#### Parallel Systems Course: Chapter III

# The Message-Passing Paradigm

Jan Lemeire Dept. ETRO October - November 2016



Vrije Universiteit Brussel



**1.** Definition **2. MPI** Efficient communication **3. Collective Communications** 4. Interconnection networks **Static networks Dynamic networks** 5. End notes

Message-passing Parallel Processing



#### **1.** Definition MPT Efficient communication **Collective Communications** 4. Interconnection networ Static networks Dynamic networks **5. End notes**

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#### Message-passing paradigm

#### Partitioned address space

- Each process has its own exclusive address space
- Typical 1 process per processor
- Only supports explicit parallelization
  - Adds complexity to programming
  - Encourages locality of data access

#### Often Single Program Multiple Data (SPMD) approach

- The same code is executed by every process.
- Identical, except for the master
- *loosely synchronous* paradigm: between interactions (through messages), tasks execute completely asynchronously



#### Clusters

# Message-passing Made from commodity parts or blade servers

#### Open-source software available





# Computing Grids

#### Provide computing resources as a service

- Hiding details for the users (transparency)
- Users: enterprises such as financial services, manufacturing, gaming, ...
- Hire computing resources, besides data storage, web servers, etc.

#### Issues:

 Resource management, availability, transparency, heterogeneity, scalability, fault tolerance, security, privacy.

# Cloud Computing, the new hype



- Internet-based computing, whereby shared resources, software, and information are provided to computers and other devices on demand
- Like the electricity grid.



# The ability to send and receive messages is all we need

+ void Send(message, destination)

+ char[] Receive(source)

+ boolean IsMessage(source)

# But... we also want performance! More functions will be provided

### Message-passing



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#### MPI: the Message Passing Interface

- A standardized message-passing API.
- There exist nowadays more than a dozen implementations, like LAM/MPI, MPICH, etc.
- For writing portable parallel programs.
- Runs transparently on heterogeneous systems (platform independence).
- Aims at not sacrificing efficiency for genericity:
   encourages overlap of communication and computation by nonblocking communication calls



Replaces the good old PVM (Parallel Virtual Machine)

### Fundamentals of MPI

- Each process is identified by its rank, a counter starting from 0.
- Tags let you distinguish different types of messages
- Communicators let you specify groups of processes that can intercommunicate

Default is MPI COMM WORLD

- All MPI routines in C, data-types, and constants are prefixed by "MPI\_"
- ♦ We use the MPJ API, an O-O version of MPI for java



### The minimal set of MPI routines

MPI_Init	Initializes MPI.
MPI_Finalize	Terminates MPI.
MPI_Comm_size	Determines the number of processes.
MPI_Comm_rank	Determines the label of calling process.
MPI_Send	Sends a message.
MPI_Recv	Receives a message.
MPI_Probe	Test for message (returns Status object).

# Counting 3s with MPI

#### <u>master</u>

partition array

send subarray to each slave

receive results and sum them

<u>slaves</u>				
receive subarray				
count 3s				
return result				

Different program on master and slave
 We'll see an alternative later

```
int rank = MPI.COMM WORLD.Rank(); int size = MPI.COMM WORLD.Size(); int nbrSlaves = size - 1;
if (rank == 0) { // we choose rank 0 for master program
 // initialise data
  int[] data = createAndFillArray(arraySize);
  // divide data over slaves
  int slavedata = arraySize / nbrSlaves; // # data for one slave
  int index = 0;
  for (int slaveID=1; slaveID < size; slaveID++) {</pre>
    MPI.COMM WORLD.Send(data, index, slavedata + rest, MPI.INT, slaveID, INPUT TAG);
    index += slavedata;
  }
  // slaves are working...
   int nbrPrimes = 0;
  for (int slaveID=1; slaveID < size; slaveID++){</pre>
      int buff[] = new int[1]; // allocate buffer size of 1
      MPI.COMM WORLD.Recv(buff, 0, 1, MPI.INT, slaveID, RESULT TAG);
```

```
nbrPrimes += buff[0];
}
else { // *** Slave Program ***
Status status = MPI.COMM_WORLD.Probe(0, INPUT_TAG);
int[] array = new int[status.count]; // check status to know data size
MPI.COMM_WORLD.Recv(array, 0, status.count, MPI.INT, 0, INPUT_TAG);
```

```
int result = count3s(array); // sequential program
```

```
int[] buff = new int[] {result};
MPI.COMM_WORLD.Send(buff, 0, 1, MPI.INT, 0, RESULT_TAG)
```

```
}
```

MPI.Finalize(); // Don't forget!!

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### **MPJ Express primitives**

- void Comm.<u>Send(java.lang.Object buf, int offset, int count, Datatype</u> datatype, int dest, int tag)
- Status Comm.Recv(java.lang.Object buf, int offset, int count, Datatype datatype, int source, int tag)

Java array

### Communicators

- A communicator defines a *communication domain* a set of processes that are allowed to communicate with each other.
  - Default is COMM\_WORLD, includes all the processes
  - Define others when communication is restricted to certain subsets of processes
- Information about communication domains is stored in variables of type Comm.
- Communicators are used as arguments to all message transfer MPI routines.
- A process can belong to many different (possibly overlapping) communication domains.



#### Example



- A process has a specific rank in each communicator it belongs to.
- Other example: use a different communicator in a library than application so that messages don't get mixed

#### MPI Datatypes

MPI++ Datatype	C Datatype	Java
MPI.CHAR	signed char	char
MPI.SHORT	signed short int	
MPI.INT	signed int	int
MPI.LONG	signed long int	long
MPI.UNSIGNED_CHAR	unsigned char	
MPI.UNSIGNED_SHORT	unsigned short int	
MPI.UNSIGNED	unsigned int	
MPI.UNSIGNED_LONG	unsigned long int	
MPI.FLOAT	float	float
MPI.DOUBLE	double	double
MPI.LONG_DOUBLE	long double	
MPI.BYTE		byte
MPI.PACKED		

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### User-defined datatypes





- Specify displacements and types => commit
- Irregular structure: use DataType.Struct
- Regular structure: Indexed, Vector, ...

#### ♦ E.g. submatrix

Alternative: packing & unpacking via buffer

## Packing & unpacking

Example: tree D G В





From objects and pointers to a linear structure... and back.

### Inherent serialization in java

• For your class: implement interface *Serializable* 

- No methods have to be implemented, this turns on automatic serialization
- Example code of writing object to file:

public static void writeObject2File(File file, Serializable o)
throws FileNotFoundException, IOException{
 FileOutputStream out = new FileOutputStream(file);
 ObjectOutputStream s = new ObjectOutputStream(out);
 s.writeObject(o);
 s.close();

Add serialVersionUID to denote class compatibility

private static final long serialVersionUID = 2;

Attributes denoted as transient are not serialized



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### Message-passing



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### Non-Buffered Blocking Message Passing Operations



Handshake for a blocking non-buffered send/receive operation.
 There can be considerable idling overheads.

#### Non-Blocking communication



With support for overlapping communication with computation

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# Non-Blocking Message Passing Operations

- With HW support: communication overhead is completely masked (*Latency Hiding 1*)
  - Network Interface Hardware allow the transfer of messages without CPU intervention

#### Message can also be buffered

- Reduces the time during which the data is unsafe
- Initiates a DMA operation and returns immediately
  - DMA (Direct Memory Access) allows copying data from one memory location into another without CPU support (Latency Hiding 2)

 Generally accompanied by a check-status operation (whether operation has finished)

### Be careful!

Consider the following code segments:





Which protocol to use?

- Blocking protocol
  - ✤ Idling...
- Non-blocking buffered protocol
  - Buffering alleviates idling at the expense of copying overheads

# Non-blocking buffered communication





# Deadlock with blocking calls

#### <u>All processes</u>

```
send(&a, 1, rank+1);
receive(&a, 1, rank-1);
```

#### **Solutions**

- Switch send and receive at uneven processor
- Buffered send
- Use non-blocking calls
  - Receive should use a different buffer!
- MPI built-in function: Send\_recv\_replace

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#### <u>All processes</u>

If 
$$(rank \% 2 == 0)$$
{

```
send(&a, 1, rank+1);
```

```
receive(&a, 1, rank-1);
```

```
} else {
```

```
receive(&b, 1, rank-1);
```

```
send(&a, 1, rank+1);
```

a=b;

}

#### Send and Receive Protocols



#### MPI Point-to-point communication

#### Blocking

Returns if locally complete (<> globally complete)

#### Non-blocking

Wait & test for completion functions

#### Modes

- Buffered
- Synchronous: wait for a rendez-vous
- Ready: no hand-shaking or buffering
  - Assumes corresponding receive is posted

#### Send\_recv & send\_recv\_replace

Simultaneous send & receive. Solves slide 31 problem!



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# Collective Communication Operations

- MPI provides an extensive set of functions for performing common collective communication operations.
- Each of these operations is defined over a group corresponding to the communicator.
- All processors in a communicator must call these operations.
- For convenience & performance
  - Collective operations can be optimized by the library by taking the underlying network into consideration!

## Counting 3s with MPI bis

#### The same program on master and slave

#### <u>All processes</u>

allocate subarray

*scatter* array from master to subarrays

count 3s

*reduce* subresults to master
public static int countPrimesPar(int[] data, String[] args) {
 final int myRank = MPI.COMM\_WORLD.Rank();
 final int NBR\_PROCESSES = MPI.COMM\_WORLD.Size();
 final int NBR\_ELEMENTS\_PER\_PROCESS = data.length/NBR\_PROCESSES;
 final int NBR\_REST\_ELEMENTS = data.length%NBR\_PROCESSES; // modulo.

int[] process\_data = new int[NBR\_ELEMENTS\_PER\_PROCESS]; // send buffer cannot be reused in this MPI implementation...

// scatter

MPI.COMM\_WORLD.Scatter(data, NBR\_REST\_ELEMENTS, process\_data.length, MPI.INT, process\_data, 0, process\_data.length, MPI.INT, 0);

```
// count 3s
int n = 0;
```

```
int[] send_buffer = new int []{n};
int[] recv_buffer = new int [1];
```

```
// reduce
MPI.COMM_WORLD.Reduce(send_buffer, 0, recv_buffer, 0, 1, MPI.INT, MPI.SUM, 0);
```

```
return recv_buffer[0];
```

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### **Optimization of Collective operations**



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### **MPI** Collective Operations

Barrier synchronization in MPI:
 int MPI\_Barrier(MPI\_Comm comm)

The one-to-all broadcast operation is:
 int MPI\_Bcast(void \*buf, int count, MPI\_Datatype
 datatype, int source, MPI\_Comm comm)

The all-to-one reduction operation is: int MPI\_Reduce(void \*sendbuf, void \*recvbuf, int count, MPI\_Datatype datatype, MPI\_Op op, int

target, MPI Comm comm)

### **MPI** Collective Operations











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### Predefined Reduction Operations

Operation	Meaning	Datatypes		
MPI_MAX	Maximum	C integers and floating point		
MPI_MIN	Minimum	C integers and floating point		
MPI_SUM	Sum	C integers and floating point		
MPI_PROD	Product	C integers and floating point		
MPI_LAND	Logical AND	C integers		
MPI_BAND	Bit-wise AND	C integers and byte		
MPI_LOR	Logical OR	C integers		
MPI_BOR	Bit-wise OR	C integers and byte		
MPI_LXOR	Logical XOR	C integers		
MPI_BXOR	Bit-wise XOR	C integers and byte		
MPI_MAXLOC	max-min value-location	Data-pairs		
MPI_MINLOC	min-min value-location	Data-pairs		

### Maximum + location

- MPI\_MAXLOC returns the pair (v, l) such that v is the maximum among all v<sub>i</sub> 's and l is the corresponding l<sub>i</sub> (if there are more than one, it is the smallest among all these l<sub>i</sub> 's).
- MPI\_MINLOC does the same, except for minimum value of v<sub>i</sub>.



An example use of the MPI\_MINLOC and MPI\_MAXLOC operators.

### Scan operation



Parallel prefix sum: every node got sum of previous nodes + itself

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### Interconnection Networks

- Interconnection networks carry data between processors and memory.
- Interconnects are made of switches and links (wires, fiber).
- Interconnects are classified as static or dynamic.
  - Static networks consist of point-to-point communication links among processing nodes and are also referred to as *direct* networks.
  - Dynamic networks are built using switches and communication links. Dynamic networks are also referred to as *indirect* networks.

## Static and Dynamic Interconnection Networks



### Important characteristics







- Difficulty to implement
- Scalability

Can processors be added with the same cost



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### Network Topologies: Completely Connected and Star Connected Networks



(a) A completely-connected network of eight nodes;(b) a star connected network of nine nodes.

# Completely Connected Network

- Each processor is connected to every other processor.
- The number of links in the network scales as  $O(p^2)$ .
- While the performance scales very well, the hardware complexity is not realizable for large values of p.
- In this sense, these networks are static counterparts of crossbars (see later).

### Star Connected Network

- Every node is connected only to a common node at the center.
- Distance between any pair of nodes is O(1).
   However, the central node becomes a bottleneck.
- In this sense, star connected networks are static counterparts of buses.

### Linear Arrays

# (a) (b)

### Linear arrays: (a) with no wraparound links; (b) with wraparound link.

### Network Topologies: Two- and Three Dimensional Meshes



Two and three dimensional meshes: (a) 2-D mesh with no wraparound; (b) 2-D mesh with wraparound link (2-D torus); and (c) a 3-D mesh with no wraparound.

### Network Topologies: Linear Arrays, Meshes, and *k-d* Meshes

- In a *linear array*, each node has two neighbors, one to its left and one to its right. If the nodes at either end are connected, we refer to it as a *1D torus or a ring*.
- Mesh: generalization to 2 dimensions has nodes with 4 neighbors, to the north, south, east, and west.
- A further generalization to *d* dimensions has nodes with *2d* neighbors.
- A special case of a *d*-dimensional mesh is a *hypercube*. Here, *d* = *log p*, where *p* is the total number of nodes.

# Hypercubes and torus



<sup>4-D hypercube</sup> Construction of hypercubes from hypercubes of lower dimension.



Torus (2D wraparound mesh).

# Super computer: BlueGene/L

#### a BlueGene/L node.



### IBM, No 1 in 2007

- www.top500.org
- 65.536 dual core nodes
  - E.g. one processor dedicated to communication, other to computation
  - Each 512 MB RAM
- US\$100 miljoen
- Now replaced by BlueGene/P and BlueGene/Q



# BlueGene/L communication networks



- (a) 3D torus (64x32x32) for standard interprocessor data transfer
  - Cut-through routing (see later)
- (b) collective network for fast evaluation of *reductions*.
- (c) Barrier network by a common wire

### Network Topologies: Tree-Based Networks



Complete binary tree networks: (a) a static tree network; and (b) a dynamic tree network.

### **Tree Properties**

- $\phi p = 2^d 1$  with *d* depth of tree
- The distance between any two nodes is no more than 2 log p.
- Links higher up the tree potentially carry more traffic than those at the lower levels.
- For this reason, a variant called a *fat-tree*, fattens the links as we go up the tree.
- Trees can be laid out in 2D with no wire crossings.
   This is an attractive property of trees.

### Network Topologies: Fat Trees



A fat tree network of 16 processing nodes.

### Network Properties

- Diameter: The distance between the farthest two nodes in the network.
- Bisection Width: The minimum number of links you must cut to divide the network into two equal parts.
- Arc connectivity: minimal number of links you must cut to isolate two nodes from each other. A measure of the multiplicity of paths between any two nodes.
- Cost: The number of links. Is a meaningful measure of the cost.
  - However, a number of other factors, such as the ability to layout the network, the length of wires, etc., also factor into the cost.

### Static Network Properties

Network	Diameter	Bisection Width	Arc Connectivity	Cost (No. of links)
Completely-connected	1	$p^{2}/4$	p-1	p(p-1)/2
Star	2	/	1	p-1
Complete binary tree	$2\log((p+1)/2)$	1	1	p-1
Linear array	p-1	1	1	p-1
2-D mesh, no wraparound	$2(\sqrt{p}-1)$	$\sqrt{p}$	2	$2(p-\sqrt{p})$
2-D wraparound mesh	$2\lfloor \sqrt{p}/2 \rfloor$	$2\sqrt{p}$	4	2p
Hypercube	$\log p$	p/2	$\log p$	$(p\log p)/2$
Wraparound k-ary d-cube	$d\lfloor k/2  floor$	$2k^{d-1}$	2d	dp



## Message Passing Costs

# The total time to transfer a message over a network comprises of the following:

- Startup time (t<sub>s</sub>): Time spent at sending and receiving nodes (executing the routing algorithm, programming routers, etc.).
- Per-hop time (t<sub>h</sub>): This time is a function of number of hops and includes factors such as switch latencies, network delays, etc.
- Per-word transfer time (t<sub>w</sub>): This time includes all overheads that are determined by the length of the message. This includes bandwidth of links, error checking and correction, etc.

# **Routing Techniques**



Passing a message from node  $P_0$  to  $P_{3'}$ .

#### (a) a **store-and-forward**

communication network;

(b) and (c) extending the concept to *cut-through routing*. The shaded regions: message is in transit. The startup time of message transfer is assumed to be zero.

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## Store-and-Forward Routing

- A message traversing multiple hops is completely received at an intermediate hop before being forwarded to the next hop.
- The total communication cost for a message of size m words to traverse / communication links is

$$t_{comm} = t_s + (mt_w + t_h)l.$$

• In most platforms,  $t_h$  is small and the above expression can be approximated by

$$t_{comm} = t_s + mlt_w.$$

# Cut-Through Routing

The total communication time for cut-through routing is approximated by:

$$t_{comm} = t_s + t_h l + t_w m.$$

- Identical to packet routing, however, t<sub>w</sub> is typically much smaller.
- $t_h$  is typically smaller than  $t_s$  and  $t_w$ . Thus, particularly, when *m* is large:

$$t_{comm} = t_s + t_w m.$$

# Routing Mechanisms



Routing a message from node  $P_s$  (010) to node  $P_d$  (111) in a threedimensional hypercube using E-cube routing.



## A broadcast in a Hypercube

### Message from node 0 to all others: *d* steps



for(int d: dimensions)
 if (all bits with index > d are 0)
 if (d<sup>th</sup> bit == 0)
 send message to (flip d<sup>th</sup> bit)
 else
 receive message from (flip d<sup>th</sup>
 bit)

Reduce operation is the opposite ...

### Cost of Communication Operations

Broadcast on hypercube: log p steps

→ With cut-through routing:  $T_{comm} = (t_s + t_w m) \cdot \log p$ 

### All-to-all broadcast (full duplex links)

- + Hypercube: log p steps
- Linear array: p-1 steps
- ring: p/2 steps
- + 2D-Mesh:  $2\sqrt{p}$  steps

Scatter and gather: similar to broadcast

Circular q-shift: send msg to (i+q)mod p

- + Mesh: maximal  $\sqrt{p/2}$  steps
- In a hypercube: embedding a linear array



(c) Distribution before the third step

(d) Final distribution of messages

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## Embedding a Linear Array into a Hypercube

1-bit Gray code

1





**Gray code problem**: arrange nodes in a ring so that neighbors only differ by 1 bit

- (a) A three-bit reflected Gray code ring
  - (b) its embedding into a three-dimensional hypercube.

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# Application of Gray code

- To facilitate <u>error correction</u> in digital communications
- The problem with <u>natural binary codes</u> is that, with real switches, it is very unlikely that switches will change states exactly in synchrony
- ♦ transition from 011 (3) to 100 (4) might look like 011 - 001 - 101 - 100
  - For receiver it is unclear whether 101 is send or not...
  - Solution: use Gray code



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# Dynamic networks: Buses



#### **Bus-based** interconnect

# Dynamic Networks: Crossbars

#### **Processing elements**



A crossbar network uses an *p×m* grid of switches to connect *p* inputs to m outputs in a non-blocking manner.

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# Multistage Dynamic Networks

- Crossbars have excellent performance scalability but poor cost scalability.
  - + The cost of a crossbar of p processors grows as  $O(p^2)$ .
  - This is generally difficult to scale for large values of p.
- Buses have excellent cost scalability, but poor performance scalability.
- Multistage interconnects strike a compromise between these extremes.

# Multistage Dynamic Networks



The schematic of a typical multistage interconnection network.

# Multistage Dynamic Networks



An **Omega network** is based on 2×2 switches.

An example of blocking in omega network: one of the messages (010 to 111 or 110 to 100) is blocked at link AB.

# Evaluating Dynamic Interconnection Networks

Network	Diameter	Bisection Width	Arc Connectivity	Cost (No. of links)
Crossbar	1	p	1	$p^2$
Omega Network	$\log p$	p/2	1	p log p
Dynamic Tree	$2\log p$	1	2	p - 1

# Recent trend: networks-on-chip

- Many-cores (such as cell processor)
- Increasing number of cores
- bus or crossbar switch become infeasible
- specific network has to be chosen
- When even more cores
   scalable network required



# Memory Latency λ

◆ Memory Latency = delay required to make a memory reference, relative to processor's local memory latency, ≈ unit time ≈ one word per instruction

Architecture Family	Computer	Lambda
Chip Multiprocessor*	AMD Opteron	100
Shared-memory Multiprocessor	Sun Fire E25K	400-660
Co-processor	Cell	N/A
Cluster	HP BL6000 w/GbE	4,160-5,120
Supercomputer	BlueGene/L	8960

\*CMP's  $\lambda$  value measures a transfer between L1 data caches on chip.



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# Choose MPI

- Aakes the fewest assumptions about the underlying hardware, is the least common denominator. It can execute on any platform.
- Currently the best choice for writing large, long-lived applications.

## MPI Issues

- MPI messages incur large overheads for each message
  - Minimize cross-process dependences
  - Combine multiple message into one
- Safety
  - Deadlock & livelock still possible...
    - But easier to deal with since synchronization is explicit
  - Sends and receives should be properly matched
  - Non-blocking and non-buffered messages are more efficient but make additional assumptions that should be enforced by the programmer.

# MPI-3: non-blocking collective communication operations

- Start a collective operation
- Proceed with some other stuff
- Check whether collective has been finished

Hide communication behind useful computations

# MPI-2: also supports onesided communication

- process accesses remote memory without interference of the remote 'owner' process
- Process specifies all communication parameters, for the sending side and the receiving side

   • exploits an interconnect with RDMA (Remote DMA) facilities
- Additional synchronization calls are needed to assure that communication has completed before the transferred data are locally accessed.

User imposes right ordering of memory accesses

# One-sided primitives

- Communication calls
  - MPI\_Get: Remote read.
  - MPI\_Put: Remote write.
  - MPI\_Accumulate: accumulate content based on predefined operation
- Initialization: first, process must create window to give access to remote processes
  - + MPI\_Win\_create
- Synchronization to prevent concflicting accesses
  MPI Win fence: like a barrier
  - + MPI\_Win\_post, MPI\_Win\_start, MPI\_Win\_complete,
     MPI\_Win\_wait : like message-passing
  - MPI\_Win\_lock, MPI\_Win\_unlock: like multi-threading

# Partitioned Global Address Space Languages (PGAS)

- Higher-level abstraction: overlay a single address space on the virtual memories of the distributed machines.
- Programmers can define global data structures
  - Language eliminates details of message passing, all communication calls are generated.
  - Programmer must still distinguish between local and nonlocal data.

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# Parallel Paradigms



## Supercomputers are like Formula 1

#### Do we need ever bigger supercomputers?

- 1. Always more expensive (>  $10^8$  euro)
- 2. Enormous power consumption (price = equals to cost!)
- 3. Efficiency decreases (<5 %)
- 4. Which applications need this power?