## PARALLELIZED CONVOLUTION

## Convolution

- Convolution is a mathematical operation on two functions
- A function derived from two given functions by integration that expresses how the shape of one is modified by the other.
- The Mathematical expression for basic two dimensional convolution is

$$
(f * g)(t) \stackrel{\text { def }}{=} \int_{-\infty}^{\infty} f(\tau) g(t-\tau) d \tau
$$

Convolution


## Applications

- Image Processing
- Electrical Engineering (Communication signal processing)
- Statistics
- Differential equations


## Matrix Convolution

$$
\begin{aligned}
& O_{57}=I_{57} K_{11}+I_{58} K_{12}+I_{59} K_{13}+I_{67} K_{21}+I_{68} K_{22}+I_{69} K_{23} \\
& O(i, j)=\sum_{k=1}^{m} \sum_{l=1}^{n} I(i+k-1, j+l-1) K(k, l)
\end{aligned}
$$

## Sequential solution

- The kernel matrix is padded over the input matrix and the overlapping pixels are computed and this operation is continued for all the pixels of input matrix.
- The complexity is similar to matrix multiplication where the computation involves huge no of multiplications and additions.


## Parallel solution

- Input Matrix is stored in a single node
- Kernel matrix is broadcasted to all the other processors
- Input Matrix node distributes chunks of input matrix to all the other processors
- All the processors sends the partially computed result to a single final node
- Because of independent convolutions, distributed parallelism can be implemented


## The Input size

- $1024 \times 1024$ image - input
- $90 \times 90$ kernel


## Running Time

No of Processors vs Running Time (seconds)
_Runing Time ( $90 \times 90$ )


## No of Processors vs Speedup



## Running Time



## Running Time

| No of Processors allotted | Processors Requested | Running Time (seconds) | Analysis |
| :---: | :---: | :---: | :---: |
| 80 | 160 | 92.12 |  |
| 80 | 135 | 87.34 |  |
| 80 | 115 | 83.98 |  |
| 80 | 90 | 79.63 |  |
| 80 | 80 | 76.38 | Best Running Time |
| 52 | 96 | 90.54 |  |
| 52 | 84 | 87.91 |  |
| 52 | 75 | 82.25 |  |
| 52 | 63 | 76.54 |  |
| 52 | 52 | 73.68 | Best Running Time |

## Running Time



## Choosing optimum $N$ from the graph?

| $x y=$ constant |  |  |
| :---: | :---: | :---: |
| $x+y=$ minimum |  |  |
| $\underline{x}$ | y | cost |
| 1 | 64 | 64 |
| 2 | 32 | 64 |
| 4 | 16 | 64 |
| 8 | 8 | 64 |
| 16 | 4 | 64 |
| 32 | 2 | 64 |
| 64 | 1 | 64 |

$8+8=16$ - which is the minimum among all $x+y$ combinations. so choosing $N$ (no of processors) at this point will give fairly best cost for a given input

## Optimum N?

- The optimum no of nodes for the approximate no of multiplications can be calculated.
- example : $1024 \times 1024$ image - input $90 \times 90$ kernel
$-1024 \times 1024 \times 90 \times 90=\sim 8$ billion operations


## Difficulties

- Communication overhead
- Large no of multiplications
- ( $\sim 8$ billion Multiplications and additions) for $90 \times 90$ kernel
- ( $\sim 6.5$ billion Multiplications and additions) for $80 \times 80$ kernel
- Filtering the input matrix


## References

- www.scribd.com/doc/58013724/10-MPI-programmes
- http://heather.cs.ucdavis.edu/~matloff/mpi.html
- Miller, Russ, and Laurence Boxer. Algorithms, sequential \& parallel: A unified approach.


## Questions?

