# Lecture 5: Parallel Matrix Algorithms (part 2)

### Column-wise Block-Striped Decomposition

Summary of algorithm for computing  $\mathbf{c} = A\mathbf{b}$ 

- Column-wise 1D block partition is used to distribute matrix.
- Let  $A = [a_1, a_2, ..., a_n]$ ,  $b = [b_1, b_2, ..., b_n]^T$ , and  $c = [c_1, c_2, ..., c_n]^T$
- Assume each task i has column  $a_i$ ,  $b_i$  and  $c_i$  (Assume a finegrained decomposition for convenience )

column-wise distribution

$P_0 P_1 P_2 P_3 P_4 P_5 P_6$	$P_7$
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- 1. Read in matrix stored in row-major manner and distribute by column-wise mapping
- 2. Each task *i* compute  $b_i a_i$  to result in a vector of partial result.
- 3. An all-to-all communication is used to transfer partial result: every partial result element *j* on task *i* must be transferred to task *j*.
- 4. At the end of computation, task i only has a single element of the result  $c_i$  by adding gathered partial results.



### After All-to-All Communication

a <sub>0,0</sub> b <sub>0</sub>	$a_{1,0} b_0$	a <sub>2,0</sub> b <sub>0</sub>	a <sub>3,0</sub> b <sub>0</sub>	$a_{4,0}b_0$
<i>a<sub>0,1</sub> b<sub>1</sub></i>	$a_{_{1,1}}b_{_{1}}$	a <sub>2,1</sub> b <sub>1</sub>	a <sub>3,1</sub> b <sub>1</sub>	a <sub>4,1</sub> b <sub>1</sub>
a <sub>0,2</sub> b <sub>2</sub>	a <sub>1,2</sub> b <sub>2</sub>	a <sub>2,2</sub> b <sub>2</sub>	a <sub>3,2</sub> b <sub>2</sub>	a <sub>4,2</sub> b <sub>2</sub>
a <sub>0,3</sub> b <sub>3</sub>	$a_{1,3} b_3$	a <sub>2,3</sub> b <sub>3</sub>	a <sub>3,3</sub> b <sub>3</sub>	a <sub>4,3</sub> b <sub>3</sub>
$a_{4,4} b_4$	$a_{1,4} b_4$	$a_{2,4} b_4$	<i>b</i> <sub>3,4</sub> <i>b</i> <sub>4</sub>	$a_{4,4} b_4$
			Proc 3	Proc 4

### Reading a Column-wise Block-Striped Matrix

#### read\_col\_striped\_matrix()

read col striped matrix()

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- Read from a file a matrix stored in row-major order and distribute it among processes in column-wise fashion.
- Each row of matrix must be scattered among all of processes.

```
...
// figure out how a row of the matrix should be distributed
create_mixed_xfer_arrays(id,p, *n, &send_count, &send_disp);
// go through each row of the matrix
for(i = 0; i < *m; i++)
{
    if(id == (p-1)) fread(buffer,datum_size, *n, infileptr);
    MPI_Scatterv(...);
}</pre>
```

- int MPI\_Scatterv( void \*sendbuf, int \*sendcnts, int \*displs, MPI\_Datatype sendtype, void \*recvbuf, int recvcnt, MPI\_Datatype recvtype, int root, MPI\_Comm comm)
  - MPI\_SCATTERV extends the functionality of MPI\_SCATTER by allowing a varying count of data to be sent to each process.
  - *sendbuf*: address of send buffer
  - *sendcnts*: an integer array specifying the number of elements to send to each processor
  - displs: an integer array. Entry i specifies the displacement (relative to sendbuf from which to take the outgoing data to process i



### Printing a Colum-wise Block-Striped Matrix

print\_col\_striped\_matrix()

- A single process print all values
- To print a single row, the process responsible for printing must gather together the elements of that row from entire set of processes

```
print_col_striped_matrix()
{
    ...
    create_mixed_xfer_arrays(id, p, n, &rec_count, &rec_disp);
    // go through rows
    for(i =0; i < m; i++)
    {
        MPI_Gatherv(a[i], BLOCK_SIZE(id,p,n), dtype, buffer,
        rec_count, rec_disp, dtype, 0, comm);
    }
}</pre>
```

- int MPI\_Gatherv( void \*sendbuf, int sendcnt, MPI\_Datatype sendtype, void \*recvbuf, int \*recvcnts, int \*displs, MPI\_Datatype recvtype, int root, MPI\_Comm comm )
  - Gathers into specified locations from all processes in a group.
  - sendbuf: address of send buffer
  - sendcnt: the number of elements in send buffer
  - *recvbuf*: address of receive buffer (choice, significant only at root)
  - *recvcounts*: integer array (of length group size) containing the number of elements that are received from each process (significant only atroot)
  - *displs*: integer array (of length group size). Entry i specifies the displacement relative to recvbuf at which to place the incoming data from process i (significant only at root)



### **Distributing Partial Results**

- $c_i = b_0 a_{i,0} + b_1 a_{i,1} + b_2 a_{i,2} + \dots + b_n a_{i,n}$
- Each process need to distribute n 1 terms to other processes and gather n - 1 terms from them (assume fine-grained decomposition).
  - MPI\_Alltoallv() is used to do this **all-to-all** exchange



**Figure 8.13** Function MPI\_Alltoallv allows every MPI process to gather data items from all the processes in the communicator. The simpler function MPI\_Alltoall should be used in the case where all of the groups of data items being transferred from one process to another have the same number of elements.

int MPI\_Alltoallv( void \*sendbuf, int \*sendcnts, int \*sdispls, MPI\_Datatype sendtype, void \*recvbuf, int \*recvcnts, int \*rdispls, MPI\_Datatype recvtype, MPI\_Comm comm );

- *sendbuf*: starting address of send buffer (choice)
- sendcounts: integer array equal to the group size specifying the number of elements to send to each processor
- *sdispls*: integer array (of length group size). Entry j specifies the displacement (relative to sendbuf) from which to take the outgoing data destined for process j
- *recvbuf*: address of receive buffer (choice)
- recvcounts: integer array equal to the group size specifying the maximum number of elements that can be received from each processor
- *Rdispls*: integer array (of length group size). Entry i specifies the displacement (relative to recvbuf at which to place the incoming data from process i

### Send of MPI\_Alltoallv()

Each node in parallel community has



proc 0

proc 1

## Process 0 Sends to Process 0



index \_/

Proc 0 send buffer

## Process 0 Sends to Process 1



index

## Process 0 Sends to Process 2



#### Receive of MPI\_Alltoallv()





### Parallel Run Time Analysis (Column-wise)

- Assume that the # of processes p is less than n
- Assume that we run the program on a parallel machine adopting hypercube interconnection network (Table 4.1 lists communication times of various communication schemes)
- 1. Each process is responsible for n/p columns of matrix. The complexity of the dot production portion of the parallel algorithm is  $\Theta(n^2/p)$
- 2. After all-to-all personalized communication, each processor sums the partial vectors. There are p partial vectors, each of size n/p. The complexity of the summation is  $\Theta(n)$ .
- 3. Parallel communication time for all-to-all *personalized* broadcast communication:
  - Each process needs to send p messages of size n/p each to all processes.

$$t_{comm} = (t_s + t_w \left(\frac{n}{p}\right))(p-1).$$
 Assume p is large, then  
$$t_{comm} = t_s(p-1) + t_w n.$$

• The parallel run time:  $T_p = \frac{n^2}{p} + n + t_s(p-1) + t_w n$ 

#### **2D Block Decomposition**

Summary of algorithm for computing y = Ab

- 2D block partition is used to distribute matrix.
- Let  $A = [a_{ij}]$ ,  $\mathbf{b} = [b_1, b_2, ..., b_n]^T$ , and  $\mathbf{y} = [y_1, y_2, ..., y_n]^T$
- Assume each task is responsible for computing  $d_{ij} = a_{ij}b_j$ (assume a fine-grained decomposition for convenience of analysis).
- Then  $y_i = \sum_{j=0}^{n-1} d_{ij}$ : for each row *i*, we add all the  $d_{ij}$  to produce the *ith* element of **y**.

$P_0$	<i>P</i> <sub>1</sub>	<i>P</i> <sub>2</sub>	<i>P</i> <sub>3</sub>
$P_4$	P5	$P_6$	<i>P</i> <sub>7</sub>
$P_8$	$P_9$	<i>P</i> <sub>10</sub>	P <sub>11</sub>
P <sub>12</sub>	P <sub>13</sub>	$P_{14}$	P <sub>15</sub>

- Read in matrix stored in row-major manner and distribute by 2D block mapping. Also distribute b so that each task has the correct portion of b.
- 2. Each task computes a matrix-vector multiplication using its portion of *A* and *b*.
- 3. Tasks in each row of the task grid perform a sumreduction on their portion of *y*.
- 4. After the sum-reduction, **y** is distributed by blocks among the tasks in the first column of the task grid.

### Distributing **b**

- Initially, **b** is divided among tasks in the first column of the task grid.
- Step 1:
  - If p square
    - First column/first row processes send/receive portions of b
  - If p not square
    - Gather **b** on process 0, 0
    - Process 0, 0 broadcasts to first row processes
- Step 2: First row processes scatter **b** within columns



#### When p is a square number



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