# An introduction to parallel programming

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# Definitions

#### > Parallel computing

- Partition computation across different compute engines

#### > Distributed computing

- Paritition computation across different machines

#### Same principle, more general



# Outline

#### > Introduction to "traditional" programming

- Writing code
- Operating systems
- ...
- > Why do we need parallel programming?
  - Focus on programming shared memory
- > Different ways of parallel programming
  - PThreads
  - OpenMP
  - MPI?
  - GPU/accelerators programming



#### > A bit of computer architecture

- We will understand why...
- Focus on shared memory systems

#### > A bit of algorithms

- We will understand why...

#### > A bit of performance analysis

- Which is our ultimate goal!
- Being able to identify bottlenecks

# **Programming basics**



#### > Programming basics

- Variables
- Functions
- Loops

#### > Programming stacks

- BSP
- Operating systems
- Runtimes

#### > Computer architectures

- Computing domains
- Single processor/multiple processors
- From single- to multi- to many- core



# Why do we need parallel computing?

Increase performance of our machines

# > Scale-up

- Solve a "bigger" problem in the same time

### > Scale-out

- Solve the same problem in less time



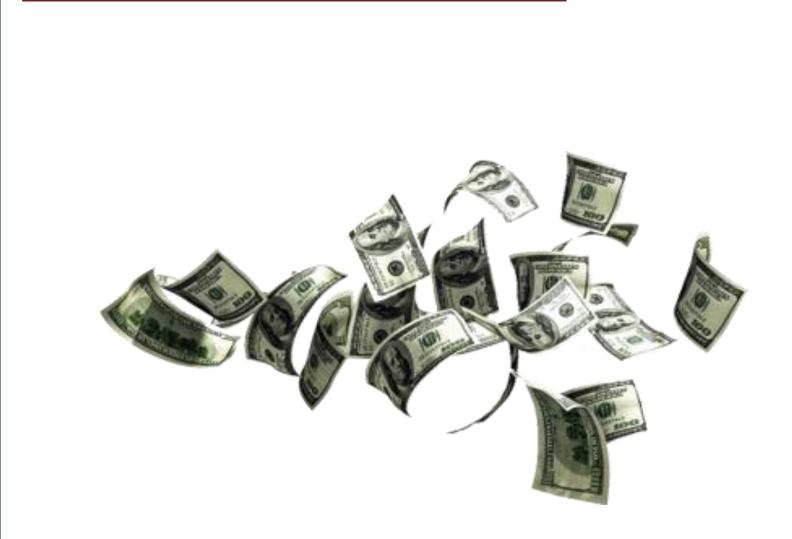
# Yes but..

> Why (highly) parallel machines...

> ...and not faster single-core machines?



# The answer **#1** - Money





#### Moore's law

> "The number of transistors that we can pack in a given die area doubles every 18 months"

#### Dennard's scaling

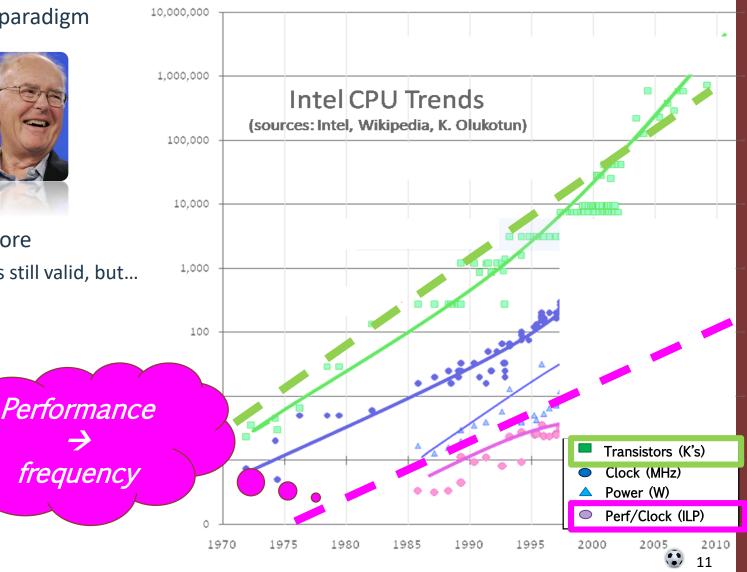
> "performance per watt of computing is growing exponentially at roughly the same rate"



SoC design paradigm >



- Gordon Moore >
  - His law is still valid, but... —



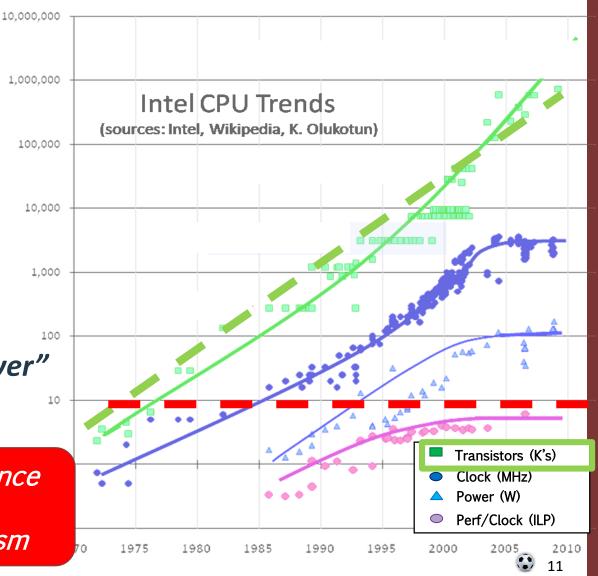


SoC design paradigm



- > Gordon Moore
  - His law is still valid, but...
- > "The free lunch is over"
  - Herb Sutter, 2005



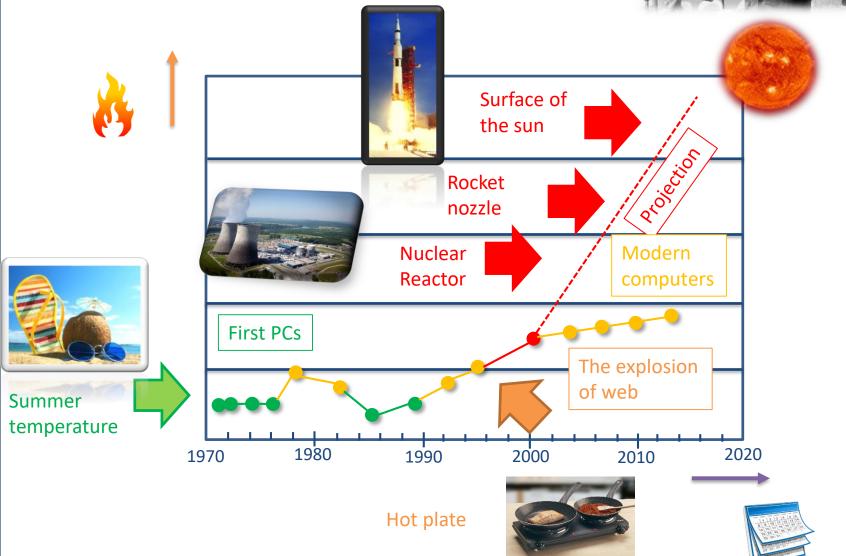




# In other words...



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# Instead of going faster..

> ..(go faster but through) parallelism!

#### Problem #1

- > New computer architectures
- > At least, three architectural templates

#### Problem #2

- > Need to efficiently program them
- > HPC already has this problem!

#### The problem

- > Programmers must know a bit of the architecture!
- > To make parallelization effective
- > "Let's run this on a GPU. It certainly goes faster" (cit.)



# The **Big** problem

#### > Effectively programming in parallel is <u>difficult</u>

"Everyone knows that debugging is twice as hard as writing a program in the first place.

So if you're as clever as you can be when you write it, how will you ever debug it?" Brian Kernighan (1942-)

- Researcher, theory of informatics
- Co-authored UNIX and AWK
- Wrote "The C Programming Language" book





> I will give you code...

#### > ...but first I need to give you some maths...

#### > ...and then, some architectual principles

# Amdahl's Law



# Amdahl's law

- > A sequential program that takes 100 sec to exec
- > Only 95% can run in parallel (it's a lot)
- And.. you are an extremely good programmer, and you have a machine with 1billion cores, so that part takes 0 sec

> So,

$$T_{par} = 100_{sec} - 95_{sec} = 5_{sec}$$

$$Speedup = \frac{100_{sec}}{5_{sec}} = 20x$$

...20x, on one billion cores!!!



# Computer architecture





#### 1. "Traditional" multi-cores

- Typically, shared-memory
- Max 8-16 cores
- This laptop

#### 2. Many-cores

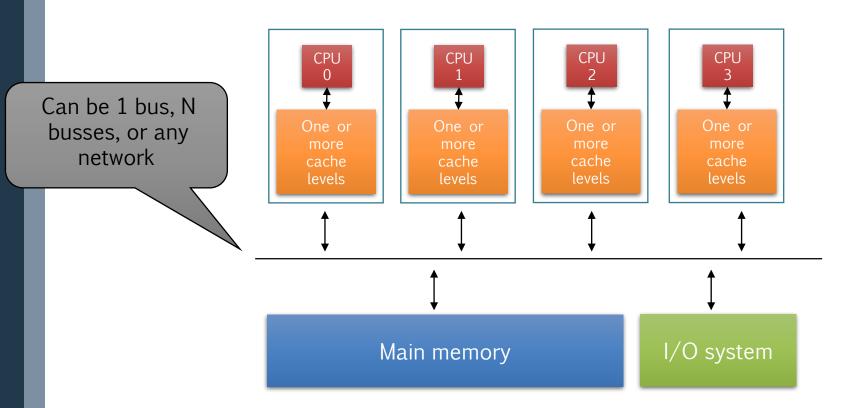
- GPUs but not only
- Heterogeneous architectures

#### 3. More advanced stuff

- Field-programmable Gate Arrays
- Neural Networks



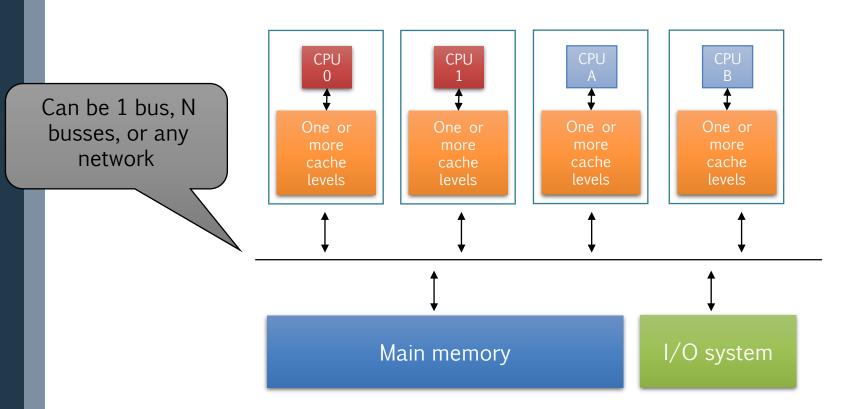
- > Memory: centralized with bus interconnect, I/O
- > Typically, multi-core (sub)systems
  - Examples: Sun Enterprise 6000, SGI Challenge, Intel (this laptop)





# **Asymmetric multi-processing**

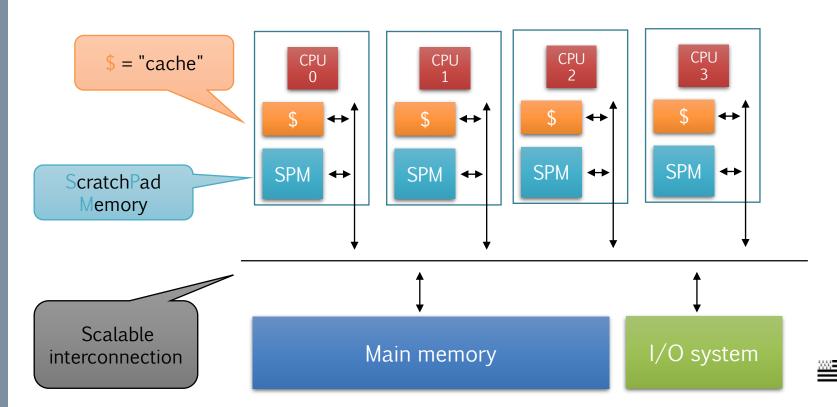
- Memory: centralized with uniform access time (UMA) and bus interconnect, I/O
- > Typically, multi-core (sub)systems
  - Examples: ARM Big.LITTLE, NVIDIA Tegra X2 (Drive PX)





# SMP – distributed shared memory

- > Non-Uniform Access Time NUMA
- > Scalable interconnect
  - Typically, many cores
  - Examples: embedded accelerators, GPUs

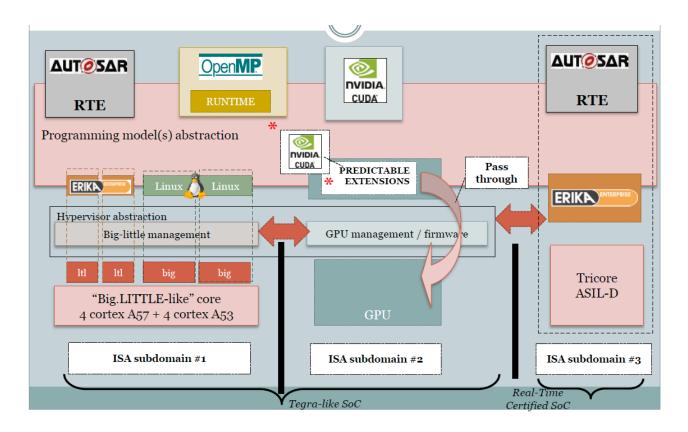


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# Go complex: NVIDIA's Tegra

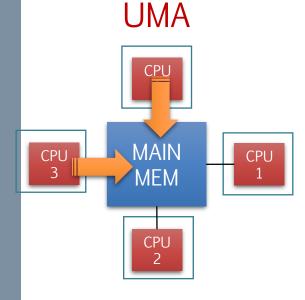
- > Complex heterogeneous system
  - 3 ISAs
  - 2 subdomains
  - Shmem between Big.SUPER host and GP-GPU



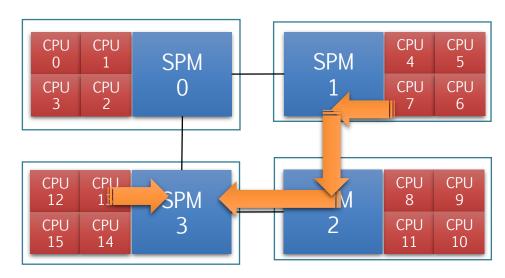


# UMA vs. NUMA

- > Shared mem: every thread can access every memory item
  - (Not considering security issues...)
- > Uniform Memory Access (UMA) vs Non-Uniform Memory Access (NUMA)
  - Different access time for accessing different memory spaces

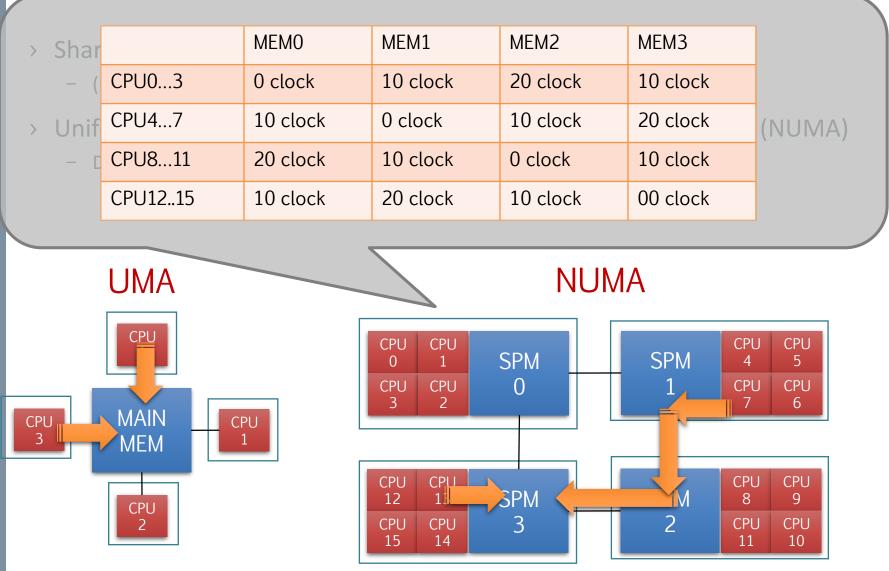


#### NUMA





# UMA vs. NUMA



# Some definitions

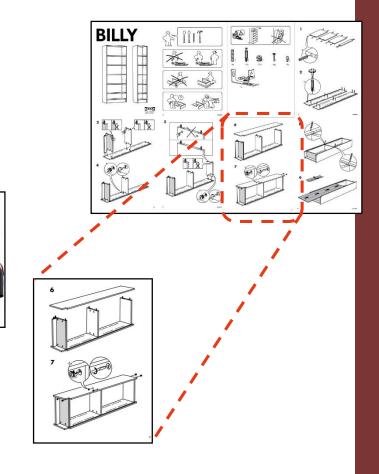


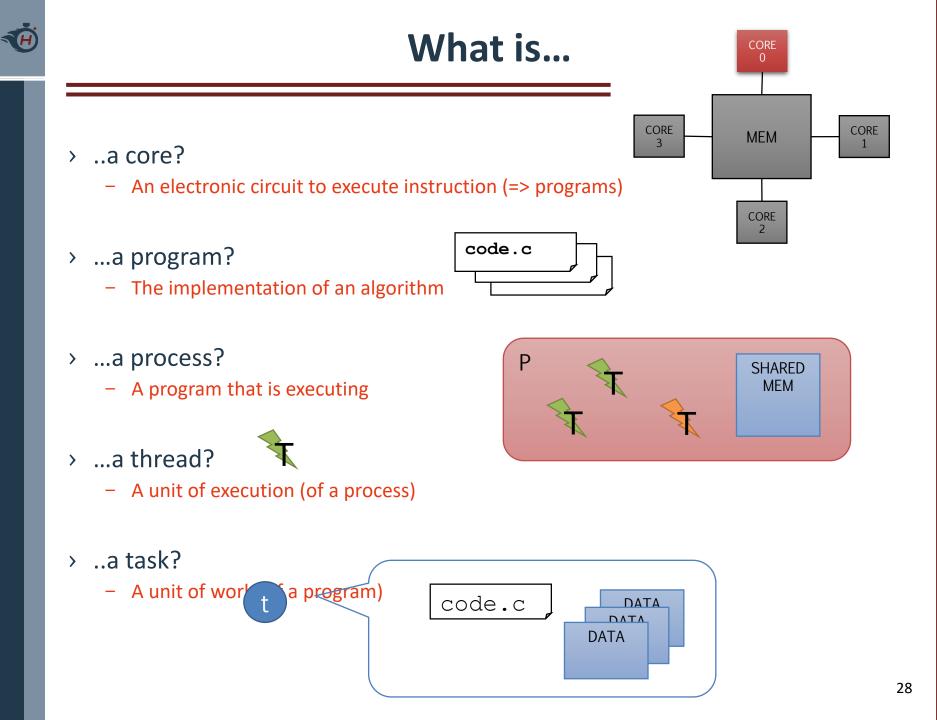
# What is...

- > ..a core?
  - An electronic circuit to execute instruction (=> programs)
- > ...a program?
  - The implementation of an algorithm
- > ...a process?
  - A program that is executing
- > ...a thread?
  - A unit of execution (of a process)



- A unit of work (of a program)



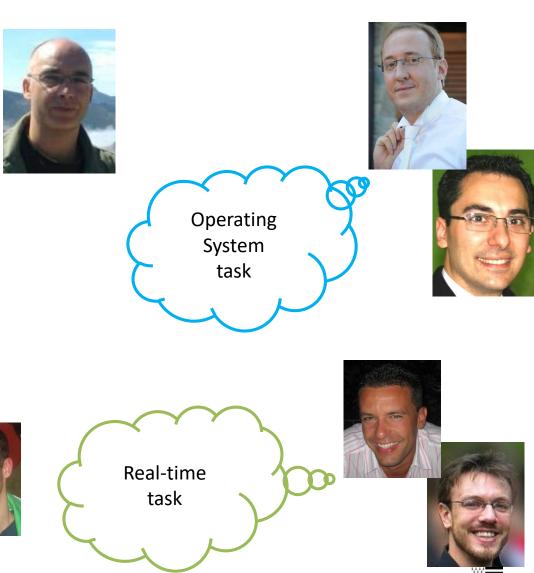




## What is a task?

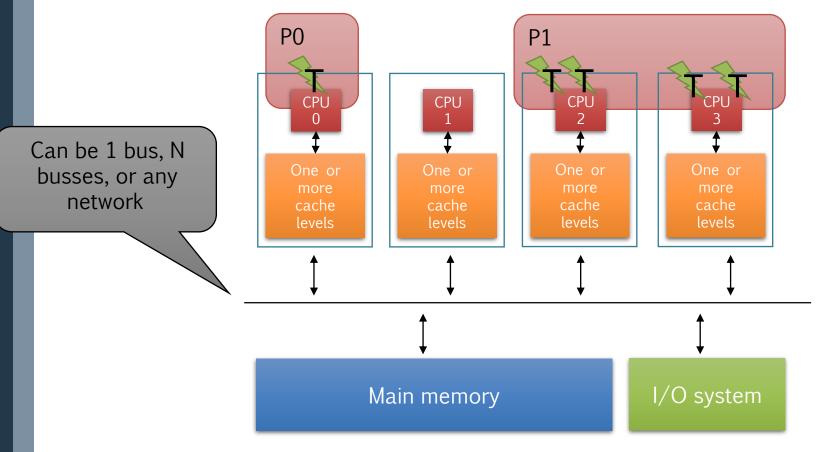








- > Memory: centralized with bus interconnect, I/O
- > Typically, multi-core (sub)systems
  - Examples: Sun Enterprise 6000, SGI Challenge, Intel (this laptop)

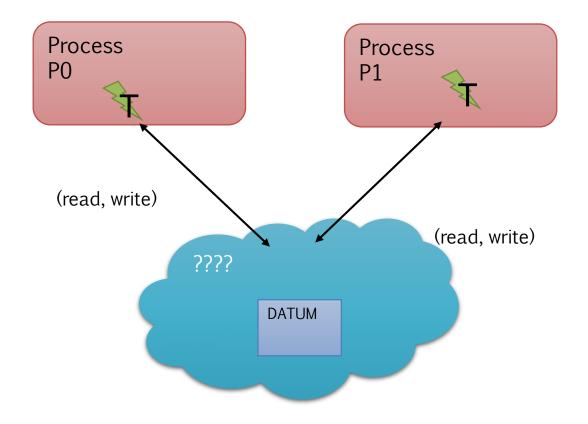


# ...start simple...



# Something you're used to..

- > Multiple processes
- > That communicate via shared data

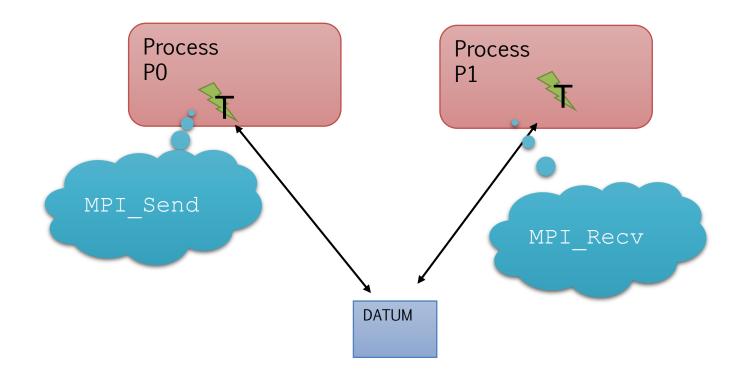




# Howto #1 - MPI

- > Multiple processes
- > That communicate via shared data

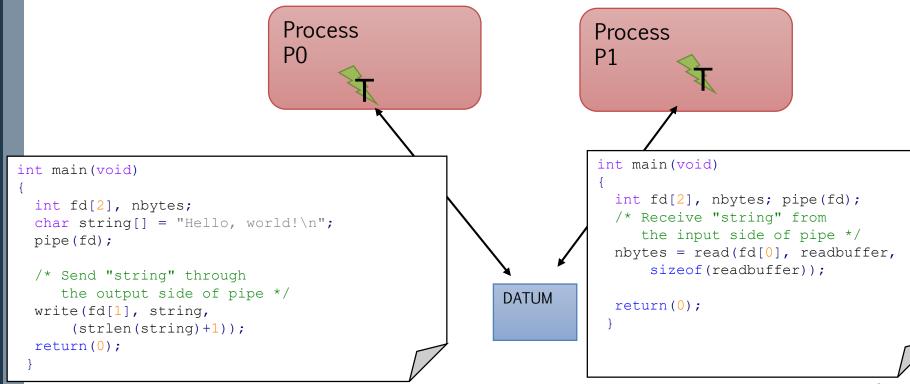






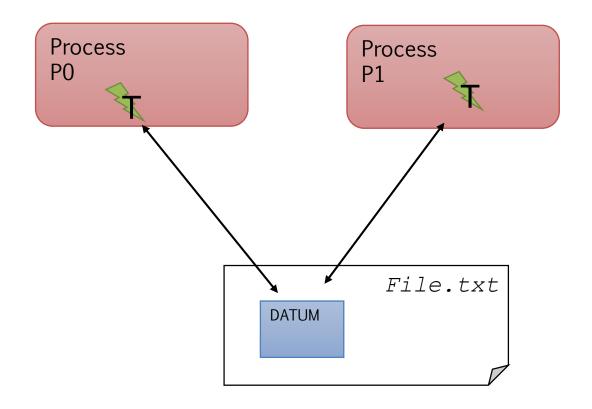
# Howto #2 – UNIX pipes

- > Multiple processes
- > That communicate via shared data





- > Multiple processes
- > That communicate via shared data

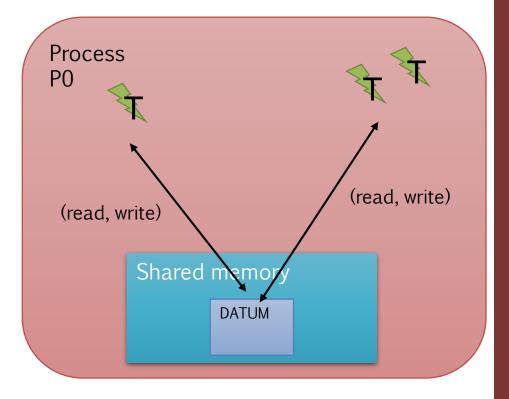




# **Shared memory**

#### > Coherence problem

- Memory consistency issue
- Data races
- > Can share data ptrs
  - Ease-to-use





# References



- > "Calcolo parallelo" website
  - <u>http://hipert.unimore.it/people/paolob/pub/PhD/index.html</u>
- > My contacts
  - paolo.burgio@unimore.it
  - <u>http://hipert.mat.unimore.it/people/paolob/</u>
- > Useful links
- > A "small blog"
  - <u>http://www.google.com</u>