Performance Analysis with CrayPat

Part 2

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Outline

- Loop work estimates with CrayPat
 - How to prepare the code for collection of loop statistics.

Reveal

- Generate the program library.
- Use the GUI.

Profiling OpenMP

- Load balancing Analysis
 - Using Apprentice2
- Monitoring Power
- Craypat-lite

Loop Work Estimates

Assess suitability of loop nests for optimization

- Gives information on inclusive time spent in the loop nests and typical trip count of the loops.
- Only available with CCE. CrayPAT can generate this information via a special kind of tracing experiment. Just like adding automatic tracing at the function level, we can add tracing to individual loops

> module load perftools

• Makes the default version of CrayPAT available

- > ftn -c -h profile_generate himeno.f90
- > ftn -o himeno.exe himeno.o
- > pat_build -w[-u] himeno.exe
- Recompile your program for gathering loop statistics.
- It is recommended to turn off OpenMP and OpenACC for the loop work estimates via -h noomp -h noacc
- Instrument the application for tracing (APA also possible)

Loop Work Estimates

aprun -n 24 ./himeno.exe+pat

- Execute the instrumented program.
- This generates one or more raw data files(s) in .xf format.

> pat_report -o report.txt himeno.exe+pat*.xf

- Process the raw data files(s) for use with Reveal.
- This generates a performance data file *.ap2 and text report report.txt.
- Even without the -u option to pat_build in the previous step you will see user functions listed in the first table. These are routines containing loops.
- Consider the -O profile_loops option to pat_report to show the time spent in loops compared to other routines.
- Reveal can use the *.ap2 to visualize time expensive loops.

Table 2: Loop Stats by function

		Subroutine			Line	e numt	ber
	.oop Incl	Time	Loop	LOOD	Loop		unction=/.LOOP[.]
Incl	Time	(Loop	Hit	Trips	Trips	Trips	PE=HIDE
Time%	i	Àdj.)	i	Avg	Min	Max	
	· · · · · · · · · · · · · · · · · · ·						
93.0%	19.232051	0.000849	2	26.5	3	50	jacobi.LOOP.1.li.236
77.8%	16.092021	0.001350	53	255.0	255	255	jacobi.LOOP.2.li.240
77.8%	16.090671	0.110827	13515	255.0	255	255	jacobi.LOOP.3.li.241
77.3%	15.979844	15.979844	3446325	511.0	511	511	jacobi.LOOP.4.li.242
14.1%	2.906115	0.001238	53	255.0	255	255	jacobi.LOOP.5.li.263
14.0%	2.904878	0.688611	13515	255.0	255	255	jacobi.LOOP.6.li.264
10.7%	2.216267	2.216267	3446325	511.0	511	511	jacobi.LOOP.7.li.265
4.3%	0.881573	0.000010	1	259.0	259	259	initmt.LOOP.1.li.191
4.3%	0.881563	0.000645	259	259.0	259	259	<pre>initmt.LOOP.2.li.192</pre>
4.3%	0.880918	0.880918	67081	515.0	515	515	<pre>initmt.LOOP.3.li.193</pre>
2.7%	0.560499	0.000055	1	257.0	257	257	initmt.LOOP.4.li.210
2.7%	0.560444	0.006603	257	257.0	257	257	initmt.LOOP.5.li.211
2.7%	0.553842	0.553842	66049	513.0	513	513	<pre>initmt.LOOP.6.li.212</pre>

Nested Loops

Reveal

Compiler Feedack and Variable scoping

Reveal

- For an OpenMP port a developper has to understand the scoping of the variables, i.e. whether variables are shared or private.
- Reveal is Cray's next-generation integrated performance analysis and code optimization tool.
 - Source code navigation using whole program analysis (data provided by the Cray compilation environment.)
 - Coupling with performance data collected during execution by CrayPAT. Understand which high level serial loops could benefit from parallelism.
 - Enhanced loop mark listing functionality.
 - Dependency information for targeted loops
 - Assist users optimize code by providing variable scoping feedback and suggested compile directives.



Input to Reveal

> module load perftools

Makes the default version of CrayPAT available

> ftn -03 -hpl=my_program.pl -c my_program_file1.f90

> ftn -03 -hpl=my_program.pl -c my_program_file2.f90

Recompile only sources to generate program library my_program.pl

- The program library is most useful when generated from fully optimized code.
- Use absolute paths to specify the program library if necessary.

> reveal my_program.pl my_program.ap2 &

• After the collection of performance data in a separate experiment and generation of a program libary you can launch Reveal.

• The *.ap2 is from a loop work estimate of my_program

- You can omit the *.ap2 and inspect only compiler feedback.
- Note that the profile_generate option disables most automatic compiler optimizations, which is why Cray recommends generating this data separately from generating the program_library file.

Reveal with Loop Work Estimates



Visualize CCE's Loopmark with Performance Profile



Visualize CCE's Loopmark with Performance Profile (2)



View Pseudo Code for Inlined Functions



Scoping Assistance – Review Scoping Results



Scoping Assistance – User Resolves Issues



Scoping Assistance – Generate Directive



OpenMP data collection and reporting

• For programs that use the OpenMP

- CrayPat can measure the overhead incurred by entering and leaving parallel regions and work-sharing constructs within parallel regions
- Show per-thread timings and other data.
- Calculate the load balance across threads for such constructs.

For programs that use both MPI and OpenMP

- Profiles by default show the load balance over PEs of the average time in the threads for each PE
- But you can also see load balances for each programming model separately.

Options for pat_report

- profile_pe_th (default view)
 - Imbalance based on the set of all threads in the program
- profile_pe.th
 - Highlights imbalance across MPI ranks
 - Uses max for thread aggregation to avoid showing under-performers
 - Aggregated thread data merged into MPI rank data
- profile_th_pe
 - For each thread, show imbalance over MPI ranks
 - Example: Load imbalance shown where thread 4 in each MPI rank didn't get much work

OpenMP data collection and reporting

- OpenMP support enabled by default with CCE
- OpenMP tracing calls inserted by default when perftools is loaded.



Work sharing

construct

Load Imbalance Analysis

- Imbalance time is a metric based on execution time and is dependent on the type of activity:
 - User functions
 Imbalance time = Maximum time Average time
 - Synchronization (Collective communication and barriers)
 Imbalance time = Average time Minimum time
 - Identifies computational code regions and synchronization calls that could benefit most from load balance optimization
 - Estimates how much overall program time could be saved
 - if corresponding section of code had a perfect balance.
 - Represents upper bound on "potential savings"
 - Assumes other processes are waiting, not doing useful work while slowest member finishes.



Load Imbalance Analysis

 Imbalance time percentage represents the percentage of resources available for parallelism that is "wasted".

Imbolonoo% - 100 V	Imbalance time	_ <u>N</u>
$1110a1a10e\% = 100 \times$	Max Time	- ^ <u>N - 1</u>

- Corresponds to percentage of time
- that rest of team is not engaged in useful work on the given function.
- Perfectly balanced code segment has imbalance of zero percentage.
- Serial code segment has imbalance of 100 percent.

Time%	Time	Imb.	Imb.	Calls Group
		Time	Time%	Function
				PE=HIDE
100.0% 20	.643909			1149.0 Total
98.8% 20	ð.395989			219.0 USER
91.1% 1	L8.797060 (0.115535	0.7%	2.0 jacobi
7.7%	1.597866 (0.006647	0.5%	1.0 initmt
1.2% 0	0.239306			871.0 MPI
0.7%	0.148981 0	0.094595	44.4%	159.0 MPI_Waitall
0.4%	0.085824 0	0.023669	24.7%	318.0 MPI_Isend

Load Imbalance Analysis

- MPI Sync time measures load imbalance in programs instrumented to trace MPI functions to determine if MPI ranks arrive at collectives together
 - Separates potential load imbalance from data transfer
 - Sync times reported by default if MPI functions traced
 - If desired, PAT_RT_MPI_SYNC=0 deactivates this feature
 - Only reported for tracing experiments.

Time% Time Imb. Time 	Imb. Calls Group Time% Function PE=HIDE
100.0% 20.643909 	1149.0 Total
 0.0% 0.008614	59.0 MPI_SYNC
0.0% 0.006696 0.00662	7 99.0% 2.0 MPI_Barrier(sync)
0.0% 0.001802 0.00139	9 77.6% 55.0 MPI_Allreduce(sync)
0.0% 0.000061 0.00005	2 86.3% 1.0 MPI_Init(sync)
0.0% 0.000056 0.00005 =================================	1 91.7% 1.0 MPI_Finalize(sync)

Causes and hints

• What is causing the load imbalance?

- Need profiler reports like CrayPAT gives for the 'where'
- Need application expertise for the 'why'

Computation

- Is decomposition appropriate?
- Would reordering ranks help?

Communication

- Is decomposition appropriate?
- Would reordering ranks help?
- Are receives pre-posted?
- Any All-to-1 communication?

• 1/0

 synchronous single-writer I/O will cause significant load imbalance already with a couple of MPI tasks (More on IO tomorrow)

Rank placement

• The default ordering can be changed using the following environment variable:

export MPICH_RANK_REORDER_METHOD=N

- These are the different values (N) that you can set it to:
 - N=0: Round-robin placement Sequential ranks are placed on the next node in the list.
 0, 1, 2, 3, 0, 1, 2, 3 (8 tasks on 4 nodes, 2 tasks per node)
 - N=1: (DEFAULT) SMP-style- (block-) placement
 0, 0, 1, 1, 2, 2, 3, 3 (8 tasks on 4 nodes, 2 tasks per node)
 - N=2: Folded rank placement
 0, 1, 2, 3, 3, 2, 1, 0 (8 tasks on 4 nodes, 2 tasks per node)
 - N=3: **Custom** ordering. The ordering is specified in a file named MPICH_RANK_ORDER.

Rank placement with CrayPat

• When is rank placement a priori useful?

- Point-to-point communication consumes a significant fraction of program time and a load imbalance detected
- Also shown to help for collectives (alltoall) on subcommunicators
- Spread out I/O servers across nodes

CrayPat can provide the following feedback

======================================	# The 'Custom' rank order in this file targets nodes with multi-core
MPI Grid Detection:	<pre># processors, based on Sent Msg Total Bytes collected for: #</pre>
There appears to be point-to-point MPI communication in a 4 X 2 X 8 grid pattern. The execution time spent in MPI functions might be reduced with a rank order that maximizes communication between ranks on the same node. The effect of several rank orders is estimated below. A file named MPICH_RANK_ORDER.Grid was generated along with this report and contains usage instructions and the Hilbert rank order	<pre># Program: /lus/nid00030/heidi/sweep3d/mod/sweep3d.mpi # Ap2 File: sweep3d.mpi+pat+27054-89t.ap2 # Number PEs: 48 # Max PEs/Node: 4 # # To use this file, make a copy named MPICH_RANK_ORDER, and set the</pre>
from the following table.	<pre># environment variable MPICH_RANK_REORDER_METHOD to 3 prior to</pre>
Rank On-Node On-Node MPICH_RANK_REORDER_METHOD Order Bytes/PE Bytes/PE% of Total Bytes/PE	<pre># executing the program. # # The following table lists rank order alternatives and the grid_order # command-line options that can be used to generate a new</pre>
Hilbert5.533e+1090.66%3Fold4.907e+1080.42%2SMP4.883e+1080.02%1RoundRobin3.740e+1061.28%0	order. 0,532,64,564,32,572,96,540,8,596,72,524,40,604,24,588 104,556,16,628,80,636,56,620,48,516,112,580,88,548,120,612 1,403,65,435,33,411,97,443,9,467,25,499,105,507,41,475
	73, 395, 81, 427, 57, 459, 17, 419, 113, 491, 49, 387, 89, 451, 121, 483

Hybrid MPI + OpenMP?

OpenMP may help

- Able to spread workload with less overhead
- Large amount of work to go from all-MPI to (better performing) hybrid must accept challenge to hybridize large amount of code

• When does it pay to add OpenMP to my MPI code?

- Add OpenMP when code is network bound
- Adding OpenMP to memory bound codes may aggravate memory bandwidth issues, but you have more control when optimizing for cache
- Look at collective time, excluding sync time: this goes up as network becomes a problem
- Look at point-to-point wait times: if these go up, network may be a problem
- If an all-to-all communication pattern becomes a bottleneck, hybridization often overcomes this
- Hybridization can be used to avoid replicated data

Cray Apprentice²

 Cray Apprentice2 is a post-processing performance data visualization tool. Takes *.ap2 files as input.

Main features are

- Call graph profile
- Communication statistics
- Time-line view for Communication and IO.
- Activity view
- Pair-wise communication statistics
- Text reports
- Source code mapping
 - > module load perftools
 - > app2 my_program.ap2 &

- Cray Apprentice² helps identify:
 - Load imbalance
 - Excessive communication
 - Network contention
 - Excessive serialization
 - I/O Problems

Cray Apprentice²



Call Tree View



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Call Tree View – Function List



Apprentice² Call Tree View of Sampled Data



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Load Balance View (from Call Tree)

Ele v sweep3d+tr-u+mpi96p.ap2 v swim+tr16p.ap2 () () () () () () () () () ()		Min, Avg, and Max Values	
PE Call Graph Load Balance PE Calls PE #33	Load Balance: MPI_Bcast		-1, +1 Std Dev marks

Time Line View

- Full trace (sequence of events) enabled by setting PAT_RT_SUMMARY=0
- Helpful to see communication bottlenecks.
- Use it only for small experiments !



Time Line View (Zoom)

▼swim+iompi+1566td.ap2 ▼T+hw1+swp+io+mpi+48p.ap2	
	_
Overview Function Traffic Report Text Report Activity Counters Plot HW Counters Overview Frates 3,564 3,608 3,652 3,695 3,739 3,783 3,926 3,970 3,914 3,958 4,001 PE #0 Image: State	
PE #13 PE #15 PE #16 PE #17 PE #17 PE #18 PE #19 PE #19 PE #20 PE #20 PE #22 PE #22	
Image: Second Control of	
0.00 1.15 2.30 3.45 4.61	

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Time Line View (Fine Grain Zoom)



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Monitoring Power

(Courtesy of Heidi Poxon)

Monitoring Power on Intel

- Feedback to the user on performance and power consumption will be key to understanding the behavior of an applications on future systems.
- To see a list of events, execute the following on compute node:

> aprun papi_native_avail -i crayrapl

> aprun papi_native_avail -i craypm

 See rap1(5) and pmpc(5) man pages for more information

Intel's RAPL (Running Average Power Level)

- Provides mechanism to enforce power consumption limit. Also facilitates the ability to measure energy consumption on SNB and IVB processors
- 32-bit counter measurements available on a per socket basis with update frequency of approximately 1 millisecond

• 7 monitoring counter events available

- Provides dynamic readings from various components of the socket
- Constant values are available for thermal specifications, max and min power caps, and time windows

Event	Description
PACKAGE_ENERGY	Total amount of energy consumed by socket
PP0_ENERGY	Total amount of energy consumed by the cores
DRAM_ENERGY	Total amount of energy consumed by the DRAM

Cray Power and Energy Management Counters

- Support CLE Intel power and energy management performance counters
- Provides compute node-level access to additional power management counters at the application level
- Enables user to monitor and report energy usage during program execution for both CPU and GPU

Event	Description
PM_POWER_CAP:NODE	Compute node power cap
PM_POWER:NODE	Compute node point in time power
PM_ENERGY:NODE	Compute node accumulated energy
PM_POWER_CAP:ACC	Accelerator power cap
PM_POWER:ACC	Accelerator point in time power
PM_ENERGY:ACC	Accelerator accumulated energy

Accessing Power Information

- > export PAT_RT_PERFCTR=PM_ENERGY:NODE
- > export PAT_RT_PERFCTR=PACKAGE_ENERGY

RAPL counters

- Launch application with aprun -cc cpu to bind MPI ranks to sockets
- Counters collected by processor 0 on each socket (assuming the application is running on processor 0)
- 32-bit RAPL counters have a wraparound time of approximately 60 seconds when power consumption is high

Cray PM counters

- Collected by processor 0 on each node (assuming the application is running on processor 0)
- Counter collection has high overhead (RAPL higher than Cray PM). It's best not to collect performance information at the same time

PM Counters for CP2K MPI+OpenMP on IVB

USER / process_mm_stacks	\$dbcsr_mm_stack		
Time% Time Imb. Time Imb. Time% Calls PM_ENERGY:NODE	0.005M/sec 51.384 /sec	2.0% 15.642021 7.142276 32.7% 72311.2 803.750	secs secs calls J
USER / build_core_hami	 ltonian_matrix\$	======================================	=== niltoniar
Time% Time Imb. Time Imb. Time% Calls PM_ENERGY:NODE	1.902 /sec 42.847 /sec	1.5% 11.564295 2.392148 17.9% 22.0 495.500	secs secs calls J



Light-weight application profiling

CrayPat-lite Overview

- Provide automatic application performance statistics at the end of a job. Focus is to offer a simplified interface to basic application performance information for users not familiar with the Cray performance tools and perhaps new to application performance analysis.
- The tool is enabled by loading a module and rebuild
 - > module load perftools-lite
 - > make clean && make
- Program is automatically relinked to add instrumentation in a.out (pat_build step done for the user)
 - .o files are automatically preserved
 - No modifications are needed to a batch script to run instrumented binary, since original binary is replaced with instrumented version
 - pat_report is automatically run before job exits.
 - Performance statistics are issued to stdout
 - User can use "classic" CrayPat for more in-depth performance investigation



Predefined Set of Performance Experiments

- Set of predefined experiments, enabled with the CRAYPAT_LITE environment variable (before compilation)
 - sample_profile
 - event_profile

• The sample_profile is equivalent to

- > pat_build -O apa a.out
- Includes collection of summary CPU performance counters around MAIN
- Includes Imbalance information.

• The event_profile is equivalent to

- > pat_build -u -gmpi a.out
- Provides profile based on summarization of events.
- Includes OpenMP if these models are used within program.
- Collection of summary CPU performance counters
- Filter to only trace functions above 1200 bytes
 - In most cases, omits tiny repetitive functions that can perturb results.

Performance Statistics Available

Job information

- Number of MPI ranks, …
- Wallclock
- Memory high water mark
- Performance counters (CPU only)

Number of PEs (MPI ranks): 64 Numbers of PEs per Node: 32 PEs on each of 2 Nodes Numbers of Threads per PE: 1 Number of Cores per Socket: 16 Execution start time: Fri Feb 15 14:42:24 2013

Wall Clock Time: 122,608994 secs High Memory: 45.70 MBytes

Profile of top time consuming routines with load balance

	Samp% Samp Imb. Imb. Group Samp Samp% Function PE=HIDE	Time% Time Imb. Calls Group Time Time% Innction PE=HIDE PE=HIDE PE=HIDE PE=HIDE PE=HIDE
100	100.0% 14272.5	100.0% 101.961423 - - 5315211.9 Total
	46.0% 6561.4 - - USER	92.5% 94.267451 - - 5272245.9 USER
	5.9% 847.6 155.4 15.7% collocate_core_1_ 4.9% 700.3 125.7 15.5% integrate_core_2_ 3.8% 544.0 124.0 18.9% collocate_core_2_ 3.7% 523.1 73.9 12.6% integrate_core_1_	75.8% 77.248585 2.356249 3.0% 1001.0 LAMMPS_NS::PairLJCut::compute 6.5% 6.644545 0.105246 1.6% 51.0 LAMMPS_NS::Neighbor::half_bin_newton 4.1% 4.131842 0.634032 13.5% 1.0 LAMMPS_NS::Verlet::run 3.8% 3.841349 1.241434 24.8% 5262868.9 LAMMPS_NS::Pair::ev_tally
	29.7% 4239.6 - - MPI	1.3% 1.288463 0.181268 12.5% 1000.0 LAMMPS_NS::FixNVE::final_integrate
	9.3% 1328.3 198.7 13.2% mpi_alltoallv	7.0% 7.110931 - - 42637.0 MPI
	4.2% 598.5 /1.5 10.8% mpi_wartall 2.9% 413.8 107.2 20.9% MPI_WAITANY 2.9% 409.1 66.9 14.3% MPI_Comm_create	4.8% 4.851309 3.371093 41.6% 12267.0 MPI_Send 1.5% 1.536106 2.592504 63.8% 12267.0 MPI_Wait
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Observations and Instructions on how to get more info.