D MPI grid where one dimension is dedicated to a parallel FFT and second dimension is used to distribute wave-function band index

$N_p$  ranks

band index  $i$

$p_0$   
 $p_1$   
 $p_2$   
 $p_3$   
 $p_4$   
 $p_5$   
 $p_6$   
 $p_7$

plane-wave index  $G$

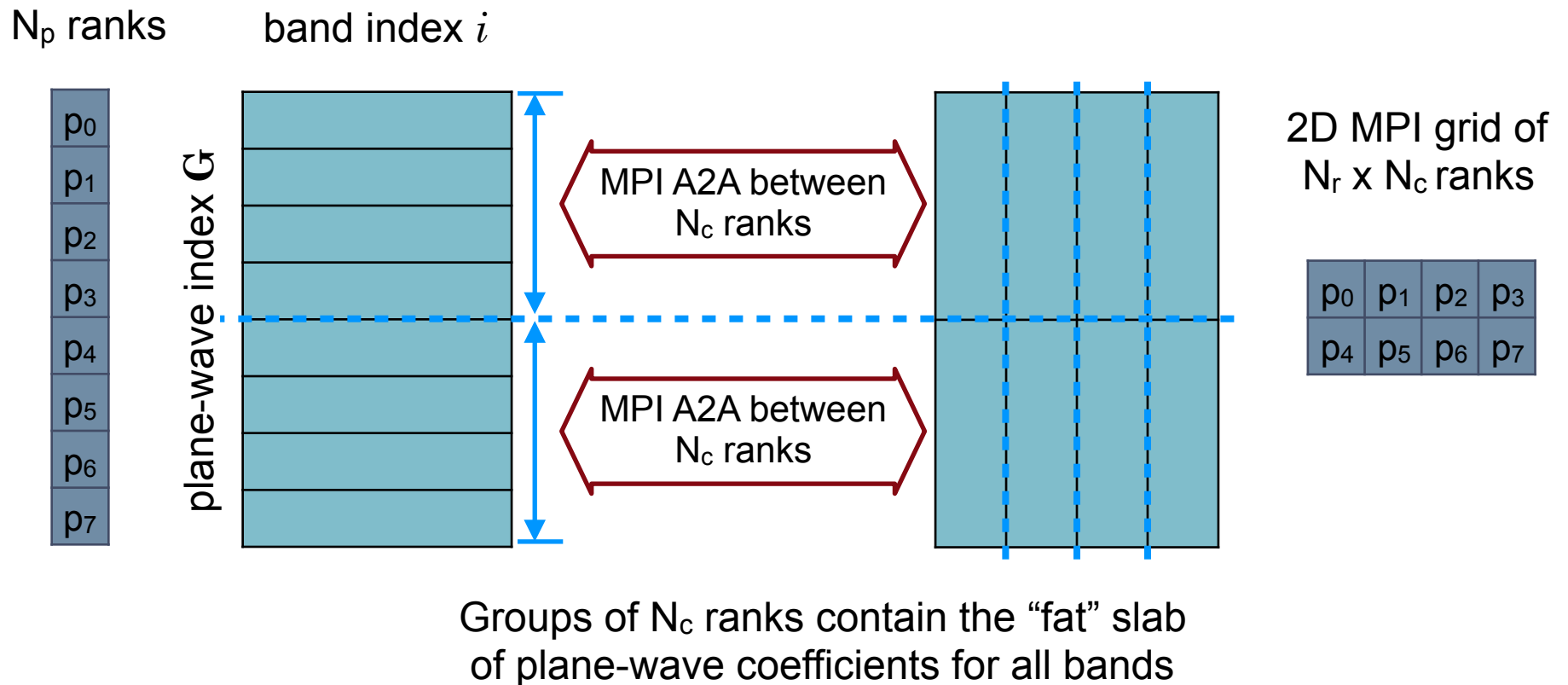


2D MPI grid of  
 $N_r \times N_c$  ranks

$p_0$	$p_1$	$p_2$	$p_3$
$p_4$	$p_5$	$p_6$	$p_7$

# Data redistribution

- Using all available MPI ranks for a single FFT is not efficient!
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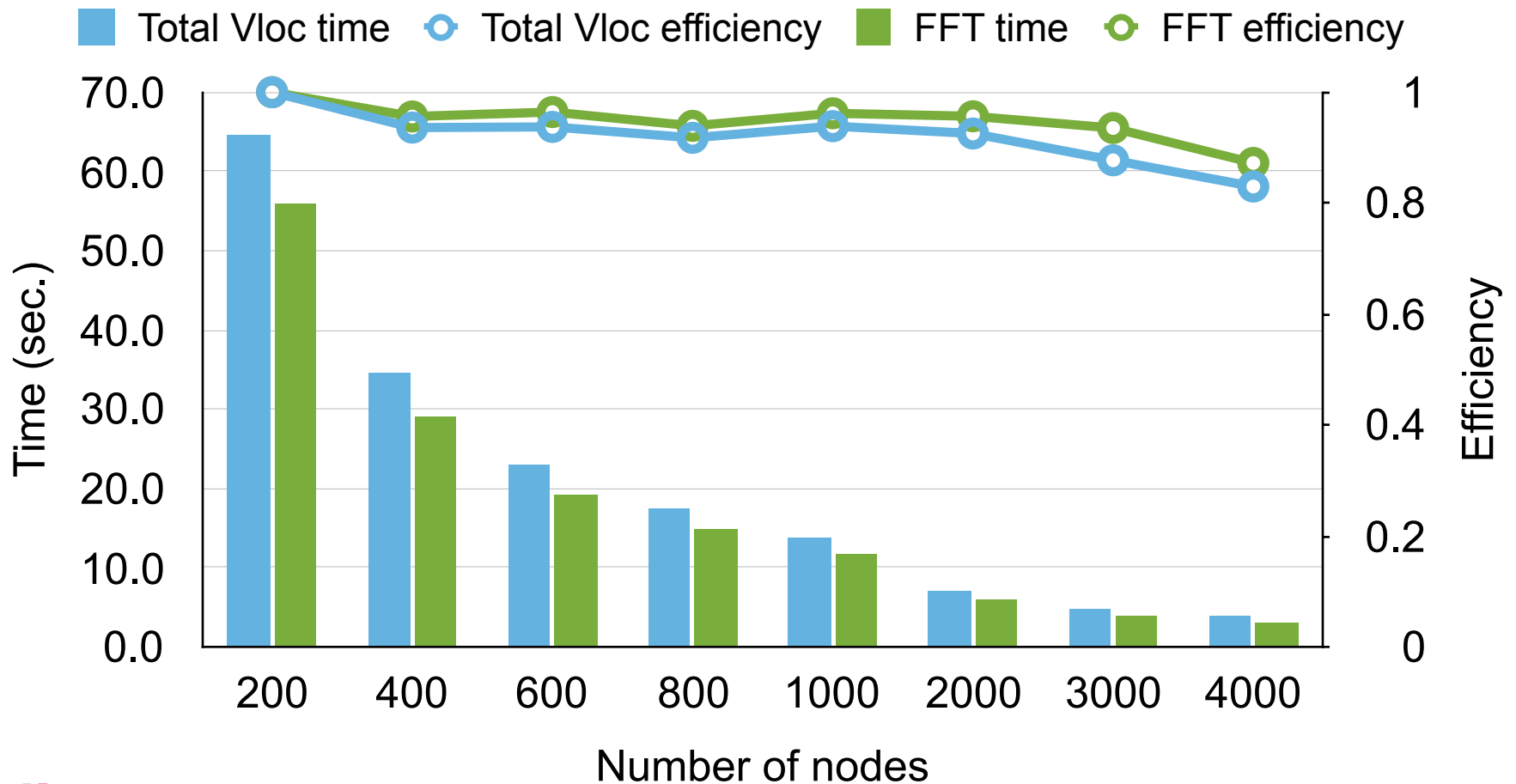


# FFT Vloc kernel

- Change wave-function distribution from “slab” to “2D grid” (**MPI\_A2A between  $N_c$  ranks**)
- Execute 1D backward FFTs along z for the local set of G-vector sticks
- swap z-columns (**MPI\_A2A between  $N_r$  ranks**)
  
- execute 2D backward FFTs in the xy-plane
- multiply by effective potential
- execute 2D forward FFTs in the xy-plane
  
- swap z-columns (**MPI\_A2A between  $N_r$  ranks**)
- Execute 1D forward FFTs along z for the local set of z-sticks
- Change wave-function distribution from “2D grid” to “slab” (**MPI\_A2A between  $N_c$  ranks**)

# FFT kernel benchmark on Piz Daint

Number of bands is 3000, number of times  $V_{loc}$  is applied is 4, number of G-vectors is  $\sim 9.2\text{M}$ , FFT grid size is  $540 \times 540 \times 540$



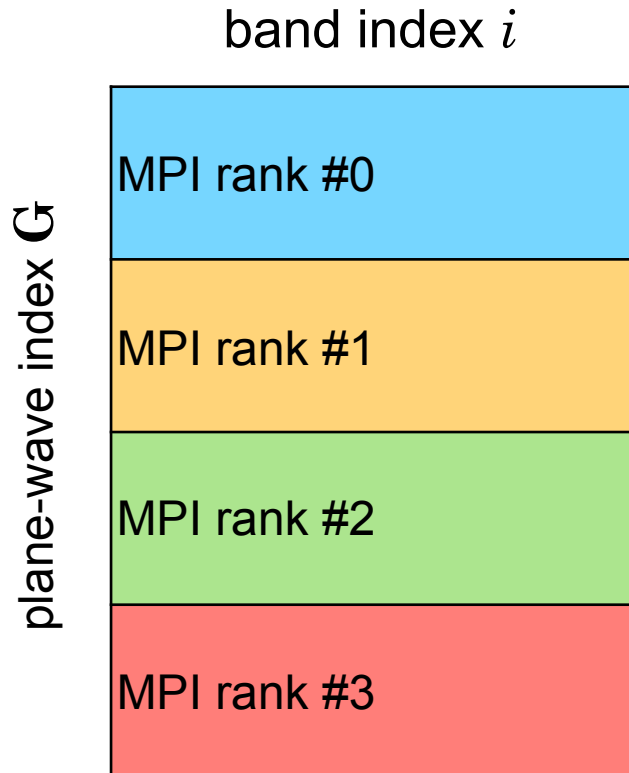
# Inner product

$$O_{ij} = \sum_{\mathbf{G}} \Psi_i^*(\mathbf{G}) \Psi_j(\mathbf{G})$$

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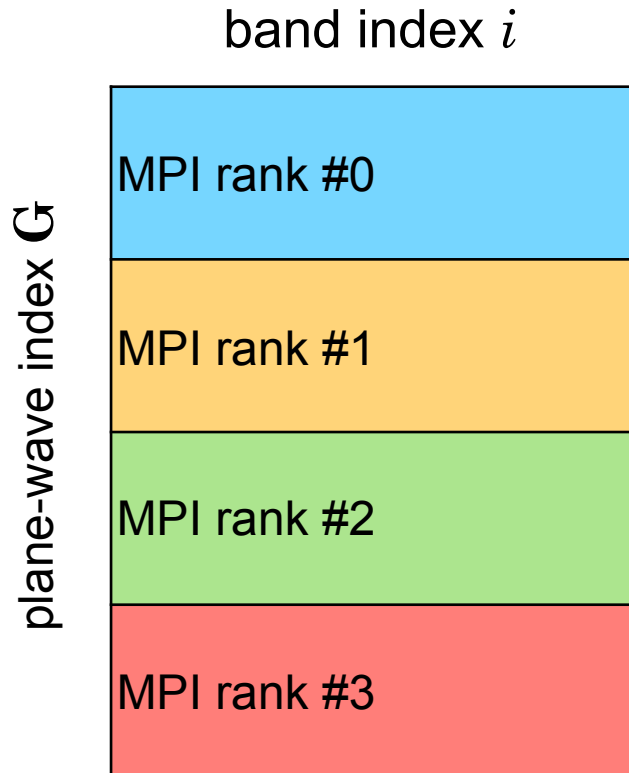
Slab data distribution of  $\Psi_i(\mathbf{G})$



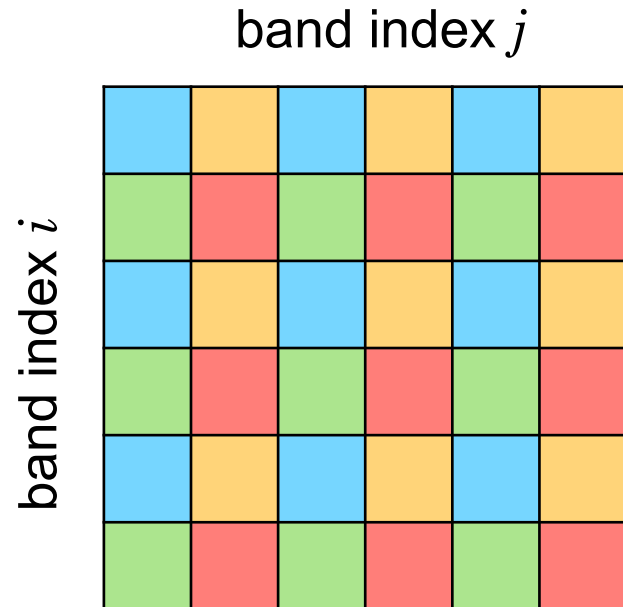
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Slab data distribution of  $\Psi_i(\mathbf{G})$



2D block-cyclic distribution of  $O_{ij}$



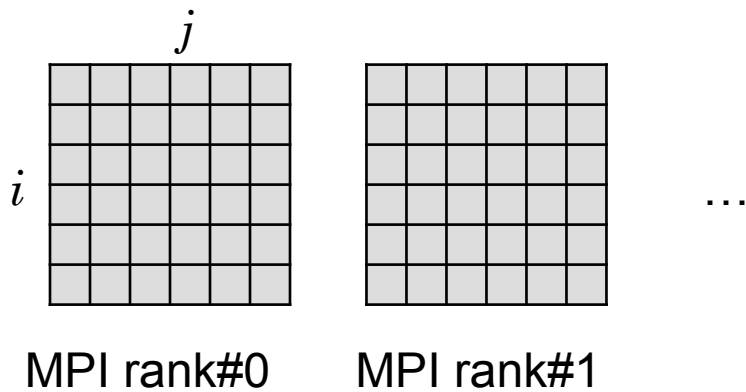
# Inner product: simple implementation



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1. Each rank computes a contribution to the global matrix

$$O_{ij}^p = \sum_{\mathbf{G}}^{N_{\mathbf{G}}^p} \Psi_i^*(\mathbf{G}) \Psi_j(\mathbf{G})$$



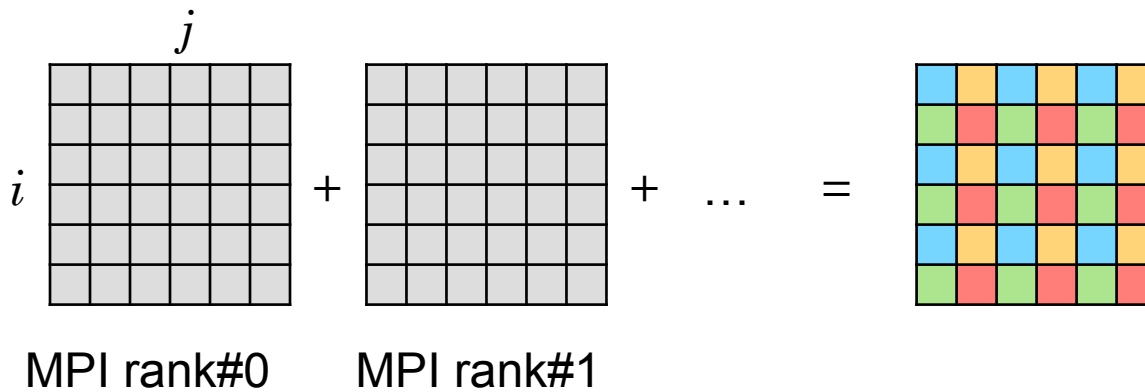
# Inner product: simple implementation

1. Each rank computes a contribution to the global matrix

$$O_{ij}^p = \sum_{\mathbf{G}}^{N_{\mathbf{G}}^p} \Psi_i^*(\mathbf{G}) \Psi_j(\mathbf{G})$$

2. **MPI\_Allreduce** of global matrix is performed

$$O_{ij} = \sum_{p=1}^{N_p} O_{ij}^p$$



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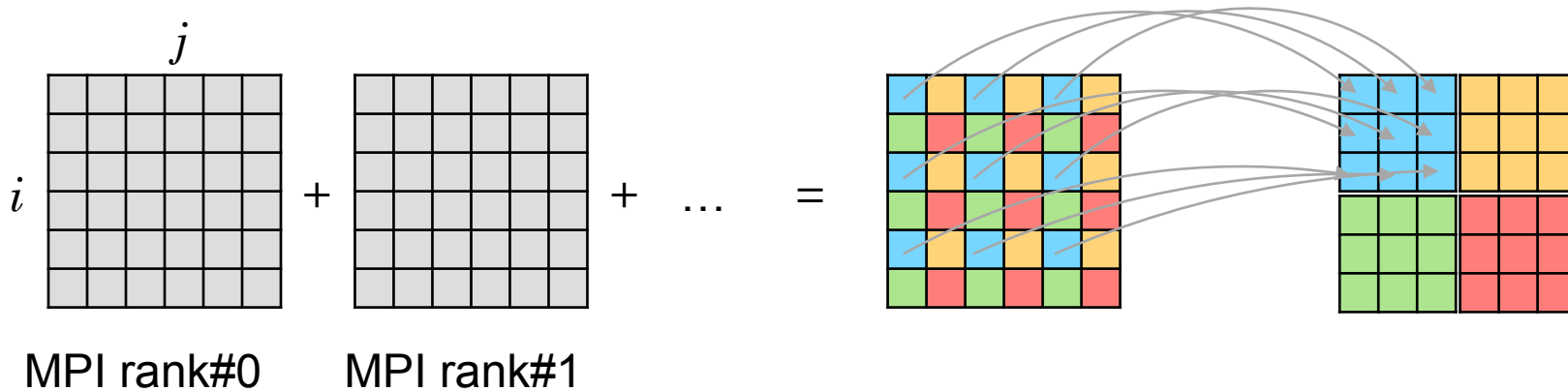
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3. Each rank picks the local fraction of matrix elements from  $O_{ij}$



# Inner product: simple implementation

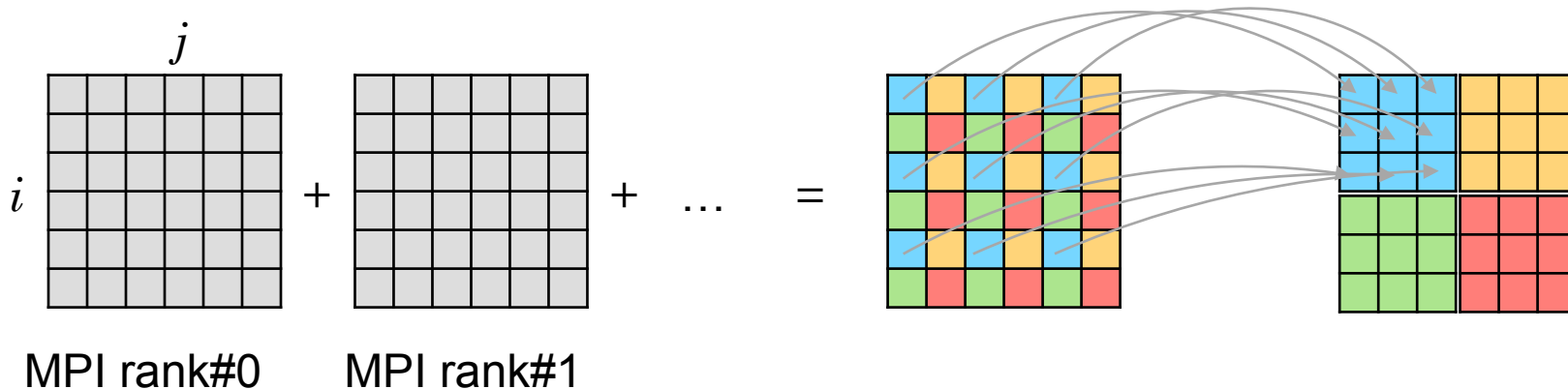
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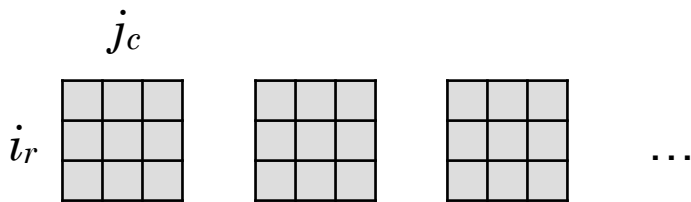
Requires MPI\_Allreduce of global matrix!  
Each MPI rank receives a lot of unnecessary data!

# Inner product: “reduce-to-one” implementation

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1. Each rank computes a contribution to the local panel of  $(p_r, p_c)$  Cartesian rank

$$O_{i_r j_c}^p = \sum_{\mathbf{G}}^{N_{\mathbf{G}}^p} \Psi_{i_r}^*(\mathbf{G}) \Psi_{j_c}(\mathbf{G})$$



MPI rank#0 MPI rank#1 MPI rank#2

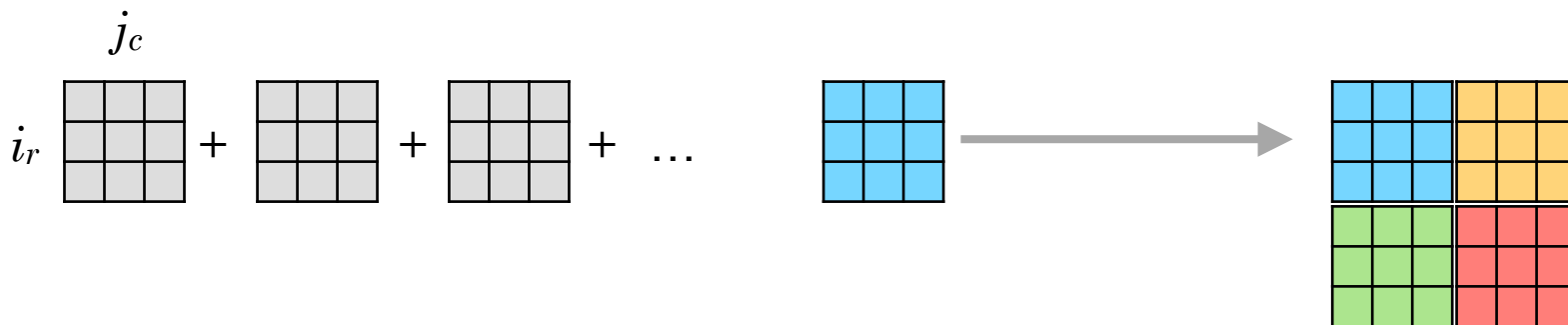
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2. **MPI\_Reduce** of local panel is performed to  $(p_r, p_c)$  Cartesian rank

$$O_{i_r j_c} = \sum_{p=1}^{N_p} O_{i_r j_c}^p$$



MPI rank#0 MPI rank#1 MPI rank#2

# Inner product: “reduce-to-one” implementation

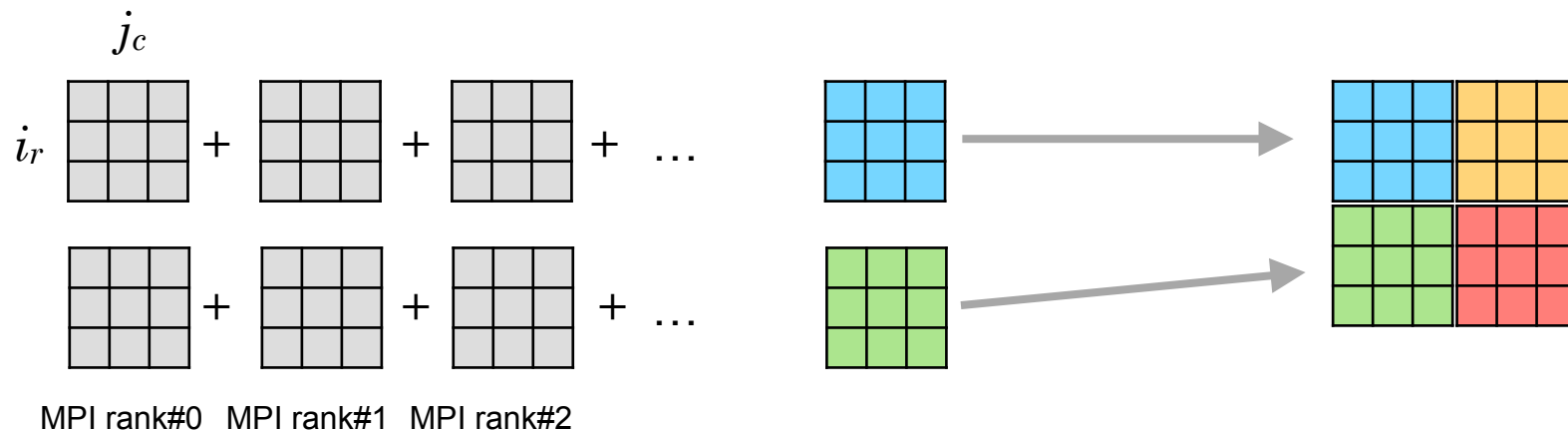
1. Each rank computes a contribution to the local panel of  $(p_r, p_c)$  Cartesian rank

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$$O_{i_r j_c} = \sum_{p=1}^{N_p} O_{i_r j_c}^p$$

3. Steps 1-2 are repeated for all Cartesian rank of a 2D BLACS grid





# Inner product: “reduce-to-one” implementation

- synchronous
  - zgemm
  - MPI\_Reduce
- asynchronous
  - MPI\_Wait
  - zgemm
  - MPI\_Ireduce

# Inner product: “reduce-to-one” implementation

- synchronous
  - zgemm
  - MPI\_Reduce
- asynchronous
  - MPI\_Wait
  - zgemm
  - MPI\_Ireduce

A lot of MPI\_Reduce!  
The resulting sub-matrices are small!

# Inner product: “block-allreduce” implementation

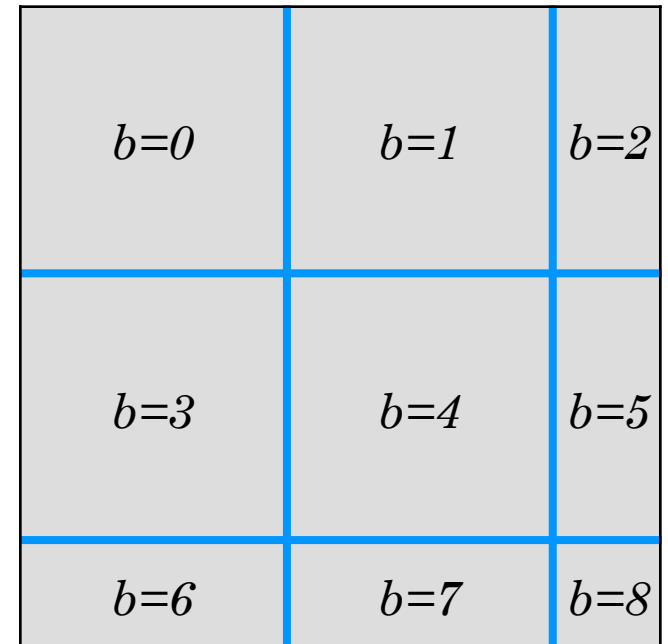
1. Each rank computes a contribution to the block of global matrix

$$O_{i_b j_b}^p = \sum_{\mathbf{G}}^{N_{\mathbf{G}}^p} \Psi_{i_b}^*(\mathbf{G}) \Psi_{j_b}(\mathbf{G})$$

2. **MPI\_Allreduce** of block is performed

$$O_{i_b j_b} = \sum_{p=1}^{N_p} O_{i_b j_b}^p$$

3. Each rank picks the local fraction of matrix elements from  $O_{i_b j_b}$  block



# Inner product: “block-allreduce” implementation

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$$O_{i_b j_b}^p = \sum_{\mathbf{G}}^{N_{\mathbf{G}}^p} \Psi_{i_b}^*(\mathbf{G}) \Psi_{j_b}(\mathbf{G})$$

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$$O_{i_b j_b} = \sum_{p=1}^{N_p} O_{i_b j_b}^p$$

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4. Steps 1-3 are repeated for all blocks

$b=0$	$b=1$	$b=2$
$b=3$	$b=4$	$b=5$
$b=6$	$b=7$	$b=8$

# Inner product: “block-allreduce” implementation

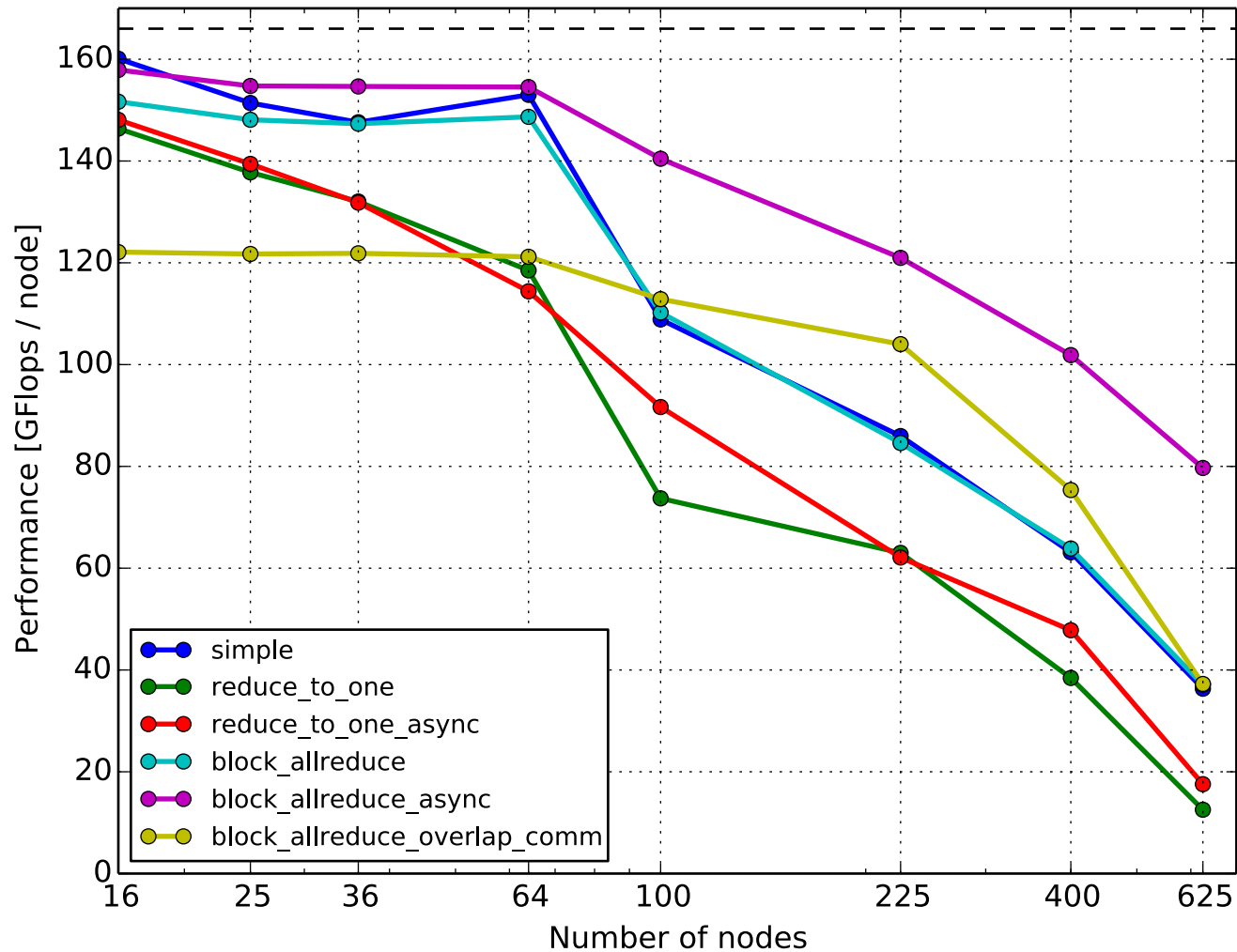
- synchronous
  - zgemm
  - MPI\_Allreduce
  - update local panels
- asynchronous
  - MPI\_Wait
  - update local panels
  - zgemm
  - MPI\_Ireduce
- overlap computation and communication
  - single OMP thread is executing MPI\_Allreduce and update of local panels
  - remaining OMP threads execute zgemm

# Example: communication and computation overlap

```
omp_set_nested(1); /* allow nested OMP */
int nt = omp_get_max_threads(); /* get total number of threads */
#pragma omp parallel num_threads(2) shared(buf_state) /* spawn two threads */
{
    if (omp_get_thread_num() == 1) { /* thread #1 executes zgemms */
        int s{0};
        omp_set_num_threads(nt - 1); /* set number of nested threads to nt - 1 */
        for (...) { /* loop over blocks */
            int state = 1;
            while (state == 1) { /* wait for the release of the buffer */
                #pragma omp atomic read
                state = buf_state[s % 2]; /* read from shared varray */
            }
            zgemm(...,buf[s % 2]); /* execute local zgemm */
            #pragma omp atomic write
            buf_state[s % 2] = 1; /* lock the buffer */
            s++;
        }
    } else { /* thread #0 is doing communication */
        int s{0};
        for (...) { /* loop over blocks */
            int state = 0;
            while (state == 0) { /* wait for the lock of the buffer */
                #pragma omp atomic read
                state = buf_state[s % 2]; /* read from shared array */
            }
            MPI_Allreduce(...,buf[s % 2]); /* execute global reduction */
            /* do something with the result, for example, store it */
            #pragma omp atomic write
            buf_state[s % 2] = 0; /* release the buffer */
            s++;
        }
    }
}
omp_set_nested(0); /* forbid nested */
```

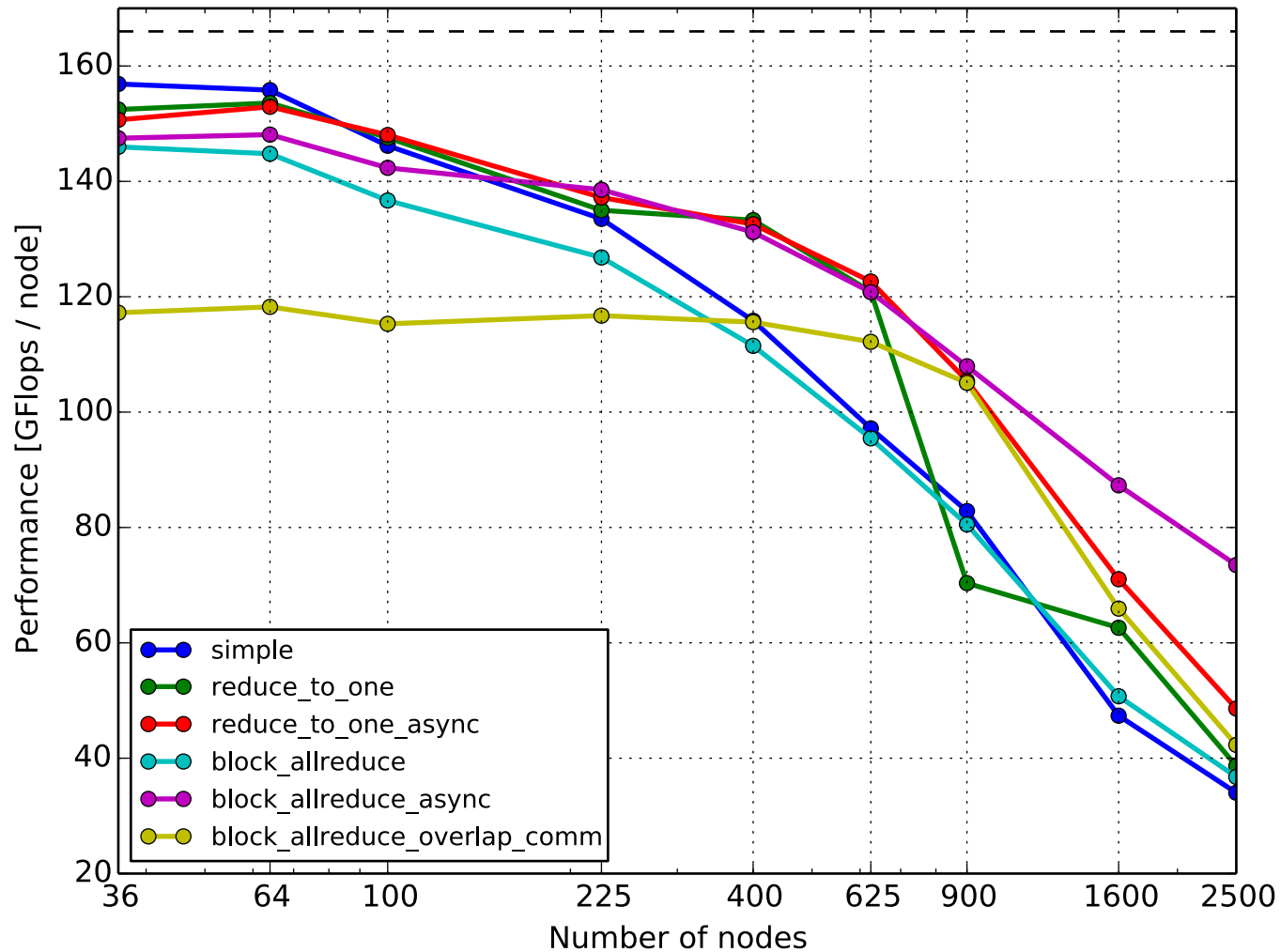
# Inner product kernel benchmark

Piz Daint, Intel SB (8 CPU cores) M=1'000 N=1'000 K=300'000



# Inner product kernel benchmark

Piz Daint, Intel SB (8 CPU cores) M=10'000 N=10'000 K=1'000'000





# Wave-function transformation

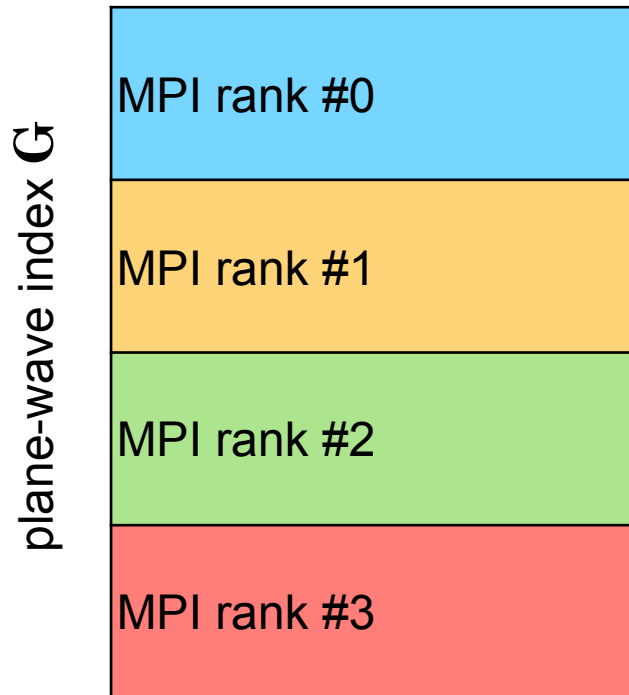
$$\Psi_i(\mathbf{G}) = \sum_j \phi_j(\mathbf{G}) Z_{ji}$$

# Wave-function transformation

$$\Psi_i(\mathbf{G}) = \sum_j \phi_j(\mathbf{G}) Z_{ji}$$

Slab data distribution of  
 $\Psi_i(\mathbf{G})$  and  $\phi_j(\mathbf{G})$

wave-function index



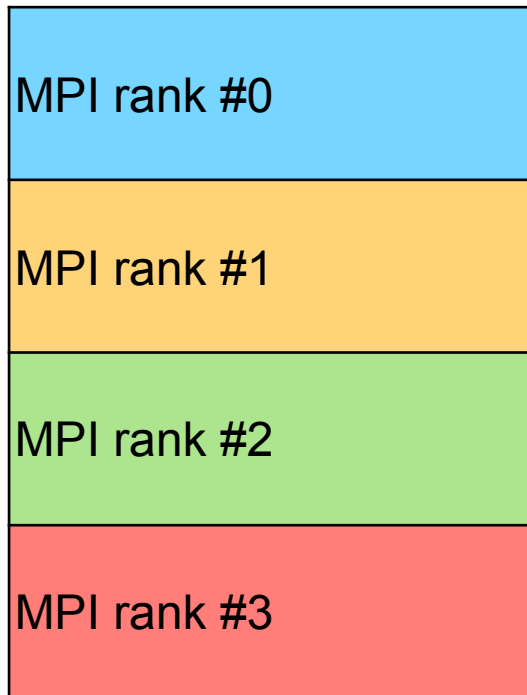
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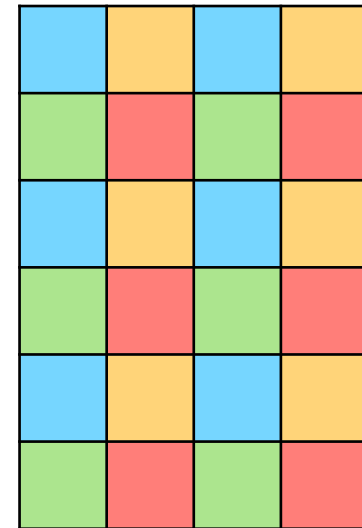
plane-wave index  $\mathbf{G}$



2D block-cyclic distribution of  $Z_{ji}$

band index  $i$

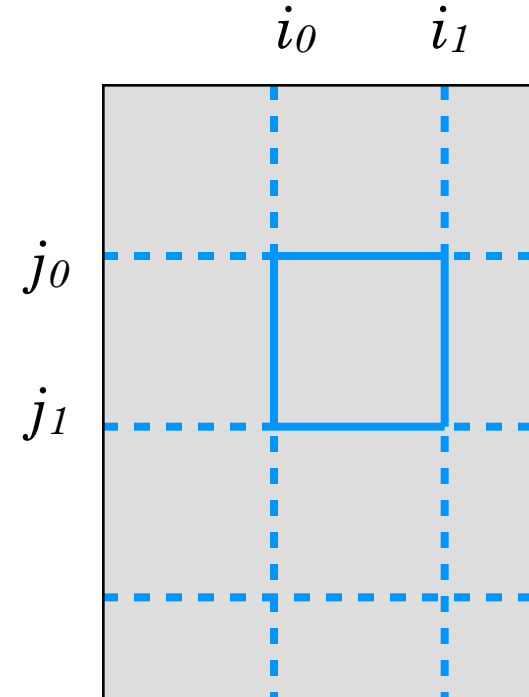
basis function index  $j$



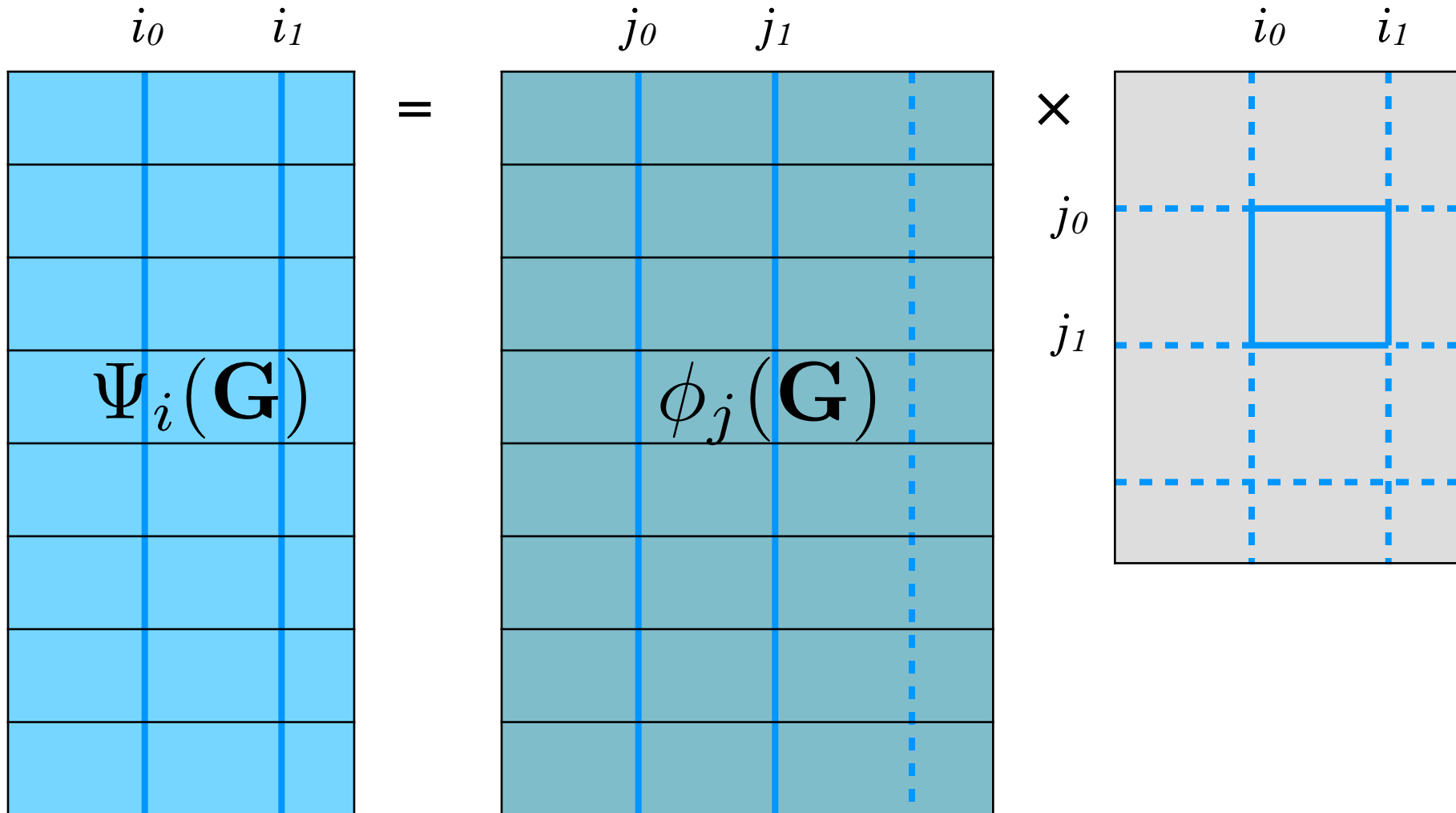
# Wave-function transformation

For each block of the transformation matrix:

- each MPI rank packs its contribution to the block
- elements of block are collected with `MPI_Allgatherv`
- elements are unpacked and the whole block is formed
- the updated of the wave-functions  $\Psi_{i_0:i_1}(\mathbf{G})$  from the wave-functions  $\phi_{j_0:j_1}(\mathbf{G})$  is done by the local **zgemm**



# Wave-function transformation



# Wave-function orthogonalization

For the orthonormal basis  $\{\phi_j^0\}$ ,  $\langle \phi_j^0 | \phi_{j'}^0 \rangle = \delta_{jj'}$  the task is to expand it with the new functions  $\{\phi_j^{new}\}$ ,  $\{\phi_j^0\} \oplus \{\phi_j^{new}\} = \{\phi_j^1\}$  such that  $\langle \phi_j^1 | \phi_{j'}^1 \rangle = \delta_{jj'}$

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- Orthogonalize to the old basis functions

$$|\tilde{\phi}_i\rangle = \left(1 - \sum_j |\phi_j^0\rangle\langle\phi_j^0|\right) |\tilde{\phi}_i^{new}\rangle = |\tilde{\phi}_i^{new}\rangle - \underbrace{\sum_j |\phi_j^0\rangle \underbrace{\langle\phi_j^0|\tilde{\phi}_i^{new}\rangle}_{\text{inner product}}}_{\text{wave-function transformation}}$$

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- Orthonormalize new functions

$$O_{ii'} = \langle \tilde{\phi}_i | \tilde{\phi}_{i'} \rangle \quad \text{inner product}$$

$$\mathbf{O} = \mathbf{L}\mathbf{L}^H \quad \text{Cholesky decomposition}$$

$$|\phi_i^{new}\rangle = \sum_{i'} |\tilde{\phi}_{i'}\rangle \mathbf{L}_{i'i}^{-1} \quad \text{wave-function transformation}$$



# Wave-function orthogonalization

Test case:

- orthogonalization and transformation of  $|\psi_i\rangle, \hat{H}|\psi_i\rangle, \hat{S}|\psi_i\rangle$  for  $i \in [1, N]$
- orthogonalization and transformation of  $|\psi_i\rangle, \hat{H}|\psi_i\rangle, \hat{S}|\psi_i\rangle$  for  $i \in [N + 1, 2N]$   
w.r.t to the first  $N$  wave-functions

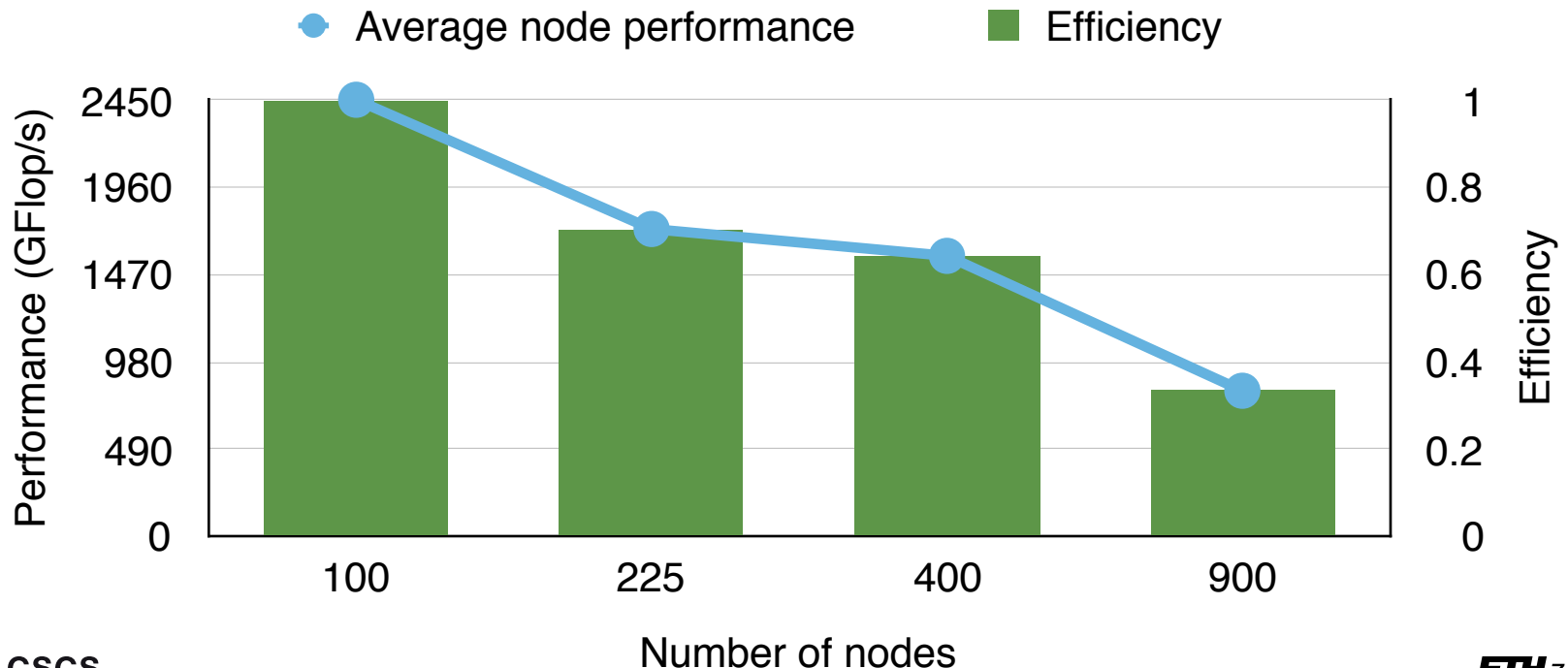
Upgraded Piz Daint, Intel HW (12 CPU cores) + P100 GPU, N=4096 K=3'000'000

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Upgraded Piz Daint, Intel HW (12 CPU cores) + P100 GPU,  $N=4096$   $K=3'000'000$

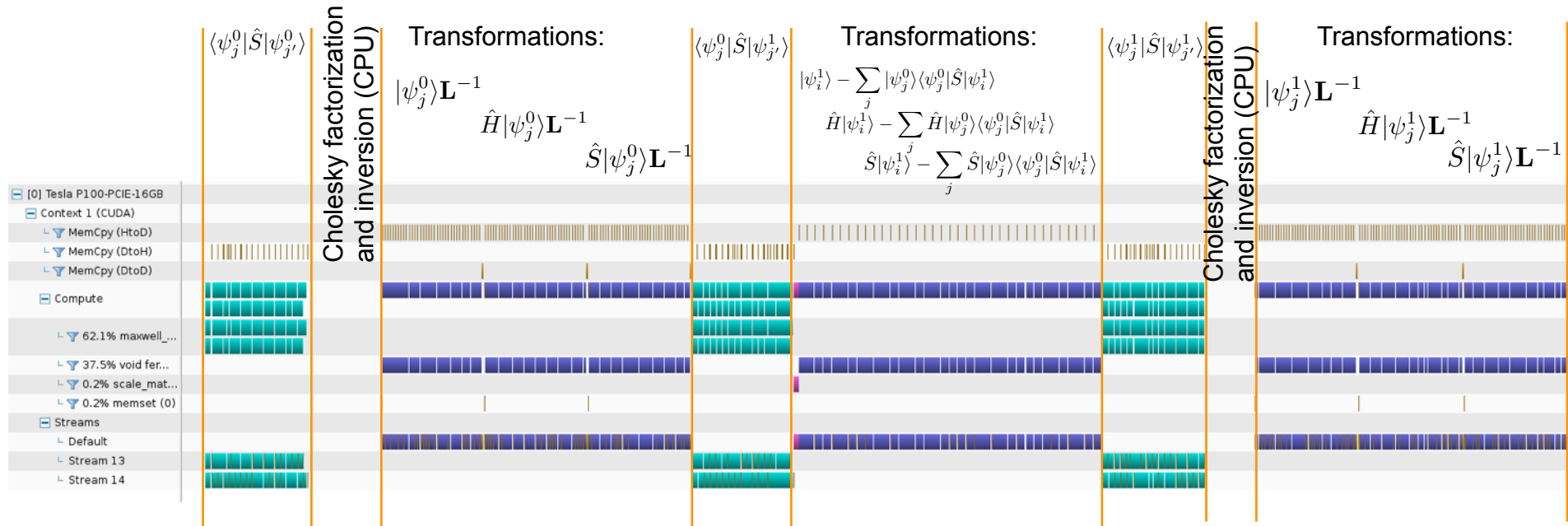


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Upgraded Piz Daint, Intel HW (12 CPU cores) + P100 GPU,  $N=4096$   $K=3'000'000$



# Conclusion

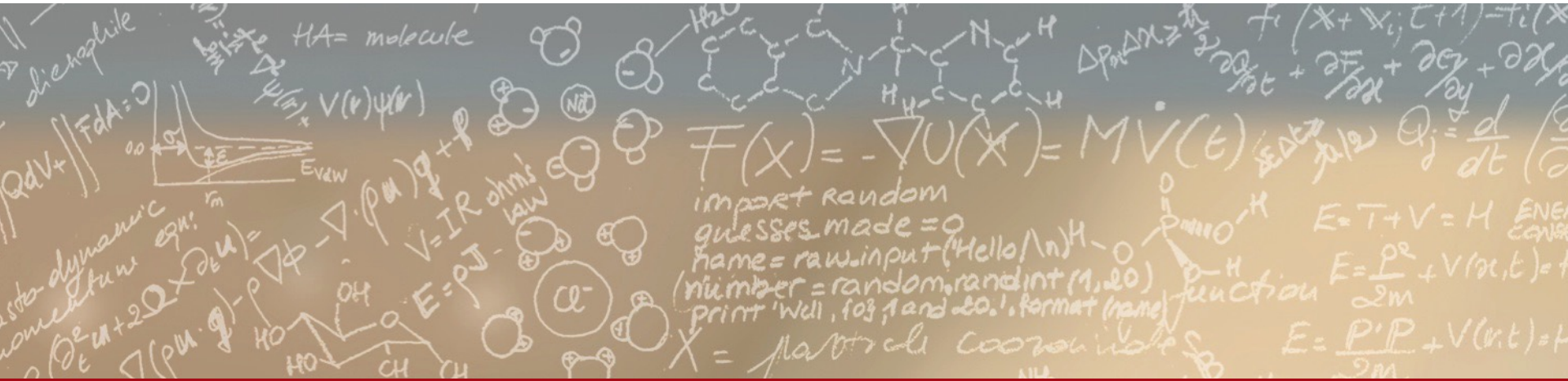
- Domain specific libraries allow a separation of concerns between HPC and scientific communities
- Several compute-intensive kernels that are one level above the standard BLAS/LAPCK/ScaLAPACK/FFTW were identified
- MaX centre of excellence is working on the initial DSL implementation and API (WP4)



**CSCS**

Centro Svizzero di Calcolo Scientifico  
Swiss National Supercomputing Centre

**ETH** zürich



**Thank you for your attention.**