# Electrical Engineering and Computer Science EECS 358 - INTRODUCTION TO PARALLEL COMPUTING

Lecture 11

Dist. Mem. Message Passing Programming - II

#### **Outline**

- Message Passing Programming intermediate concepts
- Loop parallelization
- Global versus local indices
- Loop scheduling
- READING: Foster, "Design and Building of Parallel Programs," Chapter 8

#### **Review of MPI**

- MPI\_INIT: Initiate an MPI computation
- MPI\_FINALIZE: Terminate an MPI computation
- MPI\_COMM\_SIZE: Determine number of processes
- MPI\_COMM\_RANK: Determine my process identifier
- MPI\_SEND: Send a message
- MPI\_RECV: Receive a message
- MPI\_REDUCE, MPI\_GATHER, MPI\_BCAST: Collective communication

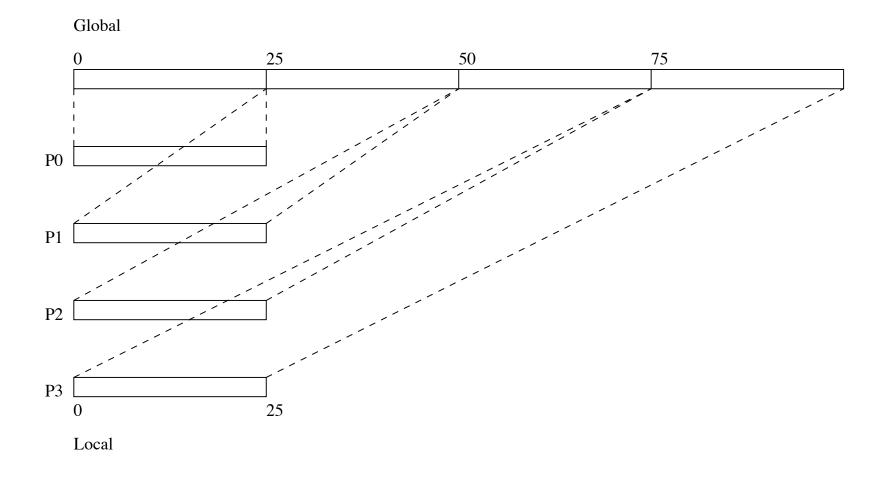
#### **Loop Parallelization**

- We will look at some simple and commonly occurring code fragments and consider schemes to parallelize them
- Techniques involve the use of:
  - Local variables to remove dependencies
  - Code transformations
  - Use of particular scheduling techniques

#### **Fully Parallel Loop**

- Data locality is important for performance
- Distributed memory machines are programmed by explicitly distributing program data when created so that each processor only operates on its local data
- For example, consider:

```
/* sequential program */
int a[100],b[100],c[100];
main()
{
  for(i=0; i < 100; i++)
    a[i] = b[i] * c[i];
}</pre>
```

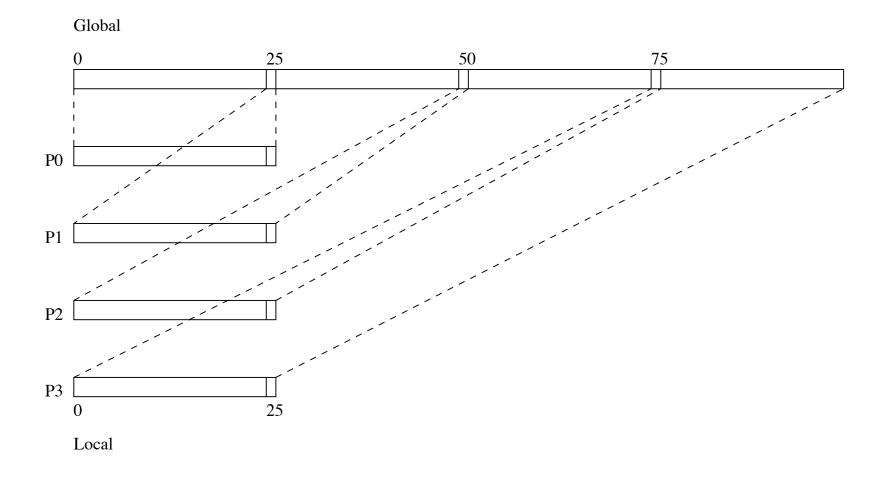


• If above were programmed on a distributed memory machine with four processors, each processor would have array elements of size 25, and they would each perform 25 iterations

```
int a[25],b[25],c[25];
main()
{
  for(i=0; i < 25; i++)
    a[i] = b[i] * c[i];
}</pre>
```

• If we were to change the example program slightly:

```
/* Sequential program */
int a[100],b[100],c[100];
main()
{
  for(i=0; i < 100; i++)
    a[i] = b[i+1] + b[i] * c[i];
}</pre>
```



• The corresponding parallel program is:

```
/* Dist memory modified program on dist data */
int a[25] b[26] c[25];
main()
{
    MPI_COMM_SIZE(MPI_COMM_WORLD, nprocs);
    MPI_COMM_RANK(MPI_COMM_WORLD,&id);
    /* all except the first processor send their first element to
        the left neighbor */
    if (id>0) MPI_SEND(&b[0], 1, MPI_FLOAT, id-1, 0, MPI_COMM_WORLD);
    /* all except the last processor recv an extra element at the end
        from the right neighbor */
    if (id<3) MPI_RECV(&b[25],1,MPI_FLOAT,id+1,0,MPI_COMM_WORLD);
    for(i=0; i < 25; i++)
        a[i] = b[i+1] + b[i] * c[i];
}</pre>
```

#### **Local Variables**

• Code fragment:

```
for (i=0;i<100;i++) {
    x=a[i]**3;
    b[i]=x*b[i];
}</pre>
```

- ullet Problem: Variable x is dependent, however dependence confined to the same iteration
- ullet Solution: Replicate x on each processor since each iteration will be completely executed by the same processor

#### **Local Variables**

```
main()
  float a[100],b[100];
  int i,p,lb,ub,id,nprocs;
  float x;
  MPI_COMM_RANK(MPI_COMM_WORLD,id);
  MPI_COMM_SIZE(MPI_COMM_WORLD, nprocs);
    if (id==0) {
    /* send appropriate portions of arrays a and b to all other processors.
       explicit copying avoided by directly acessing appropriate portion */
    for (p=1;p<nprocs;p++) {</pre>
      lb=p*100/nprocs;
      MPI_SEND(&(a[lb]), 100/nprocs, MPI_FLOAT, p, ATYPE, MPI_COMM_WORLD);
      MPI_SEND(&(b[lb]), 100/nprocs, MPI_FLOAT, p, BTYPE, MPI_COMM_WORLD);
    }
  } else {
    /* receive portion of arrays from processor 0 */
      MPI_RECV(a, 100/nprocs, MPI_FLOAT, 0, ATYPE, MPI_COMM_WORLD);
      MPI_RECV(b, 100/nprocs, MPI_FLOAT, 0, BTYPE, MPI_COMM_WORLD);
  }
```

## Local Variables (Contd)

```
/* perform portion of work */
for (i=0;i<100/nprocs;i++) {
    x=a[i]**3;
    b[i]=x*b[i];
}
if (id==0) {
    /* recv modified portion of array b from all other processors */
    for (p=1;p<nprocs;p++) {
        lb=p*100/nprocs;
        MPI_RECV(&(b[lb]), 100/nprocs, MPI_FLOAT, p, BTYPE, MPI_COMM_WORLD);
    }
} else {
    /* send modified array b to processor */
        MPI_SEND(b, 100/nprocs, MPI_FLOAT, 0, BTYPE, MPI_COMM_WORLD);
}</pre>
```

#### **Loop-Carried Values**

• Code fragment:

```
indx=0;
for (i=0;i<100;i++) {
  indx=indx + i;
  a[i]=b[indx];
}</pre>
```

- ullet Problem: The value of indx is carried over from iteration to iteration; such a variable is often called an induction variable
- ullet Solution: Substitute a closed form expression for indx in terms of the iteration counter and parallelize
- Note that we can replicate b to avoid complex packing and unpacking routines (indx) is non-linear)

#### **Loop-Carried Values**

```
main()
{
  float a[100],b[10000];
  int i,i1,id,nprocs,p,lb;
  MPI_COMM_RANK(MPI_COMM_WORLD,id);
  MPI_COMM_SIZE(MPI_COMM_WORLD, nprocs);
  if (id==0) {
    /* send copies of b to all other processors */
    for (p=1;p<nprocs;p++) {</pre>
     MPI_SEND(&b, 10000, MPI_FLOAT, p, BTYPE, MPI_COMM_WORLD);
    }
  } else {
    /* recv a copy of b from processor 0 */
     MPI_RECV(&b, 10000, MPI_FLOAT, 0, BTYPE, MPI_COMM_WORLD);
  }
  offset=id*(100/nprocs);
  /* perform portion of work */
  for (i=0;i<100/nprocs;i++) {
    i1=i+offset;
```

## **Loop-Carried Values (Contd)**

```
indx=((i1*(i1+1))/2;
a[i]=b[indx];
}

if (id==0) {
    /* recv modified portion of array a from all other processors */
    for (p=1;p<nprocs;p++) {
        lb=p*100/nprocs;
        MPI_RECV(&(a[lb]), 100/nprocs, MPI_FLOAT, p, ATYPE, MPI_COMM_WORLD);
    }
} else {
    /* send modified array a to processor 0 */
        MPI_SEND(a, 100/nprocs, MPI_FLOAT, 0, ATYPE, MPI_COMM_WORLD);
}</pre>
```

#### **Sum Reduction**

• Code fragment:

```
total=0.0
for(i=0;i<100;i++) {
  total= total + a[i];
}</pre>
```

- Problem: Value of total is carried over from iteration to iteration
- $\bullet$  Solution: Create local  $sub\_total$  variables for each processor and do a global sum at the end

#### **Sum Reduction**

```
main()
  float a[100],total;
  int i,id,nprocs,p,lb;
  float sub_total;
  MPI_COMM_RANK(MPI_COMM_WORLD,id);
  MPI_COMM_SIZE(MPI_COMM_WORLD, nprocs);
  if (id==0) {
    total=0.0;
    /* send appropriate portions of array a to all other processors */
    for (p=1;p<nprocs;p++) {</pre>
      lb=p*100/nprocs;
      MPI_SEND(&(a[lb]), 100/nprocs, MPI_FLOAT, p, ATYPE, MPI_COMM_WORLD);
  } else {
    /* receive portion of arrays from processor 0 */
     MPI_RECV(&a, 100/nprocs, MPI_FLOAT, 0, ATYPE, MPI_COMM_WORLD);
  }
```

# **Sum Reduction (Contd)**

```
/* perform portion of reduction */
sub_total=0.0;
for (i=0;i<100/nprocs;i++) {
   sub_total= sub_total + a[i];
}
MPI_REDUCE(&sub_total, &total, 1, TTYPE, MPI_SUM, 0, MPI_COMM_WORLD);
}</pre>
```

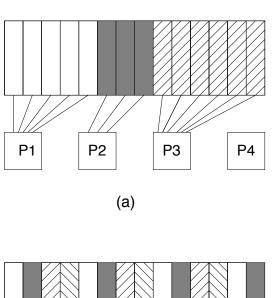
#### **Loop Scheduling**

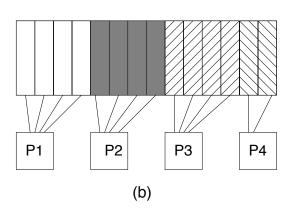
• We will now look at scheduling code for following loop

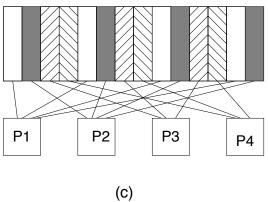
```
for (i=0; i < 100; i++) {
   a[i] = b[i] * c[i];
}</pre>
```

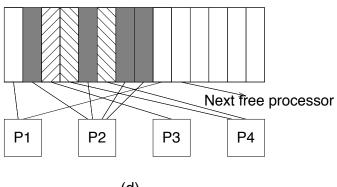
- Prescheduling
- Static Blocked Scheduling
- Static Interleaved Scheduling
- Dynamic Scheduling

## **Loop Scheduling**









#### Prescheduling

```
MPI_INIT();
MPI_COMM_RANK(comm,id);
if (id == 0) {
    /* compute iterations 0 to 29 itself */
    for (i=0; i < 30; i++) {
        a[i] = b[i] * c[i];
    }

    /* send data for iterations 30 to 69 to node 1 */
    MPI_SEND(&b[30], 40, MPI_INT, 1, BTYPE, MPI_COMM_WORLD);
    MPI_SEND(&c[30], 40, MPI_INT, 1, CTYPE, MPI_COMM_WORLD);

    /* send data for iterations 70 to 99 to node 2 */
    MPI_SEND(&b[70], 30, MPI_INT, 2, BTYPE, MPI_COMM_WORLD);
    MPI_SEND(&c[70], 30, MPI_INT, 2, CTYPE, MPI_COMM_WORLD);</pre>
```

## Prescheduling (Contd)

```
/* receives result for iterations 30 to 69 from node 1 */
MPI_RECV(&a[30], 40, MPI_INT, 1, ATYPE, MPI_COMM_WORLD);

/* receive result for iterations 70 to 99 from node 2 */
MPI_RECV(&a[70], 30, MPI_INT, 2, ATYPE, MPI_COMM_WORLD);

}

if (id == 1) {
    /* node 1 receives data for iterations 30-69 from node 0 */
    MPI_RECV(&b, 40, MPI_INT, 0, BTYPE, MPI_COMM_WORLD);
    MPI_RECV(&c, 40, MPI_INT, 0, CTYPE, MPI_COMM_WORLD);
    for(i=0;i <40; i++) {
        a[i] = b[i] * c[i];
    }

/* node 1 sends result for iterations 30-69 to node 0 */
    MPI_SEND(&a, 40, MPI_INT, 0, ATYPE, MPI_COMM_WORLD);
}</pre>
```

## Prescheduling (Contd)

```
if (id == 2) {
  /* node 2 receives data for iterations 70-99 from node 0 */
    MPI_RECV(&b, 30, MPI_INT, 0, BTYPE, MPI_COMM_WORLD);
    MPI_RECV(&c, 30, MPI_INT, 0, CTYPE, MPI_COMM_WORLD);
    for(i=0;i < 30; i++) {
        a[i] = b[i] * c[i];
    }
    /* node 2 sends result for iterations 70-99 to node 0 */
        MPI_SEND(&a, 30, MPI_INT, 0, ATYPE, MPI_COMM_WORLD);
    }
}</pre>
```

#### Static Blocked Scheduling

```
MPI_COMM_RANK(MPI_COMM_WORLD,id);
MPI_COMM_SIZE(MPI_COMM_WORLD,nprocs);

if (id == 0) {
    /* compute iterations 0 to (100/nprocs) itself */
    for (i=0; 100/nprocs; i++) {
        a[i] = b[i] * c[i];
    }

for (p=1; p <= nprocs; p++) {
    /* send iterations lb to ub to to node p */
    lb = p * 100 / nprocs;
    ub = (p +1) * 100 / nprocs;

    MPI_SEND(&b[lb], 100/nprocs, MPI_INT, p, BTYPE, MPI_COMM_WORLD);
    MPI_SEND(&c[lb], 100/nprocs, MPI_INT, p, CTYPE, MPI_COMM_WORLD);
} /* for (p=1.. */</pre>
```

#### Static Blocked Scheduling

```
for (p=1; p <= nprocs; p++) {</pre>
      /* compute lower and upper bounds of iterations */
      lb = p * 100 / nprocs;
      ub = (p+1) * 100 / nprocs;
      MPI_RECV(&a[lb], 100/nprocs, MPI_INT, p, ATYPE, MPI_COMM_WORLD);
   }
  else {
     /* (id != 0 */
      MPI_RECV(&b, 100/nprocs, MPI_INT, 0, BTYPE, MPI_COMM_WORLD);
      MPI_RECV(&c, 100/nprocs, MPI_INT, 0, CTYPE, MPI_COMM_WORLD);
      for(i=0;i <100/nprocs; i++) {
         a[i] = b[i] * c[i];
      }
      MPI_SEND(&a, 100/nprocs, MPI_INT, 0, ATYPE, MPI_COMM_WORLD);
}
```

#### Alternate Form: Static Blocked Scheduling

```
MPI_COMM_RANK(MPI_COMM_WORLD,id);
MPI_COMM_SIZE(MPI_COMM_WORLD,nprocs);

/* Scatter the values of arrays b and c to various processors */
MPI_SCATTER(&b,100/nprocs,MPI_INT,&btmp,100/nprocs,MPI_INT,0,MPI_COMM_WORLD);
MPI_SCATTER(&c,100/nprocs,MPI_INT,&ctmp,100/nprocs,MPI_INT,0,MPI_COMM_WORLD);
/* compute iterations 0 to (100/nprocs) itself */
for (i=0; 100/nprocs; i++) {
    atmp[i] = btmp[i] * ctmp[i];
}
MPI_GATHER(&atmp,100/nprocs,MPI_INT,&a,100/nprocs,MPI_INT,0,MPI_COMM_WORLD);
```

#### **Dynamic Scheduling**

#### **Dynamic Scheduling**

```
lb = global_i;
ub = global_i + chunk;
global_i = global_i + chunk;

/* send work to processor p */
    MPI_SEND(&b[lb], chunk, MPI_INT, p, BTYPE, MPI_COMM_WORLD);
    MPI_SEND(&c[lb], chunk, MPI_INT, p, CTYPE, MPI_COMM_WORLD);

    /* get result back from processor p */
    MPI_RECV(&a[lb], chunk, MPI_INT, p, ATYPE1, MPI_COMM_WORLD);
}
```

#### **Dynamic Scheduling**

```
else {
     /* (id != 0) */
     thereiswork = TRUE;
     while (thereiswork) {
        /* find from node 0 if there is work left */
        MPI_RECV(&thereiswork, 1, MPI_INT, 0, TERMTYPE, MPI_COMM_WORLD);
        /* receive work, perform work, and send result */
        MPI_RECV(&b, chunk, MPI_INT, 0, BTYPE, MPI_COMM_WORLD);
        MPI_RECV(&c, chunk, MPI_INT, 0, CTYPE, MPI_COMM_WORLD);
        for(i=0;i < chunk; i++)</pre>
           a[i] = b[i] * c[i];
        MPI_SEND(&a, chunk, MPI_INT, 0, ATYPE1, MPI_COMM_WORLD);
```

#### **Summary**

- Message Passing Programming intermediate concepts
- Loop parallelization
- Global versus local indices
- Loop scheduling
- NEXT LECTURE: Dist. Memory Message Passing Prog. III: Intermediate MPI Concepts and Examples
- READING: Foster, "Design and Building of Parallel Programs", Chapter 8