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Programming the Cray XMT

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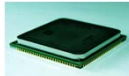
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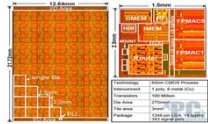
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What is parallel computing?

- ▶ Using multiple computing elements to solve a problem faster
 - Multiple systems
 - Multiple nodes
 - Multiple processors
 - Multiple cores
- ▶ Parallel computing is becoming ubiquitous due to power constraints
 - *Multiple cores rather than faster clock speeds*
- ▶ Since cores share memory and programming cores as separate computing elements is too heavy weight, **shared memory programming will become ubiquitous**



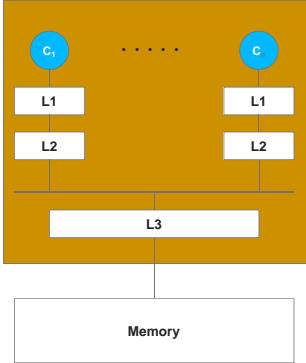
AMD Athlon X2 6400+ dual-core
en.wikipedia.org/wiki/Multi-core_processor



Intel 48-core x86 processor
www.pcpwr.com/review/Processor/Intel-Shows-48-core-x86-Processor-Single-chip-Cloud-Computer

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Shared memory



- ▶ **The Good**
 - Read and write any data item
 - No partitioning
 - No message passing
 - Reads and write performed by hardware
 - Little overhead → lower latency, higher bandwidth
- ▶ **The Bad**
 - Read and write any data item
 - *Race conditions*

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Hiding memory latencies

- ▶ Memory hierarchy
 - Reduce latency by storing some data nearby
- ▶ Vectors
 - Amortize latency by fetching *N* words at a time
- ▶ Parallelism
 - Hide latency by switching tasks
 - Can also hide other forms of latencies

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Barrel processor

- ▶ Many threads per processor core
- ▶ Thread-level context switch at every instruction cycle

COTS vs **Multithreaded**

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Multithreading

- ▶ Hide latencies via parallelism
- ▶ Maintain multiple active threads per processor, so that **gaps introduced by long latency operations in one thread are filled by instructions in other threads**

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Data parallelism

- ▶ Loop over data elements
- ▶ Work on each element in parallel
- ▶ **Best source of parallelism in almost all programs**
- ▶ Always think data parallel first

```

FOR ALL GUESTS, GUESTS[i]
FOR ALL ATOMS, ATOMS[i]
FOR ALL DOCUMENTS, LIBRARY[i]
FOR ALL NODES, GRAPH[i]
FOR ALL ELEMENTS, a[i, j] // ORDER N^2 PARALLELISM
    
```

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Simple example

```

for (i = 0; i < n; i++) {c[i] = a[i] + b[i];}
    
```

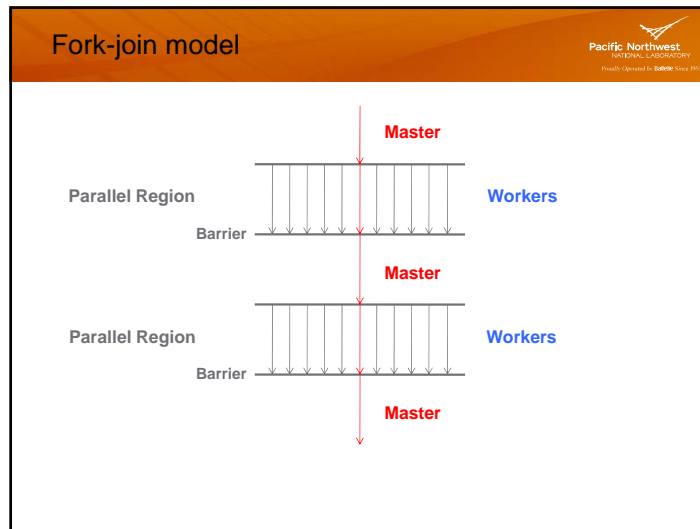
Parallel Region

Barrier

Single thread

Multiple threads

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Loops

The compiler can automatically parallelize 3 kinds of loops:

- Loops without loop-carried dependences,
- First-order linear recurrences, and
- Reductions.

This is our basic palette and we strive to express all our programs in these forms.

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Inductive Loops

Before the compiler will consider parallelizing a loop, the loop must be inductive.

- Single entrance and single exit,
- Controlled by a linear induction variable (incremented by an invariant amount each iteration), and
- Exit is controlled by comparing the induction variable against an invariant.

The key here is that the compiled code must be able to determine, a priori, how many iterations will be executed.

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Examples of for loops

```
for (i = 0; i < n; i++) b[i] = (a[i] + a[i + 1]) / 2;

for (i = 0; i < n; i*=2) b[i] = (a[i] + a[i + 1]) / 2;

for (i = 0; i < n; i++)
  if (c[i] == 0) break; else d[i] = 1.0 / c[i];

for (i = 0; i < n; i++)
  for (j = 0; j < A[i]; j++)
    B[i,j] = C[i] + D[j];
```

Which loops are legal ??

Matrix multiplication



```
void matmult(int n, int m, double **a, double **b, double **c) {
    for (int i = 0; i < n; i++) {
        for (int j = 0; j < n; j++) {
            double sum = 0.0;
            for (int k = 0; k < m; k++) sum += a[i][k] * b[k][j];
            c[i][j] = sum;
        }
    }
}
```

Check compilation



```

    |   for (int i = 0; i < n; i++) {
    |   |   for (int j = 0; j < n; j++) {
3 -- |   |   double sum = 0.0;
5 --P:$ |   |   for (int k = 0; k < m; k++) sum += a[i][k] * b[k][j];
3 -- +
** reduction moved out of 1 loop
3 SS |   |   c[i][j] = sum;
    |   |   } } }
```

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Need to use pragmas



```
void matmult(int n, int m, double **a, double **b, double **c) {
    #pragma mta assert no dependence
    for (int i = 0; i < n; i++) {
        #pragma mta assert no dependence
        for (int j = 0; j < n; j++) {
            double sum = 0.0;
            for (int k = 0; k < m; k++) sum += a[i][k] * b[k][j];
            c[i][j] = sum;
        }
    }
}
```

What you want to see



```

    |   #pragma mta assert no dependence
    |   for (int i = 0; i < n; i++) {
    |   |   #pragma mta assert no dependence
    |   |   for (int j = 0; j < n; j++) {
4 PP |   |   double sum = 0.0;
5 PP- |   |   for (int k = 0; k < m; k++) sum += a[i][k] * b[k][j];
4 PP +
4 PP |   |   c[i][j] = sum;
    |   |   } } }
```

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Loop information

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```

Loop 2 in matmult in region 1
  In parallel phase 1
  Dynamically scheduled, variable chunks, min size = 1
  Compiler generated

Loop 3 in matmult in loop 2
  Loop unrolled 1 times
  Compiler generated
  Parallel section of loop from level 1

Loop 4 in matmult at line 12 in loop 3
  Loop unrolled 2 times
  Parallel section of loop from level 2

Loop 5 in matmult at line 13 in loop 4
  Loop summary: 6 loads, 0 stores, 12 floating point operations
  6 instructions, needs 45 streams for full utilization
  pipelined
    
```

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Canal

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```

sort.cc
void counting_sort(unsigned *src, unsigned *dst, unsigned n) {
  unsigned buckets = 1 << 16;
  unsigned *start = new unsigned[buckets];
  unsigned *count = new unsigned[buckets];
  for (unsigned i = 0; i < buckets; i++)
    count[i] = 0;
  unsigned mask = 1 << 16;
  for (unsigned i = 0; i < n; i++) {
    unsigned bucket = (i >> 16) & mask;
    count[bucket]++;
  }
  start[0] = 0;
  for (unsigned i = 1; i < buckets; i++)
    start[i] = start[i - 1] + count[i - 1];
  #pragma mta assert none
  for (unsigned i = 0; i < n; i++) {
    ...
    }
  }
}
    
```

Loops

```

Loop 5 in counting_sort(unsigned int *, unsigned int *, unsigned int) at line 8 in loop 4
Loop summary: 2 memory operations, 0 floating point operations
2 instructions, needs 30 streams for full utilization
pipelined

Loop 4 in counting_sort(unsigned int *, unsigned int *, unsigned int) in region 1
in parallel phase 2
dynamically scheduled, variable chunks, min size = 8

Parallel Region 1 in counting_sort(unsigned int *, unsigned int *, unsigned int)
multiple processor implementation
requesting at least 40 streams
    
```

String: Case Sensitive Backwards Line: Loop: 18

Semantic assertions

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The various semantic assertions are used to provide information to the compiler (to make promises) about things it can't prove automatically.

```

#pragma mta assert parallel
#pragma mta assert local <variable-list>
#pragma mta assert no dependence <variable-list>
and
#pragma mta assert noalias <variable-list>
    
```

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Recurrences

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Some loops use values computed by early iterations in later iterations. These recurrences usually prevent parallelization.

The compiler recognizes first-order linear recurrences and rewrites them so they can be solved in parallel. For example:

```

for (i = 2; i < n; i++) {
  X[i] = X[i - 1] + Y[i];
}
    
```

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Nested parallelism



The compiler handles such cases by collapsing the loops, yielding code that looks something like this:

```
for (ij = 1; ij < m*n; ij++) {
    i = ij / n;
    j = ij % n;
    Y[i] = Y[i] + X[j] * A[i][j];
}
```

By using this approach, we get good parallelism whenever $m * n$ is large.

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Recursion



Recursion is a parallel programming method that can quickly saturate the machine.

XMT programming model supports *futures*

Easy and cost effective; however, each spawn must have enough work to justify the overhead.

Terminate recursion at low levels with insufficient work

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The future construct



```
future x$(i) {
    ...
    ...
    ...
}
```

- ▶ the statement purges x\$ (sets empty)
- ▶ arguments are passed by value
- ▶ enqueued and executed asynchronously in -FIFO order
- ▶ the return value is stored to x\$

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Tree search (simple)



```
struct Tree {
    Tree *llink;
    Tree *rlink;
    int data;
};

int search_tree(Tree *root, int target) {
    future int left$, right$;
    if (root == 0) return 0;

    future left$(root, target)
    { return search_tree(root->llink, target); }
    future right$(root, target)
    { return search_tree(root->rlink, target); }

    int sum = (root->data == target);
    return sum + left$ + right$;
}
```

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Tree search (better)

```

struct Tree {
    Tree *llink;
    Tree *rlink;
    int data;
};

int search_tree(Tree *root, int target) {
    future int left$;
    if (root == 0) return 0;

    future left$(root, target)
    { return search_tree(root->llink, target); }

    int right = search_tree(root->rlink, target);

    int sum = (root->data == target);
    return sum + left$ + right$;
}

```

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Tree search (best)

```

struct Tree {
    Tree *llink;
    Tree *rlink;
    int data;
};

int search_tree(Tree *root, int target) {
    future int left$;
    if (root == 0) return 0;

    future left$(root, target)
    { return search_tree(root->llink, target); }

    int right = search_tree(root->rlink, target);

    int sum = (root->data == target);
    return sum + touch(left$) + right$;
}

```

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