Parallel Computing - Notes - v0.2.0-dev 260236

October 2024

Preface

Every theory section in these notes has been taken from the sources:

• Course slides. [1]

About:

GitHub repository

These notes are an unofficial resource and shouldn't replace the course material or any other book on parallel computing. It is not made for commercial purposes. I've made the following notes to help me improve my knowledge and maybe it can be helpful for everyone.

As I have highlighted, a student should choose the teacher's material or a book on the topic. These notes can only be a helpful material.

Contents

1	\mathbf{PR}	$\mathbf{A}\mathbf{M}$	4
	1.1	Prerequisites	4
		Definition	
	1.3	How it works	L
		1.3.1 Computation	E
		1.3.2 PRAM Classificiation	
		1.3.3 Strengths of PRAM	
		1.3.4 How to compare PRAM models	
	1.4	MVM algorithm	8
Inc	dex		11

1 PRAM

1.1 Prerequisites

Before we introduce the PRAM model, we need to cover some useful topics.

- A Machine Model describes a "machine". It gives a value to the operations on the machine. It is necessary because: it makes it easy to deal with algorithms; it achieves complexity bounds; it analyses maximum parallelism.
- A Random Access Machine (RAM) is a model of computation that describes an abstract machine in the general class of register machines. Some features are:
 - Unbounded number of local memory cells;
 - Each memory cell can hold an integer of **unbounded** size;
 - Instruction set includes simple operations, data operations, comparator, branches;
 - All operations take **unit time**;
 - The definition of time complexity is the number of instructions executed:
 - The definition of space complexity is the number of memory cells used.

1.2 Definition

Definition 1: PRAM

A parallel random-access machine (parallel RAM or PRAM)s a shared-memory abstract machine. As its name indicates, the PRAM is intended as the parallel-computing analogy to the random-access machine (RAM) (not to be confused with random-access memory). In the same way that the RAM is used by sequential-algorithm designers to model algorithmic performance (such as time complexity), the PRAM is used by parallel-algorithm designers to model parallel algorithmic performance (such as time complexity, where the number of processors assumed is typically also stated).

The PRAM model has many interesting features:

- Unbounded collection of RAM processors $(P_0, P_1, \text{ and so on})$;
- Processors don't have tape;
- Each processor has unbounded registers;
- Unbounded collection of share memory cells;
- All processors can access all memory cells in unit time;
- All communication via shared memory.

1 PRAM 1.3 How it works

1.3 How it works

1.3.1 Computation

A single **processor** of the PRAM, at each computation, is **composed of 5 phases** (carried out in parallel by all the processors):

- 1. Reads a value from one of the cells $X\left(1\right),\ldots,X\left(N\right)$
- 2. Reads one of the shared memory cells $A(1), A(2), \ldots$
- 3. Performs some internal computation
- 4. May write into one of the output cells $Y(1), Y(2), \ldots$
- 5. May write into one of the shared memory cells $A(1), A(2), \ldots$

1.3.2 PRAM Classificiation

During execution, a subset of processors may remain idle. Also, some processors can read from the same cell at the same time (not really a problem), but they could also try to write to the same cell at the same time (**write conflict**). For these reasons, PRAMs are classified according to their read/write capabilities (realistic and useful):

- Exclusive Read (ER). All processors can simultaneously read from distinct memory locations.
- Exclusive Write (EW). All processors can simultaneously write to distinct memory locations.
- Concurrent Read (CR). All processors can simultaneously read from any memory location.
- Concurrent Write (CW). All processors can write to any memory location.

? But what value is ultimately written?

It depends on the mode we choose:

- Priority Concurrent Write. Processors have priority based on which value is decided, the highest priority is allowed to complete write.
- Common Concurrent Write. All processors are allowed to complete write if and only if all the value to be written are equal.
 Any algorithm for this model has to make sure that this condition is satisfied. Otherwise, the algorithm is illegal and the machine state will be undefined.
- Arbitrary/Random Concurrent Write. One randomly chosen processor is allowed to complete write.

1 PRAM 1.3 How it works

1.3.3 Strengths of PRAM

PRAM is attractive and important model for designers of parallel algorithms because:

- It is **natural**. The number of operations executed per one cycle on P processors is at most P (equal to P is the ideal case).
- It is **strong**. Any processor can read/write any shared memory cell in unit time.
- It is simple. It abstracts from any communication or synchronization overhead, which makes the complexity and correctness of PRAM algorithm easier.
- It can be used as a **benchmark**. If a problem has no feasible/efficient solution on PRAM, it has no feasible/efficient solution for any parallel machine.

1.3.4 How to compare PRAM models

Consider two generic PRAMs, models A and B. Model A is **computationally stronger** than model B ($A \ge B$) **if and only if any algorithm** written for model B will **run unchanged** on model A in the **same parallel time** and with the **same basic properties**.

However, there are some useful metrics that can be used to compare models:

• Time to solve problem of input size n on <u>one</u> processor, using best sequential algorithm:

$$T^*\left(n\right) \tag{1}$$

• Time to solve problem of input size n on p processors:

$$T_{p}\left(n\right)$$
 (2)

• Speedup on p processors:

$$SU_{p}(n) = \frac{T^{*}(n)}{T_{p}(n)}$$
(3)

• Efficiency, which is the work done by a processor to solve a problem of input size n divided by the work done by p processors:

$$E_{p}(n) = \frac{T_{1}(n)}{pT_{p}(n)}$$

$$\tag{4}$$

• Shortest run time on any process p:

$$T_{\infty}\left(n\right) \tag{5}$$

1 PRAM 1.3 How it works

• Cost, equal to processors and time:

$$C(n) = P(n) \cdot T(n) \tag{6}$$

• Work, equal to the total number of operations:

$$W\left(n\right) \tag{7}$$

Some properties on the metrics:

• The time to solve a problem of input n on a single processor using the best sequential algorithm is not equal to the time to solve a problem of input n in parallel using one of the p processors available. In other words, the problem should not be solvable on a single processor on a parallel machine (otherwise, what would be the point of using a parallel model?)

$$T^* \neq T_1$$

- $SU_P \le P$
- $SU_P \le \frac{T_1}{T_{\infty}}$
- $E_p \leq 1$
- $T_1 \ge T^* \ge T_p \ge T_\infty$
- $T^* \approx T_1 \Rightarrow E_p \approx \frac{T^*}{pT_p} = \frac{\mathrm{SU}_p}{p}$
- $E_p = \frac{T_1}{pT_p} \le \frac{T_1}{pT_\infty}$
- $T_1 \in O(C), T_p \in O\left(\frac{C}{p}\right)$
- $\bullet \ W \leq C$
- $p \approx \text{AREA}$ $W \approx \text{ENERGY}$ $\frac{W}{T_p} \approx \text{POWER}$

1.4 MVM algorithm

The Matrix-Vector Multiply (MVM) algorithm consists of four steps:

- 1. Concurrent read of vector X(1:n) (transfer N elements);
- 2. Simultaneous reads of different sections of the general matrix A (transfer $\frac{n^2}{p}$ elements to each processor);
- 3. Compute $\frac{n^2}{p}$ operations per processor;
- 4. Simultaneous writes (transfer $\frac{n}{p}$ elements from each processor).

Let i be the processor index, so the MVM algorithm is simply written as:

```
1 GLOBAL READ (Z \leftarrow X)
2 GLOBAL READ (B \leftarrow A_i)
3 COMPUTE (W := BZ)
4 GLOBAL WRITE (W \rightarrow y_i)
```

Algorithm 1: Matrix-Vector Multiply (MVM)

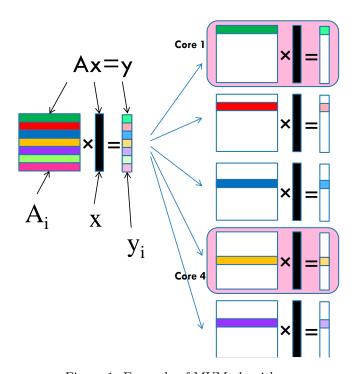


Figure 1: Example of MVM algorithm.

The performance of the MVM algorithm is as follows:

• The **time to solve** a problem of size n^2 is equal to the big O of the squared size of the problem as input divided by the number of processors available:

$$T_p\left(n^2\right) = O\left(\frac{n^2}{p}\right)$$

• The **cost** is equal to the number of processors and the time it takes to solve the problem. So it is quite trivial:

$$C = O\left(\cancel{p} \cdot \frac{n^2}{\cancel{p}} \right) = O\left(n^2\right)$$

• The work is equal to the cost, and the linear power P is equal to the ratio of work and time to solve the problem on p processors:

$$W = C \qquad \frac{W}{T_p} = P$$

• The **perfect efficiency** is equal to:

$$E_p = \frac{T_1}{pT_p} = \frac{n^2}{p\frac{n^2}{p}} = 1$$

References

[1] Ferrandi Fabrizio. Parallel computing. Slides from the HPC-E master's degree course on Politecnico di Milano, 2024.

Index

A Arbitrary Concurrent Write	5
C Common Concurrent Write Concurrent Read (CR) Concurrent Write (CW)	5 5
Exclusive Read (ER) Exclusive Write (EW)	5 5
I i	4
M Machine Model Matrix-Vector Multiply (MVM) algorithm	4
Parallel Random-Access Machine (parallel RAM or PRAM) Priority Concurrent Write	4
R Random Access Machine (RAM) Random Concurrent Write	4