



# **Overview of This Course**

- Part 0: Introduction
- Part 1: OpenMP for shared memory programming
  - 4 classes
- Part 2: GPU programming
  - OpenACC and CUDA
  - 4 classes
- Part 3: MPI for distributed memory programming
  - 3 classes

# **Computation on Computer Architecture**

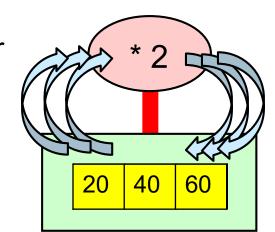


- Computation (Software) = Algorithm + Data
- Architecture (Hardware) = Processor + Memory
   Note: This is so simplified discussion

**Computer Architecture** 

Processor

Memory



**Computation Example** 

```
int a[3] = {10, 20, 30};
int i;
```

```
for (i = 0; i < 3; i++) {
a[i] = a[i] *2;
```

# What is Parallel Architecture?

- Parallel architecture has MULTIPLE components
- Two basic types:

 Shared memory parallel architecture
 Distributed memory parallel architecture

 Processor
 Image: memory parallel architecture

 Memory
 Image: memory parallel architecture

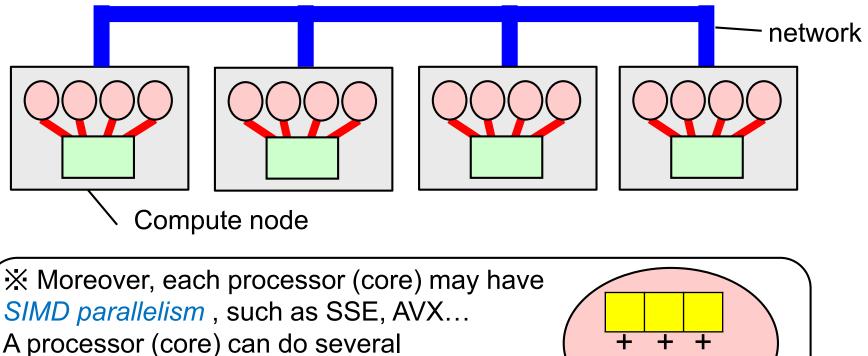
 Different programming methods are used for different architecture

# Modern SCs use Both!



Modern SCs are combination of "shared" and "distributed" "shared memory" in a node

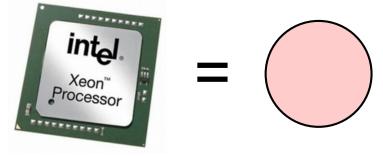
"distributed memory" among nodes, connected by network



A processor (core) can do several computations at once *SIMD is out of scope of this class* 

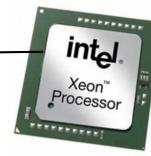
# (Confusing) Terminology

In old days, definition of "processor" was simple



• Since around 2005, "multicore processor" became popular

A processor package

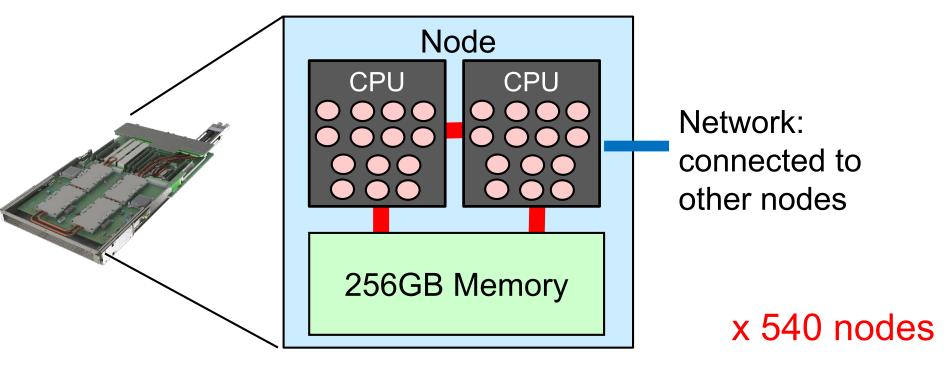


A processor core **X** *Hyperthreading* makes discussion more complex, but skipped

# **A TSUBAME3 Node**



- 2 processor packages (CPU) × 14 cores
  - 28 cores share memory

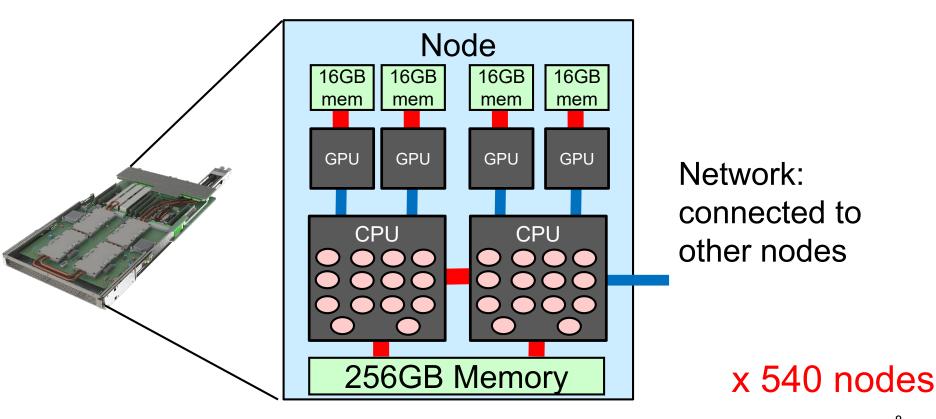


• GPUs are (still) omitted in this figure

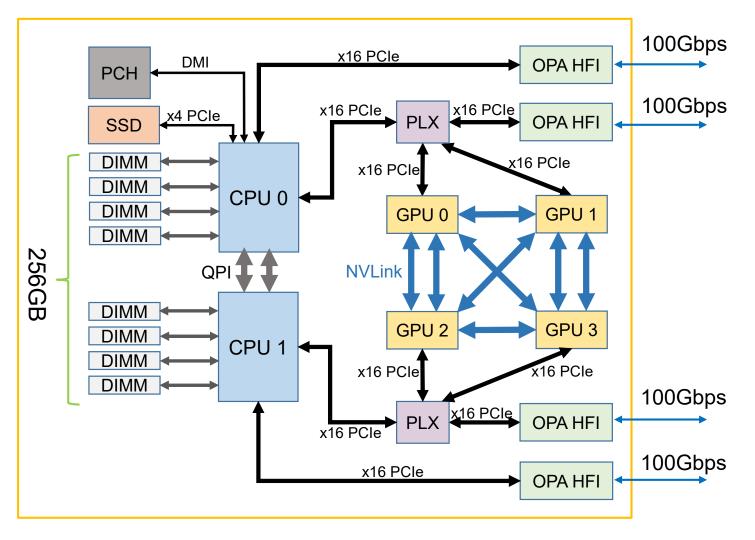
# **A TSUBAME3 Node with GPUs**

### • A node has 2 CPUs + 4 GPUs

• Each GPU (Tesla P100) has 3,584 cores



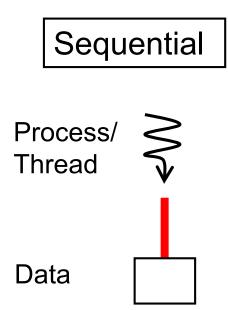
### **A TSUBAME3 Node in More Detail**



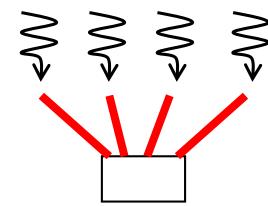


# Classification of Parallel Programming Models





Programming without parallelsim Shared memory prog. model



Distributed memory prog. model

Threads have access to shared data

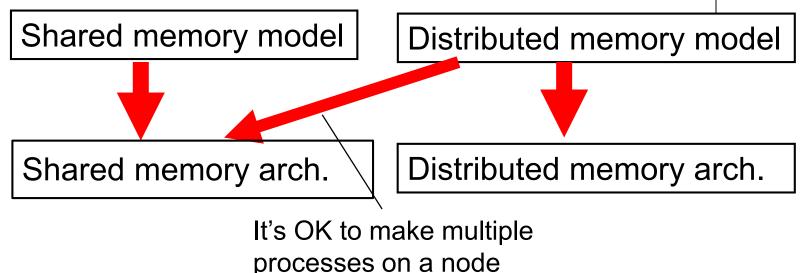
- OpenMP
- pthread
- Java thread...

Need communication among processes

- MPI
- socket
- Hadoop, Spark...

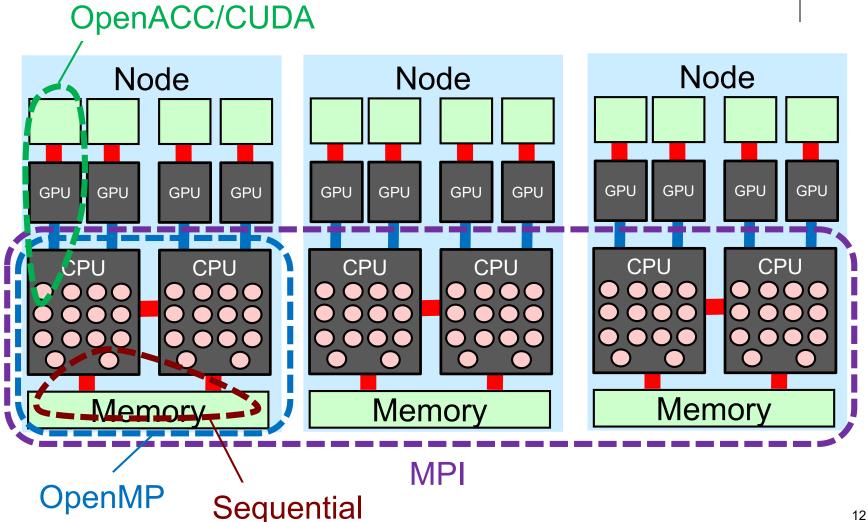
# Programming Models on Architecture





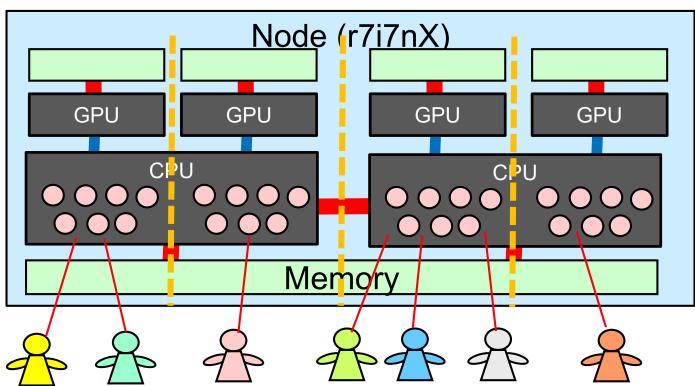
- Shared memory model (Part 1) can use only cores in a single node (up to 28 cores on TSUBAME3)
- Distributed memory model (Part 3) supports large scale parallelism (~15,000 cores on TSUBAME3)

# **Parallel Programming Methods** on **TSUBAME**



Standard route || Web-only route

# **TSUBAME Interactive Node**



A node is partitioned into 4. Each user can use

- <sup>1</sup>/<sub>4</sub> node = 7 CPU cores + 60GB memory + 1 GPU (3584cores+16GB mem)
- Only one partition simultaneously

A partition may be shared by several users  $\rightarrow$  you may suffer from slow down



# Sample Programs in this Lecture



- /gs/hs1/tga-ppcomp/20/ directory
  - You have to a member of tga-ppcomp group
  - There are sub-directories per sample
- Sequential sample programs
  - pi: approximation of pi  $(\pi)$
  - mm: matrix multiplication
  - diffusion: simple simulation of diffusion phenomena
  - fib: Fibonacci number
  - sort: quick-sort sample

# Using Sample Programs (1) Make Copies



- Samples in /gs/... are "*read-only*", so make copies of samples into somewhere in your home directory
  - Where is somewhere? If you are using web-only route, ~/t3workspace looks good
  - In the case of "mm" sample

[make sure that you are at a interactive node (r7i7nX)] cd ~/t3workspace [In web-only route] cp \_r /gs/hs1/tga-ppcomp/20/mm . \_\_\_\_\_ don't forget cd mm

# Using Sample Programs (2) Executing mm

• In the case of "mm" sample

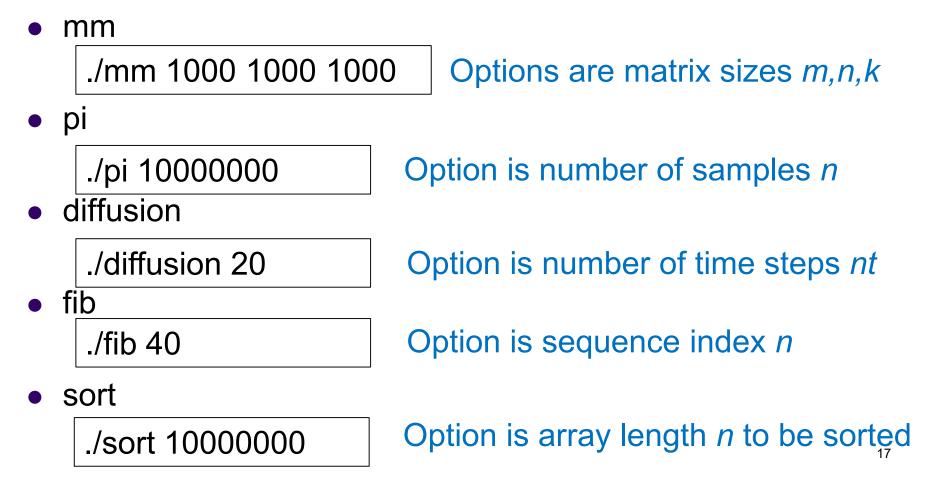
[make sure that you are at mm directory] Is [you will see 3 files of mm.c, Makefile, job.sh] make [this creates an executable file "mm"] ./mm 1000 1000 1000 [this is the execution of mm sample]



# Using Sample Programs (3) Executing Samples



Before execution, please do "copy" and "make" for each sample

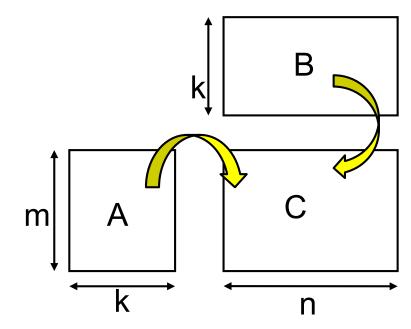


# "mm" sample: Matrix Multiply

Available at /gs/hs1/tga-ppcomp/20/mm/

A: a (m × k) matrix B: a (k × n) matrix C: a (m × n) matrix  $C \leftarrow A B$ 

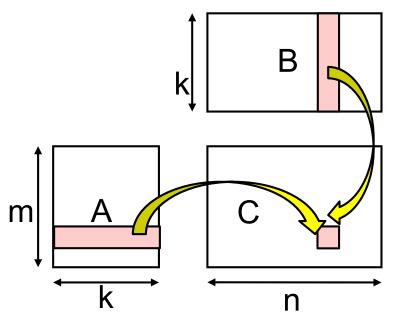
- This sample supports variable matrix sizes
- Execution: ./mm [m] [n] [k]





# Matrix Multiply Algorithm (1)





 $\boldsymbol{C}_{i,j}$  is defined as the dot product of

- A's i-th row
- B's j-th column

The algorithm uses triply-nested loop
for (i = 0; i < m; i++) {
 for (j = 0; j < n; j++) {
 for (l = 0; l < k; l++) {
 Ci,j += Ai,l \* Bl,j;
 } }</pre>

- $\leftarrow$ For each row in C
- $\leftarrow For \ each \ column \ in \ C$
- ←For dot product

# Matrix Multiply Algorithm (2)



for (i = 0; i < m; i++) { for (i = 0; i < n; i++) { for  $(| = 0; | < k; |++) \{ \leftarrow \text{For dot product} \}$ Ci,j += Ai,l \* BI,j;

 $\leftarrow$  For each row in C  $\leftarrow$ For each column in C

- The innermost statement is executed for *mnk* times
- Compute Complexity: O(mnk)
  - Computation speed (Flops) is obtained as <u>2mnk/t</u>, where t is execution time

The innermost statement includes 2 (floating point) calculations: \*, +

- [Q] What if loop order is changed?
  - Number of operations does not change. But how is the speed? 20

# Variable Length Arrays in (Classical) C Language

- double C[n]; raises an error. How do we do?
- void \*malloc(size\_t size);

 $\Rightarrow$  Allocates a memory region of *size* bytes from "heap region", and returns its head pointer

When it becomes unnecessary, it should be discarded with free() function

A fixed length array

double C[5];

··· C[i] can be used ···

A variable length array

```
double *C;
C = (double *)malloc(sizeof(double)*n);
... C[i] can be used ... array length
free(C);
```

\* Exceptionally, C99 specification includes variable length arrays 21



# How We Do for Multiple Dimensional Arrays

double C[m][n]; raises an error. How do we do? Not in a straightforward way. Instead, we do either of:

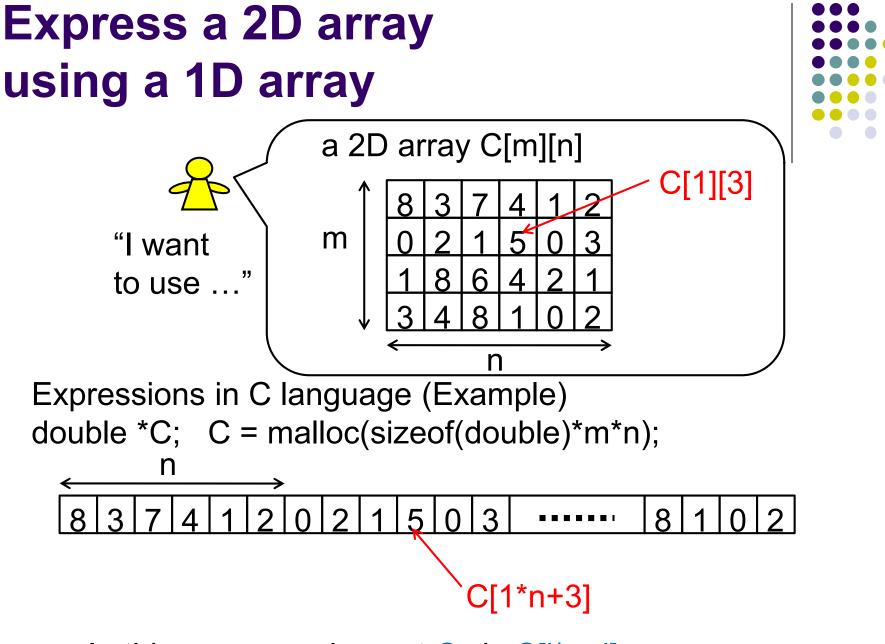
(1) Use a pointer of pointers

- We *malloc* m 1D arrays for every row (each has n length)
- We malloc 1D array of m length to store the above pointers

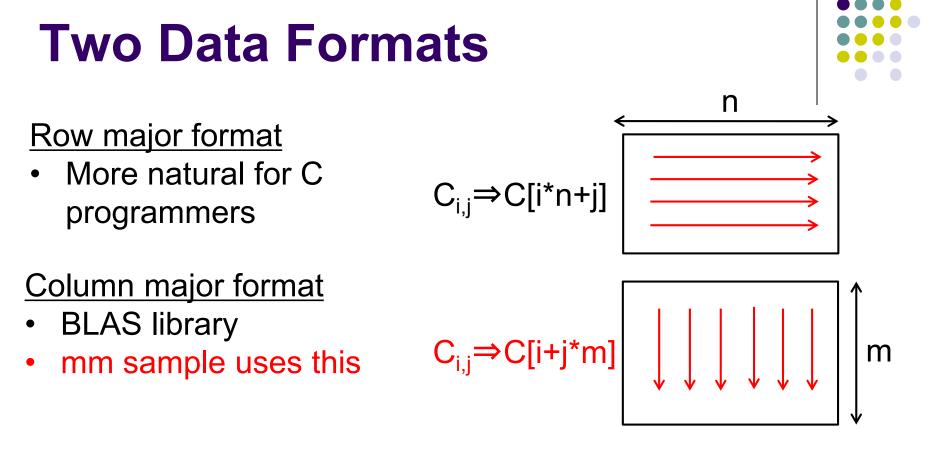
(2) Use a 1D array with length of m×n(mm sample uses this method)

 To access an array element, we should use C[i\*n+j] or C[i+j\*m], instead of C[i][j]





In this case, an element C<sub>i,i</sub> is C[i\*n+j]

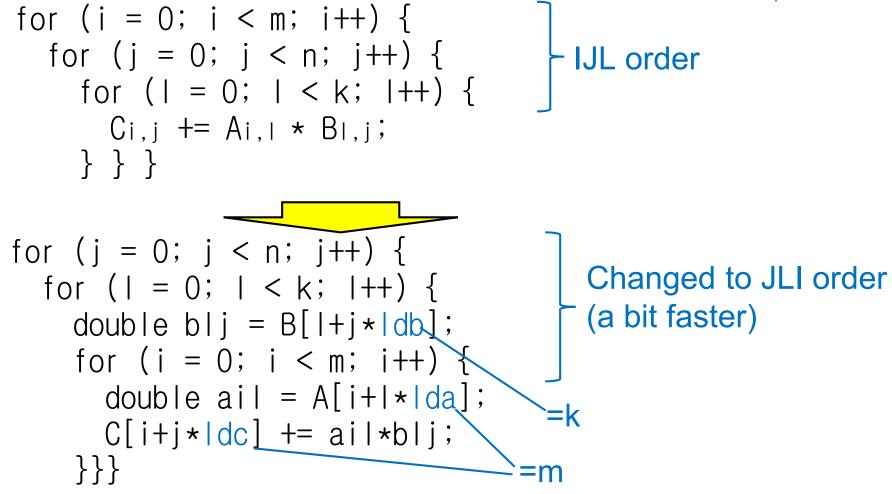


• We have more choices for 3D, 4D... arrays

[Q] Does the format affect the execution speed?



# **Actual Codes in mm Sample**



# **Time Measurement in Samples**

- gettimeofday() function is used
  - It provides wall-clock time, not CPU time
  - Time resolution is better than clock()

```
#include <stdio.h>
#include <sys/time.h>
{
   struct timeval st, et;
   long us;
   gettimeofday(&st, NULL); /* Starting time */
   •••Part for measurement •••
   gettimeofday(&et, NULL); /* Finishing time */
   us = (et.tv_sec-st.tv_sec) * 100000+
        (et.tv_usec-st.tv_usec);
   /* us is difference between st & et in microseconds */
```

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# If You Have Not Done This Yet



Please do the followings as soon as possible

- Please make your account on TSUBAME
- Please send an e-mail to ppcomp@el.gsic.titech.ac.jp

Subject: TSUBAME3 ppcomp account To: ppcomp@el.gsic.titech.ac.jp

Department name:

School year:

Name:

Your TSUBAME account name:

Then we will invite you to the TSUBAME group, please click URL and accept the invitation

その後、TSUBAMEグループへの招待を送ります。メール中のURLを クリックして参加承諾してください

# Next Class: Introduction to OpenMP

- Shared memory parallel programming API
- Extensions to C/C++, Fortran
- Includes directives& library functions
  - Directives: #pragma omp ~~

