

Compulsory assignment 2 INF236  
spring semester 2017  
Topic: matrix multiplication

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## Abstract:

This report explains two different parallel algorithm for matrix multiplication of size  $n$ , both implemented with BSP. The first solution uses a rows distribution while the second one is an implementation of Cannon's algorithm.

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## 1. Introduction

The purpose of this assignment is to implement two different parallel algorithm for computing  $C = A \times B$  where  $A, B, C$  are  $n \times n$  real matrices.

The first algorithm uses a rows distribution where processor  $i$  owns rows  $n/p * i$  up to row  $n/p * (i+1)$  of matrix  $A$  and  $C$ , while the sets of rows in matrix  $B$  are shifted cyclically between the processors in order to avoid waste of memory.

The second algorithm is an implementation of Cannon's algorithm, which uses a block distribution.

The presented solutions are written in C and parallelized using BSP; every running test is done at least three times on `brake.iit.uib.no`.

In order to get the best running time the source files are compiled with GCC using the `-O3` flag, furthermore the initial time spent on memory allocation and on generating the random values is not included; the elements of  $A$  and  $B$  on each processor are initialized on the processor, so we can avoid to distribute them from one processor.

We made the assumption that the number of processor  $p$  evenly divides  $n$ .

To make sure that the computation is correct, the user can provide coordinates  $y, x$  for the matrix  $C$ , this element is explicitly computed and compared with the element obtained in position  $y, x$  with the parallel algorithm.

## 2. Matrix multiplication with rows distribution

### 2.1 Step of the algorithm

- a) Initialization
- b) Compute partial elements of  $C$
- c) Get the set of rows owned by the next processors (repeat steps b and c,  $p$  times)
- d) Print the requested value
- e) Compute explicitly the requested value as a proof of correctness

### 2.2 Main variables

$p$ : number of processors

$s$ : processor id

$A, B, C$ : local matrices

$pA, pB, pC$ : pointers to the rows of  $A, B, C$  matrices

$N$ : matrices dimension

$K$ : is equal to  $N/p$  and it represents the number of row held by each processor

$x$ : column of the element to check, this value is given by the user

$y$ : row of the element to check, this value is given by the user

## 2.3 algorithm

### a) initialization

Each processor allocate the necessary contiguous memory to hold  $N \times k$  elements as an array and fills it up with random values.

```
A = (double *) malloc (N*k*sizeof(double));
B = (double *) malloc (N*k*sizeof(double));
C = (double *) malloc (N*k*sizeof(double));

pA = (double **) malloc(k*sizeof(double *));
pB = (double **) malloc(k*sizeof(double *));
pC = (double **) malloc(k*sizeof(double *));

for(i=0; i<k; i++){
    pA[i]=A+i*N;
    pB[i]=B+i*N;
    pC[i]=C+i*N;
}

gettimeofday(&t1, NULL);

srand(t1.tv_usec * t1.tv_sec * s);
for(i=0; i<k; i++)
    for(j=0; j<N; j++)
        pA[i][j] = (double)rand()/(double)(RAND_MAX);

for(i=0; i<k; i++)
    for(j=0; j<N; j++){
        pB[i][j] = (double)rand()/(double)(RAND_MAX);
        pC[i][j] = 0.0;
    }
```

### b) Compute partial elements of C

The idea is that to compute the element  $C[x][y]$  we have to compute  $\sum A[x][i] \cdot B[i][y]$ , but the order of the operands is irrelevant.

In addition to this, processor  $i$  holds only a portion of column  $y$  of  $B$  (precisely  $N/p$  elements), therefore there are  $p$  supersteps, in each of these, processor  $i$  computes the partial sum for the elements in the rows which is responsible. After that, it receives the next  $N/p$  rows of the matrix  $B$  from the next processor and it updates the same element in  $C$ . In this way every processor is able to see the whole matrix  $B$ , but in each superstep only  $N/p$  rows are visible.

The first loop goes from 0 up to  $p$ , so that every processor is able to see the whole matrix  $B$ .

The second loop runs from 0 up to  $k$ , since every processor is responsible for  $N/p=k$  rows.

Now that the row is fixed, we have to multiply the right elements of  $A$  with the corresponding elements in  $B$  and update all the selected row in  $C$ ; after that, the chunk of rows are shifted cyclically and we update the starting point and the endpoint for the next iteration.

```
bsp_push_reg(B, N*k*sizeof(double));
bsp_sync();

double time0= bsp_time();

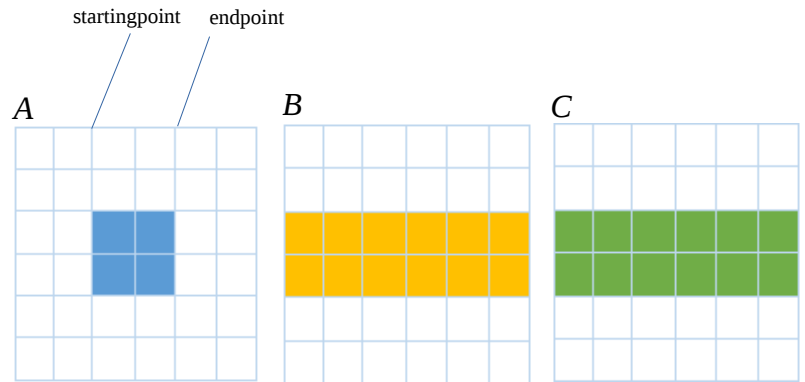
int l;
int startingpoint = s*k;
int endpoint = startingpoint + k;
int row;
int superstep;
```

```

for(superstep = 0; superstep<p; superstep++){
    for (row=0; row<k ; row++)
        for (j=startingpoint, l=0; j<endpoint; j++, l++)
            for (g=0; g<N; g++)
                pC[row][g] += pA[row][j] * pB[l][g];
    bsp_get((s+1)%p, B, 0, B, N*k*sizeof(double) );
    bsp_sync();
    startingpoint = (startingpoint+k)%N;
    endpoint = startingpoint +k ;
}

double time1= bsp_time();

```



d)Print the requested value

Now that the C matrix is computed, the processor with  $s=y/k$  holds the element  $C[y][x]$  requested by the user, so it is responsible to print out the value.

Since in each processor local rows start from 0 up to  $k$ , we have to select the  $y\%k$  row to pick up the right global row got in input.

```

if (s==y/k){
    printf("---- C[%ld][%ld]=%.2f from row-wise decomposition-----\n", y, x, pC[y%k][x]);
    printf("Totale time : %f\n", time1-time0);
}

```

Now we compute explicitly the value of  $C[y][x]$  as a proof of correctness.

Every processor puts his  $k$  elements of the column  $x$  in  $B$  in the right position of  $bcolumn$ , so that  $s=y/k$  can explicitly compute and print  $C[y][x]$ .

```

double *bcolumn;
bcolumn = (double *) malloc (N*sizeof(double));
bsp_push_reg(bcolumn, N*sizeof(double));
bsp_sync();

for(i=0; i<k; i++){
    bsp_put(y/k, &(pB[i][x]), bcolumn, (s*k+i)*sizeof(double) , sizeof(double) );
    bsp_sync();
}
if(s==y/k){
    double sum=0.0;
    for(i=0; i<N; i++)
        sum += pA[y%k][i]*bcolumn[i];
    printf("---- C[%ld][%ld]=%.2f from test -----\n", y, x, sum);
}

```

### 3. Cannon's algorithm

#### 3.1 Step of the algorithm

- a) Initialization
- b) Test
- c) Shifting matrices
- d) Compute C

#### 3.2 Main variables

p: number of processors

s: processor id

A, B, C: local matrices

pA, pB, pC: pointer to the rows of A, B, C local matrices

N: matrices dimension

K: is equal to  $N/p$  and it represents the number of row held by each processor

x: column of the element to check, this value is given by the user

y: row of the element to check, this value is given by the user

pside: is the number of processors in each side of the matrices ( $\sqrt{p}$ )

row, column: these variables contain the current row and column of a processor in the grid.

id: is the processor responsible to print out the value requested by user.

prow, pcomun: this are the values of the row and the columns necessary to compute explicitly  $C[y][x]$ ; every processor that has these values must participate in the final check.

#### 3.3 algorithm

- a) Initialization

```
A = (double *) malloc (k*k*sizeof(double));
B = (double *) malloc (k*k*sizeof(double));
C = (double *) malloc (k*k*sizeof(double));
```

```
pA = (double **) malloc(k*sizeof(double *));
pB = (double **) malloc(k*sizeof(double *));
pC = (double **) malloc(k*sizeof(double *));
```

```
//row and column of the processor in the grid
```

```
row = s/pside;
column = s%pside;
```

```
long prow = y/k;
long pcol = x/k;
long id = prow*pside+pcol;
```

```
bsp_push_reg(A, k*k*sizeof(double));
bsp_push_reg(B, k*k*sizeof(double));
bsp_push_reg(C, k*k*sizeof(double));
bsp_sync();
```

```
for(i=0; i<k; i++){
    pA[i]=A+i*k;
    pB[i]=B+i*k;
    pC[i]=C+i*k;
}
```

```
gettimeofday(&t1, NULL);
```

```
srand(t1.tv_usec * t1.tv_sec * s);
for(i=0; i<k; i++)
    for(j=0; j<k; j++)
        pA[i][j] = (double)rand()/(double)(RAND_MAX);
```

```

for(i=0; i<k; i++)
    for(j=0; j<k; j++){
        pB[i][j] = (double)rand()/(double)(RAND_MAX);
        pC[i][j] = 0.0;
    }

```

#### b)Test

For the test every processor that holds parts of the x column or parts of the y row is responsible to send their values to processor 0, so that it can compute explicitly  $C[y][x]$ .

Note that we have to put local elements from local row  $y\%k$  and from local column  $x\%k$ .

```

double *arow;
double *bcolumn;
arow = (double *) malloc(N*sizeof(double));
bcolumn = (double *) malloc(N*sizeof(double *));
bsp_push_reg(arow,N*sizeof(double *));
bsp_push_reg(bcolumn,N*sizeof(double *));
bsp_sync();

if(row == prow){
    bsp_put(0, pA[y%k] , arow, k*column*sizeof(double), k*sizeof(double));
}
bsp_sync();

if(column == pcol){
    for(i=0; i<k; i++){
        bsp_put(0, &pB[i][x%k] , bcolumn, (k*row+i)*sizeof(double) , sizeof(double));
    }
}
bsp_sync();

if(s==0){
    double sum=0.0;
    for(i=0; i<N; i++)
        sum += arow[i]*bcolumn[i];
    printf("---- C[%ld][%ld]=%.2f from test ----\n", y, x, sum);
}
bsp_pop_reg(arow);
bsp_pop_reg(bcolumn);
free(arow);
free(bcolumn);

```

#### c)Shifting matrices

This *for* loop shifts blocks of matrices A and B according to Cannon's algorithm:

if  $i$  is the last processor in his row,  $i$  has to get matrix A from  $s-pside+1$ , otherwise from  $s+1$ .

Similarly if  $i$  is the last on his column,  $i$  has to get the B matrix from  $(s+pside)\%pside$ , otherwise from the processor below with id equals to  $s+side$ .

```

for (i=0; i< pside; i++){
    if (row > 0 && i<row){
        if (s%pside == pside-1){
            //i'm the last on my row
            bsp_get(s-pside+1, A, 0, A, k*k*sizeof(double));
        }
        else{
            bsp_get(s+1, A, 0, A, k*k*sizeof(double));
        }
    }
}
bsp_sync();

```

```

}

for (i=0; i< pside; i++){
    if ( column>0 && i<column){
        if (row == pside-1){
            //i'm the last on my column
            bsp_get((s+pside)%pside, B, 0, B, k*k*sizeof(double));
        }
        else{
            bsp_get(s+pside, B, 0, B, k*k*sizeof(double));
        }
    }
    bsp_sync();
}

```

#### d)Compute C

We run this for loop *pside* times, since this is the number of processor per side, and processor *i* updates his own matrix C calling localMatUpdate().

After that, processor *i* get the block of matrix A and B according to the Cannon's algorithm.

```

double start = bsp_time();
for(i=0; i<pside; i++){
    localMatUpdate(pA, pB, pC, k);

    //get matrix A from right
    if (s%pside == pside-1){
        //i'm the last on my row
        bsp_get(s-pside+1, A, 0, A, k*k*sizeof(double));
    }
    else{
        bsp_get(s+1, A, 0, A, k*k*sizeof(double));
    }
    //get matrix B from down
    if (row == pside-1){
        //i'm the last on my column
        bsp_get((s+pside)%pside, B, 0, B, k*k*sizeof(double));
    }
    else{
        bsp_get(s+pside, B, 0, B, k*k*sizeof(double));
    }
    bsp_sync();
}

```

```
double finish = bsp_time();
```

At the end of the previous loop the responsible processor print out C[y][x].

Note that id=prow\*pside+pcol.

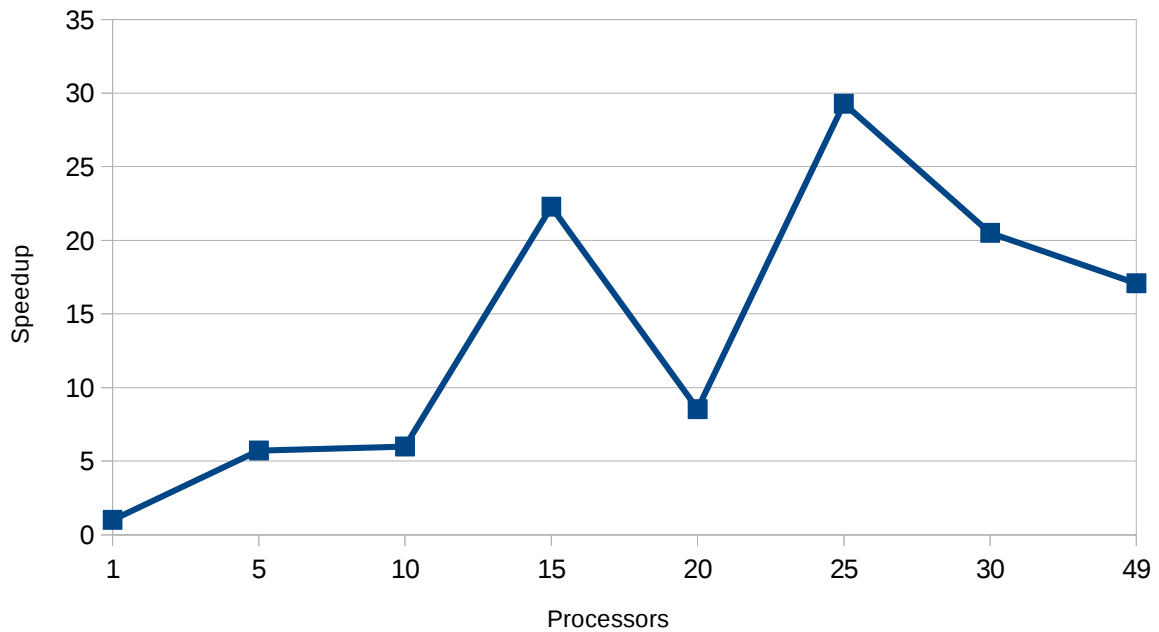
```

if (s==id){
    printf("element C[%ld][%ld]=%.2f in %f\n", y, x, pC[y%k][x%k], finish-start);
}

```

## 4. Strong scaling

The following charts shows the speedup with matrices of size  $n=1800$ .

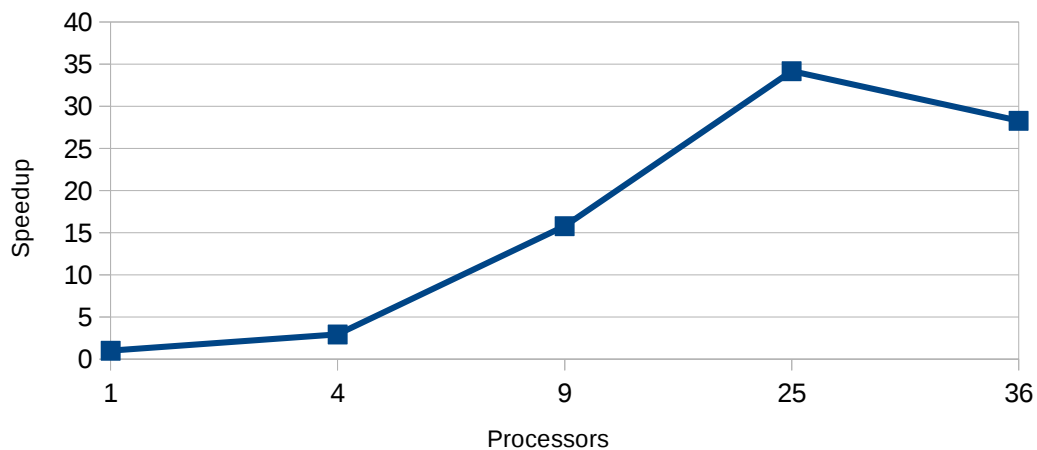


*Illustration 1: speedUp in Row-wise algorithm*

Here there is another representation of the same data where we include also the running time for the communication and the computation parts.

Processors	1	5	10	15	20	25	30	40
Sequential	10.25	10.25	10.25	10.25	10.25	10.25	10.25	10.25
Parallel	10.11	1.79	1.71	0.46	1.20	0.35	0.50	0.60
Communication time	0.04	0.18	0.40	0.08	0.49	0.11	0.14	0.3
Computation time	10.09	1.61	1.21	0.38	0.71	0.24	0.36	0.30
Speedup	1.01	5.72	5.99	22.28	8.54	29.28	20.5	17.08

Oddly, both communication and computation time are high with 10 and 20 processors, while for the other values communication time increases reasonably, since more processors are involved.



*Illustration 2: SpeedUp in Cannon's algorithm*

Here there is a table representation of the same data.

Processors	1	4	9	25	36
Sequential	10.25	10.25	10.25	10.25	10.25
Parallel	10.22	3.49	0.65	0.30	0.36
Speedup	1.00	2.93	15.77	34.17	28.28

## 5. Running time analysis

The cost of a BSP algorithm is an expression of the form  $a+bg+cl$ , where  $a$  is the number of flops overall the supersteps,  $b$  determines the communication time, and is the sum of the maximum between the number of data words sent or received in each superstep, and finally  $c$  is the number of supersteps.

$g$  and  $l$  are function of the number of processors  $p$ , the former represents the necessary flops to send one data word, the latter is the cost of the synchronization.

$r$  is the computing rate and it depends also from the machine.

In the first algorithm we have the following values:

$a=n^3$ , since every processor is responsible for  $\frac{n^2}{p}$  elements, each takes  $O(n)$ , and there are  $p$  steps.

$b=n^2$ , since there are  $p$  communications steps of lengths  $\frac{n^2}{p}$ .

$c=p$ , because every processor holds  $\frac{n^2}{p}$  elements of B and it takes  $p$  step to see the whole matrix B.

$g$  and  $l$  are computed with a benchmarking program for BSP executed on brake.ii.uib.no; with  $p$  fixed to 30, they are respectively 29.2 and 39825.7 flop.

The computing rate  $r$  is equal to 529.225 Mflop/s.

The final formula is  $\frac{n^3+n^2 \cdot g+p \cdot l}{r}$ , and inserting the corresponding values we get:

$$\frac{1800^3+1800^2 \cdot 29.2+30 \cdot 39825.7}{529.225 \times 10^6} = 11.2 \text{ s}$$

Considering instead  $p=25$ , we have  $g=101.7 \text{ flop}$ ,  $l=85036.5 \text{ flop}$ ,  $r=1036.617 \text{ Mflop/s}$ , so we get:

$$\frac{1800^3+1800^2 \cdot 101.7+25 \cdot 85036.5}{1036.617 \times 10^6} = 5.94 \text{ s}$$

In Cannon's algorithm we have the following values:

$a=\frac{n^3}{p}$ , since each processor has  $\left(\frac{n}{\sqrt{p}}\right)^2$  elements, each takes  $O(n)$  and there are  $\sqrt{p}$  steps.

$b=2\frac{n^2}{\sqrt{p}}$ , since in each of the  $\sqrt{p}$  step processor  $i$  sends and receives two matrices of size  $\left(\frac{n}{\sqrt{p}}\right)^2$ .

$c=\sqrt{p}$ .

So the final formula in Cannon's algorithm is  $\frac{n^3}{p}+2\frac{n^2}{\sqrt{p}} \cdot g+\sqrt{p} \cdot l$  and when  $p=30$ , we get:

$$\frac{\frac{1800^3}{25}+\frac{2 \cdot 1800^2}{5} \cdot 101.7+5 \cdot 85036.5}{1036.617 \times 10^6} = 0.352 \text{ s}$$

which is roughly the same result we got in the practical experiment.



