

University of Zurich^{UZH}

High Performance Computing Lecture 3

Douglas Potter

Jozef Bucko

Noah Kubli



Where are we?

We can run codes

• Submit on a SLURM queue

We can compile codes

More on this today

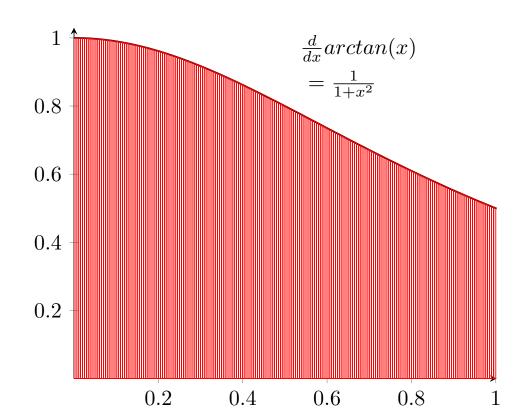
Understanding Parallel

Main topic today

GOAL: change a code

Maybe write your own

Exercise: Compute PI in Parallel



High Performance Computing

Integration in Python

```
N=5
dx=1.0 / N
s = 0
for x in range (0, N):
  s += dx / (1 + ((x+0.5)*dx)**2)
print(s*4)
dhcp-94-191:cpi$ python integrate.py
3.144925864003328
```



OpenMP Results (multi-threaded) N=1,000,000,000

```
running on 1 threads: PI = 3.141592653589971 computed in 4.55 seconds
running on 2 threads: PI = 3.141592653589901 computed in 2.291 seconds running on 3 threads: PI = 3.141592653589962 computed in 1.624 seconds
running on 4 threads: PI = 3.141592653589821 computed in 1.258 seconds
running on 5 threads: PI = 3.141592653589596 computed in 1.041 seconds
running on 6 threads: PI = 3.141592653589682 computed in 0.8988 seconds running on 7 threads: PI = 3.14159265358963 computed in 0.7989 seconds
running on 8 threads: PI = 3.141592653589769 computed in 0.7217 seconds
running on 9 threads: PI = 3.141592653589656 computed in 0.6415 seconds
running on 10 threads: PI = 3.141592653589794 computed in 0.5774 seconds running on 11 threads: PI = 3.14159265358966 computed in 0.5249 seconds
running on 12 threads: PI = 3.14159265358986 computed in 0.4811 seconds
running on 13 threads: PI = 3.141592653589865 computed in 0.4441 seconds
running on 14 threads: PI = 3.141592653589788 computed in 0.4124 seconds
running on 15 threads: PI = 3.141592653589805 computed in 0.3849 seconds
running on 16 threads: PI = 3.141592653589832 computed in 0.3609 seconds
running on 17 threads: PI = 3.141592653589839 computed in 0.3397 seconds
running on 18 threads: PI = 3.141592653589814 computed in 0.3208 seconds
running on 19 threads: PI = 3.141592653589826 computed in 0.3053 seconds
running on 20 threads: PI = 3.141592653589855 computed in 0.2897 seconds
running on 21 threads: PI = 3.141592653589775 computed in 0.2768 seconds
running on 22 threads: PI = 3.141592653589823 computed in 0.2644 seconds
running on 23 threads: PI = 3.141592653589866 computed in 0.2528 seconds
running on 24 threads: PI = 3.141592653589792 computed in 0.2423 seconds
running on 25 threads: PI = 3.14159265358978 computed in 0.2326 seconds
running on 26 threads: PI = 3.141592653589832 computed in 0.2237 seconds
running on 27 threads: PI = 3.141592653589835 computed in 0.2154 seconds running on 28 threads: PI = 3.141592653589816 computed in 0.2077 seconds
running on 29 threads: PI = 3.141592653589819 computed in 0.2006 seconds
running on 30 threads: PI = 3.141592653589893 computed in 0.1939 seconds
running on 31 threads: PI = 3.141592653589744 computed in 0.1876 seconds running on 32 threads: PI = 3.141592653589758 computed in 0.1818 seconds
running on 33 threads: PI = 3.141592653589806 computed in 0.1763 seconds
running on 34 threads: PI = 3.141592653589926 computed in 0.1711 seconds
running on 35 threads: PI = 3.14159265358979 computed in 0.1662 seconds running on 36 threads: PI = 3.141592653589822 computed in 0.1616 seconds
```

```
#!/bin/bash -1
#$BATCH --account=uzh8
#$BATCH --job-name=openmp_test
#$BATCH --time=01:00:00
#$BATCH --nodes={nodes}
#$BATCH --ntasks-per-node={processes}
#$BATCH --cpus-per-task={threads}
#$BATCH --partition=normal
#$BATCH --constraint=mc
export OMP_NUM_THREADS=$$LURM_CPUS_PER_TASK
srun cpi_openmp
```



OpenMP Results (multi-threaded) N=1,000,000,000

```
running on 1 threads: PI = 3.141592653589971 computed in 4.55 seconds
running on 2 threads: PI = 3.141592653589901 computed in 2.291 seconds running on 3 threads: PI = 3.141592653589962 computed in 1.624 seconds
running on 4 threads: PI = 3.141592653589821 computed in 1.258 seconds
running on 5 threads: PI = 3.141592653589596 computed in 1.041 seconds
running on 6 threads: PI = 3.141592653589682 computed in 0.8988 seconds running on 7 threads: PI = 3.14159265358963 computed in 0.7989 seconds
running on 8 threads: PI = 3.141592653589769 computed in 0.7217 seconds
running on 9 threads: PI = 3.141592653589656 computed in 0.6415 seconds
running on 10 threads: PI = 3.141592653589794 computed in 0.5774 seconds running on 11 threads: PI = 3.14159265358966 computed in 0.5249 seconds
running on 12 threads: PI = 3.14159265358986 computed in 0.4811 seconds
running on 13 threads: PI = 3.141592653589865 computed in 0.4441 seconds
running on 14 threads: PI = 3.141592653589788 computed in 0.4124 seconds
running on 15 threads: PI = 3.141592653589805 computed in 0.3849 seconds
running on 16 threads: PI = 3.141592653589832 computed in 0.3609 seconds
running on 17 threads: PI = 3.141592653589839 computed in 0.3397 seconds
running on 18 threads: PI = 3.141592653589814 computed in 0.3208 seconds
running on 19 threads: PI = 3.141592653589826 computed in 0.3053 seconds
running on 20 threads: PI = 3.141592653589855 computed in 0.2897 seconds
running on 21 threads: PI = 3.141592653589775 computed in 0.2768 seconds
running on 22 threads: PI = 3.141592653589823 computed in 0.2644 seconds
running on 23 threads: PI = 3.141592653589866 computed in 0.2528 seconds
running on 24 threads: PI = 3.141592653589792 computed in 0.2423 seconds running on 25 threads: PI = 3.14159265358978 computed in 0.2326 seconds
running on 26 threads: PI = 3.141592653589832 computed in 0.2237 seconds
running on 27 threads: PI = 3.141592653589835 computed in 0.2154 seconds running on 28 threads: PI = 3.141592653589816 computed in 0.2077 seconds
running on 29 threads: PI = 3.141592653589819 computed in 0.2006 seconds
running on 30 threads: PI = 3.141592653589893 computed in 0.1939 seconds
running on 31 threads: PI = 3.141592653589744 computed in 0.1876 seconds running on 32 threads: PI = 3.141592653589758 computed in 0.1818 seconds
running on 33 threads: PI = 3.141592653589806 computed in 0.1763 seconds
running on 34 threads: PI = 3.141592653589926 computed in 0.1711 seconds
running on 35 threads: PI = 3.14159265358979 computed in 0.1662 seconds running on 36 threads: PI = 3.141592653589822 computed in 0.1616 seconds
```

```
#!/bin/bash -1
#$BATCH --account=uzh8
#$BATCH --job-name=openmp_test
#$BATCH --time=01:00:00
#$BATCH --nodes=1
#$BATCH --ntasks-per-node=1
#$BATCH --cpus-per-task=36
#$BATCH --partition=normal
#$BATCH --constraint=mc
export OMP_NUM_THREADS=$$SLURM_CPUS_PER_TASK
srun cpi_openmp
```



OpenMP Results (multi-threaded) N=1,000,000,000

```
running on 1 threads: PI = 3.141592653589971 computed in 4.55 seconds
running on 2 threads: PI = 3.141592653589901 computed in 2.291 seconds running on 3 threads: PI = 3.141592653589962 computed in 1.624 seconds
running on 4 threads: PI = 3.141592653589821 computed in 1.258 seconds
running on 5 threads: PI = 3.141592653589596 computed in 1.041 seconds
running on 6 threads: PI = 3.141592653589682 computed in 0.8988 seconds running on 7 threads: PI = 3.14159265358963 computed in 0.7989 seconds
running on 8 threads: PI = 3.141592653589769 computed in 0.7217 seconds
running on 9 threads: PI = 3.141592653589656 computed in 0.6415 seconds
running on 10 threads: PI = 3.141592653589794 computed in 0.5774 seconds running on 11 threads: PI = 3.14159265358966 computed in 0.5249 seconds
running on 12 threads: PI = 3.14159265358986 computed in 0.4811 seconds
running on 13 threads: PI = 3.141592653589865 computed in 0.4441 seconds
running on 14 threads: PI = 3.141592653589788 computed in 0.4124 seconds
running on 15 threads: PI = 3.141592653589805 computed in 0.3849 seconds
running on 16 threads: PI = 3.141592653589832 computed in 0.3609 seconds
running on 17 threads: PI = 3.141592653589839 computed in 0.3397 seconds
running on 18 threads: PI = 3.141592653589814 computed in 0.3208 seconds
running on 19 threads: PI = 3.141592653589826 computed in 0.3053 seconds
running on 20 threads: PI = 3.141592653589855 computed in 0.2897 seconds
running on 21 threads: PI = 3.141592653589775 computed in 0.2768 seconds
running on 22 threads: PI = 3.141592653589823 computed in 0.2644 seconds
running on 23 threads: PI = 3.141592653589866 computed in 0.2528 seconds
running on 24 threads: PI = 3.141592653589792 computed in 0.2423 seconds
running on 25 threads: PI = 3.14159265358978 computed in 0.2326 seconds
running on 26 threads: PI = 3.141592653589832 computed in 0.2237 seconds
running on 27 threads: PI = 3.141592653589835 computed in 0.2154 seconds running on 28 threads: PI = 3.141592653589816 computed in 0.2077 seconds
running on 29 threads: PI = 3.141592653589819 computed in 0.2006 seconds
running on 30 threads: PI = 3.141592653589893 computed in 0.1939 seconds
running on 31 threads: PI = 3.141592653589744 computed in 0.1876 seconds running on 32 threads: PI = 3.141592653589758 computed in 0.1818 seconds
running on 33 threads: PI = 3.141592653589806 computed in 0.1763 seconds
running on 34 threads: PI = 3.141592653589926 computed in 0.1711 seconds
running on 35 threads: PI = 3.14159265358979 computed in 0.1662 seconds running on 36 threads: PI = 3.141592653589822 computed in 0.1616 seconds
```



MPI Results

```
This is Process-1/36 running on nid00564
This is Process-3/36 running on nid00564
This is Process-3/36 running on nid00564
This is Process-5/36 running on nid00564
This is Process-6/36 running on nid00564
This is Process-8/36 running on nid00564
This is Process-13/36 running on nid00564
This is Process-23/36 running on nid00564
This is Process-23/36 running on nid00564
This is Process-23/36 running on nid00564
This is Process-25/36 running on nid00564
This is Process-26/36 running on nid00564
This is Process-26/36 running on nid00564
This is Process-31/36 running on nid00564
This is Process-3/36 running on nid00564
This is Process-2/36 running on nid00564
This is Process-2/36 running on nid00564
   This is Process-7/36 running on nid00564
This is Process-9/36 running on nid00564
This is Process-10/36 running on nid00564
This is Process-11/36 running on nid00564
This is Process-15/36 running on nid00564
     This is Process-19/36 running on nid00564
This is Process-19/36 running on nid00564
This is Process-20/36 running on nid00564
This is Process-21/36 running on nid00564
         This is Process-24/36 running on nid00564
   This is Process-24/36 running on nid00564
This is Process-30/36 running on nid00564
This is Process-32/36 running on nid00564
This is Process-34/36 running on nid00564
This recess-34/36 running on nid00564
       This program uses 36 processes
```

The number of intervals = 1000000000 pi is approximately 3.1415926535898406 Error is 0.0000000000000475 wall clock time = 0.096959

OpenMP Result running on 36 threads: PI = 3.141592653589822 computed in 0.1616 seconds

Two Nodes

```
(some lines removed; 
This is Process-62/72 running on nid01175. 
This is Process-62/72 running on nid01174. 
This is Process-63/72 running on nid01174. 
This is Process-63/72 running on nid01174. 
This is Process-63/72 running on nid01174. 
This is Process-62/72 running on nid01175. 
This is Process-62/72 running on nid01174.
   This is Process-6//2 running on nid01174
This is Process-67/2 running on nid01175
This is Process-68/72 running on nid01174
This is Process-68/72 running on nid01174
This is Process-69/72 running on nid01174
This is Process-69/72 running on nid01175
                                                                                                                                                                                                                                                                                                                                                           #!/bin/bash -1
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --account=uzh8
 This is Process-59/72 running on nid01175 his is Process-31/72 running on nid01174 his is Process-31/72 running on nid01174 his is Process-31/72 running on nid01175 his is Process-31/72 running on nid01175 his is Process-33/72 running on nid01176 his is Process-39/72 running on nid01176 his is Process-39/72 running on nid01176 his is Process-34/72 running on nid01176 his is Process-34/72 running on nid01176 his is Process-31/72 running on nid01177 his is Process-31/72 running on nid01177 his is Process-31/72 running on nid01178
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --job-name=openmp test
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --time=01:00:00
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --nodes=(nodes)
                                                                                                                                                                                                                                                                                                                                                           #SBATCH --ntasks-per-node=
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --cpus-per-task=(threads
 This is Process-41/72 running on ni001175 his is Process-0/72 running on ni001174 his is Process-0/72 running on ni001174 his is Process-43/72 running on ni001175 his is Process-4/72 running on ni001175 his is Process-4/72 running on ni001176 his
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --partition=normal
                                                                                                                                                                                                                                                                                                                                                             #SBATCH --constraint=mc
                                                                                                                                                                                                                                                                                                                                                             srun cpi mpi
This is Process-19/72 running on nid01175
This is Process-19/72 running on nid01174
This is Process-19/72 running on nid01174
This is Process-19/72 running on nid01174
This is Process-20/72 running on nid01174
This program uses 72 processes
The number of nitervals = 1000000000

pi is approximately 3.1415926535898109,
Error is 0.000000000000000178
```

wall clock time = 0.024506



MPI Results

```
This is Process-1/36 running on nid00564
This is Process-3/36 running on nid00564
  This is Process-3/36 running on nid00564
This is Process-5/36 running on nid00564
This is Process-5/36 running on nid00564
This is Process-8/36 running on nid00564
This is Process-13/36 running on nid00564
This is Process-23/36 running on nid00564
This is Process-23/36 running on nid00564
This is Process-23/36 running on nid00564
This is Process-25/36 running on nid00564
This is Process-26/36 running on nid00564
This is Process-26/36 running on nid00564
This is Process-31/36 running on nid00564
This is Process-3/36 running on nid00564
This is Process-2/36 running on nid00564
This is Process-2/36 running on nid00564
    This is Process-7/36 running on nid00564
This is Process-9/36 running on nid00564
This is Process-10/36 running on nid00564
This is Process-11/36 running on nid00564
This is Process-15/36 running on nid00564
    This is Process-1/36 running on nid00564
This is Process-19/36 running on nid00564
This is Process-20/36 running on nid00564
This is Process-21/36 running on nid00564
This is Process-24/36 running on nid00564
    This is Process-24/36 running on nid00564
This is Process-30/36 running on nid00564
This is Process-32/36 running on nid00564
This is Process-34/36 running on nid00564
This recess-34/36 running on nid00564
        This program uses 36 processes
```

The number of intervals = 1000000000 pi is approximately 3.1415926535898406 Error is 0.0000000000000475 wall clock time = 0.096959

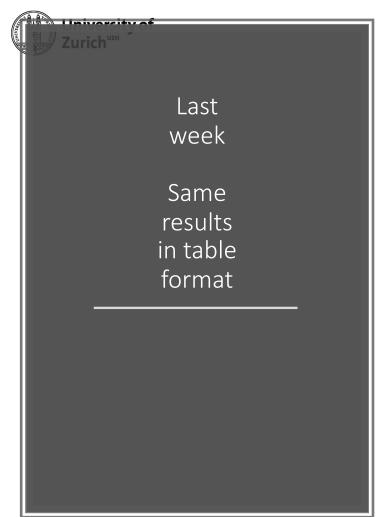
OpenMP Result running on 36 threads: PI = 3.141592653589822 computed in 0.1616 seconds

Two Nodes

```
(some lines removed; 
This is Process-62/72 running on nid01175. 
This is Process-62/72 running on nid01174. 
This is Process-63/72 running on nid01174. 
This is Process-63/72 running on nid01174. 
This is Process-63/72 running on nid01174. 
This is Process-62/72 running on nid01175. 
This is Process-62/72 running on nid01174.
   This is Process-6//2 running on nid01174
This is Process-67/2 running on nid01175
This is Process-68/72 running on nid01174
This is Process-68/72 running on nid01174
This is Process-69/72 running on nid01174
This is Process-69/72 running on nid01175
                                                                                                                                                                                                                                                                                                                                                                      #!/bin/bash -1
                                                                                                                                                                                                                                                                                                                                                                        #SBATCH --account=uzh8
 This is Process-59/72 running on nid01175 his is Process-31/72 running on nid01174 his is Process-31/72 running on nid01174 his is Process-31/72 running on nid01175 his is Process-31/72 running on nid01175 his is Process-33/72 running on nid01176 his is Process-39/72 running on nid01176 his is Process-39/72 running on nid01176 his is Process-34/72 running on nid01176 his is Process-34/72 running on nid01176 his is Process-31/72 running on nid01177 his is Process-31/72 running on nid01177 his is Process-31/72 running on nid01178
                                                                                                                                                                                                                                                                                                                                                                      #SBATCH --job-name=openmp test
                                                                                                                                                                                                                                                                                                                                                                        #SBATCH --time=01:00:00
                                                                                                                                                                                                                                                                                                                                                                        #SBATCH --nodes=2
                                                                                                                                                                                                                                                                                                                                                                        #SBATCH --ntasks-per-node=36
                                                                                                                                                                                                                                                                                                                                                                        #SBATCH --cpus-per-task=1
 This is Process-41/72 running on ni001175 his is Process-0/72 running on ni001174 his is Process-0/72 running on ni001174 his is Process-43/72 running on ni001175 his is Process-4/72 running on ni001175 his is Process-4/72 running on ni001176 his
                                                                                                                                                                                                                                                                                                                                                                      #SBATCH --partition=normal
                                                                                                                                                                                                                                                                                                                                                                        #SBATCH --constraint=mc
                                                                                                                                                                                                                                                                                                                                                                        srun cpi mpi
This is Process-19/72 running on nid01175
This is Process-19/72 running on nid01174
This is Process-19/72 running on nid01174
This is Process-19/72 running on nid01174
This is Process-20/72 running on nid01174
This program uses 72 processes
The number of intervals = 1000000000

pi is approximately 3.1415926535898109,
Error is 0.000000000000000178
```

wall clock time = 0.024506

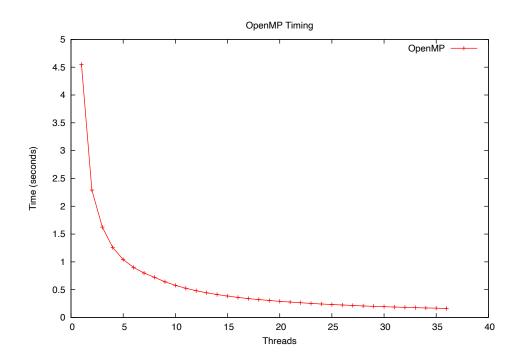


THREADS	SECONDS	THREADS	SECONDS
1	4.550	19	0.3053
2	2.291	20	0.2897
3	1.624	21	0.2768
4	1.258	22	0.2644
5	1.041	23	0.2528
6	0.8988	24	0.2423
7	0.7989	25	0.2326
8	0.7217	26	0.2237
9	0.6415	27	0.2154
10	0.5774	28	0.2077
11	0.5249	29	0.2006
12	0.4811	30	0.1939
13	0.4441	31	0.1876
14	0.4124	32	0.1818
15	0.3849	33	0.1763
16	0.3609	34	0.1711
17	0.3397	35	0.1662
18	0.3208	36	0.1616

High Performance Computing

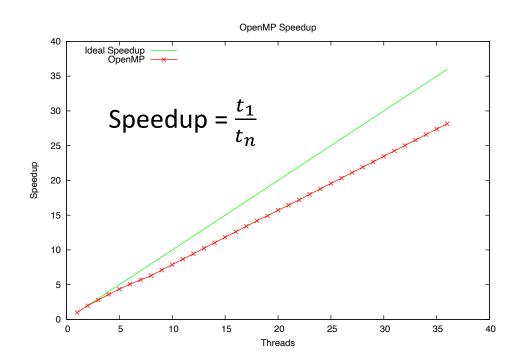
Timing Plot

set title 'OpenMP Timing'
set xlabel 'Threads'
set ylabel 'Time (seconds)'
set key top right
plot "cpi_openmp.dat"\
u 1:2 w lp lw 2 t 'OpenMP'



"Speedup" Plot

set title 'OpenMP Speedup'
set xlabel 'Threads'
set ylabel 'Speedup'
set key top left
plot x lc 2 lw 2 t 'Ideal Speedup',\
"cpi_openmp.dat" u 1:(4.55/\$2)\
w lp lc 1 lw 2 t 'OpenMP'





Parsing the Text (Results)



running on 1 threads: PI = 3.141592653589971 computed in 4.55 seconds

1	4.550000	13	0.444100	25	0.232600
2	2.291000	14	0.412400	26	0.223700
3	1.624000	15	0.384900	27	0.215400
4	1.258000	16	0.360900	28	0.207700
5	1.041000	17	0.339700	29	0.200600
6	0.898800	18	0.320800	30	0.193900
7	0.798900	19	0.305300	31	0.187600
8	0.721700	20	0.289700	32	0.181800
9	0.641500	21	0.276800	33	0.176300
10	0.577400	22	0.264400	34	0.171100
11	0.524900	23	0.252800	35	0.166200
12	0.481100	24	0.242300	36	0.161600

./parse.pl <slurm-6188431.out



dpotter@daint104:~/hpc1a> cat parse.pl

How to Plot the Results

```
#!/usr/bin/perl
use strict;
while(<STDIN>) {
    if (/running on (\d+) threads: PI.*computed in ([0-9]*\.[0-9]+) seconds/) {
          printf("%2d %f\n",$1,$2);
dpotter@daint104:~/hpc1a> cat speedup.qp
set title 'OpenMP Speedup'
set ylabel 'Speedup'
set key top left
plot x t 'Ideal Speedup', "cpi openmp.dat" u 1:(4.55/$2) w l t 'OpenMP'
```

./parse.pl <slurm-6188431.out >cpi_openmp.dat

```
gnuplot> set output "speedup.eps"
gnuplot> set terminal postscript enhanced solid color
gnuplot> load "speedup.gp"
gnuplot> set terminal x11
gnuplot> set output
```



Parsing with Python

./parse.py <slurm-6188431.out >cpi_openmp.dat

```
dpotter@daint104:~/hpc1a> cat speedup.gp
set title 'OpenMP Speedup'
set xlabel 'Threads'
set ylabel 'Speedup'
set key top left
plot x t 'Ideal Speedup', "cpi_openmp.dat" u 1:(4.55/$2) w 1 t 'OpenMP'
```

gnuplot> set terminal postscript enhanced solid color
gnuplot> load "speedup.gp"
gnuplot> set terminal x11
gnuplot> set output



Parsing Process

```
[dpotter@ela4 hpc1a]$ head -n 36 slurm-6188431.out
                                                                                                              [dpotter@ela4 hpc1a]$ python parse.py <slurm-6188431.out
running on 1 threads: PI = 3.141592653589971 computed in 4.55 seconds
                                                                                                              1 4.55
running on 2 threads: PI = 3.141592653589901 computed in 2.291 seconds
                                                                                                              2 2.291
running on 3 threads: PI = 3.141592653589962 computed in 1.624 seconds
                                                                                                              3 1.624
                                                                                                              4 1.258
running on 4 threads: PI = 3.141592653589821 computed in 1.258 seconds
running on 5 threads: PI = 3.141592653589596 computed in 1.041 seconds
                                                                                                              5 1.041
running on 6 threads: PI = 3.141592653589682 computed in 0.8988 seconds
                                                                                                              6 0.8988
                                                                                                              7 0.7989
running on 7 threads: PI = 3.14159265358963 computed in 0.7989 seconds
running on 8 threads: PI = 3.141592653589769 computed in 0.7217 seconds
                                                                                                              8 0.7217
                                                                                                              9 0.6415
running on 9 threads: PI = 3.141592653589656 computed in 0.6415 seconds
running on 10 threads: PI = 3.141592653589794 computed in 0.5774 seconds
                                                                                                              10 0.5774
running on 11 threads; PI = 3.14159265358966 computed in 0.5249 seconds
                                                                                                              11 0.5249
running on 12 threads: PI = 3.14159265358986 computed in 0.4811 seconds
                                                                                                              12 0.4811
running on 13 threads: PI = 3.141592653589865 computed in 0.4441 seconds
                                                                                                              13 0.4441
running on 14 threads: PI = 3.141592653589788 computed in 0.4124 seconds
                                                                                                              14 0.4124
running on 15 threads: PI = 3.141592653589805 computed in 0.3849 seconds
                                                                                                              15 0.3849
running on 16 threads: PI = 3.141592653589832 computed in 0.3609 seconds
                                                                                                              16 0.3609
running on 17 threads: PI = 3.141592653589839 computed in 0.3397 seconds
                                                                                                              17 0.3397
running on 18 threads: PI = 3.141592653589814 computed in 0.3208 seconds
                                                                                                              18 0.3208
                                                                                                              19 0.3053
running on 19 threads: PI = 3.141592653589826 computed in 0.3053 seconds
running on 20 threads: PI = 3.141592653589855 computed in 0.2897 seconds
                                                                                                              20 0.2897
running on 21 threads: PI = 3.141592653589775 computed in 0.2768 seconds
                                                                                                              21 0.2768
running on 22 threads: PI = 3.141592653589823 computed in 0.2644 seconds
                                                                                                              22 0.2644
running on 23 threads: PI = 3.141592653589866 computed in 0.2528 seconds
                                                                                                              23 0.2528
                                                                                                              24 0.2423
running on 24 threads: PI = 3.141592653589792 computed in 0.2423 seconds
running on 25 threads; PI = 3.14159265358978 computed in 0.2326 seconds
                                                                                                              25 0.2326
running on 26 threads: PI = 3.141592653589832 computed in 0.2237 seconds
                                                                                                              26 0.2237
running on 27 threads: PI = 3.141592653589835 computed in 0.2154 seconds
                                                                                                              27 0.2154
running on 28 threads: PI = 3.141592653589816 computed in 0.2077 seconds
                                                                                                              28 0.2077
running on 29 threads: PI = 3.141592653589819 computed in 0.2006 seconds
                                                                                                              29 0.2006
running on 30 threads: PI = 3.141592653589893 computed in 0.1939 seconds
                                                                                                              30 0.1939
running on 31 threads: PI = 3.141592653589744 computed in 0.1876 seconds
                                                                                                              31 0.1876
running on 32 threads: PI = 3.141592653589758 computed in 0.1818 seconds
                                                                                                              32 0.1818
running on 33 threads: PI = 3.141592653589806 computed in 0.1763 seconds
                                                                                                              33 0.1763
                                                                                                              34 0.1711
running on 34 threads: PI = 3.141592653589926 computed in 0.1711 seconds
running on 35 threads; PI = 3.14159265358979 computed in 0.1662 seconds
                                                                                                              35 0.1662
running on 36 threads: PI = 3.141592653589822 computed in 0.1616 seconds
                                                                                                              36 0.1616
```

More on Compilers





Compiler Suites



```
#include <stdio.h>
#include <sys/time.h>
static long steps = 1000000000;
double getTime(void) {
    struct timeval tv:
    struct timezone tz;
    gettimeofday(&tv, &tz);
    return tv.tv sec + 1e-6*(double)tv.tv usec;
int main (int argc, const char *argv[]) {
    int i;
    double x;
    double pi;
    char *p;
    double step = 1.0/(double) steps;
    double sum = 0.0;
    double start = getTime();
    for (i=0; i < steps; i++) {
        x = (i+0.5) * step;
        sum += 4.0 / (1.0+x*x);
    pi = step * sum;
    double delta = getTime() - start;
    printf("PI = %.16q computed in %.4q seconds\n", pi, delta);
    High Performance Computing
```

cpi.c (serial version)

Output Name

```
dhcp-94-191:cpi$ ls
cpi.c
dhcp-94-191:cpi$ gcc cpi.c
dhcp-94-191:cpi$ ls
a.out cpi.c
dhcp-94-191:cpi$ ./a.out
PI = 3.141592653589971 computed in 11.9 seconds
dhcp-94-191:cpi$ rm a.out
dhcp-94-191:cpi$ ls
cpi.c
dhcp-94-191:cpi$ gcc -o cpi cpi.c
dhcp-94-191:cpi$ ls
cpi cpi.c
dhcp-94-191:cpi$ ./cpi
PI = 3.141592653589971 computed in 11.82 seconds
```

High Performance Computing

Compiler Optimization

```
dhcp-94-191:cpi$ gcc -o cpi cpi.c; ./cpi
PI = 3.141592653589971 computed in 11.84 seconds
dhcp-94-191:cpi$ gcc -O -o cpi cpi.c; ./cpi
PI = 3.141592653589971 computed in 2.505 seconds
dhcp-94-191:cpi$ gcc -00 -o cpi cpi.c; ./cpi
PI = 3.141592653589971 computed in 11.82 seconds
dhcp-94-191:cpi$ gcc -01 -o cpi cpi.c; ./cpi
PI = 3.141592653589971 computed in 2.497 seconds
                                                            > 20 Times
dhcp-94-191:cpi$ gcc -02 -o cpi cpi.c; ./cpi
                                                           Improvement
PI = 3.141592653589971 computed in 1.19 seconds
dhcp-94-191:cpi$ gcc -03 -o cpi cpi.c; ./cpi
PI = 3.141592653589971 computed in 1.174 seconds
dhcp-94-191:cpi$ gcc -O3 -ffast-math -o cpi cpi.c; ./cpi
PI = 3.141592653589652 computed in 0.6 seconds
dhcp-94-191:cpi$ gcc -O3 -ffast-math -mavx2 -o cpi cpi.c; ./cpi
PI = 3.141592653589729 computed in 0.5518 seconds
     3.14159265358979323846 (real value of pi)
```

What do the levels mean?

-O1 Optimize.

• Optimizing compilation takes somewhat more time, and a lot more memory for a large function.

-O2 Optimize even more.

- GCC performs nearly all supported optimizations that do not involve a space-speed tradeoff.
- •The compiler does not perform loop unrolling or function inlining when you specify -O2.
- As compared to -O, this option **increases both compilation time** and the performance of the generated code.

-O3 Optimize yet more.

• -O3 turns on all optimizations specified by -O2 and also turns on the -finline-functions, -funswitch-loops, -fpredictive-commoning, -fgcse-after-reload and -ftree-vectorize options.

-00 No Optimization.

- Reduce compilation time and make debugging produce the expected results.
- This is the default.

Associative Property of Addition

$$(a+b) + c = a + (b+c)$$

Fast Math

Distributive Property of Multiplication

$$a(b+c) = ab + ac$$

Sometimes reordering can improve performance



Associative Property of Addition

$$(a+b) + c \neq a + (b+c)$$

Fast Math (the Truth)

Distributive Property of Multiplication

$$a(b+c) \neq ab + ac$$

Sometimes reordering can change the result



Beware of Associative Math

```
dhcp-94-191:cpi$ python
>>> a=12
>>> b=12
>>> a==b
True
>>> a=0.1 + 0.2 + 0.3
>>> b=0.1 + (0.2 + 0.3)
>>> a==b
False
>>> print(a)
0.6
>>> print(b)
0.6
```

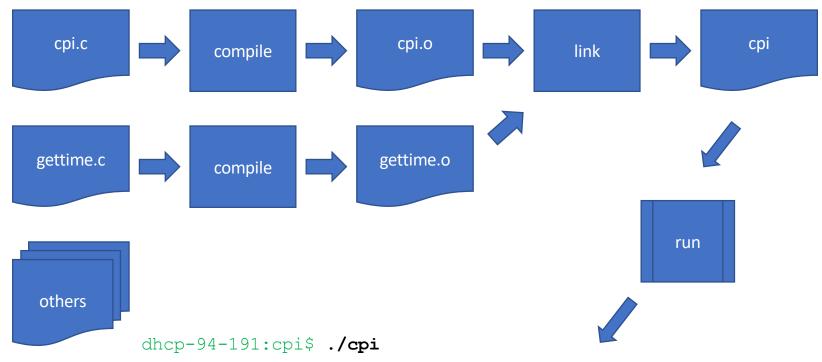
```
>>> print("%.17f" %a)
0.600000000000000009
>>> print("%.17f" %b)
0.5999999999999998
>>> c=0.6
>>> print("%.17f" %c)
0.5999999999999998
```

"Modules" in C

```
#include <stdio.h>
#include <sys/time.h>
static long steps = 1000000000;
double getTime(void) {
    struct timeval tv;
    struct timezone tz:
   gettimeofday(&tv, &tz);
    return tv.tv sec + 1e-6*(double)tv.tv usec;
int main (int argc, const char *argv[]) {
   int i;
   double x;
   double pi;
    double step = 1.0/(double) steps;
   double sum = 0.0;
    double start = getTime();
    for (i=0; i < steps; i++) {
       x = (i+0.5)*step;
        sum += 4.0 / (1.0+x*x);
   pi = step * sum;
   double delta = getTime() - start;
   printf("PI = %.16g computed in %.4g seconds\n", pi, delta);
```



Separate Compilation



PI = 3.141592653589971 computed in 1.174 seconds



gettime.c

```
#include <sys/time.h>
double getTime(void) {
    struct timeval tv;
    struct timezone tz;
    gettimeofday(&tv, &tz);
    return tv.tv_sec + 1e-6*(double)tv.tv_usec;
}
```



cpi.c

```
#include <stdio.h>
static long steps = 1000000000;
int main (int argc, const char *argv[]) {
    int i;
    double x;
    double pi;
    double step = 1.0/(double) steps;
    double sum = 0.0;
    double start = getTime();
    for (i=0; i < steps; i++) {
        x = (i+0.5) * step;
        sum += 4.0 / (1.0+x*x);
    pi = step * sum;
    double delta = getTime() - start;
   printf("PI = %.16g computed in %.4g seconds\n", pi, delta);
```



Compiling with two files



gettime.h

```
double getTime(void);
```



cpi.c

```
#include <stdio.h>
                                                     gettime.h
#include "gettime.h"
static long steps = 1000000000;
int main (int argc, const char *argv[]) {
    int i;
    double x;
    double pi;
    double step = 1.0/(double) steps;
    double sum = 0.0;
    double start = getTime();
    for (i=0; i < steps; i++) {
        x = (i+0.5) *step;
        sum += 4.0 / (1.0+x*x);
    pi = step * sum;
    double delta = getTime() - start;
    printf("PI = %.16q computed in %.4q seconds\n", pi, delta);
```

double getTime(void);



gettime.c

```
#include <sys/time.h>
#include "gettime.h"

double getTime(void);

double getTime(void) {
    struct timeval tv;
    struct timezone tz;
    gettimeofday(&tv, &tz);
    return tv.tv_sec + 1e-6*(double)tv.tv_usec;
}
```



Compile and Link Separately



Makefile

```
cpi : cpi.o gettime.o
gcc -o cpi cpi.o gettime.o

cpi.o : cpi.c gettime.h
gcc -O3 -ffast-math -mavx2 -c -o cpi.o cpi.c

gettime.o : gettime.c gettime.h
gcc -O3 -ffast-math -mavx2 -c -o gettime.o gettime.c

clean:
rm -f cpi cpi.o gettime.o
```



Compile and Link Separately

```
dhcp-94-191:cpi2$ make clean
rm -f cpi cpi.o gettime.o
dhcp-94-191:cpi2$ make
gcc -O3 -ffast-math -mavx2 -c -o cpi.o cpi.c
gcc -O3 -ffast-math -mavx2 -c -o gettime.o
gcc -o cpi cpi.o gettime.o
dhcp-94-191:cpi2$ make
make: `cpi' is up to date.
dhcp-94-191:cpi2$ touch cpi.c
dhcp-94-191:cpi2$ make
gcc -O3 -ffast-math -mavx2 -c -o cpi.o cpi.c
gcc -o cpi cpi.o gettime.o
"touch" - change modification time.
Same as if you edited the file.
```



Makefile



Makefile with default rules

```
cpi
         : cpi.o gettime.o
cpi.o
       : cpi.c gettime.h
gettime.o: gettime.c gettime.h
clean:
  rm -f cpi cpi.o gettime.o
```

```
dhcp-94-191:cpi2$ make clean
rm -f cpi cpi.o gettime.o
dhcp-94-191:cpi2$ make
    -c -o cpi.o cpi.c
   -c -o gettime.o gettime.c
cc cpi.o gettime.o -o cpi
```



Makefile with default rules

```
CFLAGS=-03 -ffast-math -mayx2
CC=gcc
cpi
         : cpi.o gettime.o
cpi.o
        : cpi.c gettime.h
gettime.o: gettime.c gettime.h
clean:
   rm -f cpi cpi.o gettime.o
```



Message Passing



Why use MPI?

One Node isn't enough

- Maybe you have run out of memory
- Maybe it takes too long to calculate

Alternatives do exist

- Partitioned Global Address Space (PGAS)
- HPX (High Performance ParalleX)
- Charm++

MPI is still omnipresent

- It has been around since 1991
- Version 3.1 was approved in 2015
- Version 4.0 release candidate now (2021)

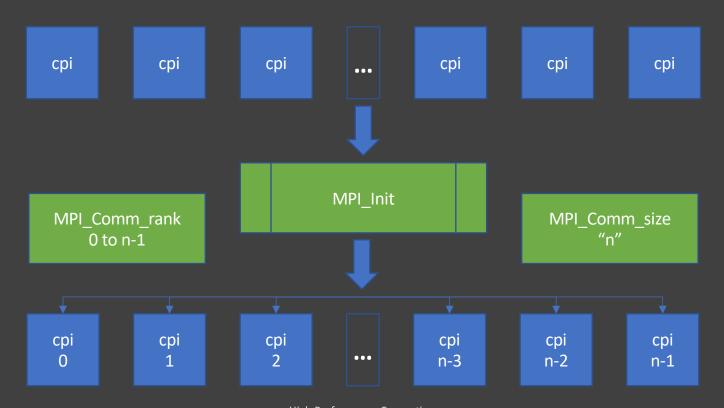


MPI Process Layout





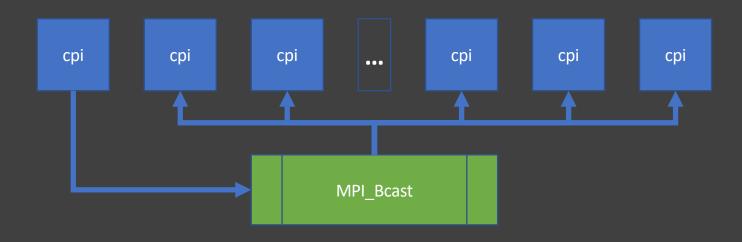
MPI Initialization



High Performance Computing



MPI Broadcast

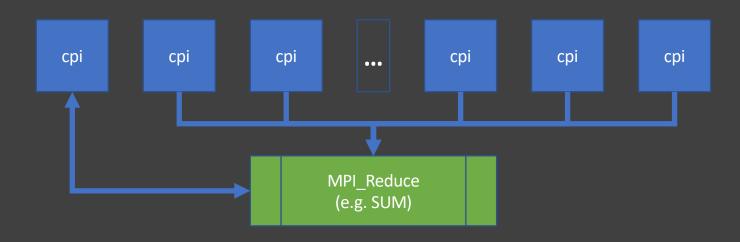


All MPI Ranks Call MPI_Bcast together.

Everyone gets the value from (usually) rank 0.



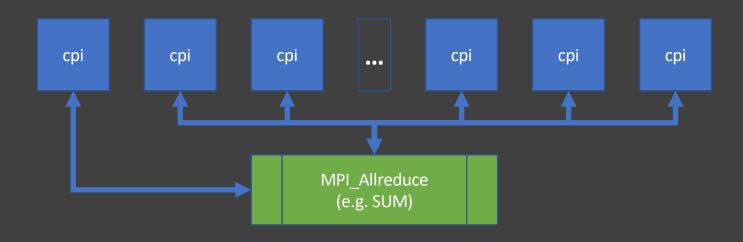
MPI Reduce



All MPI Ranks Call MPI_Reduce together.
All values from all ranks are summed together.
A single rank (usually rank 0) gets the result.



MPI All Reduce

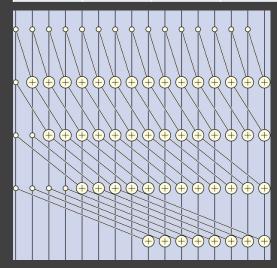


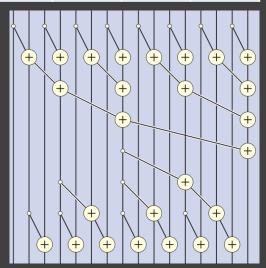
All MPI Ranks Call MPI_Reduce together.
All values from all ranks are summed together.
All ranks get the result.



Partial Reduction (e.g., sum)

Rank	0	1	2	3	4	5	6	7
Value	4	3	8	7	2	6	3	1
Scan	4	7	15	22	24	30	33	34
Exscan	0	4	7	15	22	24	30	33







The MPI version of cpi

```
MPI Init(&argc, &argv);
                                          /* Connect processes to each other */
MPI Comm size (MPI COMM WORLD, &numprocs); /* Get total number of processes */
                                                     /* Rank of this process */
MPI Comm rank (MPI COMM WORLD, &myid);
MPI Get processor name (name, &resultlen);
printf("This is Process-%d/%d running on %s \n", myid, numprocs, name);
MPI Barrier (MPI COMM WORLD);
if(myid == 0) {
    printf("This program uses %d processes\n", numprocs);
    n = 1000000000;
MPI Bcast(&n, 1, MPI INT, 0, MPI COMM WORLD); /* Send n from 0 to all others */
sum = 0.0;
h = 1.0/n;
                                                   /* Compute the Derivative of ArcTan */
for (i=myid+0.5; i<n; i+=numprocs) {</pre>
                                                   double dx arctan(double x) {
    sum += dx arctan(i*h);
                                                       return 1.0 / (1.0 + x*x);
mypi = 4.0*h*sum;
                   /* Add all partial sums to each other and send to rank 0 */
MPI Reduce (&mypi, &pi, 1, MPI DOUBLE, MPI_SUM, 0, MPI_COMM_WORLD);
if (mvid == 0) {
    printf("pi is approximately %.16f\n",pi);
MPI Finalize();
                                                 /* Disconnect all processes */
```



High Performance Computing



MPI Comm accept

MPI Comm dup with info

MPI Comm free keyval

MPI Comm get errhandler

MPI Comm get attr

MPI Comm get info

MPI Comm group

MPI Comm idup

MPI Comm join

MPI Comm rank

MPI Comm get name

MPI Comn, get parent

MPI Comm remote group

MPI Comm set errhandler

MPI Comm spawn multiple

MPI Comm remote size

MPI Comm set artr

MPI Comm set info

MPI Comm size

MPI Comm split

MPI Dims create

MPI Comm spawn

MPI Comm set name

MPI Comm split type

MPI Comm test inter

MPI Compare and swap

MPI Dist graph create

MPI Dist graph neighbors

MPI Dist graph create adjacent MPI Iallreduce

MPI Dist graph neighbors count MPI Ialltoally

MPI Comm f2c

MPI Comm free

MPI Comm c2f

MPI File write shared MPI Put ion 3 man pages) Universimpi Comm call errhandler MPI Finalize MPI Ouery thread MPI File call errhandler MPI Comm compare MPI Finalized MPI Raccumulate ther init MPI File close MPI Comm connect MPI Free mem MPI Recv herv init MPI File create errhandler ce init MPI File delete MPI Comm create MPI Gather MPI Recv init MPI File f2c MPI Comm create errhandler MPI Gathery MPI Reduce MPI File get amode MPI Comm create group MPI Get MPI Reduce local MPI File get atomicity MPI File get byte offset MPI Comm create keyval MPI Get accumulate MPI Reduce scatter MPI File get errhandler MPI Get address MPI Comm delete attr MPI Reduce scatter block MPI File get group MPI Comm disconnect MPI Get count MPI Register datarep MPI File get info MPI Comm dup MPI Get elements MPI Request c2f

MPI File Write ordered end

MPI Get elements x

MPI Get version

MPI Graph get

MPI Graph map

MPI Graph neighbors

MPI Graphdims get

MPI Grequest start

MPI Group compare

MPI Group difference

MPI Group intersection

MPI Group range excl

MPI Group range incl

MPI Group translate ranks

MPI Group c2f

MPI Group excl

MPI_Group_f2c

MPI Group free

MPI Group incl

MPI Group rank

MPI Group size

MPI Group union

MPI Iallgather

MPI Iallgathery

MPI Ialltoall

MPI_Grequest_complete

MPI Graph neighbors count

MPI Graph create

MPI Request f2c MPI Get library version MPI Request free MPI Get processor name MPI Request get status

MPI Rsend

MPI Scan

MPI Send

MPI Scatter

MPI Scattery

MPI Send init

MPI Sendrecv

MPI Sizeof

MPI Ssend

MPI Start

MPI Startall

MPI Ssend init

MPI Status c2f

MPI Status f2c

MPI Status set cancelled

MPI Status set elements

MPI T category changed

MPI T category get cvars

MPI T category get info

MPI T category get num

MPI T category get pyars

MPI Status set elements x

MPI Sendrecy replace

MPI Rsend init

MPI Publish name

MP MPI Rget

MPI MPI MPI V MPI Raet accumulate MPI Rput

API

rv init MPI W MPI Wil

MPI Win

MPI Win f

MPI Win fer

MPI Win flus

MPI Win flush

MPI Win flush

MPI Win free

MPI Win flush I

MPI Win free key

MPI Win get attr

MPI Win get errhan

MPI Win get group

MPI Win get name

MPI Win get info

MPI Win lock all

MPI Win set attr

MPI Win set info

MPI Win start

MPI Win set name

MPI Win shared query

MPI Win lock

MPI Win post

MPI T category get categories MPI Win set errhandler

MPI File get position MPI File get position shared MPI Info get MPI File get size MPI File get type extent MPI File get view MPI File iread MPI File iread all MPI File iread at MPI File iread at all MPI File iread shared MPI File iwrite MPI Win MPI File iwrite all

MPI File iwrite at

File open

ile read

PI File iwrite at all

File iwrite shared

File preallocate

e read all

read all begin

read all end

ad at all

d at all begin

at all end

dered end

ordered

ead at

MPI T pvar start MPI Info f2c MPI Info free MPI T pvar stop MPI Info get nkeys MPI Info get nthkey MPI Info get valuelen MPI Info set MPI Init MPI Init thread MPI Initialized MPI Intercomm create MPI Intercomm merge MPI Iprobe MPI Irecv

MPI Ineighbor allgather

MPI Ineighbor allgathery

MPI Ineighbor alltoall

MPI Ineighbor alltoally

MPI Ineighbor alltoallw

MPI Info c2f

MPI Info create

MPI Info delete

MPI Info dup

MPI Info env

MPI Ireduce

MPI Irsend

MPI Iscan

MPI Isend

MPI Issend

rdered begin MPI Message c2f

MPI Kevval create

MPI Lookup name

MPI Keyval free

MPI Message f2c

MPI Neighbor allgather

MPI Neighbor allgathery

MPI Neighbor alltoall

MPI Neighbor alltoally

MPI Neighbor alltoallw

MPI Op commutative

MPI Mprobe

MPI Mrecv

MPI Op c2f

MPI Op f2c

MPI Op free

PI Pack

MPI Open port

PI Pack external

MPI Op create

MPI Iscatter

MPI Iscattery

MPI Ireduce scatter

MPI Is thread main

MPI T pvar write MPI Test MPI Test cancelled MPI Testall MPI Testany MPI Testsome MPI Topo test MPI Type c2f MPI Type commit MPI Type contiguous MPI Type create darray MPI Type create f90 co MPI Type create f90 int

MPI T init thread

MPI T pvar read

MPI T pvar reset

MPI T pvar get info

MPI T pvar get num

MPI T pvar handle alloc

MPI T pvar handle free

MPI T pvar readreset

MPI T pvar session crea

MPI T pvar session free

MPI Type create f90 re MPI Ireduce scatter block MPI Type create hindex MPI Type create hindex MPI Type create hvecto MPI Type create indexed MPI Type create keyval

MPI Type create resized

MPI Type create struct MPI Type create subarra MPI Type delete attr MPI Type dup MPI Type extent MPI Type f2c

MPI Type free

MPI Type free keyval

MPI Type get attr MPI Type get contents MPI Type get envelope

MPI Type get extent

MPI Type get extent >

MPI Type get name

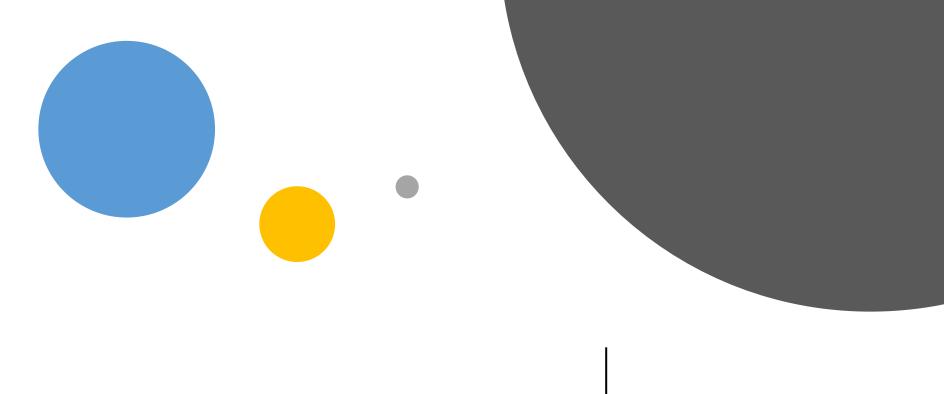
MPI Type match size

MPI Type set attr

MPI Type get true exter MPI Type get true exte

MPI Type hindexed

MPI Type hvector MPI Type indexed MPI Type Ib



OpenMP

The Serial Version of cpi

```
#include <stdio.h>
#include "gettime.h"
static long steps = 1000000000;
int main (int argc, const char *argv[]) {
   int i;
    double x;
    double pi;
    double step = 1.0/(double) steps;
    double sum = 0.0;
    double start = getTime();
    for (i=0; i < steps; i++) {
       x = (i+0.5) * step;
        sum += 4.0 / (1.0+x*x);
   pi = step * sum;
    double delta = getTime() - start;
   printf("PI = %.16g computed in %.4g seconds\n", pi, delta);
```

Start of OpenMP Version

```
#include <stdio.h>
#include "gettime.h"
static long steps = 1000000000;
int main (int argc, const char *argv[]) {
   int i;
    double x;
    double pi;
    double step = 1.0/(double) steps;
    double sum = 0.0;
    double start = getTime();
#pragma omp parallel for
    for (i=0; i < steps; i++) {
       x = (i+0.5) * step;
        sum += 4.0 / (1.0+x*x);
   pi = step * sum;
    double delta = getTime() - start;
   printf("PI = %.16g computed in %.4g seconds\n", pi, delta);
```



Need to Update our Makefile

```
CFLAGS=-Wall -O3 -ffast-math -mavx2 -fopenmp

CC=gcc

cpi : cpi.o gettime.o

cpi.o : cpi.c gettime.h

gettime.o : gettime.c gettime.h

clean:
    rm -f cpi cpi.o gettime.o
```



Not quite good enough



Makefile need linker flags too

```
CFLAGS=-Wall -O3 -ffast-math -mavx2 -fopenmp
LDFLAGS=-fopenmp
CC=gcc

cpi : cpi.o gettime.o

cpi.o : cpi.c gettime.h

gettime.o : gettime.c gettime.h

clean:
    rm -f cpi cpi.o gettime.o
```

Better. Not good, but better.

```
(Laptop)
dhcp-94-191:cpi3$ make
gcc -fopenmp cpi.o gettime.o -o cpi
dhcp-94-191:cpi3$ ./cpi
PI = 0.5675882184166633 computed in 0.2785 seconds
                          This is not pi
          This is pi
dhcp-94-191:cp/3$ OMP NUM THREADS=1 ./cpi
PI = 3.141592653589729 computed in 0.5467 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=2 ./cpi
PI = 1.287002217586625 computed in 0.2806 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=4 ./cpi
PI = 0.9799146525073925 computed in 0.2782 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=4 ./cpi
PI = 0.5675882184166633 computed in 0.279 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=4 ./cpi
PI = 0.9799146525073925 computed in 0.2772 seconds
```

High Performance Comput

Where is the problem?

```
#include <stdio.h>
#include "gettime.h"
static long steps = 1000000000;
int main (int argc, const char *argv[]) {
    int i;
    double pi;
    double step = 1.0/(double) steps;
    double sum = 0.0;
    double start = getTime();
#pragma omp parallel for
    for (i=0; i < steps; i++) {
        double x = (i+0.5) * step;
        sum += 4.0 / (1.0+x*x);
    pi = step * sum;
    double delta = getTime() - start;
    printf("PI = %.16g computed in %.4g seconds\n", pi, delta);
```

Where is the problem?

```
#include <stdio.h>
#include "gettime.h"
static long steps = 1000000000;
int main (int argc, const char *argv[]) {
    int i;
    double pi;
                                               Like
    double step = 1.0/(double) steps;
                                           MPI Reduce
    double sum = 0.0:
    double start = getTime();
#pragma omp parallel for reduction(+ : sum)
    for (i=0; i < steps; i++) {
        double x = (i+0.5)*step;
        sum += 4.0 / (1.0+x*x);
                                   All others must be "handled"
    pi = step * sum;
    double delta = getTime() - start;
    printf("PI = %.16g computed in %.4g seconds\n", pi, delta);
     Loop variable is fine
```

High Performance Computing



Now it all works

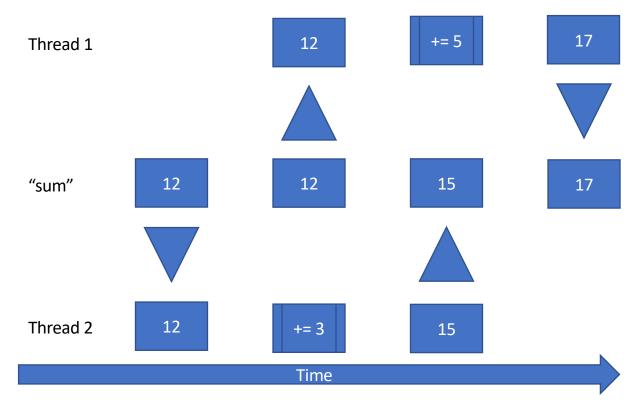
```
dhcp-94-191:cpi3$ make
gcc -Wall -O3 -ffast-math -mavx2 -fopenmp -c -o cpi.o cpi.c
gcc -fopenmp cpi.o gettime.o -o cpi
dhcp-94-191:cpi3$ ./cpi
PI = 3.141592653589774 computed in 0.2805 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=4 ./cpi
PI = 3.141592653589774 computed in 0.2776 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=3 ./cpi
PI = 3.141592653589908 computed in 0.2786 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=2 ./cpi
PI = 3.141592653589974 computed in 0.2841 seconds
dhcp-94-191:cpi3$ OMP NUM THREADS=20 ./cpi
PI = 3.14159265358980\overline{2} computed in 0.2766 seconds
```



What you're glad that Parallel Pitfalls | you don't need to know (too much) (too much)



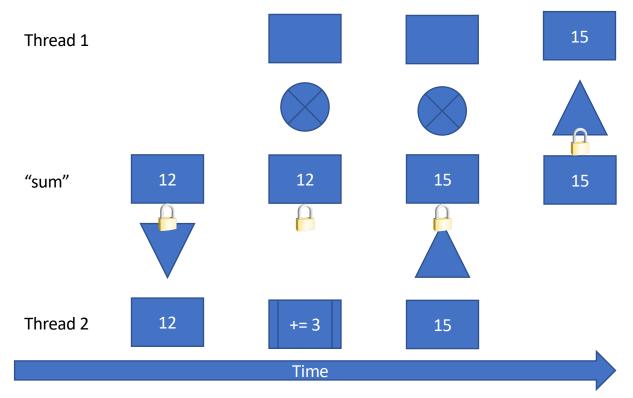
Critical Section: sum += value



High Performance Computing



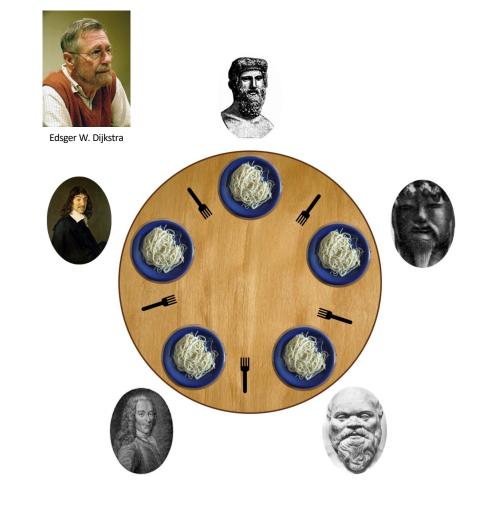
Solution: Locking



High Performance Computing

Deadlock

- Think for some time
- Pick up left fork
- Pick up right fork
- Eat for some time
- Put down right fork
- Put down left fork
- Continue Thinking





Requirements for a Deadlock

Mutual Exclusion

• Resource cannot be shared

Hold and Wait

• Must hold a resource while waiting for another

No Pre-emption

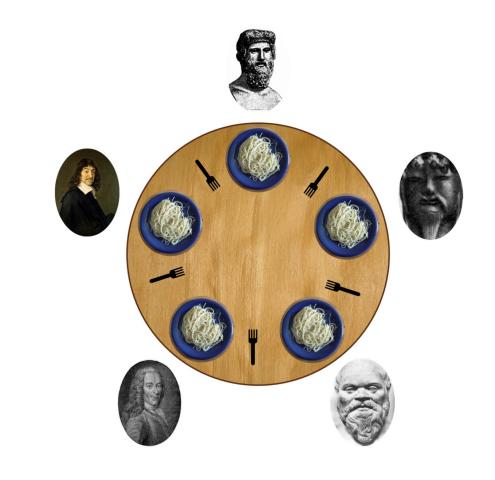
• Held resources cannot be given away

Circular Wait

• The wait dependency must be circular

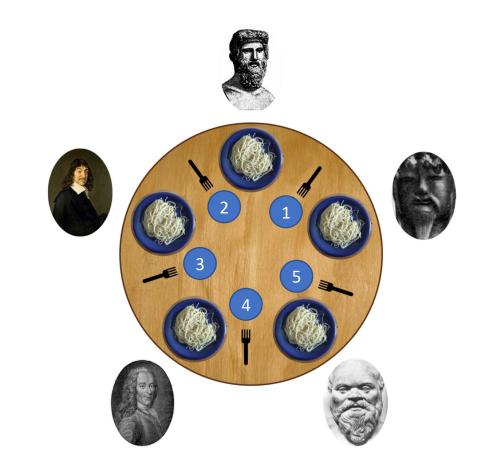
Starvation (No Hold and Wait)

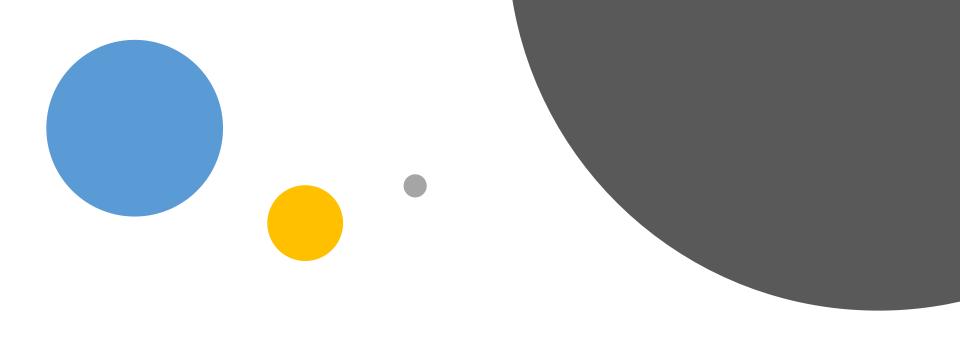
- Think for some time
- Pick up left fork
- Right fork not available
- ... or left fork not available
- Put down left fork
- Think for a while
- Eventually try again



Resource Hierarchy (No Circular Wait)

- Number each resource
- Choose resources in order
 - Confucius is different
- Cannot deadlock
- Cannot starve?

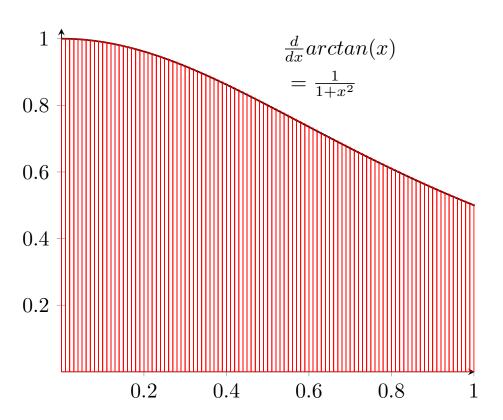




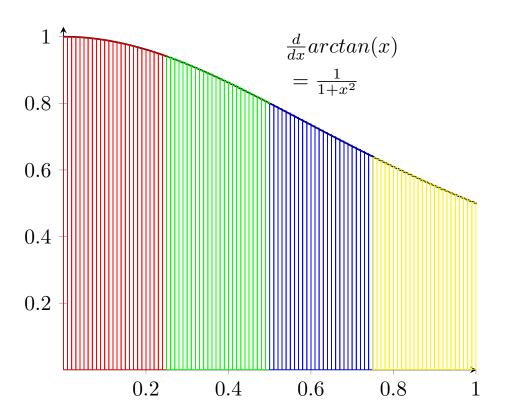
Load Balancing

How to divide up the work

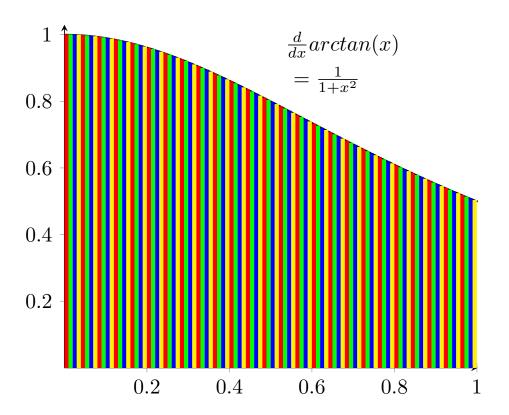
Divide 100 rectangles into four domains



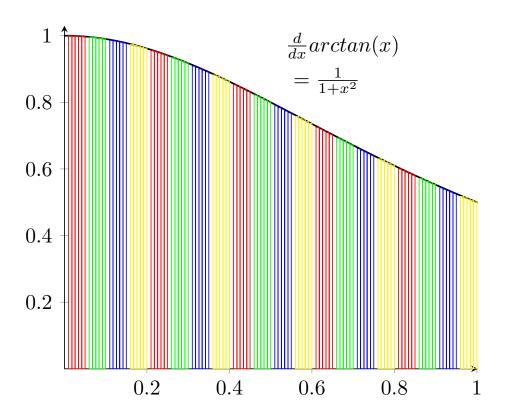
Option 1



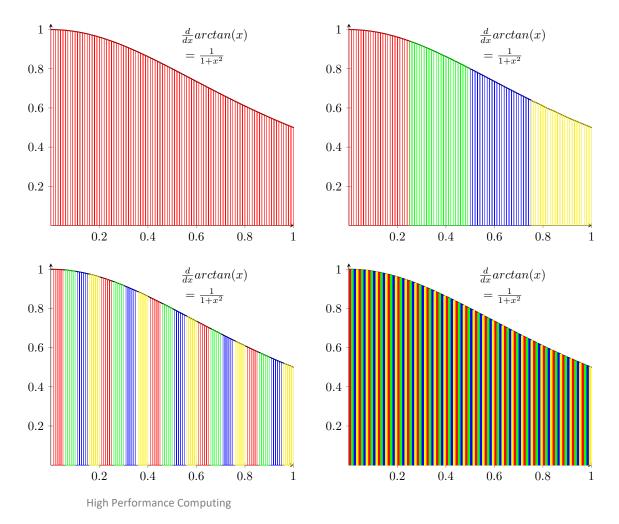
Option 2



Option 3



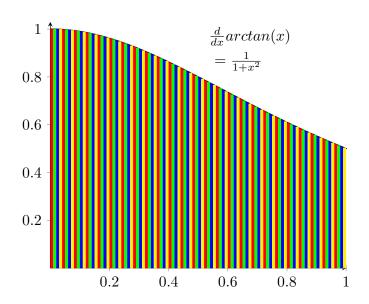
Which is the best choice?

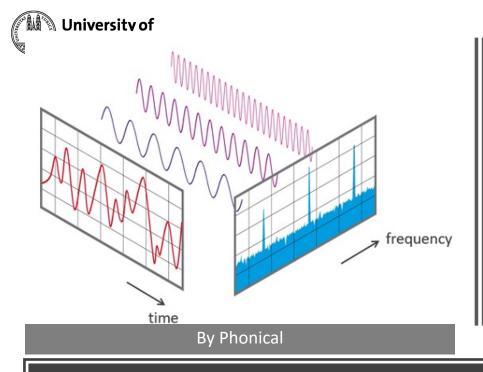


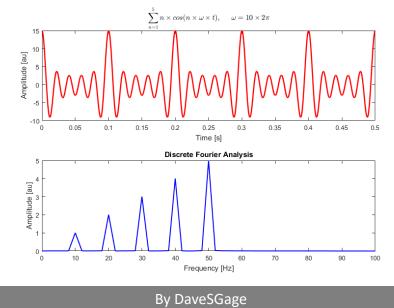


The MPI version of cpi

```
MPI Init(&argc, &argv);
                                                  /* Connect processes to each other */
MPI Comm size(MPI COMM WORLD, &numprocs);  /* Get total number of processes */
MPI Comm rank(MPI COMM WORLD, &myid);  /* Rank of this process */
MPI Get processor name (name, &resultlen);
printf("This is Process-%d/%d running on %s \n", myid, numprocs, name);
MPI Barrier (MPI COMM WORLD);
if(myid == 0) {
   printf("This program uses %d processes\n", numprocs);
     n = 10000000000;
MPI Bcast(&n, 1, MPI INT, 0, MPI COMM WORLD); /* Send n from 0 to all others */
sum = 0.0;
h = 1.0/n;
for (i=myid+0.5; i<n; i+=numprocs) {
     sum += dx arctan(i*h);
mypi' = 4.0*h*sum;
/* Add all partial sums to each other and send to rank 0 */
MPI_Reduce(&mypi, &pi, 1, MPI_DOUBLE, MPI_SUM, 0, MPI_COMM_WORLD);
if (mvid == 0) {
     printf("pi is approximately %.16f\n",pi);
MPI finalize();
                                                           /* Disconnect all processes */
```

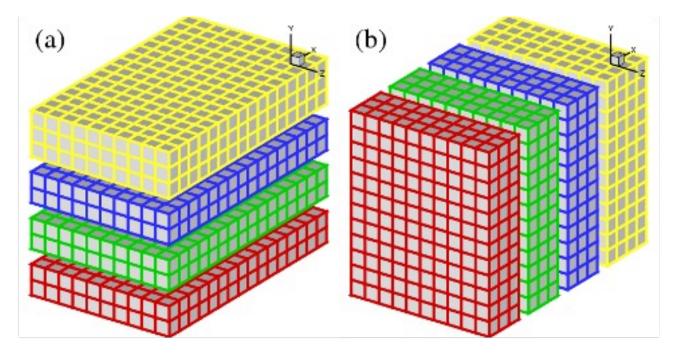




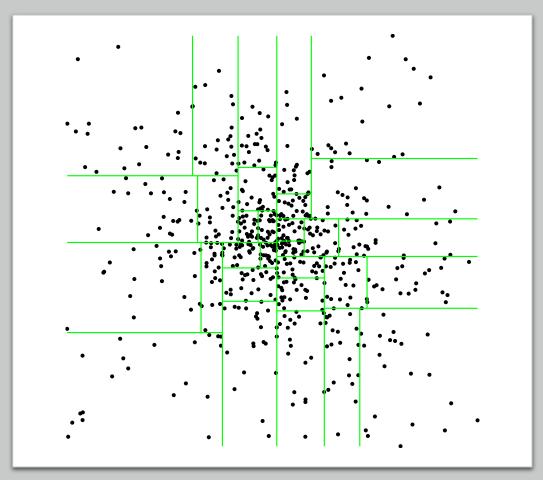


Fast Fourier Transform





http://2decomp.org



Particle Data (N-Body)