

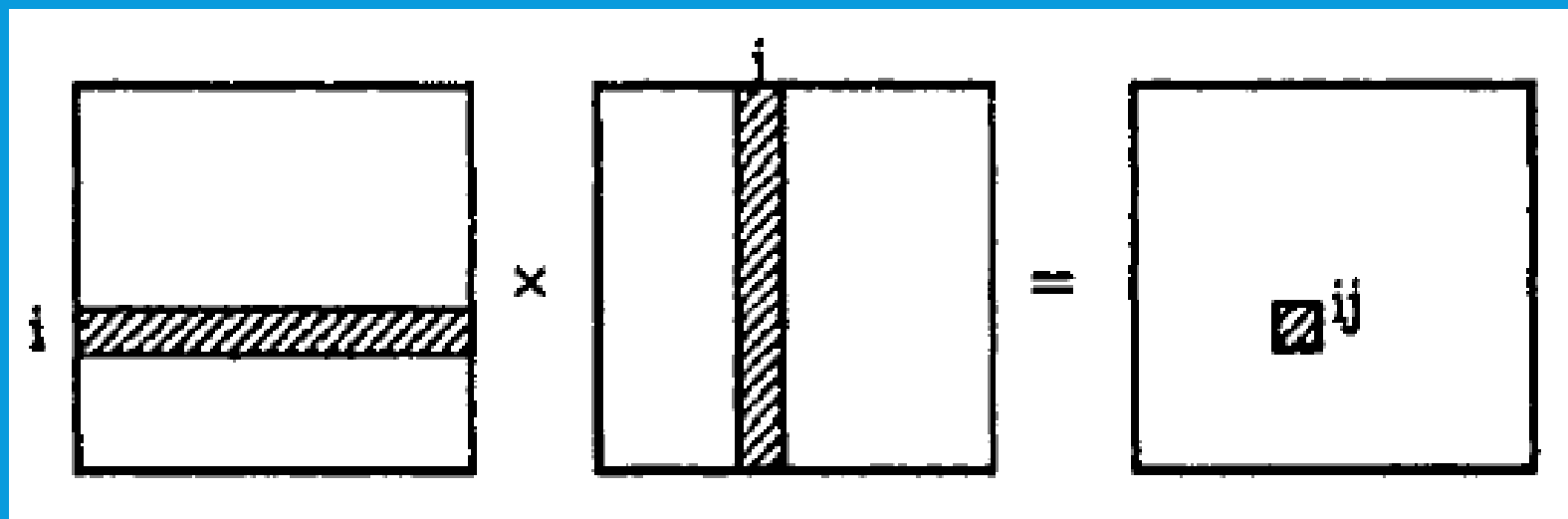
PARALLEL PROCESSING

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MATRIX MULTIPLICATION ON PRAM



MATRIX MULTIPLICATION ON PRAM

$$\begin{bmatrix} 1 & 2 \\ 2 & 1 \end{bmatrix} \times \begin{bmatrix} 3 & 1 \\ 1 & 3 \end{bmatrix}$$

MATRIX MULTIPLICATION ON PRAM

$$c_{ij} = \sum_{k=0}^{m-1} a_{ik} b_{kj}$$

Sequential matrix multiplication algorithm

```
for  $i = 0$  to  $m - 1$  do
  for  $j = 0$  to  $m - 1$  do
     $t := 0$ 
    for  $k = 0$  to  $m - 1$  do
       $t := t + a_{ik} b_{kj}$ 
    endfor
     $c_{ij} := t$ 
  endfor
endfor
```

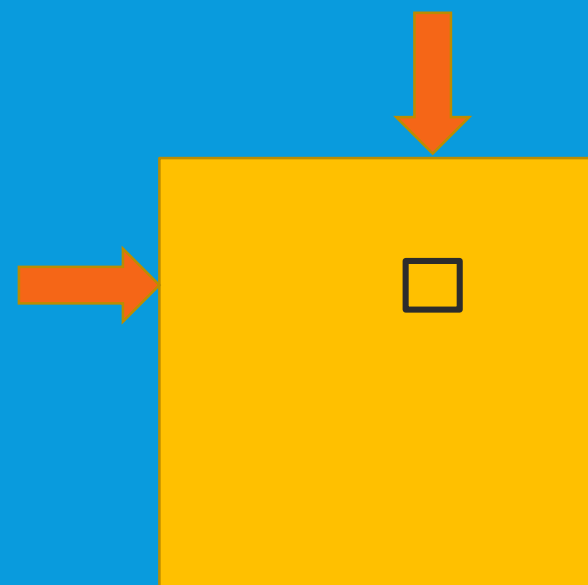
MATRIX MULTIPLICATION ON PRAM

PRAM matrix multiplication algorithm using m^2 processors

```
Processor  $(i, j)$ ,  $0 \leq i, j < m$ , do  
begin  
   $t := 0$   
  for  $k = 0$  to  $m - 1$  do  
     $t := t + a_{ik} b_{kj}$   
  endfor  
   $c_{ij} := t$   
end
```

MATRIX MULTIPLICATION ON PRAM

- When PRAM has $p=m^2$ processors
 - Processor i, j :
 - Read the elements of Row i in A
 - Read the elements of column j in B
 - Write the results in C .
 - This requires CREW sub model.
 - $p=m^2$ processors the algorithm takes $\Theta(m)$ time



MATRIX MULTIPLICATION ON PRAM

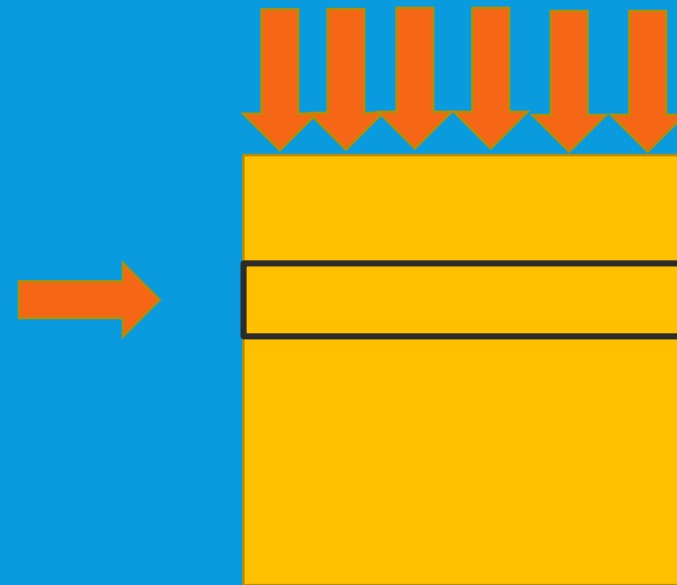
At processor i

PRAM matrix multiplication algorithm using m processors

```
for  $j = 0$  to  $m - 1$  Processor  $i$ ,  $0 \leq i < m$ , do  
   $t := 0$   
  for  $k = 0$  to  $m - 1$  do  
     $t := t + a_{ik} b_{kj}$   
  endfor  
   $c_{ij} := t$   
endfor
```

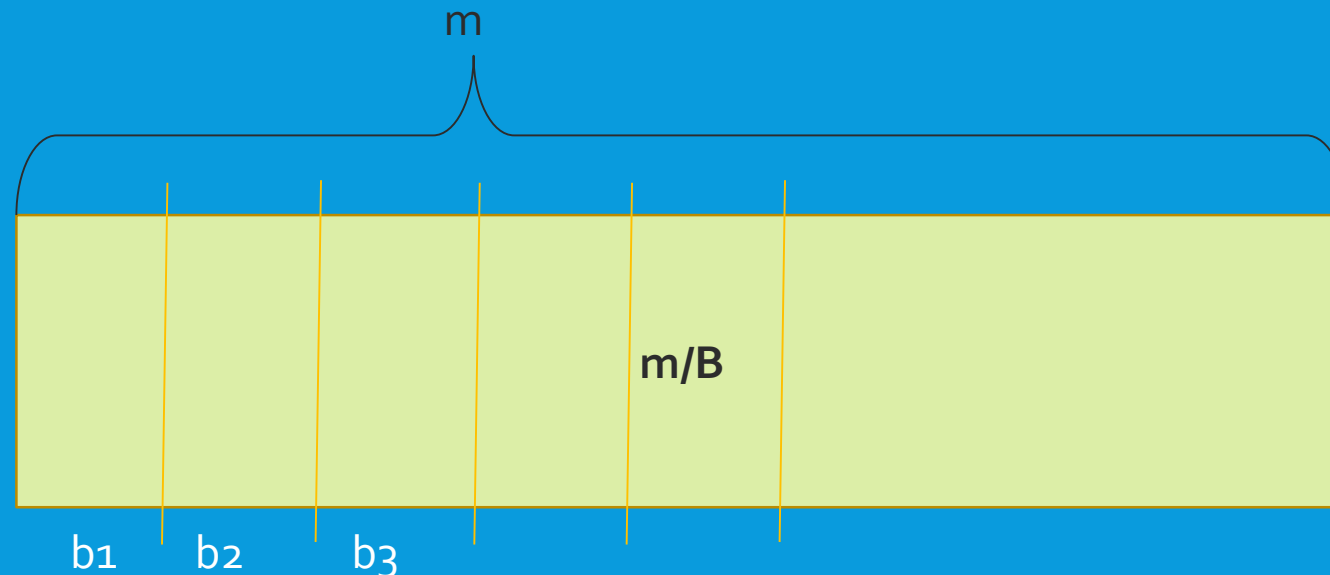
MATRIX MULTIPLICATION ON PRAM

- When PRAM has $p=m$ processors
 - Processor i :
 - Read the elements of Row i in A
 - Read the elements of all columns in B
 - Write the results in row i in C
 - This requires CREW sub model.
 - $p=m$ processors the algorithm takes $\Theta(m^2)$ time



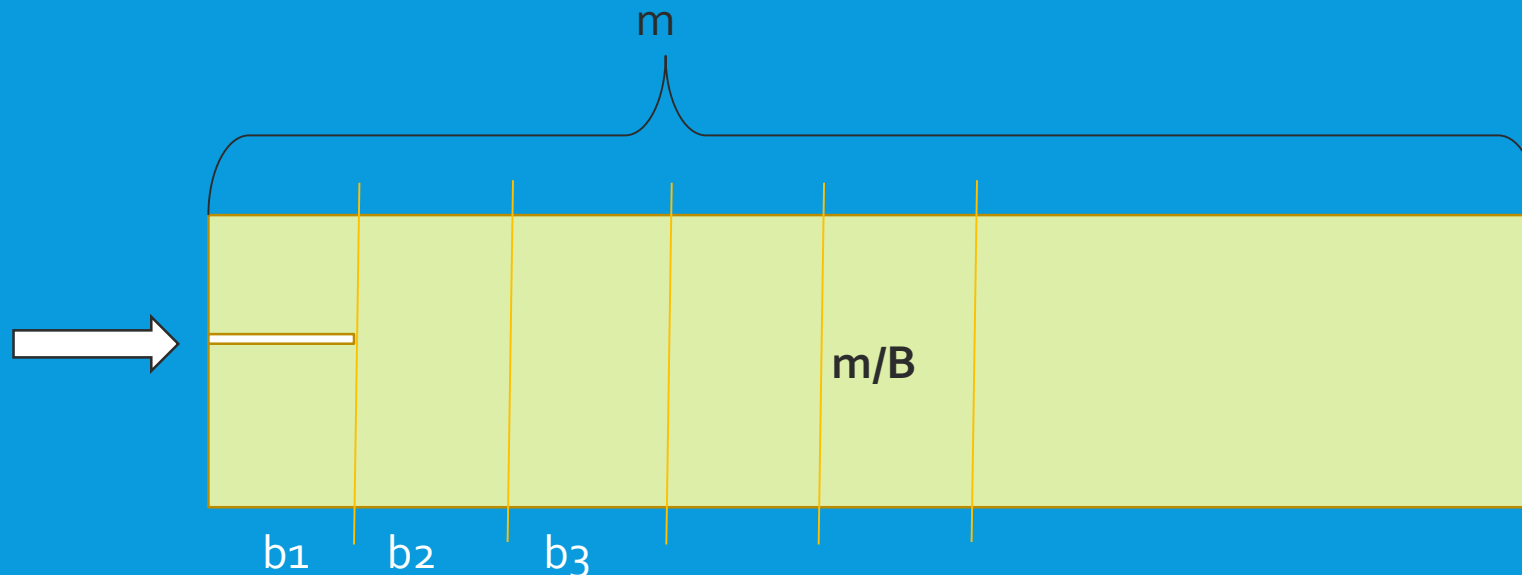
MATRIX MULTIPLICATION ON PRAM

- In any physical implementation of shared memory, the m memory locations will be in B memory banks (modules), each bank holding m/B addresses.



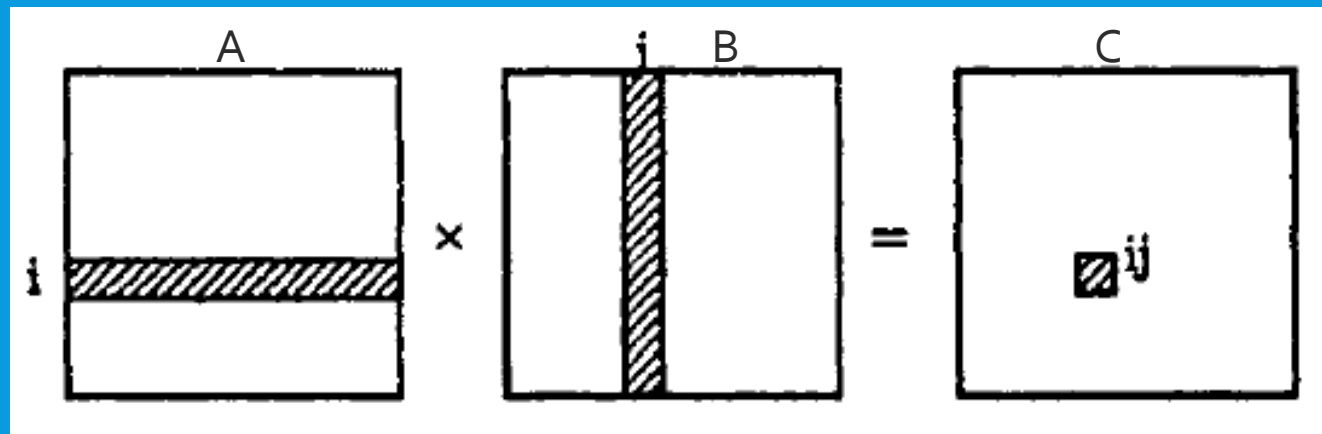
MATRIX MULTIPLICATION ON PRAM

- Typically, a memory bank can provide access to a single memory word in a given memory cycle.



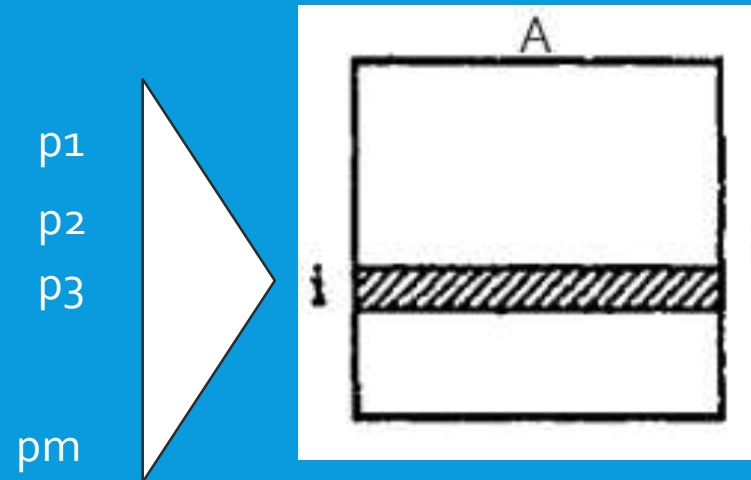
MATRIX MULTIPLICATION ON PRAM

- Let us take the $m \times m$ matrix multiplication algorithm in which $p = m^2$ processors are used.
- We identify each processor by an index pair (i, j) . Then, Processor P_{ij} will be responsible for computing the element c_{ij} of the result matrix C .



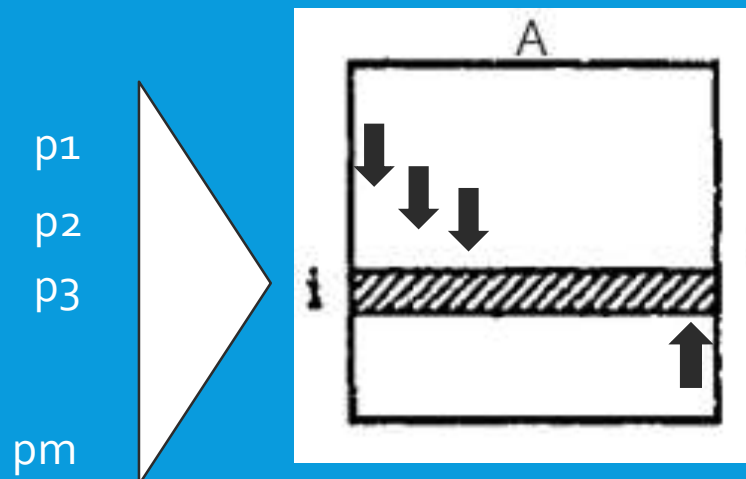
MATRIX MULTIPLICATION ON PRAM

- The m processors $P_i, 0 \leq i < m$, would need to read (the same row) Row i of the matrix A for their computation.



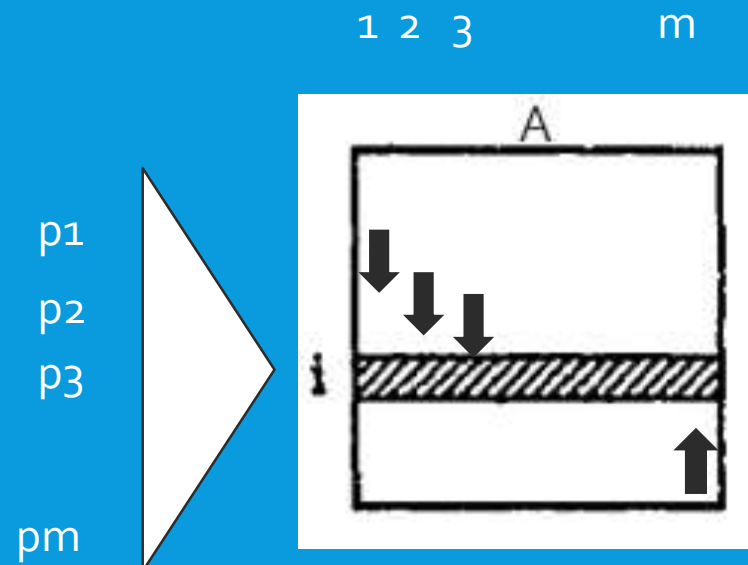
MATRIX MULTIPLICATION ON PRAM

- In order to avoid multiple accesses to the same matrix element, we skew the accesses so that P_i reads the elements of Row i beginning with $A_{i,y}$.
- In this way, the entire Row i of A is read out in every cycle, although with the elements distributed differently to the processors in each cycle.



MATRIX MULTIPLICATION ON PRAM

- data layout must assign different columns of A to different memory banks. This is possible if we have at least m memory banks and corresponds to the data storage in column-major order



MATRIX MULTIPLICATION ON PRAM

Column 2						
0,0	0,1	0,2	0,3	0,4	0,5	
1,0	1,1	1,2	1,3	1,4	1,5	Row 1
2,0	2,1	2,2	2,3	2,4	2,5	
3,0	3,1	3,2	3,3	3,4	3,5	
4,0	4,1	4,2	4,3	4,4	4,5	
5,0	5,1	5,2	5,3	5,4	5,5	
Module	0	1	2	3	4	5

MATRIX MULTIPLICATION ON PRAM



- note that Processors P_{xj} , $0 \leq x < m$, all access the j th column of matrix B . Therefore, the column-major storage scheme is not suitable and will lead to memory bank conflicts for all such accesses to the columns of B .
- If we store B in row-major order to avoid such conflicts. We may later need to use B in a different matrix multiplication $B \times D$.
- Should we rearrange B in memory or change the algorithm??

MATRIX MULTIPLICATION ON PRAM



- A matrix can be laid out in memory in such a way that both columns and rows are accessible in parallel without memory bank conflicts.
- This is called skewed storage scheme that allows conflict-free access to both rows and columns of a matrix.
- matrix element (i, j) is found in location i of module $(i + j) \bmod B$ (B number of memory banks).
- It is clear from this formulation that all elements (i, y) , $0 \leq y < m$, will be found in different modules, as are all elements (x, j) , $0 \leq x < m$, provided that $B \geq m$.

MATRIX MULTIPLICATION ON PRAM

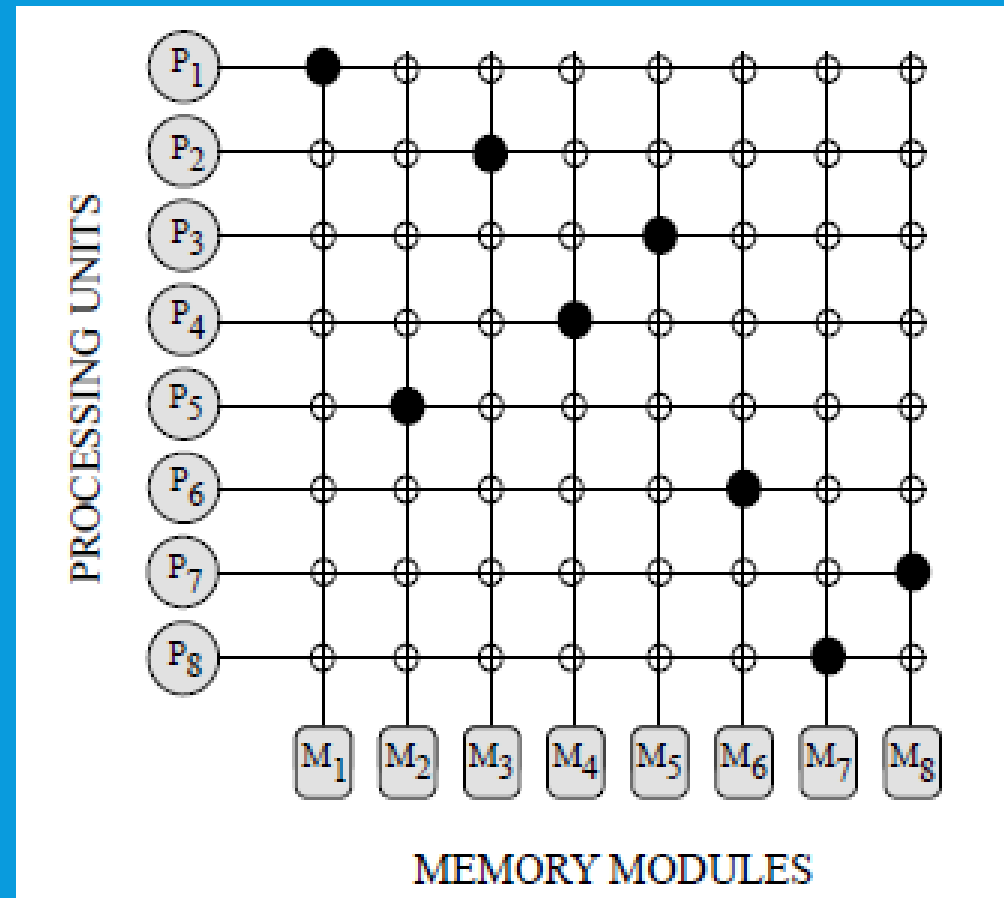
	0,0	0,1	0,2	0,3	0,4	0,5	
	1,5	1,0	1,1	1,2	1,3	1,4	Row 1
	2,4	2,5	2,0	2,1	2,2	2,3	
	3,3	3,4	3,5	3,0	3,1	3,2	
	4,2	4,3	4,4	4,5	4,0	4,1	
	5,1	5,2	5,3	5,4	5,5	5,0	
Module	0	1	2	3	4	5	

MATRIX MULTIPLICATION ON PRAM



- A multiple memory access requests must be directed from the processors to the associated memory banks.
- With a large number of processors and memory banks, this is a nontrivial problem.
- Ideally, the memory access network should be a permutation network that can connect each processor to any memory bank as long as the connection is a permutation.

MATRIX MULTIPLICATION ON PRAM

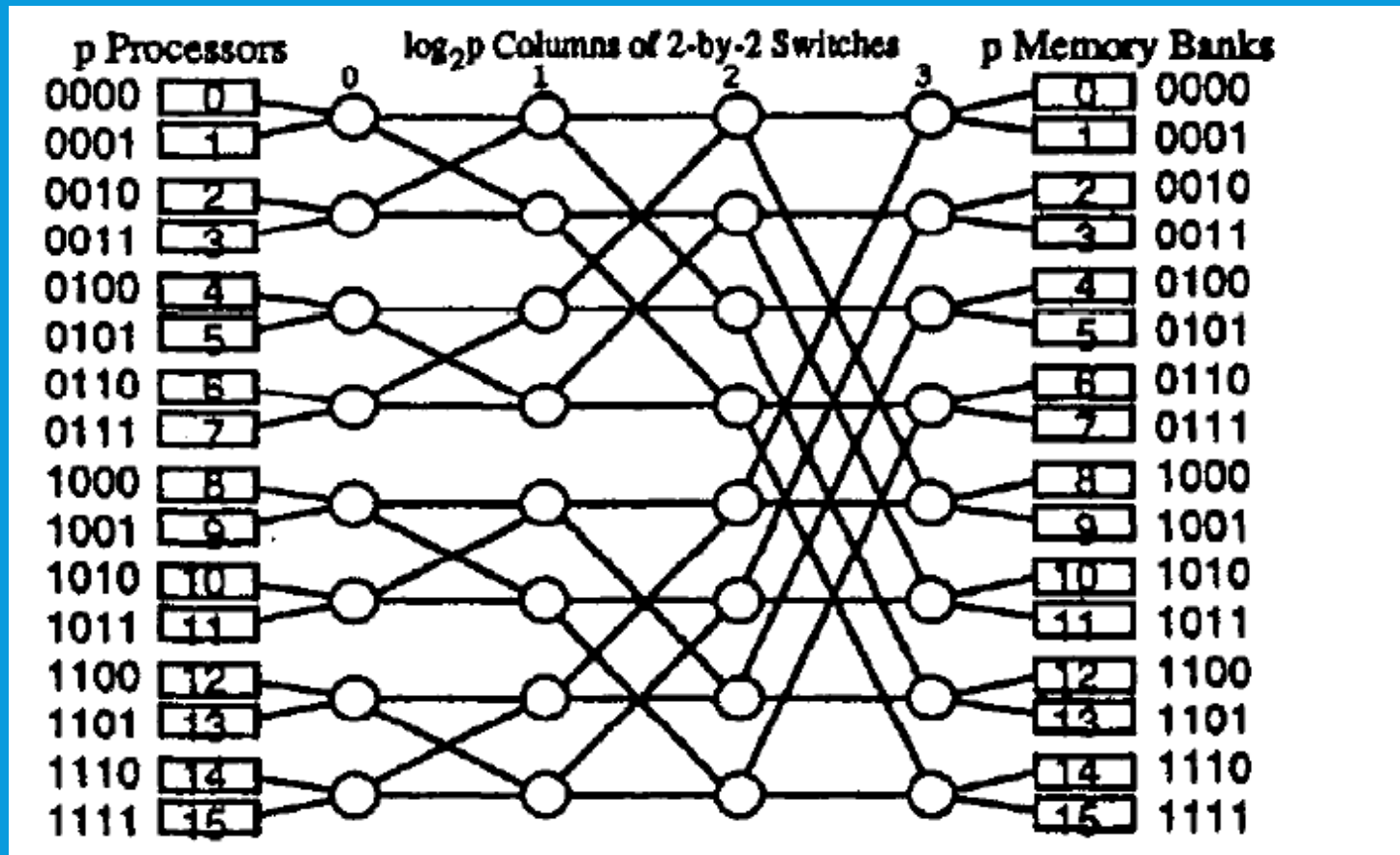


MATRIX MULTIPLICATION ON PRAM



- Permutation networks are quite expensive to implement and difficult to control.
- We usually settle for networks that do not possess full permutation capability.
- Multistage interconnection network as an example of a compromise solution.
- The following is the Butterfly interconnection network.

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MATRIX MULTIPLICATION ON PRAM

