High Performance Computing Systems (CMSC714)





Abhinav Bhatele, Department of Computer Science

Summary of last lecture

- Shared-memory programming and OpenMP
- Fork-join parallelism
- OpenMP vs MPI: ease of programming, performance



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Performance analysis

- Parallel performance of a program might not be what the developer expects
- How do we find performance bottlenecks?
- Two parts to performance analysis: measurement and analysis/visualization
- Simplest tool: timers in the code and printf





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Using timers

double start, end; double phase1, phase2, phase3;

```
start = MPI_Wtime();
 ... phasel code ...
end = MPI Wtime();
phase1 = end - start;
```

```
start = MPI Wtime();
 ... phase2 ...
end = MPI_Wtime();
phase2 = end - start;
```

```
start = MPI_Wtime();
 ... phase3 ...
end = MPI_Wtime();
phase3 = end - start;
```



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Using timers

double start, end; double phase1, phase2, phase3;

```
start = MPI_Wtime();
 ... phase1 code ...
end = MPI Wtime();
phase1 = end - start;
```

```
start = MPI_Wtime();
 ... phase2 ...
end = MPI_Wtime();
phase2 = end - start;
```

```
start = MPI Wtime();
 ... phase3 ...
end = MPI_Wtime();
phase3 = end - start;
```



Phase I took 2.45 s

Phase 2 took 11.79 s

Phase 3 took 4.37 s

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Performance Tools

- Tracing tools
 - Capture entire execution trace
 - Vampir, Score-P
- Profiling tools
 - Provide aggregated information
 - Typically use statistical sampling
 - Gprof, pyinstrument, cprofile
- Many tools can do both
 - TAU, HPCToolkit, Projections



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Metrics recorded

- Counts of function invocations
- Time spent in code
- Number of bytes sent
- Hardware counters
- To fix performance problems we need to connect metrics to source code



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Tracing tools

• Record all the events in the program with timestamps

• Events: function calls, MPI events, etc.

Vampir visualization: <u>https://hpc.llnl.gov/software/development-environment-software/vampir-vampir-server</u>



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Tracing tools

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Tracing tools

Record all the events in the program with timestamps

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Profiling tools

- Ignore the specific times at which events occurred
- Provide aggregate information about different parts of the code
- Examples:
 - Gprof, perf
 - mpiP
 - HPCToolkit, caliper
- Python tools: cprofile, pyinstrument, scalene



gprof Data	Q Enter filter	text		🔵 🕀 🖪 🖽
4 bytes per bucket, each sample counts	as 10.000ms			
Name (location)	Samples	Calls	Time/Call	% Time
▼Summary	2228			100.0%
►calc.c	590			26.48%
▶ copy.c	0			0.0%
▶diag.c	25			1.12%
▶main.c	0			0.0%
▶time.c	653			29.31%
▼tstep.c	958			43.0%
▼tstep	958	10000	957.999us	43.0%
tstep (tstep.c:47)	1			0.04%
tstep (tstep.c:48)	62			2.78%
tstep (tstep.c:49)	46			2.06%
tstep (tstep.c:50)	46			2.06%
tstep (tstep.c:51)	48			2.15%
tstep (tstep.c:58)	101			4.53%
tstep (tstep.c:59)	135			6.06%
tstep (tstep.c:60)	120			5.39%
tstep (tstep.c:61)	126			5.66%
tstep (tstep.c:66)	3			0.13%
tstep (tstep.c:67)	108			4.85%
tstep (tstep.c:68)	63			2.83%
tstep (tstep.c:69)	43			1.93%
tstep (tstep.c:70)	56			2.51%
	-			

Gprof data in hpctView

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Calling contexts, trees, and graphs

- Calling context or call path: Sequence of function invocations leading to the current sample
- Calling context tree (CCT): dynamic prefix tree of all call paths in an execution
- Call graph: merge nodes in a CCT with the same name into a single node but keep caller-callee relationships as arcs







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Contextual information

File Line number Function name Callpath Load module Process ID Thread ID

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File Line number Function name Callpath Load module Process ID Thread ID

Performance Metrics

- Time
- Flops
- Cache misses

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Questions?

Abhinav Bhatele 5218 Brendan Iribe Center (IRB) / College Park, MD 20742 phone: 301.405.4507 / e-mail: bhatele@cs.umd.edu