

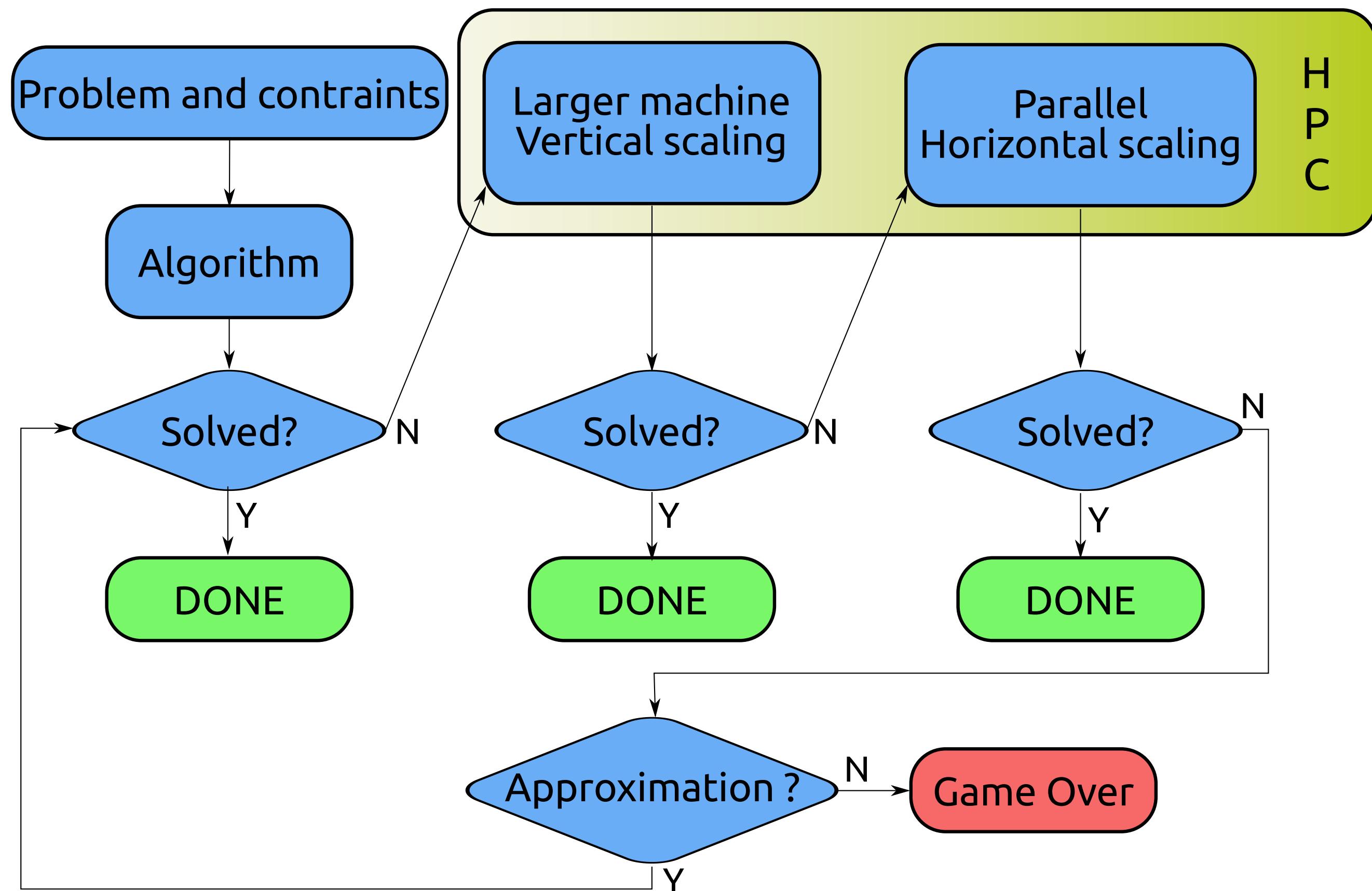
*High*  
*Performance*  
*Computing*

# Source of majority of materials

- CSC (IT Center for science)
- Summer school on HPC  
(2014)
- Creative commons by-nc-sa

# How To Solve any problem

© Michael Cochez



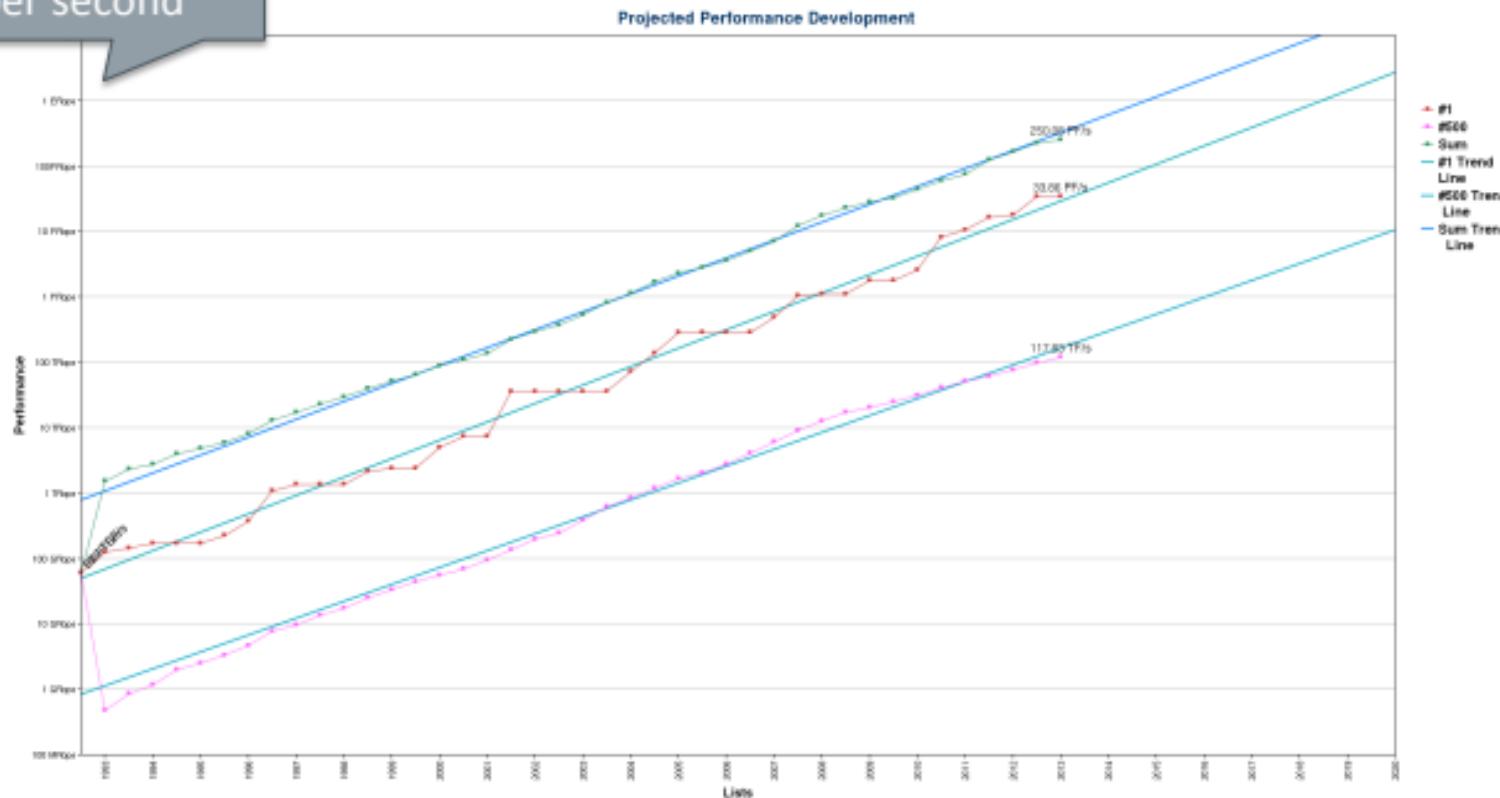
# WHAT IS HIGH-PERFORMANCE COMPUTING?

## High-performance computing

- A special branch of scientific computing – high-performance computing (HPC) or *supercomputing* - that refers to computing with supercomputer systems, is the scientific instrument of the future
- It offers a promise of breakthroughs in many major challenges that humankind faces today
- Useful through various disciplines

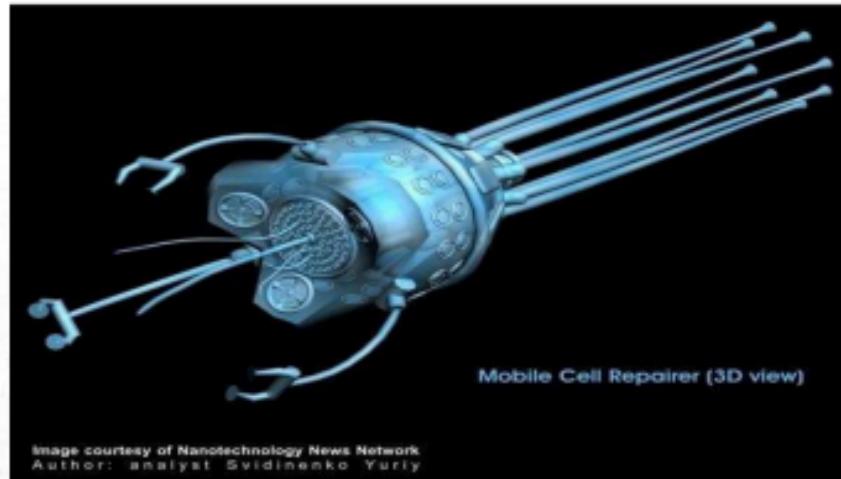
Flops: floating-point operations per second

# HPC through the ages



# Materials science

- ➊ New materials
  - Design of meta-materials
  - Hydrogen storage
- ➋ New methods for catalysis
  - Industrial processes
  - Air and water purification
- ➌ Design of devices from first principles



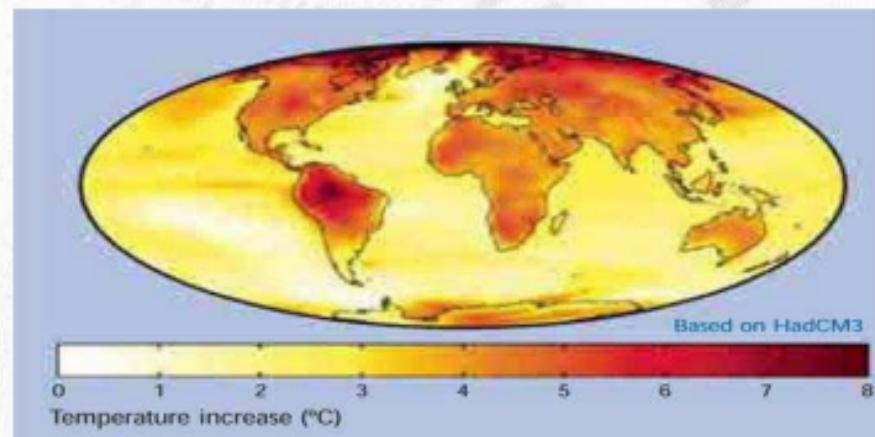
## Life sciences

- ⌚ Next-generation sequencing techniques
- ⌚ Identifying genomic variants associated with common complex diseases
- ⌚ Understanding the natural development of diseases
- ⌚ Simulated surgeries
- ⌚ Predicting protein folding

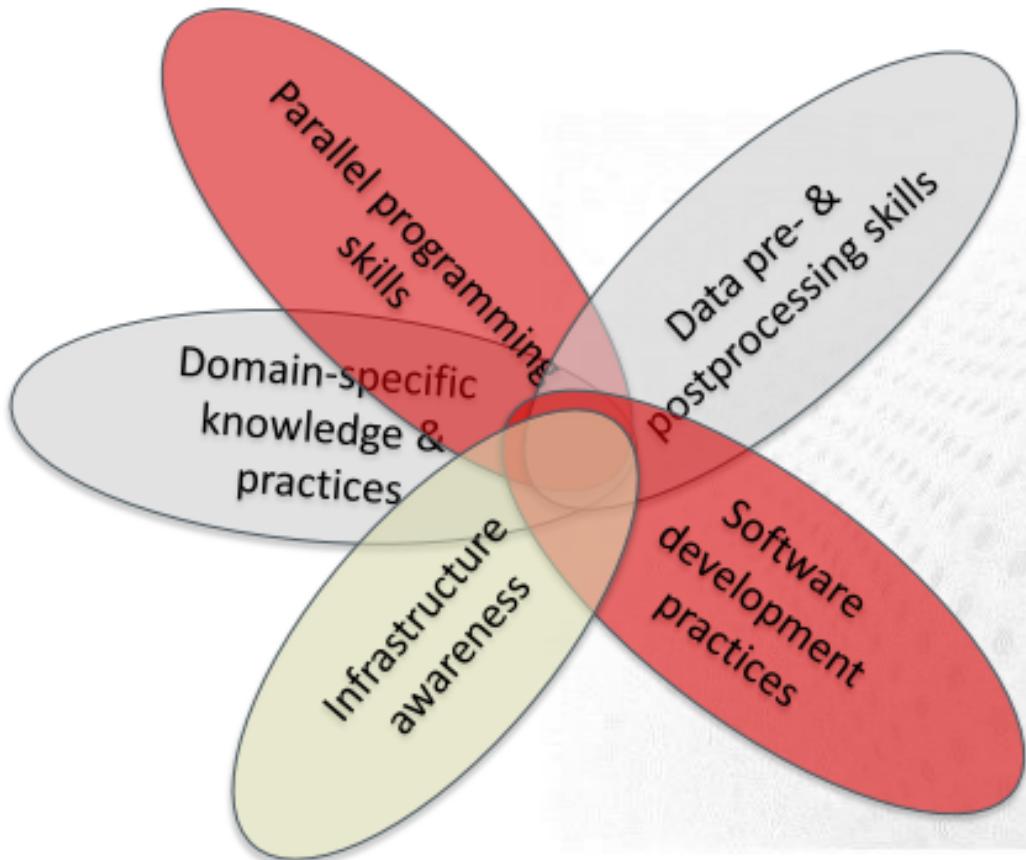


# Earth sciences

- ➊ Long term climate modeling
  - Coupling atmospheric, ocean and land models
  - Understanding and predicting the climate change
- ➋ High-resolution weather prediction
  - Predicting extreme weather conditions
  - District-scale forecasts
- ➌ Whole-Earth seismological models



# Utilizing HPC in scientific research

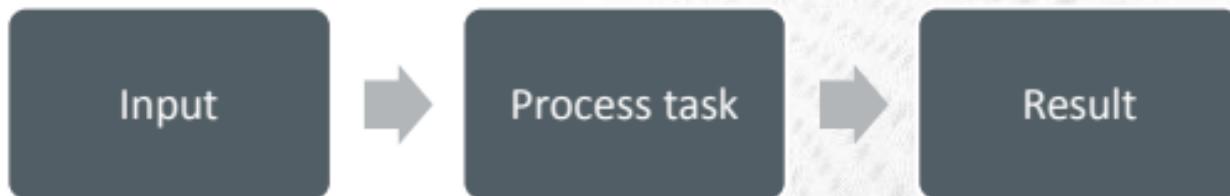


# PARALLEL COMPUTING CONCEPTS

# Computing in parallel

## Serial computing

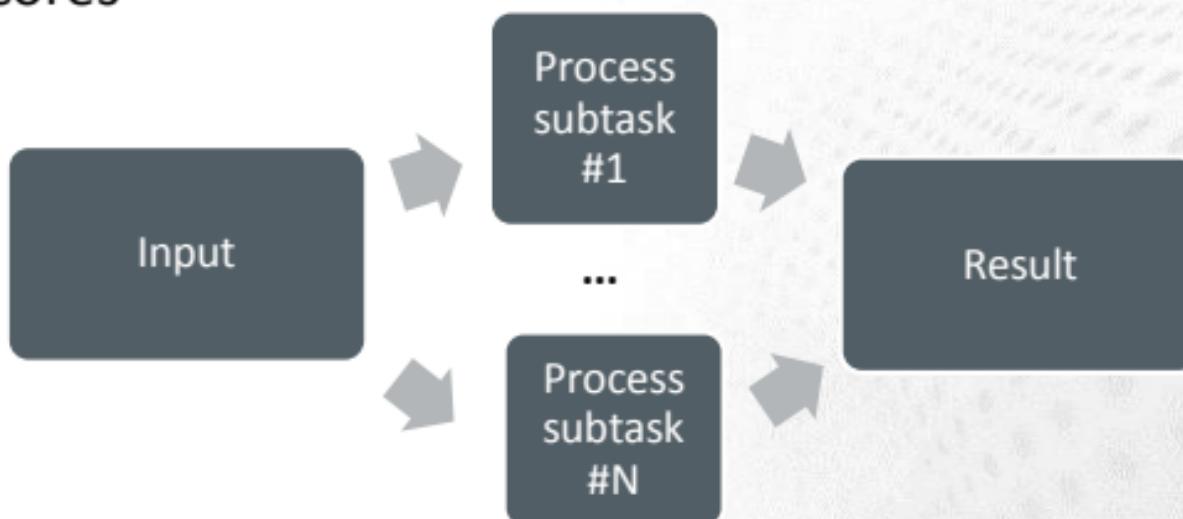
- single processing unit (“core”) is used for solving a problem



# Computing in parallel

## Parallel computing

- A problem is split into smaller subtasks
- multiple subtasks are processed *simultaneously* using multiple cores



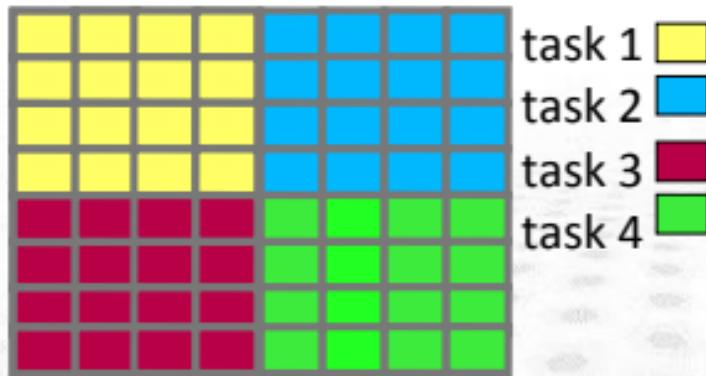
# 5 types of Parallel computing (personal opinion)

- Vector operations
- Multiple pipelines
- Hyper threading
- Multiple cores
- Multiple nodes

# Exposing parallelism

- ➊ Data parallelism

- Data is distributed to processor cores
  - Each core performs simultaneously (nearly) identical operations with different data



- ➋ Task parallelism

- Different cores perform different operations with (the same or) different data

- ➌ These can be combined

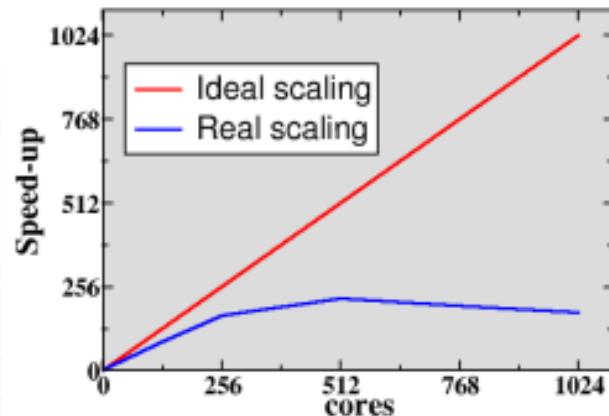
# Parallel scaling

## Strong parallel scaling

- constant problem size
- execution time decreases in proportion to the increase in the number of cores

## Weak parallel scaling

- increasing problem size
- execution time remains constant when number of cores increases in proportion to the problem size

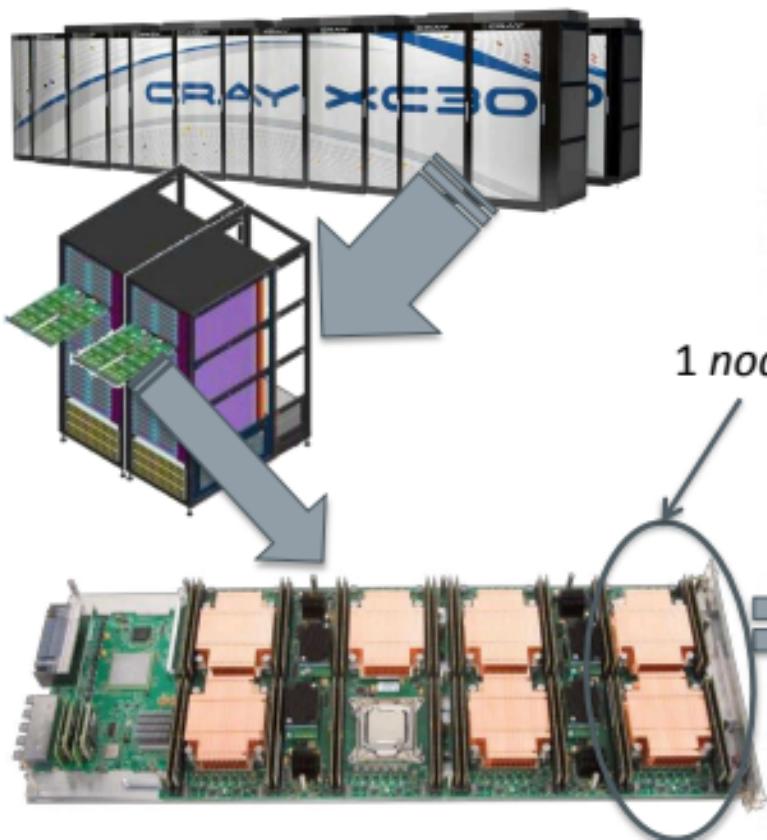


# Parallel computing concepts

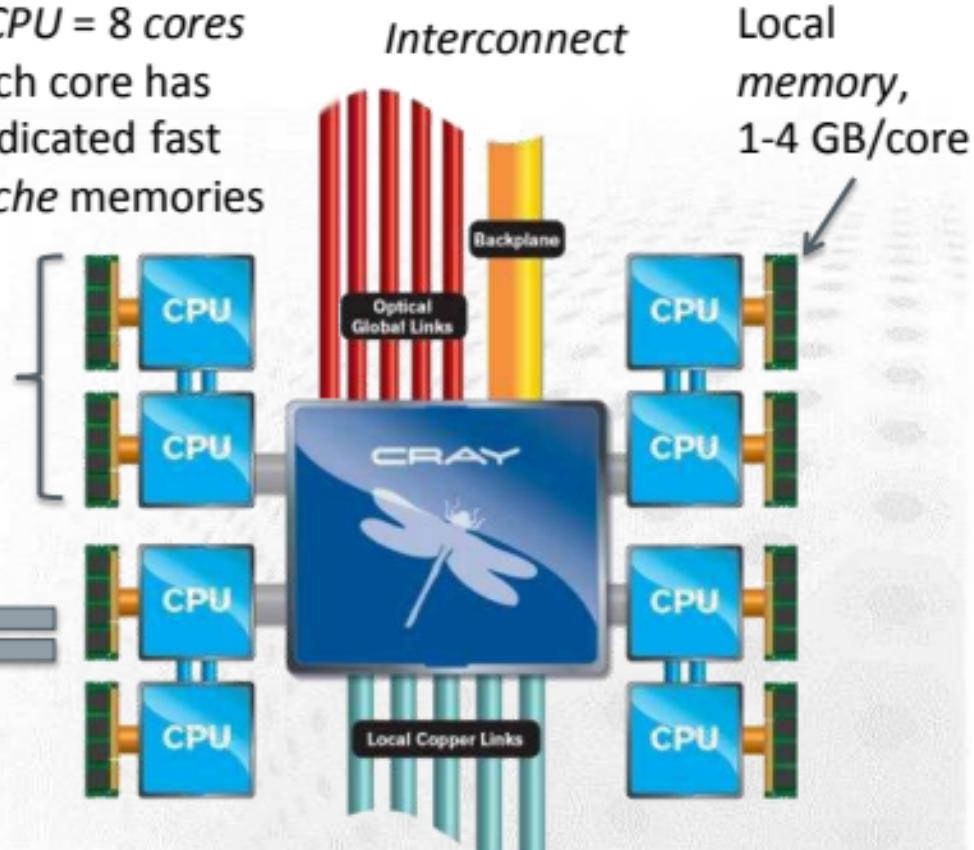
- ➊ Load balance
  - distribution of workload to different cores
- ➋ Parallel overhead
  - additional operations which are not present in serial calculation
  - synchronization, redundant computations, communications

# ON SUPERCOMPUTER ARCHITECTURES

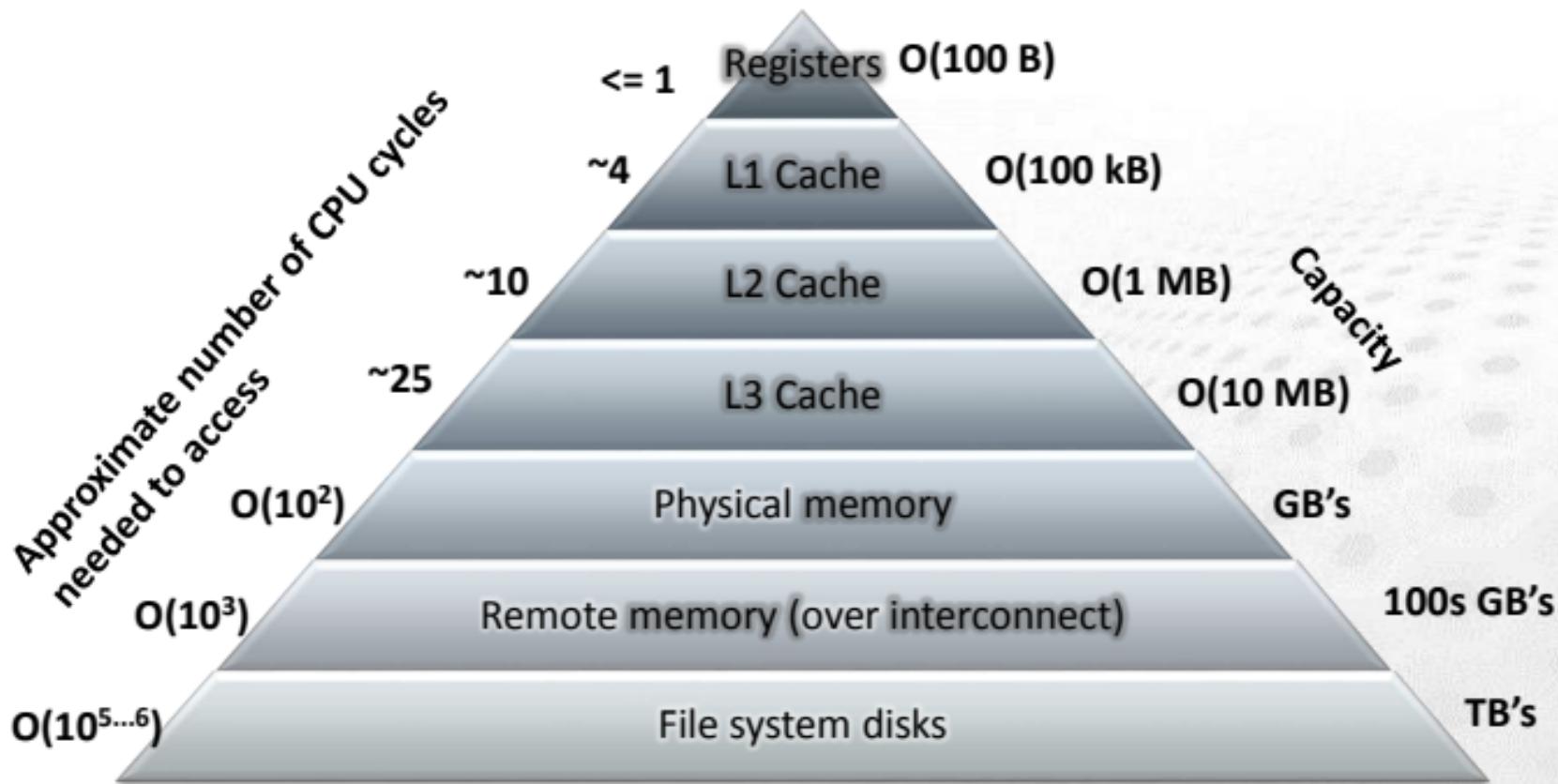
# Supercomputer autopsy



1 CPU = 8 cores  
Each core has dedicated fast cache memories



# Memory hierarchy



# 1. Productivity: Choosing a programming language

- ➊ Most common are C, C++ and Fortran 9X
  - mostly a question of taste
  - C++ more full featured with object oriented features and many more data structures (maps, etc.)
  - Fortran has really good array syntax
- ➋ One should also consider Python
  - much faster coding cycle (and less error prone)
  - parts of the code can be written in C, Fortran
  - tradeoff in speed; e.g. 10% overhead (with C extensions)

# Accelerators

- ➊ Specialized parallel HW for floating point operations
  - General purpose graphics processing units (GPGPU) have been the most common accelerators during the last few years
  - New technology emerging: Intel Xeon Phi
- ➋ Co-processors for traditional CPUs
- ➌ Refactoring of programs required

# Parallel programming models

## • Message passing

- Can be used both in distributed and shared memory computers
- Programming model allows for good parallel scalability
- Programming is quite explicit

## • Threading (pthreads, OpenMP)

- Can be used only in shared memory computers
- Limited parallel scalability
- “Simpler”/less explicit programming

## Message-passing interface

- ➊ MPI is an application programming interface (API) for communication between separate processes
  - The most widely used approach for *distributed* parallel computing
- ➋ MPI programs are portable and scalable
- ➌ MPI is flexible and comprehensive
  - Large (over 120 procedures)
  - Concise (often only 6 procedures are needed)
- ➍ MPI standardization by MPI Forum

## Execution model

- Parallel program is launched as set of independent, identical processes
- The same program code and instructions
- Can reside in different nodes
  - or even in different computers
- The way to launch parallel program is implementation dependent
  - mpirun, mpiexec, srun, aprun, poe, ...

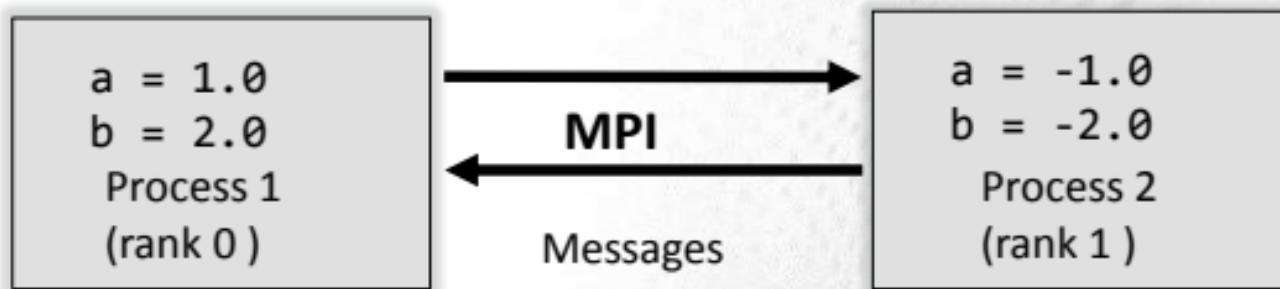
## MPI ranks

- MPI runtime assigns each process a rank
  - identification of the processes
  - ranks start from 0 and extent to N-1
- Processes can perform different tasks and handle different data basing on their rank

```
...  
if ( rank == 0 ) {  
    ...  
}  
if ( rank == 1) {  
    ...  
}  
...
```

## Data model

- All variables and data structures are local to the process
- Processes can exchange data by sending and receiving messages



## MPI communicator

- Communicator is an object connecting a group of processes
- Initially, there is always a communicator MPI\_COMM\_WORLD which contains all the processes
- Most MPI functions require communicator as an argument
- Users can define own communicators

# Routines of the MPI library

- ➊ Information about the communicator
  - number of processes
  - rank of the process
- ➋ Communication between processes
  - sending and receiving messages between two processes
  - sending and receiving messages between several processes
- ➌ Synchronization between processes
- ➍ Advanced features

# Programming MPI

- ➊ MPI standard defines interfaces to C and Fortran programming languages
  - There are unofficial bindings to Python, Perl and Java

## ➋ C call convention

```
rc = MPI_Xxxx(parameter, ...)
```

- some arguments have to be passed as pointers

## ➌ Fortran call convention

```
CALL MPI_XXXX(parameter, ..., rc)
```

- return code in the last argument

## First five MPI commands

- ➊ Set up the MPI environment

`MPI_Init()`

- ➋ Information about the communicator

`MPI_Comm_size(comm, size)`

`MPI_Comm_rank(comm, rank)`

- Parameters

**comm** communicator

**size** number of processes in the communicator

**rank** rank of this process

## First five MPI commands

- ⌚ Synchronize processes  
`MPI_Barrier(comm)`
- ⌚ Finalize MPI environment  
`MPI_Finalize()`

## Writing an MPI program

- ➊ Include MPI header files
  - C: #include <mpi.h>
  - Fortran: INCLUDE 'mpif.h'
- ➋ Call MPI\_Init
- ➌ Write the actual program
- ➍ Call MPI\_Finalize before exiting from the main program

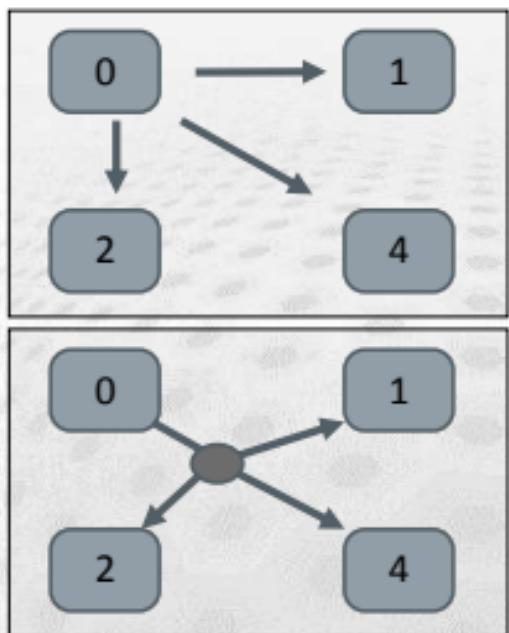
## Summary

- ➊ In MPI, a set of *independent processes* is launched
  - Processes are identified by *ranks*
  - Data is always *local* to the process
- ➋ Processes can exchange data by sending and receiving *messages*
- ➌ MPI library contains functions for
  - Communication and synchronization between processes
  - Communicator manipulation

# POINT-TO-POINT COMMUNICATION

# Introduction

- MPI processes are *independent*, they *communicate* to coordinate work
- Point-to-point communication
  - Messages are sent between two processes
- Collective communication
  - Involving a number of processes at the same time



## MPI point-to-point operations

- ➊ One process *sends* a message to another process that *receives* it
- ➋ Sends and receives in a program should match – one receive per send

## MPI point-to-point operations

- ➊ Each message (envelope) contains
  - The actual *data* that is to be sent
  - The *datatype* of each element of data.
  - The *number of elements* the data consists of
  - An identification number for the message (*tag*)
  - The ranks of the *source* and *destination* process

# Presenting syntax

INPUT  
arguments in red

OUTPUT  
arguments in blue

Note! Extra error parameter for Fortran

Slide with extra material included in handouts

## Send operation

**MPI\_Send(buf, count, datatype, dest, tag, comm)**

- **buf** The data that is sent
- **count** Number of elements in buffer
- **datatype** Type of each element in buf (see later slides)
- **dest** The rank of the receiver
- **tag** An integer identifying the message
- **comm** A communicator
- **error** Error value; in C/C++ it's the return value of the function, and in Fortran an additional output parameter

Operations presented in pseudocode,  
C and Fortran bindings presented in  
extra material slides.

## Send operation

```
int MPI_Send(void *buffer, int count, MPI_Datatype datatype,int dest, int tag, MPI_Comm comm)
```

- The return value of the function is the error value

### Fortran binding

```
MPI_SEND(buffer, count, datatype,  
         dest, tag, comm, ierror)  
<type> buf(*),  
integer count, datatype, dest, tag, comm, ierror
```

- **ierror**: the error value

# Send operation

**MPI\_Send(buf, count, datatype, dest, tag, comm)**

<b>buf</b>	The data that is sent
<b>count</b>	Number of elements in buffer
<b>datatype</b>	Type of each element in buf (see later slides)
<b>dest</b>	The rank of the receiver
<b>tag</b>	An integer identifying the message
<b>comm</b>	A communicator
<b>error</b>	Error value; in C/C++ it's the return value of the function, and in Fortran an additional output parameter

## Receive operation

**MPI\_Recv(buf, count, datatype, source, tag, comm,  
status)**

**buf** Buffer for storing received data

**count** Number of elements in buffer, not the number  
of element that are actually received

**datatype** Type of each element in buf

**source** Sender of the message

**tag** Number identifying the message

**comm** Communicator

**status** Information on the received message

**error** As for send operation

## MPI datatypes

- MPI has a number of predefined datatypes to represent data
- Each C or Fortran datatype has a corresponding MPI datatype
  - C examples: `MPI_INT` for int and `MPI_DOUBLE` for double
  - Fortran example: `MPI_INTEGER` for integer
- One can also define custom datatypes

## Special parameter values

`MPI_Send(buf, count, datatype, dest, tag, comm)`

dest	<code>MPI_PROC_NULL</code>	Null destination, no operation takes place
comm	<code>MPI_COMM_WORLD</code>	Includes all processes
error	<code>MPI_SUCCESS</code>	Operation successful

## Special parameter values

**MPI\_Recv(buf, count, datatype, source, tag,  
comm, status)**

source	MPI_PROC_NULL	No sender, no operation takes place
	MPI_ANY_SOURCE	Receive from any sender
tag	MPI_ANY_TAG	Receive messages with any tag
comm	MPI_COMM_WORLD	Includes all processes
status	MPI_STATUS_IGNORE	Do not store any status data
error	MPI_SUCCESS	Operation successful

## Status parameter

- ➊ The status *parameter* in MPI\_Recv contains information on how the receive succeeded
  - Number and datatype of received elements
  - Tag of the received message
  - Rank of the sender
- ➋ In C the status parameter is a struct, in Fortran it is an integer array

## Status parameter

- Received elements

Use the function

`MPI_Get_count(status, datatype, count)`

- Tag of the received message

C: `status.MPI_TAG`

Fortran: `status(MPI_TAG)`

- Rank of the sender

C: `status.MPI_SOURCE`

Fortran: `status(MPI_SOURCE)`

## Blocking routines & deadlocks

- ➊ Blocking routines
  - Completion depends on other processes
  - Risk for deadlocks – the program is stuck forever
- ➋ MPI\_Send exits once the send buffer can be safely read and written to
- ➌ MPI\_Recv exits once it has received the message in the receive buffer

# Point-to-point communication patterns

Pairwise exchange



Pipe, a ring of processes exchanging data



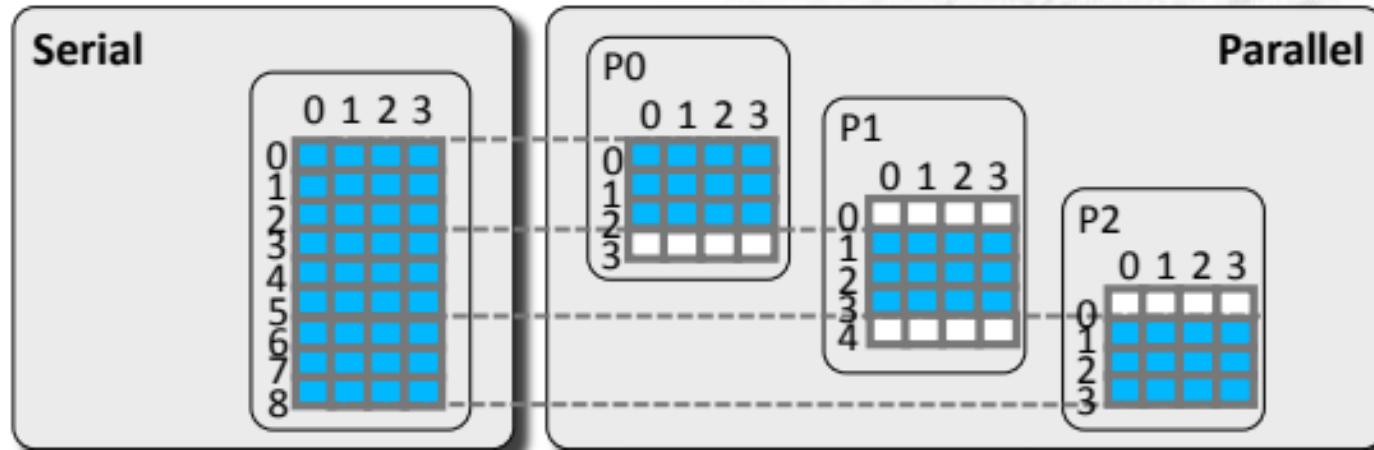
## Combined send & receive

```
MPI_Sendrecv(sendbuf, sendcount, sendtype, dest, sendtag,  
recvbuf, recvcount, recvtype, source, recvtag, comm,  
status)
```

- Parameters as for MPI\_Send and MPI\_Recv combined
- Sends one message and receives another one, with one single command
  - Reduces risk for deadlocks
- Destination rank and source rank can be same or different

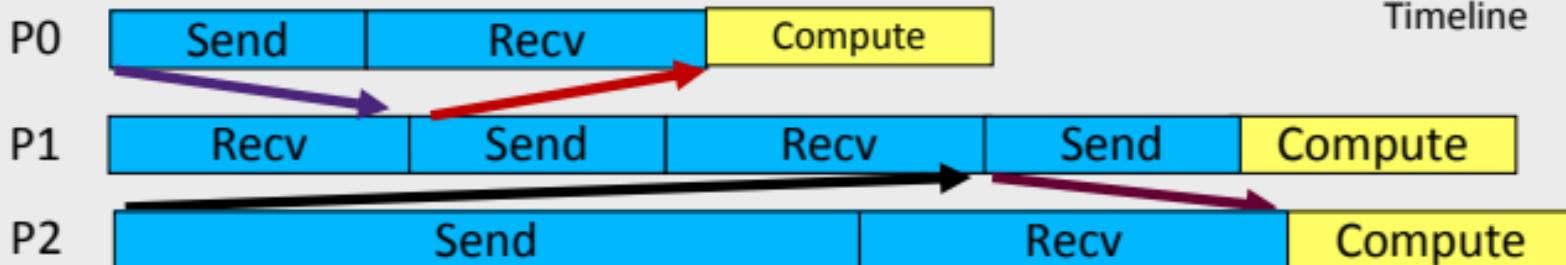
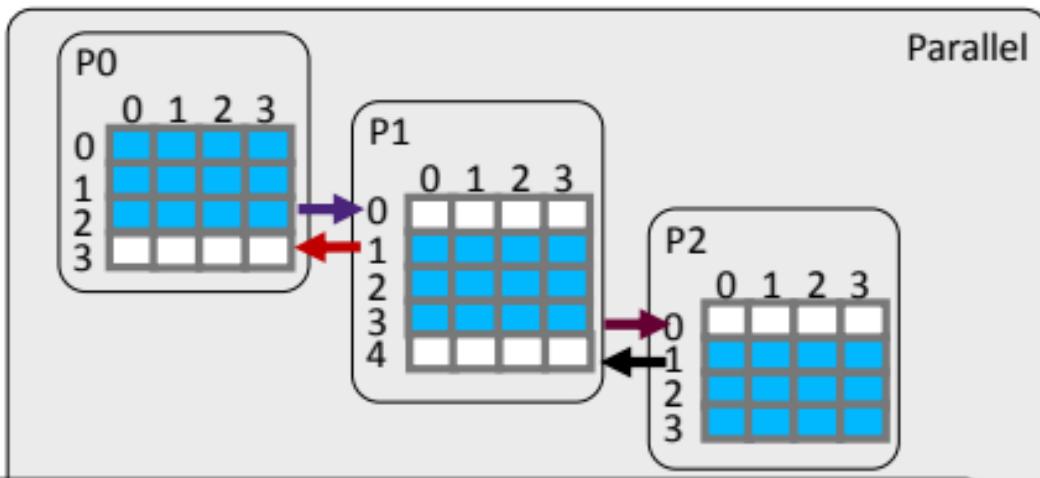
## Case study 2: Domain decomposition

- Computation inside each domain can be carried out independently; hence in parallel
- Ghost layer* at boundary represent the value of the elements of the other process



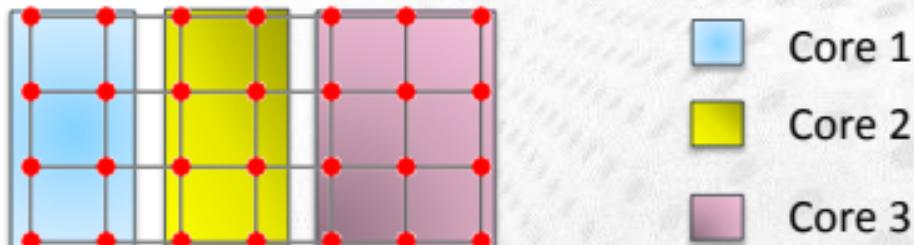
## CS2: One iteration step

- Have to carefully schedule the order of sends and receives in order to avoid deadlocks



# Solving heat equation in parallel

- Temperature at each grid point can be updated independently
- Domain decomposition



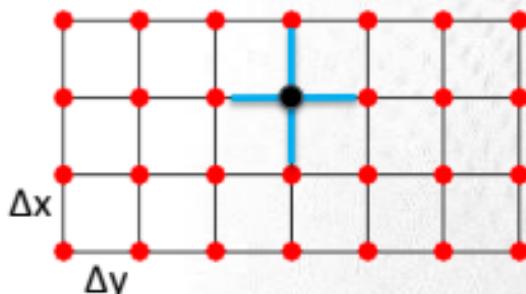
- Straightforward in shared memory computer

# Numerical solution

- Finite difference Laplacian in two dimensions

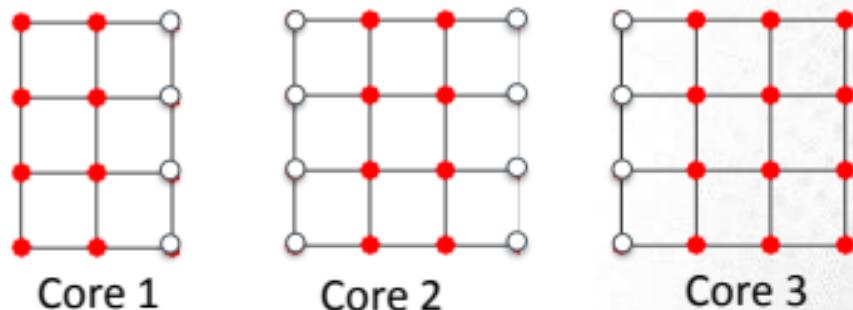
$$\nabla^2 u(i,j) = \frac{u(i-1,j) - 2u(i,j) + u(i+1,j)}{(\Delta x)^2} + \\ \frac{u(i,j-1) - 2u(i,j) + u(i,j+1)}{(\Delta y)^2}$$

Temperature  
field  $u(i,j)$



## Solving heat equation in parallel

- In distributed memory computers, each core can access only its own memory
- Information about neighbouring domains is stored in "ghost layers"

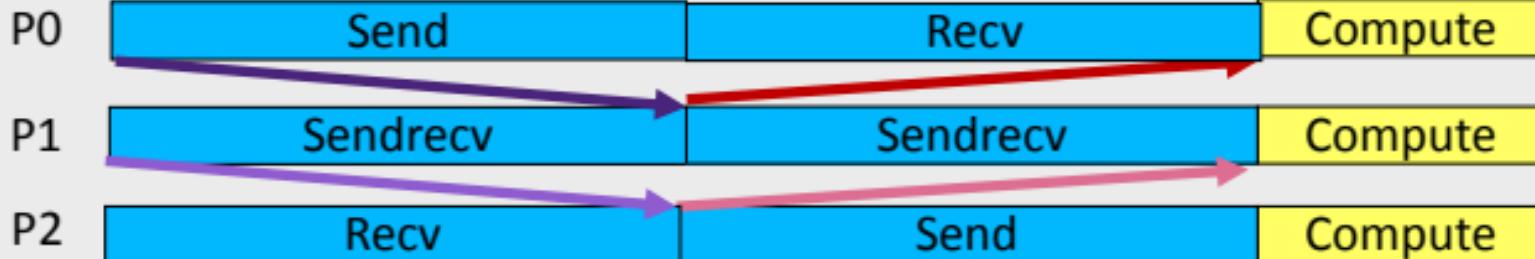
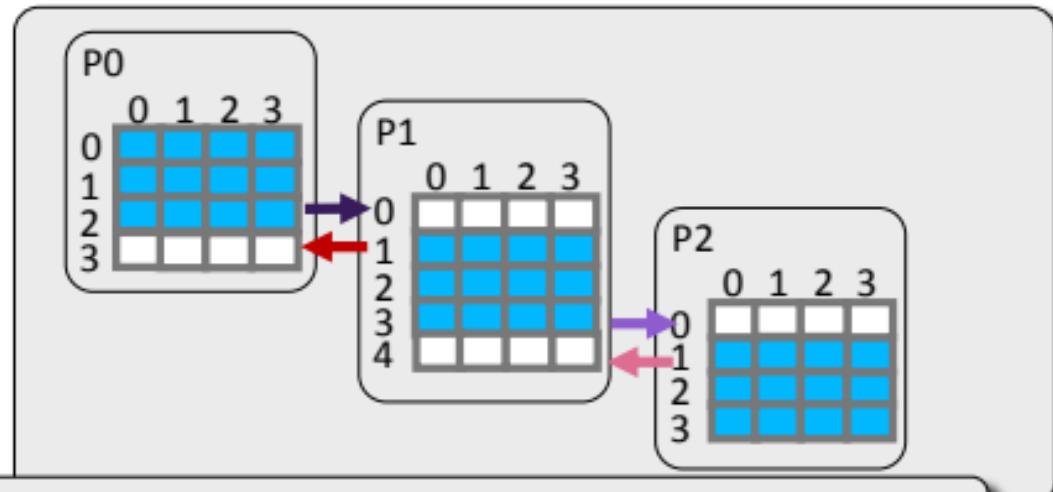


- Before each update cycle, CPU cores communicate boundary data: halo exchange

## CS2: MPI\_Sendrecv

### • MPI\_Sendrecv

- Sends and receives with one command
- No risk of deadlocks



## Summary

- ➊ Point-to-point communication
  - Messages are sent between two processes
- ➋ We discussed send and receive operations enabling any parallel application
  - MPI\_Send & MPI\_Recv
  - MPI\_Sendrecv
- ➌ Status parameter
- ➍ Special argument values

## Web resources

- List of MPI functions with detailed descriptions

[http://mpi.deino.net/mpi\\_functions/index.htm](http://mpi.deino.net/mpi_functions/index.htm)

- Good online MPI tutorial:

<https://computing.llnl.gov/tutorials/mpi>

- MPI 3.0 standard

<http://www.mpi-forum.org/docs/>

- MPI Implementations

- MPICH2 <http://www.mcs.anl.gov/research/projects/mpich2/>

- OpenMPI <http://www.open-mpi.org/>

## COLLECTIVE OPERATIONS

# Outline

- Introduction to collective communication
- One-to-many collective operations
- Many-to-one collective operations
- Many-to-many collective operations
- Non-blocking collective operations
- User-defined communicators

# Introduction

- ➊ Collective communication transmits data among all processes in a process group
  - These routines must be called by all the processes in the group
- ➋ Collective communication includes
  - data movement
  - collective computation
  - synchronization

## Example

### **MPI\_Barrier**

makes each task hold until all tasks have called it

```
int MPI_Barrier(comm)
MPI_BARRIER(comm, rc)
```

# Introduction

- Collective communication outperforms normally point-to-point communication
- Code becomes more compact and easier to read:

```
if (my_id == 0) then
    do i = 1, ntasks-1
        call mpi_send(a, 1048576, &
                      MPI_REAL, i, tag, &
                      MPI_COMM_WORLD, rc)
    end do
else
    call mpi_recv(a, 1048576, &
                  MPI_REAL, 0, tag, &
                  MPI_COMM_WORLD, status, rc)
end if
```



```
call mpi_bcast(a, 1048576, &
               MPI_REAL, 0, &
               MPI_COMM_WORLD, rc)
```

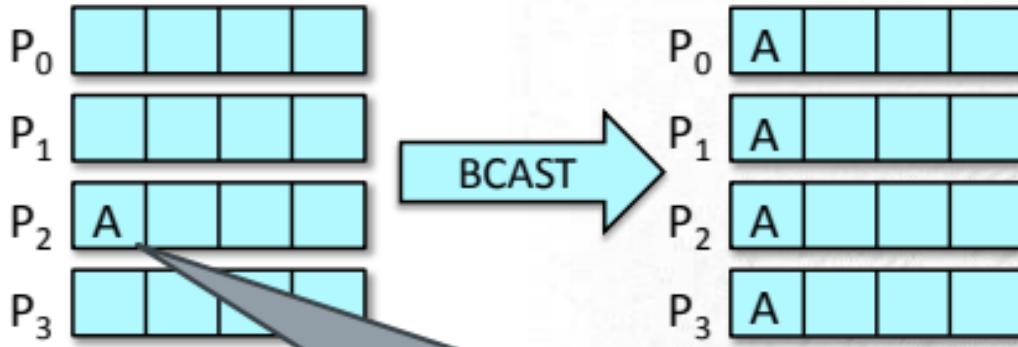
Communicating a vector  $a$  consisting of 1M float elements from the task 0 to all other tasks

## Introduction

- ➊ Amount of sent and received data must match
- ➋ Non-blocking routines are available in the MPI 3 standard
  - Older libraries do not support this feature
- ➌ No tag arguments
  - Order of execution must coincide across processes

# Broadcasting

- Send the same data from one process to all the other



This buffer may contain multiple elements of any datatype.

# Broadcasting

- With MPI\_Bcast, the task *root* sends a *buffer* of data to all other tasks

**MPI\_Bcast(buffer, count, datatype, root, comm)**

**buffer** data to be distributed

**count** number of entries in buffer

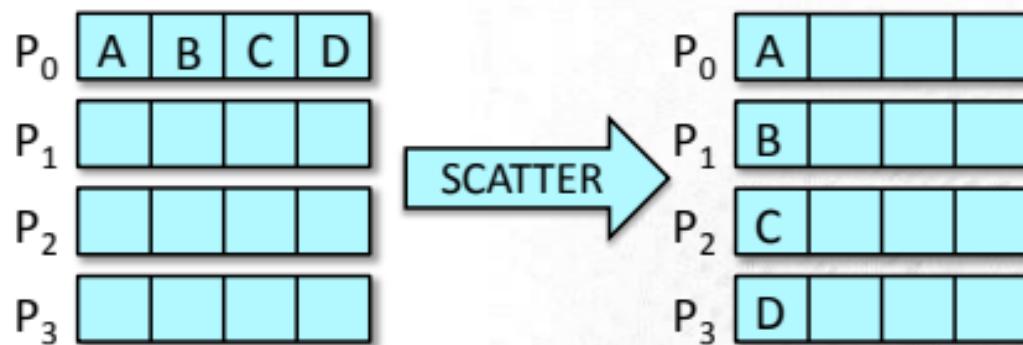
**datatype** data type of buffer

**root** rank of broadcast root

**comm** communicator

# Scattering

- Send equal amount of data from one process to others



- Segments A, B, ... may contain multiple elements

# Scattering

- MPI\_Scatter: Task *root* sends an equal share of data (*sendbuf*) to all other processes

```
MPI_Scatter(sendbuf, sendcount, sendtype, recvbuf,  
            recvcount, recvtype, root, comm)
```

<b>sendbuf</b>	send buffer (data to be scattered)
<b>sendcount</b>	number of elements sent to each process
<b>sendtype</b>	data type of send buffer elements
<b>recvbuf</b>	receive buffer
<b>recvcount</b>	number of elements in receive buffer
<b>recvtype</b>	data type of receive buffer elements
<b>root</b>	rank of sending process
<b>comm</b>	communicator

## Common mistakes with collectives

- ✖ Using a collective operation within one branch of an if-test of the rank

`IF (my_id == 0) CALL MPI_BCAST(...)`

- All processes, both the root (the sender or the gatherer) and the rest (receivers or senders), *must* call the collective routine!

- ✖ Assuming that all processes making a collective call would complete at the same time

- ✖ Using the input buffer as the output buffer

`CALL MPI_ALLREDUCE(a, a, n, MPI_REAL, MPI_SUM, ...)`

## Summary

- ➊ Collective communications involve all the processes within a communicator
  - All processes must call them
- ➋ Collective operations make code more transparent and compact
- ➌ Collective routines allow optimizations by MPI library
- ➍ Performance consideration:
  - Alltoall is expensive operation, avoid it when possible

## USER-DEFINED COMMUNICATORS

## Communicators

- ➊ The communicator determines the "communication universe"
  - The source and destination of a message is identified by process rank within the communicator
- ➋ So far: MPI\_COMM\_WORLD
- ➌ Processes can be divided into subcommunicators
  - Task level parallelism with process groups performing separate tasks
  - Parallel I/O

## Communicators

- Communicators are dynamic
- A task can belong simultaneously to several communicators
  - In each of them it has a unique ID, however
  - Communication is normally within the communicator

# Grouping processes in communicators

