Parallel Scientific Computing

Course AMS301 — Fall 2023 — Lecture 1

Context, motivation and generalities Parallel architectures, algorithms and programming

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Context, motivation and generalities

Parallel architectures and algorithms Parallel programming with MPI in C++

Parallel computing — Context and motivation [1/2]

We consider large-scale problems that are difficult or even impossible to solve with standard computers ...

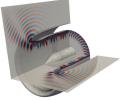
- because the computation time is too long,
- because the **amount of data** to be stored is too large.

Examples of large-scale problems



Weather forecast

(Picture Météo France)





Simulation R&D Aeronautic industry

(Picture Siemens Indus. Soft.)

Simulation of earthquake Picture SPECFEM31

Parallel computing — Context and motivation [2/2]

Parallel computing allows for ...

- \blacktriangleright using more computing power \longrightarrow Decreasing the computation time
- ▶ using more memory space → Processing a larger amount of data

Examples of parallel computers



Standard supercomputer

- Composed of several nodes
- Each node: processor(s) + RAM (Random Memory Access)
- Nodes connected with an internal network



Cluster of standard computers

- Composed of several machines
- Each machine: processor(s) + RAM
- Machines connected with a standard network (e.g. Ethernet/Wi-Fi)

Parallel computing — What is different? [1/3]

Using a **parallel machine** is more complicated than using a standard computer.

A parallel machine is composed of ...

- several nodes (each of them with dedicated computing/memory resources),
- an interconnection network.

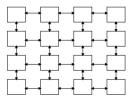


Illustration of a standard supercomputer



Illustration of a cluster of standard computers

To run a program on these machines, we have to specify

- The resources to be used (How many nodes? Which nodes?);
- The distribution of operations and data on the nodes;
- How to manage dependencies between the operations?

Parallel architectures

Parallel computing — What is different? [2/3]



To control the parallel execution of a program, we have to:

- modify the code (additional variables and functions),
- use a "parallel" compiler (or a standard compiler with a parallel library),
- add options at the execution.

The MPI library (Message Passing Interface) gives the functions required to manage data transfers between MPI processes ("from one node to another one").

Example of MPI functions in C++ to send an integer from one process to another one: MPI_Send(&value, 1, MPI_INT, idTo, 0, MPI_COMM_WORLD) MPI_Recv(&value, 1, MPI_INT, idFrom, 0, MPI_COMM_WORLD, status)

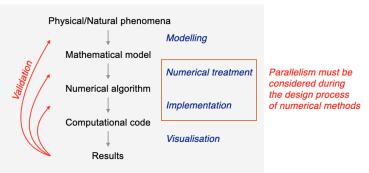
To compile, we use the "parallel version" of standard compilers:

To execute, we use the command mpirum to give the execution options.

Parallel computing — What is different? [3/3]

- For the parallel numerical solution of scientific problems, the codes must be parallelized (*i.e. parallel treatment of operations/data*).
- In order to really leverage the computational power of the parallel machines, we have to rethink the numerical methods for parallel computing to take into account the characteristics of the parallel architectures.

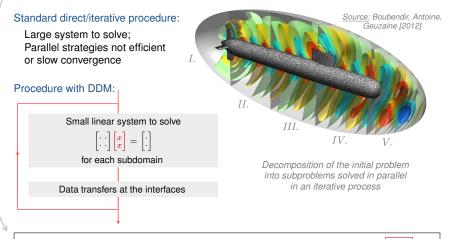
Design of a numerical simulation tool



Parallel computing — Example of a parallel numerical method

Finite element solution with a domain decomposition method (DDM)

 $\mathsf{Find}\; u \in H^1(\Omega) \; \mathsf{s.t.}\; (\nabla u, \nabla v)_\Omega - (k^2 u, v)_\Omega + \langle \imath k u, v \rangle_{\partial\Omega} = (f, v)_\Omega, \, \forall v \in H^1(\Omega)$



For each Ω_i , find $u_i \in H^1(\Omega_i)$ s.t. $(\nabla u_i, \nabla v_i)_{\Omega_i} - (k^2 u_i, v_i)_{\Omega_i} + \sum_{\text{interfaces}}$???

AMS301 course [1/3]

Goals of AMS301

Taking into account the parallel aspects in the design and the implementation of numerical methods for efficient simulations *Numerical and algorithmic aspects of parallel computing*

Course proposed in the following programs:

- > 3A "Modélisation et simulation" (parcours ModSim) at ENSTA Paris
- > 3A "Mathématiques pour la santé et l'environnement" at ENSTA Paris
- M2 "Mathématiques et Applications" (parcours AMS) at IP Paris and UPSay
- M2 "Informatique" (parcours HPDA) at IP Paris

Other courses of 3A ModSim and M2 AMS:

- Focused on programming aspects:
 - AMS-O12 Cours accéléré de programmation (Bloc 0) https://pmarchand.pages.math.cnrs.fr/slides/courses/master_AMS_012/
 - AMS-103 Programmation hybride et multi-cœurs (*Bloc 2*) https://perso.ensta-paris.fr/~tajchman/
- Focused on numerical aspects:
 - AMS-X02 Méthodes num. avancées et calcul haute performance (Bloc 2)

AMS301 course [2/3]

Goals of AMS301

Taking into account the parallel aspects in the design and the implementation of numerical methods for efficient simulations *Numerical and algorithmic aspects of parallel computing*

Content

(approx. 1h lecture and 2h exercices per session)

- Paradigms and fundamentals of parallel scientific computing
- Parallel solution of linear algebraic systems
- Parallel solution of partial differential problems (with finite differences/elements)
- Parallel programming with MPI in C++

Prerequisite knowledge and skills

- Basic knowledge on num. linear algebra and num. methods for PDE problems
- Basic knowledge on the UNIX environment and the C++ language

https://ams301.pages.math.cnrs.fr/

AMS301 course [3/3]

Evaluation

No written exam!

- Two programming project (evaluation based on written reports and C++ codes)
- Oral presentation for the second project, with questions related to the lectures



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Context, motivation and generalities Parallel architectures and algorithms Parallel programming with MPI in C++

Architectures — Standard computer [1/3]



Working stations at ENSTA Paris

Architectures — Standard computer [2/3]

Standard computers are composed of ...

- processing units:
 - one processor (CPU Central Processing Unit)
 - one graphic card (GPU Graphical Processing Unit)
- memory units:
 - fast memory (RAM Random Access Memory)
 - one hard drive (HDD Hard Disk Drive)
- connections for data transfers:
 - between HDD and RAM
 - between RAM and the "cache" memory of processing units



Intel Core i5 processor Real size: 3.75cm x 3.75cm



 $\begin{array}{c} 7.75 \text{ GB} \\ \sim 1 \text{ TB} \end{array}$

Performance of working stations at ENSTA Paris

	# Cores	Frequency	Arithmetic throughput
CPU : Intel(R) Core(TM) i5-4430	4	3.0 GHz	\sim 15 GFLOP/s (double precision?)
GPU : ATI Mobility Radeon HD 5430	80	675 MHz	\sim 80 GFLOP/s (single precision)

	Memory size
Fast memory (RAM)	7.75 GB
Hard drive (HDD)	\sim 1 TB

	Memory bandwidth
PCI express	\sim 10 GB/s

Warning: These numbers are approximate, but the orders should be correct.

10^3 kilo (k)	10^{12} tera (T)
$10^6 \text{ mega} (\text{M})$	10^{15} peta (P)
10^9 giga (G)	10 ¹⁸ exa (E)

Arithmetic throughput \approx "Rate of computing"

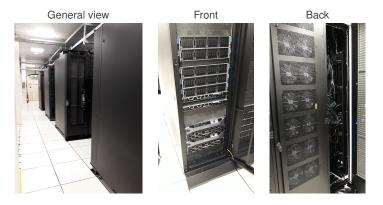
FLOP = Floating-Point Operation

Memory size

byte (B) = 8 bits (bit = binary digit) Storage of a float with single precision = 4 bytes Storage of a float with double precision = 8 bytes

Memory bandwidth \approx "Rate of data transfer"

Architectures — Standard supercomputer [1/3]

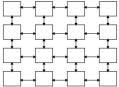


Cluster Cholesky — IDCS mesocentre — IP Paris

http://meso-ipp.gitlab.labos.polytechnique.fr/user_doc/

Architectures — Standard supercomputer [2/3]





The cluster Cholesky is composed of ...

- 2 login front-end nodes
- processing units:
 - 68 "CPU nodes" with 2 CPUs

• one parallel file system (shared)

- 4 "GPU nodes" with 2 CPUs and 4 GPUs
- memory units:
 - one fast memory (RAM) on each node (private)

160 to 384 GB/node 385 TB

- connections for data transfers:
 - between RAM and the "cache" memory of processing units on each node
 - between nodes (RAM) and file system (interconnection network)

http://meso-ipp.gitlab.labos.polytechnique.fr/user_doc/

Architectures — Standard supercomputer [3/3]

Performance of cluster Cholesky

	# Cores	Frequency	Arithmetic throughput	Quantity
CPU : Intel Xeon CPU Gold 6230	20	2.1 GHz	\sim 1 715 GFLOPS/s	144
GPU : Nvidia V100	5 120		\sim 14 TFLOP/s	8
GPU : Nvidia A100	6 912		\sim 19 TFLOP/s	8
Memory si (one node, Fast memory (RAM) 160 to 384 Hard drive (HDD)) (32 I			vutational power / ~ 0.5 PFLOP/s
	Memo	ory bandwidth		
Transfers in the node (PCI expres	s) \sim 48	GB/s	_	
Interconnection network (InfiniBar	nd) 100 G	iB/s	Transfers be	$etween \ nodes$

Warning: These numbers are approximate, but the orders should be correct.

10^3 kilo (k)	10^{12} tera (T)
10^6 mega (M)	10^{15} peta (P)
10^9 giga (G)	$10^{18} exa (E)$

Architectures — World #3 supercomputer (June 1, 2021)

Cluster LUMI (EUROHPC/CSC, Kajaani, Finland)

Nodes: 1 536 CPU nodes + 2 560 GPU nodes Processor: AMD EPYC 64C 2GHz (2 per CPUnode) GPU: AMD MI250X GPUs (4 per GPU node) Total peak performance: 214.35 PFLOP/s

https://www.lumi-supercomputer.eu/



https://www.top500.org/



Parallel algorithms

The design of parallel algorithms is more complicated than the design of sequential algorithms.

- To design a sequential algorithm, we have to
 - define a sequence of instructions to be process in a particular order by a sequential machine.

... that's it. :-)

- To design a parallel algorithm, we have to
 - distribute the operations/data between the nodes of the parallel machine, (each node has its own sequence of instructions and its own data)
 - specify the data transfers between the nodes,
 - specify the order of operations.

Parallel algorithms — Addition of two vectors $\mathbf{z} = \mathbf{x} + \mathbf{y}$

Sequential algorithm for $n = 0 \cdots 99$ do $| z_n = x_n + y_n$ end

Parallel algorithm with 2 processes

Data: each process knows half of the entries of x and y.

On each process p = 0, 1:

for
$$n = (50 \cdot p) \cdots (50 \cdot (p+1) - 1)$$
 do
 $| z_n = x_n + y_n$

end

Result: each process knows half of the entries of z.

A process is a set of instructions, a memory space and resources for in/out operations.

With the "*divide and conquer*" strategy, the problem is divided into smaller problems that are distributed between the processes.

Parallel algorithms — Scalar product $S = \mathbf{x} \cdot \mathbf{y}$

Sequential algorithm for $n = 0 \cdots 99$ do $\mid S = S + x_n \cdot y_n$ end

Parallel algorithms with 2 processes

Data: each process knows half of the entries of x et y.

On each process p = 0, 1:

for
$$n = (50 \cdot p) \cdots (50 \cdot (p+1) - 1)$$
 do
 $\int S^{(p)} = S^{(p)} + x_n \cdot y_n$

end

Communication: process 1 sends $S^{(1)}$ to process 0.

On process 0: $S = S^{(0)} + S^{(1)}$

Result: process 0 knows S.

A synchronization is introduced by the communication.

Parallel algorithms that are far less basic

Some important fields:

1. Numerical linear algebra (with dense and sparse matrices)

Find $\mathbf{x} \in \mathbb{R}^N$, such that $\mathbf{A}\mathbf{x} = \mathbf{b}$.

2. Problems with structured grids (ex. différence finies)

$$\frac{u_{i,j}^{\ell+1} - u_{i,j}^{\ell}}{\Delta t} + \frac{u_{i+1,j}^{\ell} + u_{i-1,j}^{\ell} + u_{i,j+1}^{\ell} + u_{i,j-1}^{\ell} - 4u_{i,j}^{\ell}}{\Delta x^2} = 0$$

3. Problems with unstructured (ex. éléments finis)

$$M_{ij} = \int_{\Omega} \psi_i(\mathbf{x}) \, \psi_j(\mathbf{x}) \, d\mathbf{x} \qquad \quad K_{ij} = \int_{\Omega} \nabla \psi_i(\mathbf{x}) \cdot \nabla \psi_j(\mathbf{x}) \, d\mathbf{x}$$

4. Spectal methods

FFT:
$$\hat{f}_n = \sum_{m=0}^{N-1} f_m e^{-2\pi i m n/N}$$
 $(n = 0...N - 1)$

- 5. *N*-body problems, Monte Carlo methods, ...
- 6. Algorithms on graphs (e.g. in operational research)

To be continued during AMS301 ...

Context, motivation and generalities Parallel architectures and algorithms Parallel programming with MPI in C++

The MPI standard

- MPI ("Message Passing Interface") is an coding standard to program applications and libraries for computing on parallel architectures:
 - Supercomputers (with an internal network e.g. Infiniband)
 - Clusters of computers (with an external network e.g. Ethernet/WIFI)
 - Standard computers ... with one processor, one RAM and one hard drive
- MPI defines the syntax and semantics of library routines for writing portable message-passing programs in C, C++, and Fortran.
- The MPI specifications are decided by a consortium, the MPI Forum, composed of academics, laboratories and companies (Intel, Cray, ATOS, Microsoft ...).

https://www.mpi-forum.org/

History

Year	Version	Specifications	
1991			Start of discussions for a new standard
1994	MPI 1.0	236 pages	MPI 1.1 (1995), MPI 1.2 (2008)
1997	MPI 2.0	370 pages	MPI 2.1 (2008), MPI 2.2 (2009)
2012	MPI 3.0	852 pages	MPI 3.1 (2015)
2021	MPI 4.0	1139 pages	

MPI — Introduction [2/3]

MPI libraries and installation

- Several implementations for Fortran and/or C/C++:
 - OpenMPI (open source)
 - MPICH (open source)
 - ...
- Installation possible via depots:

 On Linux, using apt-get: 	
\gg sudo apt-get install libopenmpi-dev	(OpenMPI)
\gg sudo apt-get install mpich	(MPICH)
 On macOS, using macport: 	
≫ sudo port install openmpi ≫ sudo port install mpich	(OpenMPI) (MPICH)

MPI — Introduction [3/3]

How to use MPI?

Library with functions, constants and data types

The header of the C++ library must be included:

```
#include <mpi.h>
```

Functions allow for actions during the execution and/or they give informations:

```
MPI_Init(&argc, &argv);
MPI_Comm_size(MPI_COMM_WORLD, &nbTask);
MPI_Comm_rank(MPI_COMM_WORLD, &myRank);
MPI_Send(...);
MPI_Recv(...);
MPI_Finalize();
```

Compilation with the MPI library

 \gg mpicxx myCode.cpp

This is the standard compiler (g++ here) with the options to include MPI.

Environment for parallel execution

>> mpirun -np 4 a.out

mpirun is used to run the program in parallel, with options to give informations on the parallel execution (*e.g. number of parallel processes*).

```
MPI — Example: Hello, World!
```

Code

```
#include <iostream>
#include <iostream>
#include <mpi.h>
using namespace std;
int main(int argc, char* argv[])
{
    MPI_Init(&argc, &argv); // Initialize MPI
    cout << "Hello, World!" << endl; // Every proc prints the message
    MPI_Finalize(); // Finalize MPI
    return 0;
}</pre>
```

Compilation and execution

```
1 >> mpicxx helloworld.cpp
2 >> mpirun -np 3 a.out
3 Hello, World!
4 Hello, World!
5 Hello, World!
```

The program must include:

- The header file mpi.h
- MPI_Init(...) before the first call to a MPI function
- MPI_Finalize() after the last call to a MPI function

The number of MPI processes is chosen at the execution *(here, 3)*. It cannot be modified.

MPI — Example: I Am Number Four

Code

```
1 #include <iostream>
2 #include <mpi.h>
  using namespace std;
4
  int main(int argc, char* argv[])
6 f
    MPI_Init(&argc, &argv);
                                             // Initialize MPI
    int nbTask:
   int mvRank:
   MPI_Comm_size(MPI_COMM_WORLD, &nbTask); // Get total nb of proc
   MPI_Comm_rank(MPI_COMM_WORLD, &myRank); // Get rank for each proc
  cout << "I am task " << mvRank << " out of " << nbTask << endl:
  MPI_Finalize();
                                             // Finalize MPI
    return 0:
15 }
```

Compilation and execution

1	>>	> mj	picxx	nι	ımbeı	rfou	ır.	cpp
2	>>	> mj	pirun	- 1	ıp 4	a.(out	
3	Ι	am	task	2	out	of	4	
4	Ι	am	task	0	out	of	4	
5	Ι	am	task	3	out	of	4	
6	Ι	\mathtt{am}	task	1	out	of	4	

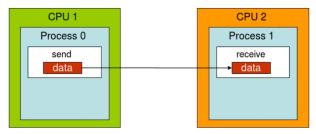
MPI_Comm_size(...) and MPI_Comm_rank(...) allow to get the total number of MPI processes, and the rank of the current one (*here, from 0 to 3*).

The rank can be used to differentiate the work to be performed by each MPI process.

The order of display cannot be predicted.

MPI — Point-to-point communication with MPI_Send/MPI_Recv [1/2]

The routines for point-to-point communications, $MPL_Send(...)$ and $MPL_Recv(...)$, allow for the transfer of data from one given process to another one.



Example

```
if(myRank == 0)
    MPI_Send(arraySend, 8, MPI_INT, 1, 666, MPI_COMM_WORLD);
    if(myRank == 1)
    MPI_Recv(arrayRecv, 8, MPI_INT, 0, 666, MPI_COMM_WORLD, MPI_STATUS_IGNORE);
```

In this example, an array of 8 integers is sent from process 0 to process 1. The tag associated to the message is 666.

The functions are **blocking**: while the message is not totally received by process 1, both processes (0 and 1) are blocked. \Rightarrow WARNING !!!

MPI — Point-to-point communication with MPI_Send/MPI_Recv [2/2]

The entries of the functions give informations on the data and the transfer:

int MPI_Send(const void*		buf,	Pointer to data to send
i	int	count,	Size of the array to send
Ν	MPI_Datatype	datatype,	Type of data to send
i	int	dest,	Rank of the process "destination"
i	int	tag,	Tag of the message
Ν	MPI_Comm	comm)	Communicator
int MPI_Recv(void*		buf,	Pointer to storage for received data
i	int	count,	Size of the array to receive
Ν	MPI_Datatype	datatype,	Type of data to receive
i	int	source,	Rank of the process "source"
i	int	tag,	Tag of the message
Ν	MPI_Comm	comm,	Communicator
Ν	MPI_Status*	status)	Status of the communication

Data type: MPI_INT (int), MPI_FLOAT (float), MPI_DOUBLE (double), ...

To transfer a message, the tag must be identical in the send and in the recv. Any number can be use.

The communicator specify the group of MPI processes in which the comunication is performed. During this course, only MPI_COMM_WORLD shall be used.

MPI — Example: Sending arrays and vectors

Sending a single double number:

```
1 double data = 3.14185;
2 MPI_Send(&data, 1, MPI_DOUBLE, 1, 666, MPI_COMM_WORLD);
```

Sending a static array of double numbers:

```
double data[5];
data[0] = 0.1; data[1] = 9.9; data[2] = 0; data[3] = 2; data[4] = 4;
MPI_Send(data, 5, MPI_DOUBLE, 1, 666, MPI_COMM_WORLD);
```

Sending a vector of double numbers:

```
vector <double > data(5);
data[0] = 0.1; data[1] = 9.9; data[2] = 0; data[3] = 2; data[4] = 4;
MPI_Send(&data[0], 5, MPI_DOUBLE, 1, 666, MPI_COMM_WORLD);
```

... or only the two last values ...

```
vector <double > data(5);
data[0] = 0.1; data[1] = 9.9; data[2] = 0; data[3] = 2; data[4] = 4;
MPI_Send(&data[3], 2, MPI_DOUBLE, 1, 666, MPI_COMM_WORLD);
```

MPI — Example: Deadlock

The functions MPI_Send and MPI_Recv are **blocking**: while the message is not completely received, both processes involved in the communication are blocked.

Version 1

```
1 if(myRank == 0){
2 MPI_Recv(b, 100, MPI_DOUBLE, 1, 39, MPI_COMM_WORLD, MPI_STATUS_IGNORE);
3 MPI_Send(a, 100, MPI_DOUBLE, 1, 17, MPI_COMM_WORLD);
4 }
5 if(myRank == 1){
6 MPI_Recv(b, 100, MPI_DOUBLE, 0, 17, MPI_COMM_WORLD, MPI_STATUS_IGNORE);
7 MPI_Send(a, 100, MPI_DOUBLE, 0, 39, MPI_COMM_WORLD);
8 }
```

Both processes are blocked in the "send" mode, mutually waiting themself. The program is blocked. \implies **Deadlock :-(**

Version 2

```
1 if(myRank == 0){
2 MPI_Recv(b, 100, MPI_DOUBLE, 1, 39, MPI_COMM_WORLD, MPI_STATUS_IGNORE);
3 MPI_Send(a, 100, MPI_DOUBLE, 1, 17, MPI_COMM_WORLD);
4 }
5 if(myRank == 1){
6 MPI_Send(a, 100, MPI_DOUBLE, 0, 39, MPI_COMM_WORLD);
7 MPI_Recv(b, 100, MPI_DOUBLE, 0, 17, MPI_COMM_WORLD, MPI_STATUS_IGNORE);
8 }
```

Everything is alright. \implies Happy face :-)

MPI — Example: Addition of the N first integers

```
1 int main(int argc, char *argv[]){
   int myrank, np;
   MPI Init(&argc, &argv);
   MPI Comm size(MPI COMM WORLD, &np):
    MPI_Comm_rank(MPI_COMM_WORLD, &myrank);
    int N
           = 1000;
    int startval = N * myrank / np + 1
    int endval = N * (myrank+1) / np
    int partSum = 0:
    for(int i=startval; i<=endval; i++)</pre>
      partSum += i :
     cout << "Partial sum on proc " << myrank << " equals " << partSum << endl ;
    if(myrank != 0)
       MPI_Send(&partSum, 1, MPI_INT, 0, 23, MPI_COMM_WORLD ) ;
     elsef
      for(int j=1; j<np; j++) {</pre>
        int tmp = 0;
        MPI_Recv(&tmp, 1, MPI_INT, j, 23, MPI_COMM_WORLD, MPI_STATUS_IGNORE);
        partSum += tmp ;
      3
24
      cout << "The sum from 1 to " << N << " is: " << partSum << endl:
    }
26
    MPI Finalize():
28 }
```

Summary

Parallel architectures

- Processing units: CPU, GPU
- Memory units: HDD, RAM, "cache" memory
- Supercomputer Compute node Hybrid machine
- Interconnection network

Parallel algorithms

- Distributed operations and data
- Process, task and data transfer
- "Divide and Conquer" strategy

Basic MPI Commands

- MPI_Init
- MPI_Finalize
- MPI_Comm_size
- MPI_Comm_rank
- MPI_Send
- MPI_Recv