### Introduction

- Used to find shortest paths in a weighted graph
- Travel maps containing driving distance from one point to another
  - Represented by tables
  - Shortest distance from point A to point B given by intersection of row and column
  - Route may pass through other cities represented in the table
- Navigation systems

### All-pairs shortest-path problem

- Graph G = (V, E)
- Weighted and directed graph
- Problem: Find the length of the shortest path between every pair of vertices
  - Length of the path is strictly determined by the weight of its edges
  - It is not based on the number of edges traversed
- Representation of weighted directed graph by adjacency matrix
  - $n \times n$  matrix for a graph with n vertices adjacency matrix
    - \* Chosen for constant time access to every edge
  - Nonexistent edges may be assigned a value  $\infty$

	0	1	2	3	4	5
0	0	2	5	$\infty$	$\infty$	$\infty$
1	$\infty$	0	7	1	$\infty$	8
2	$\infty$	$\infty$	0	4	$\infty$	$\infty$
3	$\infty$	$\infty$	$\infty$	0	3	$\infty$
4	$\infty$	$\infty$	2	$\infty$	0	3
5	$\infty$	5	$\infty$	2	4	0

• Algorithm

```
Input n: Number of vertices
    a[0..n-1][0..n-1] -- Adjacency matrix

Output: Transformed a that contains shortest path lengths

for ( k = 0; k < n; k++ )
    for ( i = 0; i < n; i++ )
        for ( j = 0; j < n; j++ )
            a[i][j] = min ( a[i][j], a[i][k] + a[k][j] );</pre>
```

- Easy to see that the algorithm is  $\Theta(n^3)$
- Solution

	0	1	2	3	4	5
0	0	2	5	3	6	9
1	$\infty$	0	6	1	4	7
2	$\infty$	15	0	4	7	10
3	$\infty$	11	5	0	3	6
4	$\infty$	8	2	5	0	3
5	$\infty$	5	6	2	4	0

### Creating arrays at run time

• Allocate arrays on heap at run-time to make the program more useful, such as

```
int * arr;
arr = ( int * ) malloc ( n * sizeof ( int ) );
```

- 2D arrays in C are represented by a 1D array of pointers, using malloc
- Problem in transmission as memory should be contiguous
- Allocate them by first allocating space, and then, putting pointers in place

• Initialize the array elements either by using a[i][j] notation, or by using storage if initialized en masse

### Designing parallel algorithm

- Partitioning
  - Choose either domain decomposition or functional decomposition
  - Same assignment statement executed  $n^3$  times
    - \* No functional parallelism
  - Easy to do domain decomposition
    - \* Divide matrix A into  $n^2$  elements
    - \* Associate a primitive task with each element
- Communication
  - Each update of element a[i][j] requires access to elements a[i][k] and a[k][j]
  - For a given value of k
    - \* Element a [k, m] is needed by every task associated with elements in column m
    - \* Element a [m,k] is needed by every task associated with elements in row m
  - In iteration k, each element in row k gets broadcast to the tasks in the same column
  - Each element in column k gets broadcast to tasks in the same row
  - Do we need to update every element of matrix concurrently?
    - \* Values of a[i][k] and a[k][j] do not change during iteration k

\* Update to a[i][k] is

```
a[i][k] = min ( a[i,k], a[i,k] + a[k,k] );
```

\* Update to a[k][j] is

$$a[k][j] = min ( a[k,j], a[k,k] + a[k,j] );$$

- \* In both the above updates, a[i][k] and a[k][j] cannot decrease (all numbers are positive)
- \* Hence, no dependence between updates of a[i][j] and the updates of a[i][k] and a[k][j]
- \* For each iteration k of the outer loop, perform broadcasts and update every element of matrix in parallel

## **Agglomeration and mapping**

- Use the decision tree to determine agglomeration and mapping strategy
  - Number of tasks: static
  - Communication among tasks: structured
  - Computation time per task: constant
- Agglomerate tasks to minimize communication
  - One task per MPI process
- Agglomerate  $n^2$  primitive tasks into p tasks using either of the following two methods
  - Row-wise block striped
    - \* Agglomerate tasks in the same row
    - \* Broadcast within rows eliminated; data values local to task
    - \* During every iteration of outer loop, one task broadcasts n elements to all other tasks
    - \* Time for each broadcast:  $\lceil \log p \rceil (\lambda + n/\beta)$
  - Column-wise block striped
    - \* Agglomerate tasks within same column
    - \* Broadcast within columns eliminated
    - \* Time for each broadcast:  $\lceil \log p \rceil (\lambda + n/\beta)$
  - Both the above methods result in same performance, look outside the computational kernel
  - Final choice: Simpler to read matrix from file with row-wise block striped if the file stores data as row-major order
    - \* Internally, C stores the matrices as row major as well

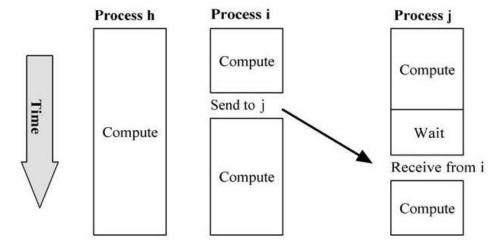
#### Matrix I/O

- Choice to let each process open the file, access the appropriate row (seek to it), and read the row
- Another method to read the matrix rows in last process and send them to appropriate process
  - Process i responsible for rows  $\lfloor in/p \rfloor$  through  $\lfloor (i+1)n/p \rfloor 1$
  - Last process responsible for  $\lceil n/p \rceil$  rows (largest buffer)
    - \* No extra space needed for file input buffering
  - Last process reads the rows for each process in a loop and sends the data to appropriate task
- All the printing done by process 0, by getting data from other processes
  - Print all the output in correct order
  - Processes  $1, 2, \ldots, p-1$  simply wait for a message from process 0, then send process 0 their portion of the matrix

\* Process 0 never receives more than one submatrix at a time

## Point-to-point communication

- Function to read matrix from file
  - Executed by process p-1
  - Reads a contiguous group of matrix rows
  - Sends a message containing these rows directly to the process responsible to manage them
- Function to print the matrix
  - Each process sends the group of matrix rows to process 0
  - Process 0 receives the message and prints the rows to standard output
- Communication involves a pair of processes
  - One process sends a message
  - Other process receives the message



- Process h is not involved in communication
- Both Send and receive are blocking
- Both send and receive need to be conditionally executed by process rank

- Communication calls must be in conditionally executed code

- Function MPI\_Send
  - Perform a blocking send

```
int MPI_Send ( void * buffer, int count, MPI_Datatype datatype, int dest,
   int tag, MPI_Comm comm );
```

**buffer** Starting address of the array of data items to send

**count** Number of data items in array (nonnegative integer)

datatype Data type of each item (uniform since it is an array); defined by an MPI constant

dest Rank of destination (integer)

tag Message tag, or integer label; allows identification of message purpose

comm Communicator; group of processes participating in this communication function

- Function blocks until the message buffer is again available
- Message buffer is free when
  - \* Message copied to system buffer, or
  - \* Message transmitted (may overlap computation)
- Function MPI\_Recv
  - Blocking receive for a message

```
int MPI_Recv ( void * buffer, int count, MPI_Datatype datatype, int src,
    int tag, MPI_Comm comm, MPI_Status * status );
```

**buffer** Starting address of receive buffer

count Maximum number of data items in receive buffer

datatype Data type of each item (uniform since it is an array); defined by an MPI constant

src Rank of source (integer)

- \* Can be specified as MPI ANY SOURCE to receive the message from any source in the communicator
- \* Process rank in this case can be determined through status

tag Desired tag value (integer)

- \* Can be specified as MPI\_ANY\_TAG
- \* Received tag can be determined through status

**comm** Communicator; group of processes participating in this communication function

status Status objects; must be allocated before call to MPI\_Recv

- Blocks until the message has been received, or until an error condition causes the function to return
- count contains the maximum length of message
  - \* Actual length of received message can be determined with MPI\_Get\_count
- status contains information about the just-completed function

status->MPI\_source Rank of the process sending message

status->MPI\_tag Message's tag value

statis->MPI\_ERROR Error condition

- Function blocks until message arrives in buffer
- If message never arrives, function never returns
- Deadlock
  - Process blocked on a condition that will never become true
  - Easy to write send/receive code that deadlocks
    - \* Two processes with rank 0 and 1, each wanting to compute the average of two numbers in an array a [2]

· Process i has the updated value of a[i]

\* Both receive before send

- · Process 0 blocks inside MPI Recv waiting for message from process 1 to arrive
- · Process 1 blocks inside MPI\_Recv waiting for message from process 0 to arrive
- · Both are deadlocked
- \* Send tag does not match receive tag

- · Processes block in MPI\_Recv because the tag is not correct
- \* Other problems could be wrong destination in send or wrong source in receive

### Documenting the parallel program

- Housekeeping, starting in floyd.c
  - Use a typedef and a #define macro to indicate matrix data types
- floyd.c:main() responsible to read and print original matrix
  - It verifies that the matrix is square
  - All work done by compute\_shortest\_paths with four parameters

### Analysis and benchmarking

- Sequential version performance:  $\Theta(n^3)$
- Analysis of parallel algorithm
  - Innermost loop has complexity  $\Theta(n)$
  - Middle loop executed at most  $\lceil n/p \rceil$  times due to rowwise block-striped decomposition of matrix
  - Overall computational complexity:  $\Theta(n^2/p)$
- Communication complexity
  - No communication in inner loop
  - No communication in middle loop
  - Broadcast in outer loop

- \* Passing a single message of length n from one PE to another has time complexity  $\Theta(n)$
- \* Broadcasting to p PEs requires  $\lceil \log p \rceil$  message-passing steps
- \* Complexity of broadcasting:  $\Theta(n \log p)$
- Outermost loop
  - For every iteration of outermost loop, parallel algorithm must compute the root PE taking constant time
  - Root PE copies the correct row of A to array tmp, taking  $\Theta(n)$  time
  - The loop itself executes n times
- Overall time complexity

$$\Theta(n(1 + n + n \log p + n^2/p)) = \Theta(n^3/p + n^2 \log p)$$

- Prediction for the execution time on commodity cluster
  - n broadcasts, with  $\lceil \log p \rceil$  steps each
  - Each step passes messages of 4n bytes
  - Expected communication time of parallel program:  $n \lceil \log p \rceil (\lambda + 4n/\beta)$
  - Average time to update a single cell:  $\chi$
  - Expected computation time for parallel program:  $n^2 \lceil n/p \rceil \chi$
  - Execution time

$$n^{2}\lceil n/p\rceil\chi + n\lceil\log p\rceil(\lambda + 4n/\beta)$$

 This expression overestimates the parallel execution time because it ignores the fact that there can be considerable overlap between computation and communication