



















#### Cray Performance Tools Enhancements for Next Generation Systems Heidi Poxon

















## Recent Enhancements

# • Support for Cray systems with KNL

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# **Cray Performance Analysis Tools Overview**

Assist the user with application performance analysis and optimization

- Help user identify important and meaningful information from potentially massive data sets
- Help user identify problem areas instead of just reporting data
- Bring optimization knowledge to a wider set of users

### • Focus on ease of use and intuitive user interfaces

- Automatic program instrumentation
- Automatic analysis

#### • Whole program analysis across many nodes

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# **Two Modes of Use**



- CrayPat-lite for novice users, or convenience
- CrayPat for in-depth performance investigation and tuning assistance

# • Both offer:

- Whole program analysis across many nodes
- Indication of causes of problems
- Suggestions of modifications for performance improvement



#### Load performance tools modules

> module load perftools-lite

#### Build program

#### (no modification to makefile)

> make



a.out (instrumented program)

#### **Run program**

(no modification to batch script)

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> aprun a.out

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Condensed report to stdout a.out\*.rpt (same as stdout) a.out\*.ap2 files

# **Example CrayPat-lite Output**

******	#
#	#
# CrayPat-lite Performance Statistics	#
#	#
*****	#
CrayPat/X: Version 6.3.2.461 Revision 56930ff 02/01/16 15:31:3	3
Experiment: lite lite/sample_profile	
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: Tue Feb 2 18:53:50 2016	
System name and speed: kay 2301 MHz (approx)	
Avg Process Time: 64.38 secs	
High Memory: 1.563 MBytes 24.43 MBytes per PE	
MFLOPS: Not supported (see observation below)	
I/O Read Rate: 48.514130 MBvtes/sec	
I/O Write Rate: 22.281350 MBytes/sec	
Avg CDI Energy: 41 820 joules 20 910 joules per node	
Avg CDI Dower: 649 53 watts 324 77 watts per node	/
Avg cro rower. 045.55 watts 524.77 watts per noue	

Table 1: Profile by Function Group and Function (top 10 functions shown)

	Samp%     	Samp     	Imb.   Imb.  Group Samp   Samp%   Function   PE=HIDE	
	100.0%   0	5,156.2	Total	
ļ	66.3%	4,082.5	USER	
ł	11.8%	729.2	48.8   6.4%  mult su3 mat vec sum 4dir	
i	10.2%	629.4	49.6 7.4%  mult_adj_su3_mat_4vec	
Ì	6.1%	377.1	28.9   7.2%  mult_su3_nn	
	5.9%	365.4	42.6   10.6%  mult_su3_na	
	5.4%	329.4	37.6   10.4%  scalar_mult_add_lathwvec_proj	j
	3.8%	232.9	39.1   14.6%  mult_su3_sitelink_lathwvec	
	========			
	25.3%	1,557.0	MPI	
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		411.9		
	4.9%	300.2	95.8   24.6%  MPI_Allreduce	
	==========			
1	5.9%	365.4	44.6   11.1%  STRING	_
	5.9%	365.4	44.6   11.1%  memcpy	
1				

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# **Guidance: How Can I Learn More?**

MPI utilization:

The time spent processing MPI communications is relatively high. Functions and callsites responsible for consuming the most time can be found in the table generated by **pat\_report -O callers+src** (within the MPI group).

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#### **Guidance: Reduce Shared Resource Contention**

Metric-Based Rank Order:

When the use of a shared resource like memory bandwidth is unbalanced across nodes, total execution time may be reduced with a rank order that improves the balance.

A file named MPICH\_RANK\_ORDER.USER\_Time was generated along with this report and contains usage instructions and the custom rank order from the following table.

Rank	Node	Reduction	Maximum	Average
Order	Metric	in Max	Value	Value
	Imb.	Value		
Current	15.46%		1.134e+03	9.588e+02
Custom	1.46%	14.202%	9.731e+02	9.588e+02

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# **Highlights Since Last CUG**

- New perftools-base and instrumentation modules (6.3.0)
- Sampling over time and gnuplots (6.2.3)
- Apprentice2 sampling over time plots with call stack (6.3.0)
- Apprentice2 MPI communication pattern in summary mode (6.3.0)
- Observation for helper threads in reports (6.3.0)
- Performance data comparison in Apprentice2 (6.3.1)

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# **Evaluate Scaling with Cray Apprentice2**



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### **Energy Consumption Over Time (XC Systems)**



# Support for Cray Systems with KNL

#### Port



#### Analyze



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# **Overview of Support for KNL**

#### • CrayPat and CrayPat-lite

- Identifies top time consuming routines, work load imbalance, MPI rank placement strategies, etc.
- Enhanced program memory high water mark
  - Broken down into DDR and MCDRAM memory
- Report active allocations at samples or during tracing at the function level

## • PAPI

#### • Cray Apprentice2

• Helps identify load imbalance, excessive communication, network contention, excessive serialization

#### • Reveal support for adding OpenMP and allocating in MCDRAM

# **Functionality Coming in 2016**

# MCDRAM configuration information

# • New trace groups for

- MemKind, HBW, CrayMem
- OpenCL
- Lustre API
- Parallel NetCDF

# Support for Charm++

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# Example: MCDRAM Configuration Information

```
CrayPat/X: Version 6.4.X Revision e82c848 04/29/16 14:13:55
Number of PEs (MPI ranks):
                           64
Numbers of PEs per Node: 1 PE on each of 64 Nodes
Numbers of Threads per PE:
                           1
. . .
Execution start time: Mon May 2 15:54:21 2016
Intel knl CPU ....
MCDRAM: 16 GiB available as snc2, cache (100% cache) for 16 PEs
MCDRAM: 16 GiB available as snc2, flat ( 0% cache) for 16 PEs
MCDRAM: 16 GiB available as snc4, flat ( 0% cache) for 1 PE
MCDRAM: 16 GiB available as quad, flat ( 0% cache) for 15 PEs
MCDRAM: 16 GiB available as quad, equal ( 50% cache) for 16 PEs
```

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# **Adding OpenMP with Reveal**

Reveal OpenMP Scopia



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								sweepz.190:Loop@51			
e o o X Reveal									Call or I/O at line 81 of sweepz.f90	L	
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vhone.pl 🔯					Name		Type	Scor	)e	Info	
Navigation		Source - /lus/nid00	0030/heidi/	Whone/sweepz.f90	1		Array	Unre	solved	FAIL: Last defining iteration not known for variable that is live on exit.	
Top coops	✓ 34						-			WARN: LastPrivate of array may be very expensive.	4
v par v PAF	RABOLA		50 #end	lif	flat I		Array	Unre	solved	FAIL: Last defining iteration not known for variable that is live on exit.	4
0.7166 Loc	op@67	LS	51 do j	= 1, js						WARN: LastPrivate of array may be very expensive.	4
v rier	mann.f90		52 00	1 = 1, 1SZ adjus = Zyc(i+mypez*isz)	р		Array	Unre	solved	FAIL: Last defining iteration not known for variable that is live on exit.	4
2.2982 Loc	op@63		54 t	theta = zyc(j+sypey*js)						WARN: LastPrivate of array may be very expensive.	41
1.4100 Loc	op@64		55 s	stheta = sin(theta)	qI		Array	Unre	solved	FAIL: Last defining iteration not known for variable that is live on exit.	
v sw v SW	VEEPZ		56 r	radius = radius * stheta						WARN: LastPrivate of array may be very expensive.	
3.7464 Loc	op@251 🛑		58 !	Put state variables into 1D	delp1		Scalar	Priva	te		
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v sw	VEEPY	LL18	60	do k = 1, ks	deltx		Scalar	Priva	ite		
3.9347 Loc	op@35 😑		61	n = k + ks*(m-1) + 6	dtheta		Scalar	Priva	te		
3.9342 Loc	op@36 eepx1.590		63	p(n) = recv3(2, j, k, i, m)	dvol I		Array	Priva	ite	FAIL: incompatable with 'natural' scope.	
🗢 SW	VEEPX1 😑		64	u(n) = recv3(5,j,k,i,m)						WARN: LastPrivate of array may be very expensive.	
3.8855 Loc	op@231 😑		65	v(n) = recv3(3, j, k, i, n)	dx		Array	Priva	te	FAIL: incompatable with 'natural' scope.	
	eepx2.190		67	f(n) = recv3(6, j, k, i, n)						WARN: LastPrivate of array may be very expensive.	
v sw	VEEPX2		68	enddo	ChdD		Array	Priva	te	FAIL: incompatable with 'natural' scope.	
3.9166 Loc 3.9164 Loc	op@31 op@32									WARN: LastPrivate of array may be very expensive.	
	- Felor	A loop starting a	at line 51 w	as not vectorized because it contains	е		Array	Priva	te	FAIL: incompatable with 'natural' scope.	
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COMPLITE

#### Navigate to relevant loops to parallelize

- Identify parallelization and scoping issues
- Get feedback on issues down the call chain (shared reductions, etc.)
- Insert parallel directives into source for performance portable code
- Validate scoping correctness on existing directives

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# **More Information for C/C++ Programs**



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# More Information for C/C++ Programs (2)

			X Reveal OpenMP Scoping		
icope Lo	ops Sco	ping Resul	ts Footnote		
			m_mat_an.c: Loop@39		
ame	Туре	Scope	Info		
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# **Reveal Auto-Parallelization**

- Build an experimental binary that includes automatic runtime-assisted parallelization
- No source code changes required to see if high level loops that contain calls can be automatically parallelized
- Result includes parallelization of serial loops via traditional OpenMP as well as more extensive loop optimizations
- User Workflow:
  - 1. Obtain **loop work estimates** using CCE 8.5 and perftools-liteloops from perftools/6.4.0
  - 2. Use Reveal and CCE's program library to **parallelize loops and** create experimental binary
  - 3. Run experimental binary and compare performance against baseline
  - 4. If auto-parallelization is successful, use Reveal to insert parallel directives into source



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# **Examples of Reveal Analysis Feedback**

00	X Reveal	
<u>File E</u> dit <u>View H</u> elp		
▼mg.pl 😹		50.0
NavigationrSout	urce - /home/heidi/demos/NPB/NPB3.2-MPI-mg/MG/mg.f	O O X Reveal OpenMP Scoping
🔺 Loop Performance 🛛 🔽 🏟	<u> ↑ U</u> p 👎 <u>D</u> own 🔚 Save 🎄	Scope Loops Scoping Results Build Results
▶ 12.5484 MG MPI@245 ★	663	Your binary was rebuilt with the following changes.
✓ 6.5747 MG_MPI@664 ★	Fg 664 do i3=2,n3-1	✓ /home/heidi/demos/NPB/NPB3.2-MPI-mg/MG/mg.f
0.1878 Instance #1	<b>F</b> 665 do i2=2,n2-1	OMP loop at line 596
0.2593 Instance #2	r FVr 4 666 do il=1,nl	OMP loop at line 664
0.0130 Instance #3	667 ul(il) = u(il,i2-1,i3) + u(il,i2+1,i3)	OMD lean at line 750
2.8343 Instance #4 2.8454 Instance #5	668 > + u(i1,i2,i3-1) + u(i1,i2,i3+1)	
0.1455 Instance #6	669 u2(i1) = u(i1,i2-1,i3-1) + u(i1,i2+1,i3-1)	OMP loop at line 834
0.1447 Instance #7	670 > + u(i1,i2-1,i3+1) + u(i1,i2+1,i3+1)	OMP loop at line 995
0.1448 Instance #8	671 enddo	OMP loop at line 1154
▶ 6.5736 MG_MPI@665 ★	FVr4 672 do 11=2, n1-1	Autothreaded loop at line 1199
▶ 3.8584 MG_MPI@666 ★		Autothreaded loop at line 1213
▶ 2.8689 MG_MPI@596 ★	n - Line 664	Autothreaded loop at line 1262
▶ 2.8683 MG_MPI@597 ★	A loop starting at line 664 was scoped without errors.	Autotineaded loop at line 1202
V 2.5819 MG_MPI@672 ★	A loop starting at line 664 is flat (contains no external calls).	Autothreaded loop at line 1276
	A loop starting at line 664 was not vectorized because a recurrence was found on "u1" between lines 667 ar	Autothreaded loop at line 1326
	A loop starting at line 664 was partitioned.	Autothreaded loop at line 1335
	A loop starting at line 665 is flat (contains no external calls).	Autothreaded loop at line 1370
▶ 1.0593 MG MPI@834 ↔	A loop starting at line 665 was not vectorized because a recurrence was found on "u1" between lines 667 ar	Autothreaded loop at line 1379
▶ 1.0590 MG MPI@835 ★	A loop starting at line 666 is flat (contains no external calls).	OMP loop at line 2173
▶ 1.0583 MG_MPI@750 ★	A loop starting at line 666 was unrolled 4 times.	OMD leap at line 2475
▶ 1.0580 MG_MPI@753 ★	A loop starting at line 666 was vectorized.	
▶ 1.0363 MG_MPI@604 🗙	A loop starting at line 672 is flat (contains no external calls).	
▶ 0.9935 MG_MPI@1154 🗙 🚽 🧧	A loop starting at line 6/2 was unrolled 4 times.	Close
	a loop starting at line 672 was vectorized.	
/home/heidi/demos/NPB/NPB3.2-MPI-mg/bin/m	ng.C.16+17976-76t.ap2 loaded.	
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# **Reveal Auto-Parallelization Recap**

- Minimal user time investment includes time to set up and run optimization experiment
  - Collect loop work estimates
  - Build program library
  - Click button in Reveal
  - Run experimental binary and compare against original program
- Even if experiment does not yield a performance improvement, Reveal will provide insight into parallelization issues
- Targeted for KNL, where a pure MPI solution cannot utilize all cores on a node
- Can be used on existing hardware (AMD Interlagos, Intel Haswell, etc.)
- Infrastructure will allow different optimization experiments in the future

# Coming Soon...

# Identifying Objects for Allocation in KNL MCDRAM

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# **FLOPS vs Data Movement / Data Locality**

- Next generation memory systems will be more complicated
  - Multi-tier hierarchies
  - NUMA domains
  - Complicated caches
- Data movement through the memory hierarchy is critical to performance
- Compared to the price of data movement, flops are "free"
- Monitoring and minimizing data movement within node and across nodes is key

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# Identifying Objects for Allocation in MCDRAM

- Is application predominantly memory intensive?
- Does application data all fit within MCDRAM?
- What data contributes most to memory bandwidth?
- Where is data allocated within program?

# **Reveal Data Allocation Assistance**

# Use combination of CrayPat and Reveal to identify data most relevant for allocation in MCDRAM

```
subroutine sweep (it, jt, kt, nm, isct, mm, mmo, mmi, mk, myid,
     1 hi, hj, hk, di, dj, dk, Phi, Phii,
     2 Src, Flux, Sigt,
     3 w,mu,eta,tsi, wmu,weta,wtsi, pn,
                                                                        c...AUTOMATIC ARRAYS
...
         do i = 1, it
                                                                          double precision Src(it,jt,kt,nm)
387
                                                                          double precision pn(mm,nm,8)
 388
            phi(i) = src(i,j,k,1)
                                                                          double precision Phi(it)
         end do
 389
         do n = 2, nm
 390
 391
           do i = 1, it
               phi(i) = phi(i) + pn(m,n,iq)*src(i,j,k,n)
 392
            end do
 393
 394
         end do
```

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# **Example Workflow**

- Enable data collection for memory analysis experiment and build program with CCE's program library feature
- Run program to collect data
- Pass program library and memory traffic data to Reveal
- Reveal shows best candidates for allocation in MCDRAM and identifies points of allocation
- Reveal helps insert allocation directives into source

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- Users continue to need tools to help find critical performance bottlenecks within a program
- Cray performance tools offer functionality that reduces the time investment associated with porting and tuning applications on new and existing Cray systems







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