

OpenMP Parallel Programming for Multicore processors and GPU

Mitsuhisa Sato RIKEN R-CCS and University of Tsukuba

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Agenda

- Trends of Multicore processor
- What's OpenMP
- Advanced topics
 - MPI/OpenMP Hybrid Programming
 - Programming for Multi-core cluster
 - OpenMP 3.0 (2007, approved)
 - Task parallelism
 - OpenACC (2012)
 - For GPU, by NVIDIA, PGI, Cray, ...
 - OpenMP 4.0 (2013, released)
 - Accelerator extension
 - SIMD extension
 - Task dependency description

How to make computer fast?

Computer became faster and faster by



Trends of Mulitcore processors

- Faster clock speed, and Finer silicon technology
 - "now clock freq is 3GHz, in future it will reach to 10GHz!?"
 - Intel changed their strategy -> multicore!
 - Clock never become faster any more
 - Silicon technology 45 nm -> 7 nm in near future!

Good news & bad news!

- Progress in Computer Architecture
 - Superpipeline, super scalar, VLIW ...
 - Multi-level cache, L3 cache even in microprocessor
 - Multi-thread architecture, Intel Hyperthreading
 - Shared by multiple threads
 - Multi-core: multiple CPU core on one chip dai

Programming support is required

Inetl ® Pentium® processor Dai of Extreme-edition





Multi-core processor: Solution of Low power by parallel processing



- Progress in silicon technology 130nm \Rightarrow 90nm \Rightarrow 65nm,22nm (Decrease **C** and **V**)
- Use a silicon process for low power (embedded processor) (Small a)
- Performance improvement by Multi-core (N=2~16)
 - Number of transistors are increasing by "Moore's Law"
- Parallel processing by low power processor



Solution by multi-core processors for High performance embedded system

Highly Parallel Performance Intel[®] Many Integrated Core (Intel[®] MIC) Architecture



A Step Forward In Dealing With Efficient Performance & Programmability Why parallelization needs? 4 times speedup by using 4 cores!



Overhead of parallel execution



Shared memory multi-processor system



Multiple CPUs share main memory

Threads executed in each core(CPU) communicate with each other by accessing shared data in main memory.

 Enterprise Server
 SMP Multi-core processors

Distributed memory multi-processor



- System with several computer of CPU and memory, connected by network.
- Thread executed in each computer communicate with each other by exchanging data (message) via network.夕

PC ClusterAMP Multi-core processor

Very simple example of parallel computing for high performance



Parallel programming model

- Message passing programming model
 - Parallel programming by exchange data (message) between processors (nodes)
 - Mainly for distributed memory system (possible also for shared memory)
 - Program must control the data transfer explicitly.
 - Programming is sometimes difficult and time-consuming
 - Program may be scalable (when increasing number of Proc)
- Shared memory programming model
 - Parallel programming by accessing shared data in memory.
 - Mainly for shared memory system. (can be supported by software distributed shared memory)
 - System moves shared data between nodes (by sharing)
 - Easy to program, based on sequential version
 - Scalability is limited. Medium scale multiprocessors.

Parallel programming models

- There are numerous parallel programming models
- The ones most well-known are:
 - Distributed Memory
 - Sockets (standardized, low level)
 - PVM Parallel Virtual Machine (obsolete)³
 - 🕨 🗸 MPI Message Passing Interface (de-facto sta)
 - Shared Memory

Posix Threads (standardized, low level)

- v OpenMP (de-facto standard)
 - Automatic Parallelization (compiler does it for you)

Multithread(ed) programming

- Basic model for shared memory
- Thread of execution = abstraction of execution in processors.
 - Different from process
 - Procss = thread + memory space
 - POSIX thread library = pthread



POSIX thread library

- Create thread: thread_create
- Join threads: pthread_join
- Synchronization, lock



#include <pthread.h>

```
void func1( int x ); void func2( int x );
```

```
main() {
      pthread_t t1;
      pthread t t2;
        pthread_create( &t1, NULL,
                       (void *)func1, (void *)1);
        pthread_create( &t2, NULL,
                      (void *)func2, (void *)2);
        printf("main()¥n");
        pthread_join( t1, NULL );
        pthread join(t2, NULL);
void func1( int x ) {
    int i :
     for(i = 0; i < 3; i + +) {
          printf("func1( %d ): %d ¥n",x, i );
void func2( int x ) {
          printf("func2( %d ): %d ¥n",x);
```

Programming using POSIX thread

Create threads

- Divide and assign iterations of loop
- Synchronization for sum

```
Pthread, Solaris thread
                                 int s; /* global */
for(t=1;t<n_thd;t++) \{
                                 int n thd; /* number of threads */
  r=pthread create(thd main,t)
                                 int thd_main(int id)
                                   int c,b,e,i,ss;
thd main(0);
                                   c=1000/n thd;
for(t=1; t<n thd;t++)</pre>
                                   b=c*id;
      pthread_join();
                                   e=s+c;
                                   ss=0;
                                   for(i=b; i<e; i++) ss += a[i];</pre>
  Thread =
                                   pthread lock();
  Execution of program
                                   s += ss;
                                   pthread unlock();
                                   return s;
```

Message passing programming

- General programming paradigm for distributed memory system.
 - Data exchange by "send" and "receive"
- Communication library, layer
 - POSIX IPC, socket
 - TIPC (Transparent Interprocess Communication)
 - LINX (on Enea's OSE Operating System)
 - MCAPI (Multicore Communication API)
 - MPI (Message Passing Interface)



Simple example of Message Passing Programming

Sum up 1000 element in array

```
int a[250]; /* 250 elements are allocated in each node */
```

```
main(){ /* start main in each node */
   int i,s,ss;
   s=0;
   for(i=0; i<250;i++) s+= a[i]; /*compute local sum*/
   if(myid == 0){ /* if processor 0 */
      for(proc=1;proc<4; proc++){</pre>
         recv(&ss,proc); /* receive data from others*/
         s+=ss; /*add local sum to sum*/
   } else { /* if processor 1,2,3 */
      send(s,0); /* send local sum to processor 0 */
   }
```

Parallel programming using MPI

- MPI (Message Passing Interface)
- Mainly, for High performance scientific computing
- Standard library for message passing parallel programming in high-end distributed memory systems.
 - Required in case of system with more than 100 nodes.
 - Not easy and time-consuming work
 - "assembly programming" in distributed programming

Over-specs for Embedded system Programming?!

- Communication with message
 - Send/Receive
- Collective operations
 - Reduce/Bcast
 - Gather/Scatter



Programming in MPI

```
#include "mpi.h"
#include <stdio.h>
#define MY_TAG 100
double A[1000/N PE];
int main( int argc, char *argv[])
{
                      int n, myid, numprocs, i;
                      double sum, x;
                      int namelen;
                      char processor name[MPI MAX PROCESSOR NAME];
                      MPI Status status;
                      MPI Init(&argc,&argv);
                      MPI_Comm_size(MPI_COMM_WORLD,&numprocs);
                      MPI Comm rank(MPI COMM WORLD, & myid);
                      MPI Get processor name(processor name, & namelen);
                      fprintf(stderr,"Process %d on %s\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\functions\function
```

. . . .

Programming in MPI

```
sum = 0.0;
for (i = 0; i < 1000/N_PE; i++){
  sum + = A[i];
}
if(myid == 0){
  for(i = 1; i < numprocs; i++){</pre>
      MPI Recv(&t,1,MPI_DOUBLE,i,MY_TAG,MPI_COMM_WORLD,&status
       sum += t;
} else
       MPI_Send(&t,1,MPI_DOUBLE,0,MY_TAG,MPI_COMM_WORLD);
/* MPI_Reduce(&sum, &sum, 1, MPI_DOUBLE, MPI_SUM, 0, MPI_COMM
MPI Barrier(MPI COMM WORLD);
. . .
MPI Finalize();
return 0;
```

What's OpenMP?

- Programming model and API for shared memory parallel programming
 - It is not a brand-new language.
 - Base-languages(Fortran/C/C++) are extended for parallel programming by directives.
 - Main target area is scientific application.
 - Getting popular as a programming model for shared memory processors as multi-processor and multi-core processor appears.
- OpenMP Architecture Review Board (ARB) decides spec.
 - Initial members were from ISV compiler venders in US.
 - Oct. 1997 Fortran ver.1.0 API
 - Oct. 1998 C/C++ ver.1.0 API
 - Latest version, OpenMP 4.5

```
http://www.openmp.org/
```



Programming using POSIX thread

Create threads

- Divide and assign iterations of loop
- Synchronization for sum

```
Pthread, Solaris thread
                                 int s; /* global */
for(t=1;t<n_thd;t++) \{
                                 int n thd; /* number of threads */
  r=pthread create(thd main,t)
                                 int thd_main(int id)
                                   int c,b,e,i,ss;
thd main(0);
                                   c=1000/n thd;
for(t=1; t<n thd;t++)</pre>
                                   b=c*id;
      pthread_join();
                                   e=s+c;
                                   ss=0;
                                   for(i=b; i<e; i++) ss += a[i];</pre>
  Thread =
                                   pthread lock();
  Execution of program
                                   S += SS;
                                   pthread unlock();
                                   return s;
```

Programming in OpenMP

これだけで、OK!

#pragma omp parallel for reduction(+:s)
for(i=0; i<1000;i++) s+= a[i];</pre>

OpenMP API

- It is not a new language!
 - Base languages are extended by compiler directives/pragma, runtime library, environment variable.
 - Base languages: Fortran 90, C, C++
 - Fortran: directive line starting with !\$OMP
 - C: directive by #pragma omp
- Different from automatic parallelization
 - OpenMP parallel execution model is defined explicitly by a programmer.
- If directives are ignored (removed), the OpenMP program can be executed as a sequential program
 - Can be parallelized in incrementally
 - Practical approach with respect to program development and debugging.
 - Can be maintained as a same source program for both sequential and parallel version.

OpenMP Execution model

- Start from sequential execution
- Fork-join Model
- parallel region







Parallel Region

A code region executed in parallel by multiple threads (team)

- Specified by Parallel constructs
- A set of threads executing the same parallel region is called "team"
- Threads in team execute the same code in region (duplicated execution)

```
#pragma omp parallel
{
    ...
    ...
    Parallel region...
}
```

Demo

- How many threads? /proc/cpuinfo
- gcc –fopenmp, gcc suppots OpenMP from versio、4.2, gfortran
- You can specify the number of threads by environment variable OMP_NUM_THREADS

```
#include <omp.h>
#include <stdio.h>
```

```
main()
{
    printf("omp-test ... n_thread=%d¥n",omp_get_max_threads());
#pragma omp parallel
    {
        printf("thread (%d/%d)...¥n",
            omp_get_thread_num(),omp_get_num_threads());
    }
    printf("end...¥n");
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```

Work sharing Constructs

- Specify how to share the execution within a team
 - Used in parallel region
 - for Construct
 - Assign iterations for each threads
 - For data parallel program
 - Sections Construct
 - Execute each section by different threads
 - For task-parallelism
 - Single Construct
 - Execute statements by only one thread
 - Combined Construct with parallel directive
 - parallel for Construct
 - parallel sections Construct



For Construct

- Execute iterations specified For-loop in parallel
- For-loop specified by the directive must be in <u>canonical shape</u>

#pragma omp for [clause...]
for(var=lb; var logical-op ub; incr-expr)
body

- Var must be loop variable of integer or pointer(automatically private)
- incr-expr
 - ++ Var, Var++, -- Var, Var--, Var+= incr, Var-= incr
- logical-op
 - <, <=, >, >=
- Jump to ouside loop or break are not allows
- Scheduling method and data attributes are specified in *clause*

Example: matrix-vector product



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The performance looks like ...



Scheduling methods of parallel loop

• # processor = 4



Static scheduling



Cyclic & dynamic scheduling

#time/iteration #time/iteration proc0 proc1 proc2 proc3 proc0 proc1 proc? Proc? #iteration #iteration

Data scope attribute clause

- Clause specified with parallelconsruct, work sharing construct
- shared(var_list)
 - Specified variables are shared among threads.
- private(var_list)
 - Specified variables replicated as a private variable
- firstprivate(var_list)
 - Same as private, but initialized by value before loop.
- lastprivate(var_list)
 - Same as private, but the value after loop is updated by the value of the last iteration.
- reduction(op:var_list)
 - Specify the value of variables computed by reduction operation op.
 - Private during execution of loop, and updated at the end of loop



reduction clause

- The syntax of the reduction clause is as follows:
 reduction (operator : list)
- a private copy is created in each implicit task.
- After the end of the region, it is updated with the private copies using the specified operator.

#pragma omp parallel for reduction(+:t)



Operator	Initial value	Operator	Initial value
+	0	&	~0
*	1		0

Example of loop construct

```
#include <stdio.h>
#include <math.h>
double f( double a )
                                                                               \pi = \int_0^1 \frac{4}{1+t^2} dt
{
     return (4.0 / (1.0 + a^*a));
}
int main( int argc, char *argv[])
{
     int n. l. thd:
     double PI25DT = 3.141592653589793238462643;
     double pi, h, sum, x;
     n = atoi(argv[1]); thd = atoi(argv[2]);
     h = 1.0 / (double) n;
     sum = 0.0;
#pragma omp parallel for private(x) reduction(+:sum) num_threads(thd)
     for (i = 1; i \le n; i++) {
       x = h^* ((double) i - 0.5);
        sum += f(x):
     }
     pi = h * sum;
     printf("pi=%.16f, Error=%.16, n=%d, thd=%df¥n", pi, fabs(pi - PI25DT), n, thd);
     return 0;
}
```

Barrier directive

- Sync team by barrier synchronization
 - Wait until all threads in the team reached to the barrier point.
 - Memory write operation to shared memory is completed (flush) at the barrier point.
 - Implicit barrier operation is performed at the end of parallel region, work sharing construct without nowait clause

#pragma omp barrier

You cannot parallelize this loop



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Barrier directive

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 - Wait until all threads in the team reached to the barrier point.
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Barrier is important in this case



You don't need to put barrier directive Because for directive without nowait performs implicit barrier.

How to use nowait



Other directives

- Single construct: to specify a region executed by one thread.
- Master construct: to specify a region executed by master thread.
- Section construct: to specify regions executed by different threads (task parallelism)
- Critical construct: to specify critical region executed exclusively between threads
- Flush construct
- Threadprivate construct

Example of OpenMP program: laplace

- Explicit solver of Laplace equation
 - Stencil operation: update value with 4-points of up/down/left/right.
 - Use array of "old" and "new". Compute new by old and replace old with new.
 - Typical parallelization by domain decomposition
 - At each iteration, compute residual

- OpenMP version: lap.c
 - Parallelize 3 loops
 - OpenMP support only loop parallelization of outer loop.
 - For loop directive is orphan, in dynamic extent of parallel directive.



```
void lap solve()
{
    int x,y,k;
    double sum;
#pragma omp parallel private(k,x,y)
ł
    for(k = 0; k < NITER; k++){</pre>
         /* old <- new */
#pragma omp for
         for(x = 1; x \le XSIZE; x++)
           for(y = 1; y \le YSIZE; y++)
             uu[x][y] = u[x][y];
         /* update */
#pragma omp for
         for(x = 1; x \le XSIZE; x++)
           for(y = 1; y <= YSIZE; y++)</pre>
             u[x][y] = (uu[x-1][y] + uu[x+1][y] + uu[x][y-1] + uu[x][y+1])/4.0;
    }
 }
/* check sum */
    sum = 0.0;
#pragma omp parallel for private(y) reduction(+:sum)
    for(x = 1; x \le XSIZE; x++)
         for(y = 1; y \le YSIZE; y++)
           sum += (uu[x][y]-u[x][y]);
    printf("sum = %g¥n",sum);
}
```

What about performance?

- OpenMP really speedup my problem?!
- It depends on hardware and problem size/characteristics
- Esp. problem sizes is an very important factor
 - Trade off between overhead of parallelization and grain size of parallel execution.
- To understand performance, ...
 - How to lock
 - How to exploit cache
 - Memory bandwidth

Advanced topics

- MPI/OpenMP Hybrid Programming
 Programming for Multi-core cluster
- OpenMP 3.0 (2007, approved)
 - Task parallelism
- OpenACC (2012)
 - For GPU, by NVIDIA, PGI, Cray, …
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OpenACC

- A spin-off activity from OpenMP ARB for supporting accelerators such as GPGPU and MIC
- NVIDIA, Cray Inc., the Portland Group (PGI), and CAPS enterprise
- Directive to specify the code offloaded to GPU.



A simple example

	direction	сору	copyin	copyout
	Llast , davias	\bigcirc	\frown	
#define N 1024	HOST->device	0	0	
<pre>int main(){</pre>	Device->Host	0		0
int i;				
int a[N], b[N],c[N];		1		
<pre>#pragma acc data copyin(a,b) {</pre>	copyout(c)	nost	ċ	levice
<pre>#pragma acc parallel</pre>			·>	1
{ #pragma acc loop		CC	py a,b	
for(i = 0; i < N; i++){				
c[i] = a[i] + b[i];				
} }				
} }		← -	сору с	\checkmark

 \mathbf{J}

A simple example



Matrix Multiply in OpenACC

```
#define N 1024
void main(void)
{
  double a[N][N], b[N][N], c[N][N];
  int i,j;
  // ... setup data ...
#pragma acc parallel loop copyin(a, b) copyout(c)
  for(i = 0; i < N; i++)
#pragma acc loop
    for(j = 0; j < N; j++){</pre>
      int k;
      double sum = 0.0;
      for (k = 0; k < N; k++)
       sum += a[i][k] * b[k][j];
      }
      c[i][j] = sum;
    }
  }
```

Stencil Code (Laplace Solver) in OpenACC

```
#define XSIZE 1024
   #define YSIZE 1024
   #define ITER 100
   int main(void){
     int x, y, iter;
     double u[XSIZE][YSIZE], uu[XSIZE][YSIZE];
     // setup ...
   #pragma acc data copy(u, uu)
       for(iter = 0; iter < ITER; iter++){</pre>
         //old <- new
   #pragma acc parallel loop
         for(x = 1; x < XSIZE-1; x++){</pre>
   #pragma acc loop
            for(y = 1; y < YSIZE-1; y++)
              uu[x][y] = u[x][y];
         //update
   #pragma acc parallel loop
         for(x = 1; x < XSIZE-1; x++)
   #pragma acc loop
            for(y = 1; y < YSIZE-1; y++)
                u[x][y] = (uu[x-1][y] + uu[x+1][y])
                             + uu[x][y-1] + uu[x][y+1]) / 4.0;
         }}
     } //acc data end
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```

Performance of OpenACC code

exec time

matrix multiply



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Performance of OpenACC code



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OpenMP 4.0

- Released July 2013
 - http://www.openmp.org/mp-documents/OpenMP4.0.0.pdf
 - A document of examples is expected to release soon
- Changes from 3.1 to 4.0 (Appendix E.1):
 - Accelerator: 2.9
 - SIMD extensions: 2.8
 - Places and thread affinity: 2.5.2, 4.5
 - Taskgroup and dependent tasks: 2.12.5, 2.11
 - Error handling: 2.13
 - User-defined reductions: 2.15
 - Sequentially consistent atomics: 2.12.6
 - Fortran 2003 support

Accelerator (2.9): offloading

- Execution Model: Offload data and code to accelerator
- *target* construct creates tasks to be executed by devices
- Aims to work with wide variety of accs
 - GPGPUs, MIC, DSP, FPGA, etc
 - A target could be even a remote node, intentionally





Accelerator: explicit data mapping

- Relatively small number of truly shared memory accelerators so far
- Require the user to explicitly *map* data to and from the device memory
- Use array region

```
long a = 0x858;
long b = 0;
int anArray[100]
```

```
#pragma omp target data map(to:a)
¥
map(tofrom:b,anArray[0:64])
{
    /* a, b and anArray are mapped
    * to the device */
    /* work here */
}
/* b and anArray are mapped
```

```
* back to the host */
```

Accelerator: hierarchical parallelism

Organize massive number of threads

- teams of threads, e.g. map to CUDA grid/block
- Distribute loops over teams

```
#pragma omp target
#pragma omp teams num_teams(2)
        num threads(8)
{
   //-- creates a "league" of teams
  //-- only local barriers permitted
#pragma omp distribute
for (int i=0; i<N; i++) {
}
```



target and map examples

```
void vec mult(int N)
{
   int i;
   float p[N], v1[N], v2[N];
   init(v1, v2, N);
   #pragma omp target map(to: v1, v2) map(from: p)
   #pragma omp parallel for
   for (i=0; i<N; i++)</pre>
     p[i] = v1[i] * v2[i];
   output(p, N);
void vec mult(float *p, float *v1, float *v2, int N)
Ł
   int i;
   init(v1, v2, N);
   #pragma omp target map(to: v1[0:N], v2[:N]) map(from: p[0:N])
   #pragma omp parallel for
   for (i=0; i<N; i++)</pre>
     p[i] = v1[i] * v2[i];
   output(p, N);
```

target date example

```
void vec mult(float *p, float *v1, float *v2, int N)
Ł
   int i;
   init(v1, v2, N);
   #pragma omp target data map(from: p[0:N])
   Ł
      #pragma omp target map(to: v1[:N], v2[:N])
      #pragma omp parallel for
      for (i=0; i<N; i++)</pre>
        p[i] = v1[i] * v2[i];
                                                   Note mapping
inheritance
      init again(v1, v2, N);
      #pragma omp target map(to: v1[:N], v2[:N])
      #pragma omp parallel for
      for (i=0; i<N; i++)</pre>
        p[i] = p[i] + (v1[i] * v2[i]);
   }
   output(p, N);
}
```

teams and distribute loop example

```
float dotprod_teams(float B[], float C[], int N, int num_blocks,
    int block_threads)
{
    float sum = 0;
    int i, i0;
    #pragma omp target map(to: B[0:N], C[0:N])
    #pragma omp teams num_teams(num_blocks) thread_limit(block_threads)
        reduction(+:sum)
    #pragma omp distribute
    for (i0=0; i0<N; i0 += num_blocks)
        #pragma omp parallel for reduction(+:sum)
        for (i=i0; i< min(i0+num_blocks,N); i++)
            sum += B[i] * C[i];
    return sum;
}
```

Double-nested loops are mapped to the two levels of thread hierarchy (league and team)