

Parallelization of Fully Distributed dense Matrix-Matrix Multiplication (2)

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Introduction to Parallel Programming for
Multicore/Manycore Clusters



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Agenda

1. Execute sample program of fully distributed matrix-matrix multiplication
2. Explanation of sample program
3. Homework 5: fully distributed matrix-matrix multiplication
4. Hints of parallelization

Execute sample program (Matrix-matrix Multiplication (2))

Note: sample program of matrix-matrix multiplication

- ▶ Common file name of C/Fortran languages:
Mat-Mat-d-fx.tar
- ▶ Modify queue name from **lecture** to **lecture6** in job script file **mat-mat-d.bash**. Then type “**pbsub**”.
 - ▶ **lecture** : Queue in out of time of this lecture.
 - ▶ **lecture6**: Queue in time of this lecture.

Execute sample program of dense matrix-matrix multiplication (2)

- ▶ Type the follows in command line:

```
$ cp /home/z30082/Mat-Mat-d-fx.tar ./  
$ tar xvf Mat-Mat-d-fx.tar  
$ cd Mat-Mat-d
```

- ▶ Choose the follows:

```
$ cd C : For C language.  
$ cd F : For Fortran language.
```

- ▶ The follows are common:

```
$ make  
$ pbsub mat-mat-d.bash
```

- ▶ After finishing the job, type the follow:

```
$ cat mat-mat-d.bash.oXXXXXX
```

Output of sample program of matrix-matrix multiplication (C Language)

- ▶ You can see the followings if it runs successfully.

N = 384

Mat-Mat time = 0.000135 [sec.]

841973.194818 [MFLOPS]

Error! in (0 , 2)-th argument in PE 0

Error! in (0 , 2)-th argument in PE 61

Error! in (0 , 2)-th argument in PE 51

Error! in (0 , 2)-th argument in PE 59

Error! in (0 , 2)-th argument in PE 50

Error! in (0 , 2)-th argument in PE 58

....

It is true execution
for printing errors,
because it does
not finish
parallelization.

Output of sample program of matrix-matrix multiplication (Fortran Language)

- ▶ You can see the followings if it runs successfully.

NN = 384

Mat-Mat time = 1.295508991461247E-03

MFLOPS = 87414.45135502046

Error! in (1 , 3)-th argument in PE 0

Error! in (1 , 3)-th argument in PE 61

Error! in (1 , 3)-th argument in PE 51

Error! in (1 , 3)-th argument in PE 58

Error! in (1 , 3)-th argument in PE 55

Error! in (1 , 3)-th argument in PE 63

Error! in (1 , 3)-th argument in PE 60

It is true execution for printing errors, because it does not finish parallelization.

Explanation of sample program (C Language)

- ▶ **#define N 384**

- ▶ You can change size of matrix by varying the number.

- ▶ **#define DEBUG 1**

- ▶ Results of matrix-matrix multiplication can be verified by setting “1”.

- ▶ Specification of **MyMatMat** function

- ▶ Return result of matrix-matrix multiplication of A with $(N/NPROCS) \times N$ of **double** times B with $N \times (N/NPROCS)$ of **double**, in C with $(N/NPROCS) \times N$ of **double**.

Explanation of sample program (Fortran Language)

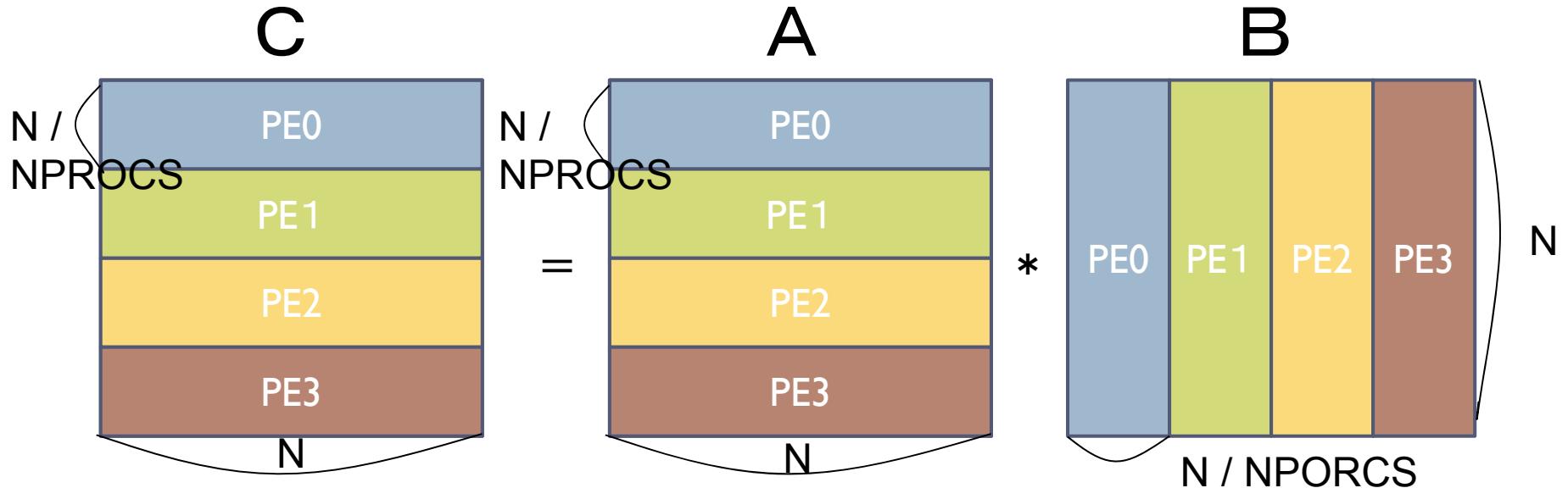
- ▶ The declaration of size of N can be found in the following name of file:
mat-mat-d.inc
- ▶ The size of matrix is defined as variable NN as follows:
integer NN
parameter (NN=384)

Homework 5

- ▶ Parallelize **MyMatMat** function (procedure):
 - ▶ For debugging, use:
`#define N 384`
- ▶ To parallelize this, please take care initial data distributions for A, B and C.

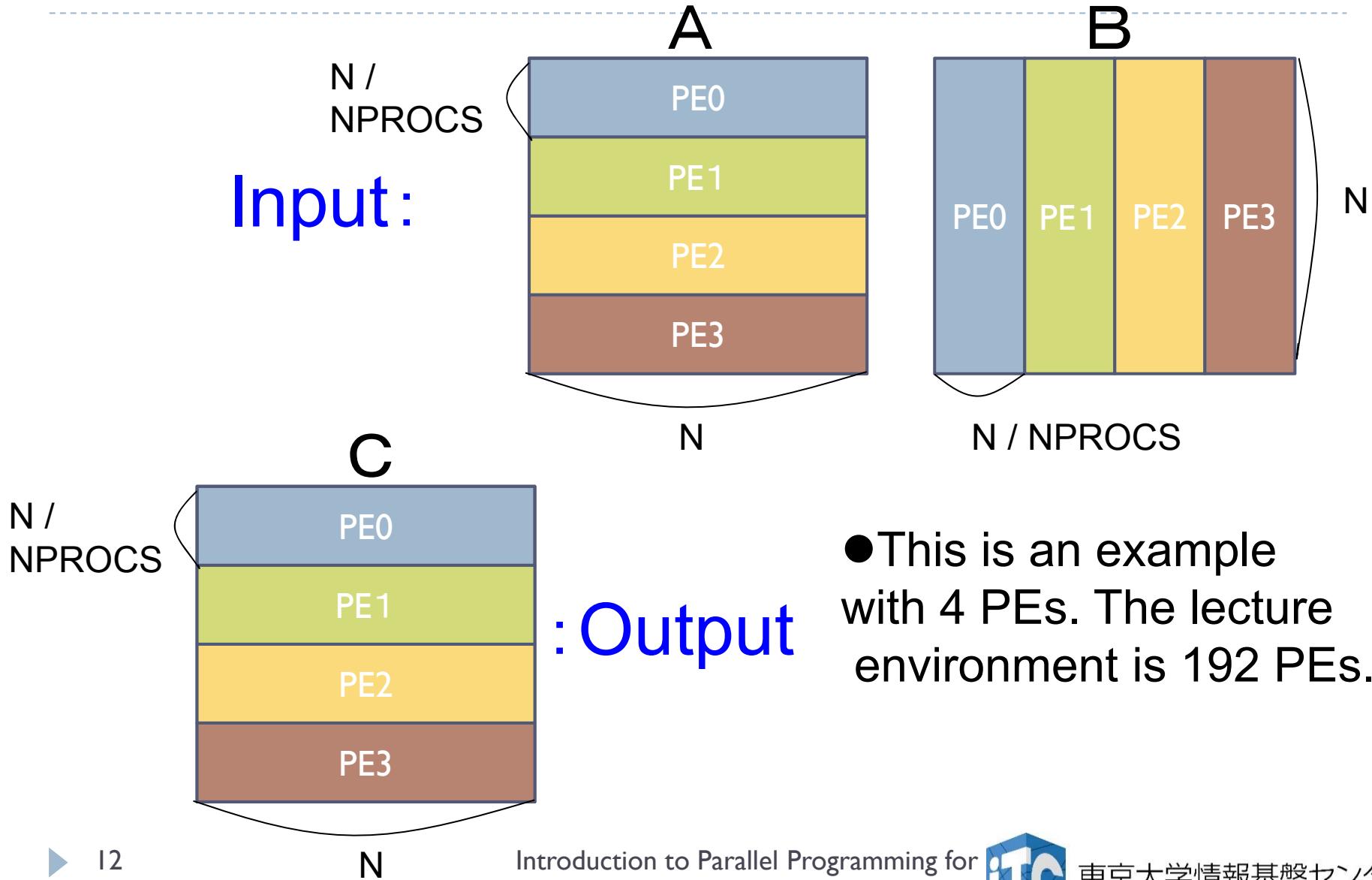
Initial data distributions for A, B and C

- The follows is recommended initial distribution for A, B and C.
The following is an example with 4 PEs. The lecture environment is 192 PEs.



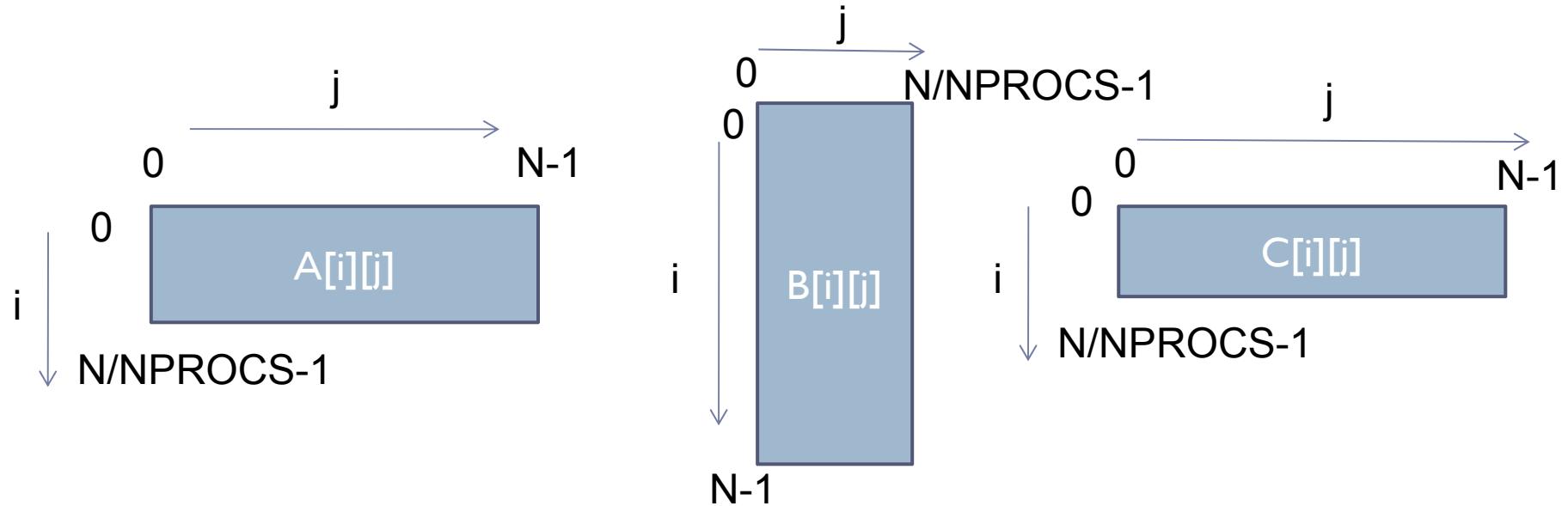
- It needs 1-to-1 communications.
 - It needs a receive buffer in addition to arrays for matrices A, B, and C.
- ▶ 11

Specification of input and output



Note: Parallelization (C Language)

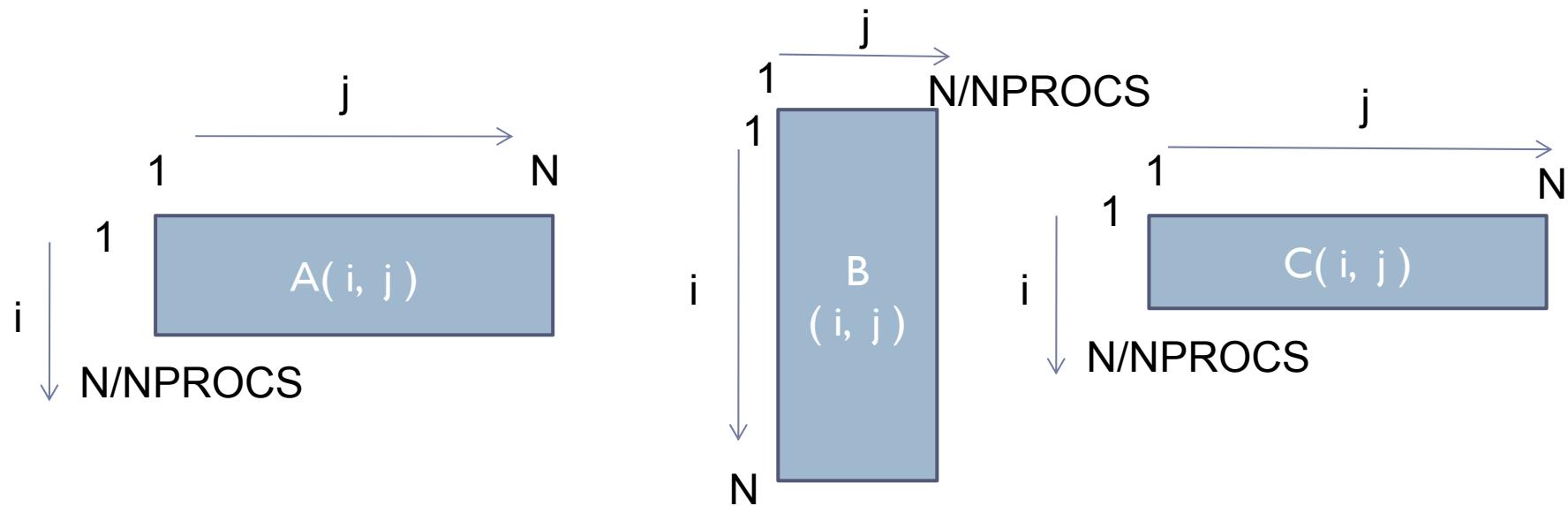
- ▶ Each element of array is totally distributed.
- ▶ In each PE, indexes of array are as follows:



- ▶ Take care of specification for local indexes in each PE for the matrix-matrix multiplication.

Note: Parallelization (Fortran Language)

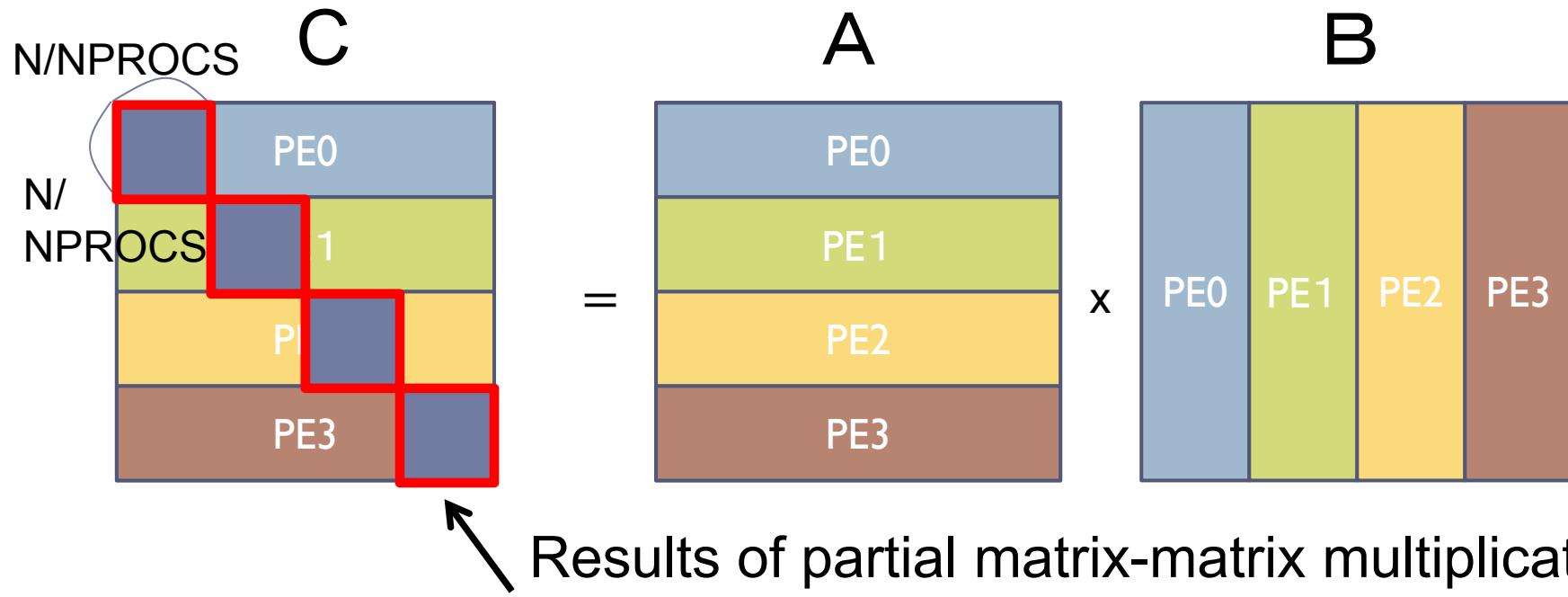
- ▶ Each element of array is totally distributed.
- ▶ In each PE, indexes of array are as follows:



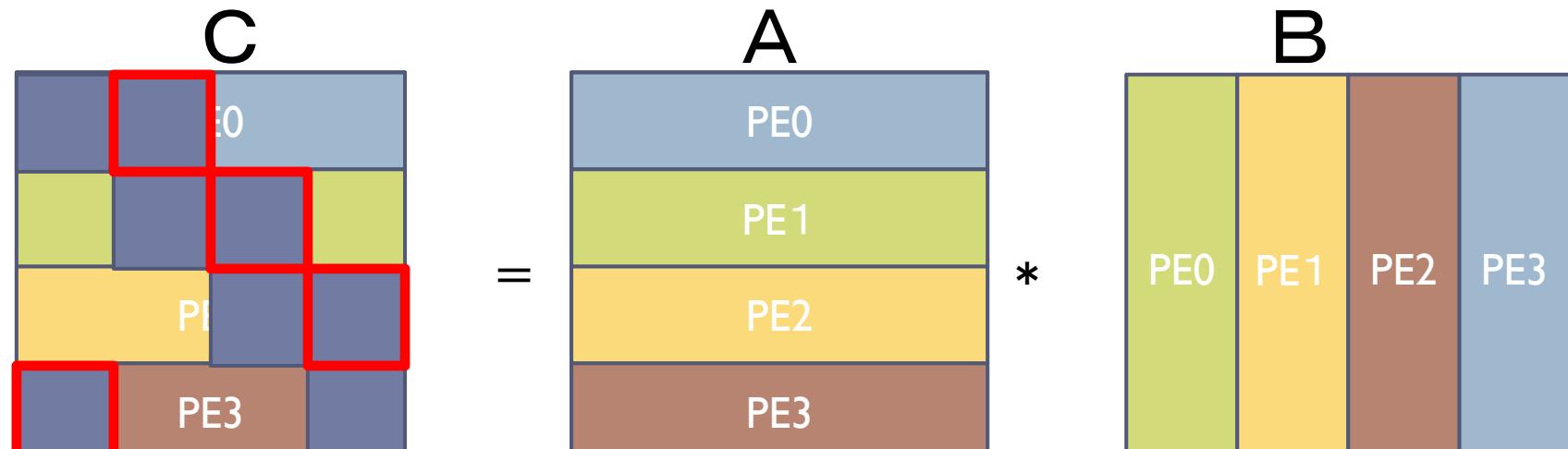
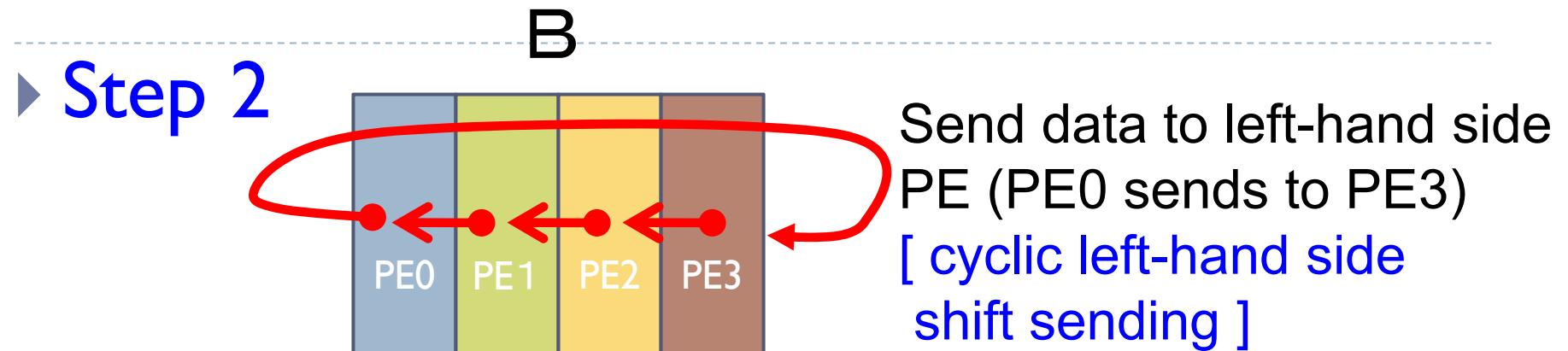
- ▶ Take care of specification for local indexes in each PE for the matrix-matrix multiplication.

Hints of Parallelization

- ▶ A communication is needed for data of matrix B, since **whole elements are not allocated in each PE** to do matrix-matrix multiplication. One of parallel algorithms can be described as:
- ▶ Step I

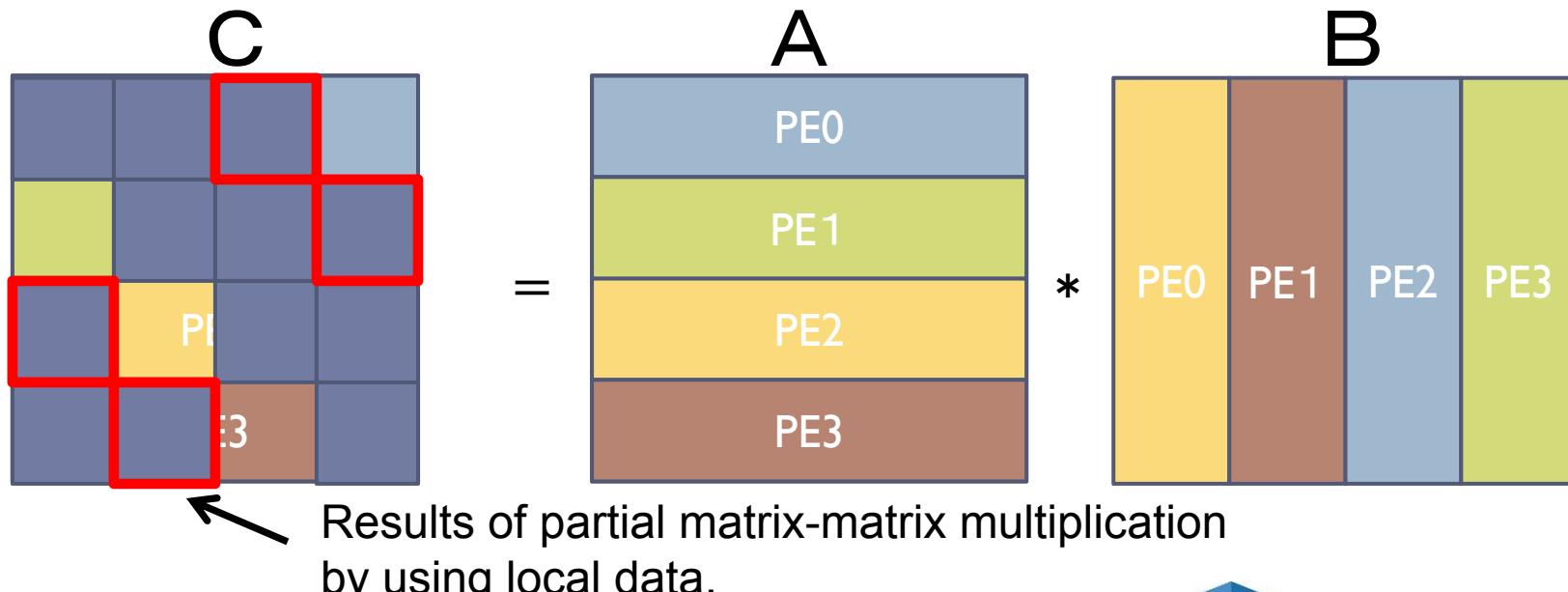
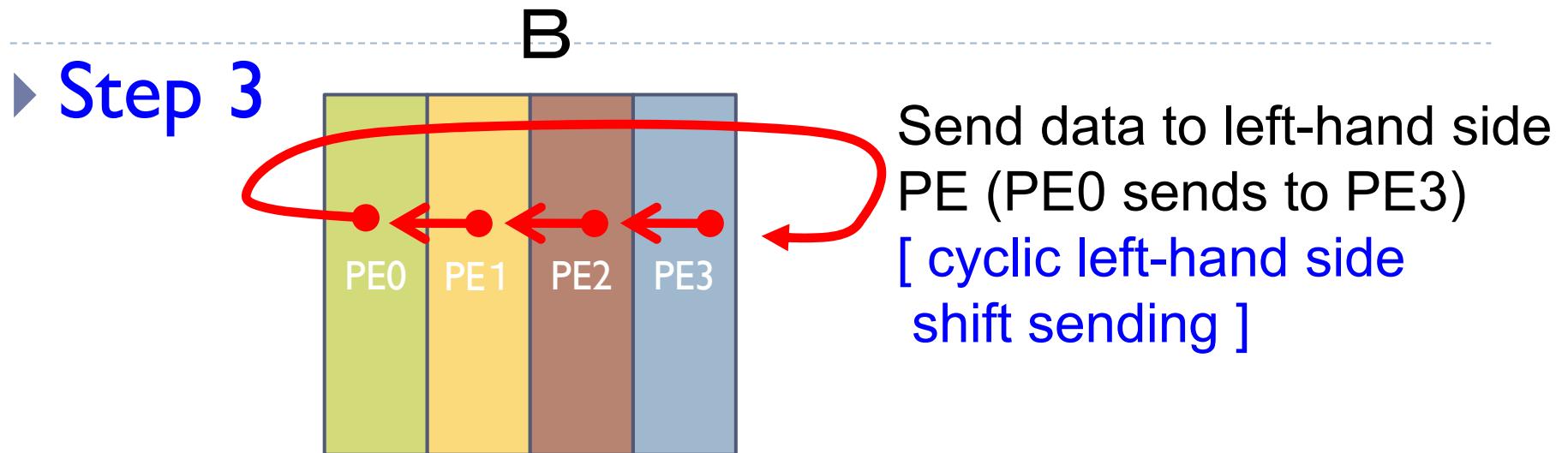


Hints of Parallelization



Results of partial matrix-matrix multiplication
by using local data.

Hints of Parallelization

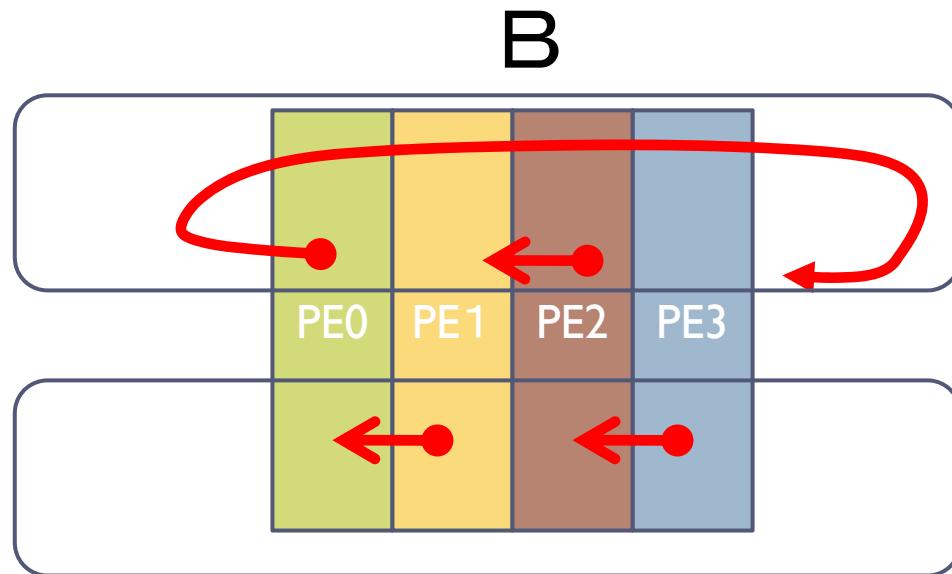


Note: Cyclic left-hand side shift sending

- ▶ If all PEs send data by using `MPI_Send` to implement **cyclic left-hand side shift sending**, process is stopped in that point. (*Sometimes is working, but sometime is not working.*)
 - ▶ When large message is sending in `MPI_Send`, system buffer is all used.
 - ▶ Waiting until the system buffer to be reused. (Spin waiting)
 - ▶ However never reuse it. (since there is no `MPI_Recv` in this world!).
 - ▶ To avoid this, use the following implementation:
 - ▶ If rank number can be devisable by 2:
 - ▶ `MPI_Send()`;
 - ▶ `MPI_Recv()`;
 - ▶ Otherwise:
 - ▶ `MPI_Recv()`;
 - ▶ `MPI_Send()`;
-
- Corresponding
each sending and receiving.

Note: Parallelization

- This means implementing the cyclic left-hand side shift sending with the following 2 steps.



Step 1:

Send data from PE which has rank number that can be dividable by 2.

Step 2:

Send data from PE which has rank number that can not be dividable by 2.

Basic Communication Function

-MPI_Send

- ▶ **ierr = MPI_Send(sendbuf, ict, idatatype, idest, itag, icomm);**
 - ▶ **sendbuf** : Specify first address of sending area.
 - ▶ **ict** : Integer type. Specify number of elements for sending area.
 - ▶ **idatatype** : Integer type. Specify data type of sending area.
 - ▶ **idest** : Integer type. Specify rank number in communicator **icomm**.
 - ▶ **itag** : Integer type. Specify tags for receiving message.
 - ▶ **icomm** : Integer type. Specify communicator.
 - ▶ **ierr (return value)** : Integer type. An error code returns.

Basic Communication Function

-MPI_Recv (1/2)

- ▶ **ierr = MPI_Recv(recvbuf, ict, idatatype, isource, itag, icomm, istatus);**
-
- ▶ **recvbuf** : Specify first address of receiving area.
 - ▶ **ict** : Integer type. Specify number of elements for receiving area.
 - ▶ **idatatype** : Integer type. Specify data type of receiving area.
 - ▶ **MPI_CHAR** (Character type) , **MPI_INT** (Integer type),
MPI_FLOAT (float type), **MPI_DOUBLE**(double type)
 - ▶ **isource** : Integer type. Specify rank number for receiving message.
 - ▶ If you want to receive any ranks, specify “**MPI_ANY_SOURCE** ”.

Basic Communication Function

—MPI_Recv (2/2)

- ▶ **itag** : Integer type. Specify tag number for receiving message.
 - ▶ If you want to receive any tag number, specify “**MPI_ANY_TAG**”.
- ▶ **icomm** : Integer type. Specify communicator.
 - ▶ Normally, specify “**MPI_COMM_WORLD**”
- ▶ **istatus** : MPI_Status Type (Array of integer type.) Return status of receiving.
 - ▶ Declare an integer array with elements of **MPI_STATUS_SIZE**.
 - ▶ Number of rank that is sending message is stored in **istatus[MPI_SOURCE]**, its tag is stored in **istatus[MPI_TAG]**.
- ▶ **ierr (return value)** : Integer type. Return an error code.

Note: Implementation of Tags

▶ How to describe Tag (itag)?

- ▶ Tag (itag) can be specified any values with **int** type for **MPI_Send()** and **MPI_Recv()**.
- ▶ However it is reasonable to specify different values of tag in each communication to know errors for the communications.
- ▶ In this implementation, there are two pairs of **MPI_Send()** and **MPI_Recv()**. Hence we can describe different values of tags in each step.
- ▶ For example, we use value of the outer loop induction variable, say **iloop**, for one communication in this algorithm. The other can be specified with **iloop+NPROCS**.

Additional Hints

Answer codes are shown.

Summary of the parallel implementation

1. The times of cyclic left-hand side shift sending is [**total number of processes - 1**].
2. To receive data of array $B[][],$ we need a buffer array $B_T[][].$
3. Copy the received $B_T[][]$ to $B[][]$ to do local matrix-matrix multiplication.
4. Initial indexes of diagonal blocks for the local matrix-matrix multiplication: **Length of block * myid**. The indexes are added with the length of block, but **it should be set to 0 if it exceeds N.**

Hints of parallelization (Almost answer code, C Language)

- ▶ The follows are overview of code.

```
ib = n/numprocs;
for (iloop=0; iloop<NPROCS; iloop++ ) {
    A local matrix-matrix multiplication C = A * B;
    if (iloop != (numprocs-1) ) {
        if (myid % 2 == 0 ) {
            MPI_Send(B, ib*n, MPI_DOUBLE, isendPE,
                      iloop, MPI_COMM_WORLD);
            MPI_Recv(B_T, ib*n, MPI_DOUBLE, irecvPE,
                      iloop+numprocs, MPI_COMM_WORLD, &istatus);
        } else {
            MPI_Recv(B_T, ib*n, MPI_DOUBLE, irecvPE,
                      iloop, MPI_COMM_WORLD, &istatus);
            MPI_Send(B, ib*n, MPI_DOUBLE, isendPE,
                      iloop+numprocs, MPI_COMM_WORLD);
        }
        Copy B_T[ ][ ] to B[ ][ ];
    }
}
```

Hints of parallelization (Almost answer code, C Language)

- ▶ The follows are local matrix-matrix multiplication.

```
jstart=ib*( (myid+iloop)%NPROCS );
for (i=0; i<ib; i++) {
    for(j=0; j<ib; j++) {
        for(k=0; k<n; k++) {
            C[ i ][ jstart + j ] += A[ i ][ k ] * B[ k ][ j ];
        }
    }
}
```

Hints of parallelization (Almost answer code, Fortran Language)

- ▶ The follows are overview of code.

```
ib = n/numprocs
do iloop=0, NPROCS-1
    A local matrix-matrix multiplication C = A * B
    if (iloop .ne. (numprocs-1) ) then
        if (mod(myid, 2) .eq. 0 ) then
            call MPI_SEND(B, ib*n, MPI_DOUBLE_PRECISION, isendPE,
&                      iloop, MPI_COMM_WORLD, ierr)
            call MPI_RECV(B_T, ib*n, MPI_DOUBLE_PRECISION, irecvPE,
&                      iloop+numprocs, MPI_COMM_WORLD, istatus, ierr)
        else
            call MPI_RECV(B_T, ib*n, MPI_DOUBLE_PRECISION, irecvPE,
&                      iloop, MPI_COMM_WORLD, istatus, ierr)
            call MPI_SEND(B, ib*n, MPI_DOUBLE_PRECISION, isendPE,
&                      iloop+numprocs, MPI_COMM_WORLD, ierr)
        endif
        Copy B_T to B
    endif
enddo
```

Hints of parallelization (Almost answer code, Fortran Language)

- ▶ The follows are local matrix-matrix multiplication.

```
imod = mod( (myid+iloop), NPROCS )
jstart = ib* imod
do i=1, ib
    do j=1, ib
        do k=1, n
            C( i , jstart + j ) = C( i , jstart + j ) + A( i , k ) * B( k , j )
        enddo
    enddo
enddo
```