



## Programmation non-euclidienne

comment avoir les threads qui se touchent... avant l'infini?

Vincent LAFAGE

<sup>1</sup>IJCLab, Laboratoire de Physique des 2 Infinis Irène Joliot-Curie Université Paris-Saclay









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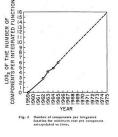






# Why parallelize?

- MOORE's Law: Gordon MOORE's observation (1965)
   «Cramming More Components onto Integrated Circuits.»:
   The number of transistors
   in a dense integrated circuit (IC) doubles about every two years.
   (even before microprocessors)
- + registers
- + memory cache
- + processor instructions
- + bus size (4 bits  $\rightarrow$  64 bits)
- + memory management (MMU)
- $+ \ \ processing \ units \ (one, \ then \ many \ ALU/FPU, \ vector \ ALU/FPU...)$
- + pipeline depth (superscalars cf Pentium ca 1993)
- + complex branch predictor / out-of-order execution unit
- $\bullet \ \ \mathsf{Heat/Power} \ \ \mathsf{Wall} : \mathcal{P} = \alpha \cdot C \cdot {V_{dd}}^2 \cdot \mathit{f} + V_{dd} \cdot I_{st} + V_{dd} \cdot I_{leak}$
- Frequency Wall: « Free lunch is over » (already for 15 years, almost 20 years)
- $1971 \Rightarrow 10 \, \mu\text{m}$ ,  $2012 \Rightarrow 22 \, \text{nm}$ ,  $2014 \Rightarrow 14 \, \text{nm}$ ,  $10 \, \text{nm}$  in (slow) progress (Intel). TSMC, Samsung :  $7 \, \text{nm}$ ,  $5 \, \text{nm}$  factories.  $3 \, \text{nm}$  and beyond down to  $1.4 \, \text{nm}$  in Intel roadmap. Tunnel effect  $\Rightarrow$  **Quantum Wall**
- Money Wall







# Why parallelize?

### end of Moore's law

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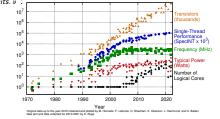
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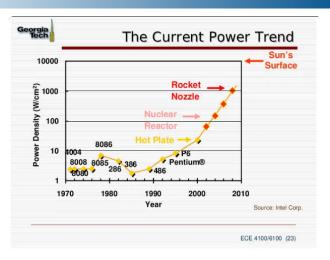
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## Why parallelize? Frequency/Power Wall



Introduction to Multicore architecture, Tao ZHANG - Oct. 21, 2010





## Why parallelize? in the era of dimate change

Information technologies : growing part of a rare, expensive & dirty energy. 1.6 MW for the first room of IN2P3 Computing Centre : 0,5 to 1 M€/yr

Moving from PFlops to Exascale requires a breakthrough...

- moving to a better W/MIPS ratio (or W/MFLOPS): Intel XScale <sup>1</sup>, 600 MHz, 0.5 W
   5 × slower, 80 × cheaper in energy!
- reduce frequency, using more cores

« The number of computations per joule of energy dissipated doubled about every 1.57 years. »

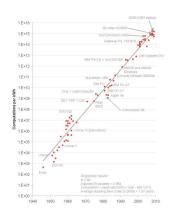


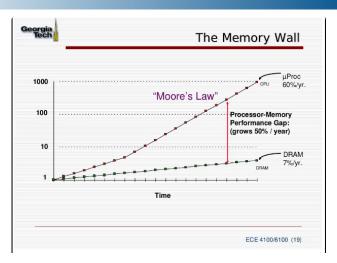
Figure - KOOMEY's law, 2010





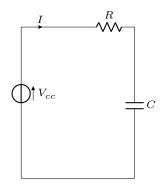


## Why parallelize? Yet another Wall...



Introduction to Multicore architecture, Tao ZHANG - Oct. 21, 2010





Data is moved through wires

Wires/memory behave like an RC circuit

### Trade-off:

- Longer response time  $\tau = RC$  ("latency")
- Higher current  $I \implies \text{more power}$

### Physics says:

Communication is slow, power-hungry, or both

### Hierarchy of memories

- Small amount of fast memory close to CPU
- $\bullet$  Large amount of slow memory far from CPU

CPU register « Level 1 cache « Level 2 cache « Level 3 cache « Main memory « Disk « Internet





We must feed the CPU  $\Rightarrow$  some problems will be **memory bound**.

The distinction between memory bound and CPU bound algorithms can often be related to their arithmetic intensity:

for N-sized problem, how many operations?

- dotproducts :  $\mathcal{O}(N)$  data,  $\mathcal{O}(N)$  ops convolution
- ullet matrix-vector products :  $\mathcal{O}(N(N+1))$  data,  $\mathcal{O}(N^2)$  ops
- matrix-matrix products :  $\mathcal{O}(2N^2)$  data,  $\mathcal{O}(N^3)$  ops matrix inversion, diagonalisation, Fourier/Bessel transform...

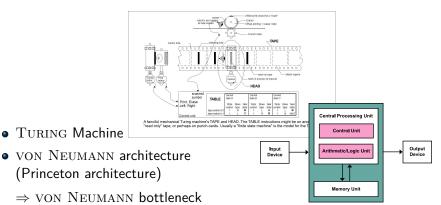
"If the only tool you have is a hammer, you tend to see every problem as a nail."

Maslow's gavel

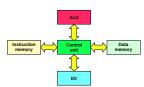
"If the only tool you have is a GPU, you tend to see every problem as a matrix product."



## **Architecture**



Harvard architecture







# **Know your tool**

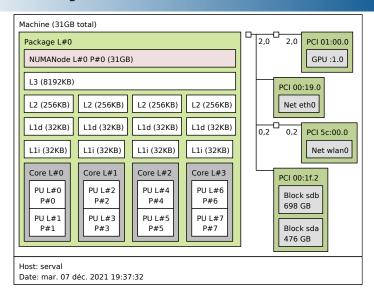
	_
execute typical instruction	1ns
fetch from L1 cache memory	$0.5\mathrm{ns}$
branch misprediction	$5\mathrm{ns}$
fetch from L2 cache memory	$7\mathrm{ns}$
Mutex lock/unlock	$25\mathrm{ns}$
fetch from main memory	$100\mathrm{ns}$
send 2K bytes over 1Gbps network	$20000\mathrm{ns}$
read 1MB sequentially from memory	$250000\mathrm{ns}$
fetch from new disk location (seek)	8000000ns
read 1MB sequentially from disk	$20000000{\rm ns}$
send packet US to Europe and back	150000000ns







## Know your tool hwloc-ls

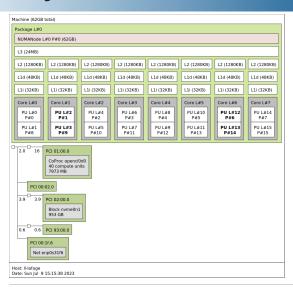








### **Know your tool** hwloc-ls







# Why parallelize?









**IMPERATIVE PROGRAMMING** = programming sequence of instructions/subtasks to the processor program as an ordered shopping list, as an ordered recipe **SEQUENTIALITY** is essential to programming





# Concurrency

With only one processor, **tasks** will get executed one after the other. Often this order is compulsory: permuting tasks would change the result ... sometimes this order is contingent: permuting tasks wouldn't change the result

If we can identify all these permutable tasks,

- we could run those OUT OF SEQUENCE
- we could run those CONCURRENTLY on multiple processors, or execution units

(exhibiting concurrency in a program is an industrialization process).





## Task & Thread

Logical level: we want to identify **TASKS** and among them, order-independent tasks.

Physical level : we want to assign tasks to execution THREADS.

Multitasking can occur on one processor :

- time sharing of processing ressource among threads
- context switching between threads

If we have a multiprocessor, some/each processor can be assigned one or many threads

PARALLEL programming = CONCURRENT programming on a MULTIPROCESSOR (a.k.a multiprocessing) (a.k.a. multiprogramming)

### two kinds of loops:

- iterations depends on the previous one(s)
- ⇒ what we usually call an iterative process
- iterations are independent of the previous ones
  - ⇒ more duplication (or N-uplication) than iteration
- ⇒ embarassingly parallel = lowest possible concurrency = as decoupled as possible
- ⇒ delightfuly parallel!

very common in particle physics : each event is independent and can be processed on a separate processor / in a separate process

⇒ **DISTRIBUTED** processing







When we apply the same function on a collection of objects, the collection of result is independent of the order of application of the function.

To ensure that this is right we need PURE functions :

- $\Rightarrow$  computer functions that are as close as possible to mathematical functions
  - the function return values are identical for identical arguments (no variation with local static variables, non-local variables, mutable reference arguments or input streams.) i.e. its evaluation relies on a **DETERMINISTIC ALGORITHM**: given a particular input, will always produce the same output, with the underlying machine always passing through the same sequence of states
    - ⇒ function are referentially transparent (see below)
  - the function application has no SIDE EFFECTS: no mutation of local static variables, non-local variables, mutable reference arguments or input/output streams

Pure = deterministic + without side effects





# **Purity**

## down-to-earth functional paradigm...

- input arguments must be immutable : C++ const, Fortran intent (in),...
- evaluation must not rely on (mutable) global variables
   (e.g. in Fortran, it shouldn't rely on COMMON variables, but it can rely on module parameters or protected variables.
   In C++, you can use const / constexpr / static constexpr global)
- a pure function can only call pure functions
- no exceptions

#### REFERENTIAL TRANSPARENCY:

- $\Rightarrow$  the expression can be replaced with its corresponding value (and vice-versa) without changing the program's behavior.
- ⇒ allows MEMOIZATION :
- optimization technique used primarily to speed up computer programs by storing the results of expensive function calls and returning the cached result
- a specific type of LOOKUP TABLE (LUT):
- $\Rightarrow$  a collection / an array of precomputed results that one reuses instead of recomputing. Lookup tables are usually initialised at start, while memoization fills it on the fly.



Mixing functional paradigm (purity) with object-oriented paradigm will **strongly** change your object-oriented style







## Side effects

### what happens when the function is not pure...

- Input/Output: displaying something occur in a given order, storing data to disk (can be seen as a global object)
- hardware related behavior: depends on the interaction with environment, which is a global variable
- time dependency: time is a global variable
- exceptions: your function is not returning a value of the expected type, likely because of limited definition domain for the arguments.
   A mathematical function is not only pure, it also aims at totality (maximal expansion of the definition domain)
- most random number generators rely on a hidden state changing on each call.
- $\Rightarrow$  in the long run, no computer function can ever be called pure : running a computer requires energy and increases the entropy of the Universe, which is a global variable  $\Rightarrow$  side effect...





### simple functions

#### Fortran'23

A pure procedure changes variables outside its scope only through its arguments. This allows it to be used in parallel constructs, where concurrency issues would otherwise prevent use. A simple procedure is a pure procedure that in addition is restricted to reference variables outside its scope only through its arguments.  $\Rightarrow$  It represents an entirely local calculation. If all the intent in arguments are constants and there are no intent inout arguments, it may be performed by the compiler at compile time.

A simple procedure must satisfy all the requirements of a pure procedure. In addition,

- it must not reference a variable by use or host association,
- it must not reference a variable in a common block,
- all its dummy procedures must be simple,
- all its internal procedures must be simple,
- all procedures it references must be simple,
- when used in a context that requires it to be simple, its interface must be explicit and specify that it is simple, and
- it must not contain a entry statement.
- All the intrinsic functions are simple.
- All the module functions in all of the intrinsic modules are simple.







### short warning

#### CAVEAT !!!

Floating point evaluation are usually dependent on the order of evaluation: floating point operations are NOT associative, contrarily to the real number corresponding operation :  $\forall (a,b,c), (a+b)+c=a+(b+c)$  BUT  $\exists (a,b,c), (a\oplus b)\oplus c\neq a\oplus (b\oplus c)$ ⇒ out-of-order operation might change ever so slightly the result Subtle side-effects introduced by the languages, compilers and optimization options...

- C strictly conforms to your order of computation
- Fortran, i.e. FORmula TRANslator, tries to somehow optimize your computation: mathematically equivalent, numerically not strictly equivalent

Some purity check by compiler are rather formal (particularly on heterogeneous architectures)...





### What could go wrong?

#### REENTRANCY

a subroutine is called reentrant if

- multiple invocations can safely run concurrently on multiple processors,
- or on a single processor system, where a reentrant procedure can be interrupted in the middle of its execution and then safely be called again ("re-entered") before its previous invocations complete execution.
- Reentrant code may not hold any static or global non-constant data without synchronization.
- Reentrant code may not modify itself without synchronization.
- Reentrant code may not call non-reentrant computer programs or routines.

#### THREAD SAFETY

Thread-safe code only manipulates shared data structures in a manner that ensures that all threads behave properly and fulfill their design specifications without unintended interaction. (no data race)

reentrant ⇒ thread-safe thread-safe ⇒ reentrant

https://en.wikipedia.org/wiki/Reentrancy\_(computing)

https://stackoverflow.com/questions/856823/threadsafe-vs-re-entrant







### When some task takes the lead

**CRITICAL SECTION** is a part of code where concurrent accesses to shared resources would lead to erroneous behavior.

 $\Rightarrow$  we need to protect these accesses

**Lock** / mutex (mutual exclusion), protected object (atomic instruction)

During a critical section, we loose all benefits of the multiprocessor.

!!!Warning !!!: dead lock

synchronization point, or rendez-vous :

sometimes one task has to wait for the completion of another one



