# Parallel Performance Evaluation With TAU

CSCADS 2009 Wyatt Spear wspear@cs.uoregon.edu http://tau.uoregon.edu



### **TAU Performance System® Project**

- <u>*T*</u>uning and <u>*A*</u>nalysis <u>*U*</u>tilities (15+ year project effort)
- Performance system framework for HPC systems
  - Integrated, scalable, and flexible
  - Target parallel programming paradigms
- Integrated toolkit for performance problem solving
  - Instrumentation, measurement, analysis, and visualization
  - Portable performance profiling and tracing facility
  - Performance data management and data mining

#### Partners

- LLNL, ANL, LANL
- Research Centre Jülich, TU Dresden



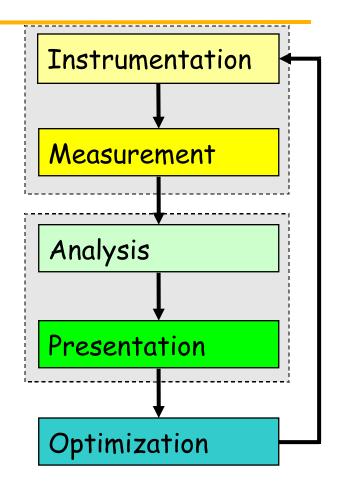
### What is TAU?

- TAU is a performance evaluation tool
- It supports parallel profiling and tracing
- Profiling shows you how much (total) time was spent in each routine
- Tracing shows you *when* the events take place in each process along a timeline
- TAU uses a package called PDT for automatic instrumentation of the source code
- Profiling and tracing can measure time as well as hardware performance counters from your CPU
- TAU can automatically instrument your source code (routines, loops, I/O, memory, phases, etc.)
- TAU runs on all HPC platforms and it is free (BSD style license)
- TAU has instrumentation, measurement and analysis tools
  - paraprof is TAU's 3D profile browser
- To use TAU, you need to set a couple of environment variables and substitute the name of your compiler with a TAU shell script



### **Performance Optimization Cycle**

- Expose factors
- Collect performance data
- Calculate metrics
- Analyze results
- Visualize results
- Identify problems
- Tune performance





### **Steps of Performance Evaluation**

- Collect basic routine-level timing profile to determine where most time is being spent
- Collect routine-level hardware counter data to determine types of performance problems
- Collect callpath profiles to determine sequence of events causing performance problems
- Conduct finer-grained profiling and/or tracing to pinpoint performance bottlenecks
  - Loop-level profiling with hardware counters
  - Tracing of communication operations



#### **Parallel Performance Properties**

- Parallel code performance is influenced by both sequential and parallel factors?
- Sequential factors
  - Computation and memory use
  - Input / output
- Parallel factors
  - Thread / process interactions
  - Communication and synchronization



#### **Performance Analysis Questions**

- How does performance vary with different compilers?
- Is poor performance correlated with certain OS features?
- Has a recent change caused unanticipated performance?
- How does performance vary with MPI variants?
- Why is one application version faster than another?
- What is the reason for the observed scaling behavior?
- Did two runs exhibit similar performance?
- How are performance data related to application events?
- Which machines will run my code the fastest and why?
- Which benchmarks predict my code performance best?



#### **TAU Parallel Performance System Goals**

- Portable (open source) parallel performance system
  - Computer system architectures and operating systems
  - Different programming languages and compilers
- Multi-level, multi-language performance instrumentation
- Flexible and configurable performance measurement
- Support for multiple parallel programming paradigms
  - Multi-threading, message passing, mixed-mode, hybrid, object oriented (generic), component-based
- Support for performance mapping
- Integration of leading performance technology
- Scalable (very large) parallel performance analysis



# **Using TAU: A brief Introduction**

- TAU supports several measurement options (profiling, tracing, profiling with hardware counters, etc.)
- Each measurement configuration of TAU corresponds to a unique stub makefile that is generated when you configure it
- To instrument source code using PDT

Choose an appropriate TAU stub makefile in <arch>/lib:
 % export TAU\_MAKEFILE=/projects/tau/tau\_latest/x86\_64/lib/Makefile.tau-mpi-pdt
 % export TAU\_OPTIONS='-optVerbose ...' (see tau\_compiler.sh -help)
 And use tau\_f90.sh, tau\_cxx.sh or tau\_cc.sh as Fortran, C++ or C compilers:
 % mpif90 foo.f90
 changes to
 % tau f90.sh foo.f90

- Execute application and analyze performance data:
  - At runtime, if more than one metric is measured
    - export TAU\_METRICS=TIME:PAPI\_FP\_INS:PAPI\_NATIVE\_<native\_event\_name>
      - Use papi\_native\_avail, papi\_avail, and papi\_event\_chooser to select these preset and native event names

% pprof (for text based profile display) % paraprof (for GUI)



#### Using TAU

- Configuration
- Instrumentation
  - Manual
  - MPI Wrapper interposition library
  - PDT- Source rewriting for C,C++, F77/90/95
  - Compiler-based instrumentation for C, C++, F90
  - OpenMP Directive rewriting
  - Component based instrumentation Proxy components
  - Binary Instrumentation
    - DyninstAPI Runtime Instrumentation/Rewriting binary
    - Jáva Runtime instrumentation
    - Python Runtime instrumentation
- Measurement
- Performance Analysis



### **TAU Measurement Configuration – Examples**

- ./configure -arch=x86\_64 –pdt=/projects/tau/pdtoolkit-3.14 -mpi Configure using PDT and MPI
- ./configure -arch=x86\_64 -papi=/projects/tau/papi-3.6.2
   -pdt=<dir> -mpi ; make clean install
  - Use PAPI counters (one or more) with C/C++/F90 automatic instrumentation. Also instrument the MPI library.
- Typically configure multiple measurement libraries
- Each configuration creates a unique <arch>/lib/Makefile.tau<options>
  - stub makefile. It corresponds to the configuration options used. e.g.,
    - \$(PET\_HOME)/tau/x86\_64/lib/Makefile.tau-mpi-pdt
    - \$(PET\_HOME)/tau/x86\_64/lib/Makefile.tau-mpi-papi-pdt



#### TAU\_SETUP: A GUI for Installing TAU

Compilers Message Passing Tracing/Profiling Threads Data Tools Misc	Compilers Message Passing Tracing/Profiling Threads Data Tools Misc
C Compiler [-cc=]: Default ; ? User Defined C++ Compiler [-c++=]: Default ; ? User Defined	<ul> <li>Profile [-PROFILE]</li> <li>Compensate [-COMPENSATE]</li> <li>Callpath Profiling [-PROFILECALLPATH]</li> <li>Profile Headroom [-PROFILEHEADROOM]</li> <li>Profile Memory [-PROFILEMEMORY]</li> </ul>
Fortran Compiler [-fortran=]:     Default \$     ?       User Defined	Trace [-TRACE] Epilog [-epilog=]: Browse
PDT [-pdt=]: Browse ?	SLOG2 [-slog2]:         Use External SLOG2SDK [-slog2=]:
PDT C++ Compiler [-pdt_c++=]:       Default +       ?         User Defined       ?         PAPI [-papi=]:       Browse ?         PAPI Wallclock [-PAPIWALLCLOCK]       ?         PAPI Virtual [-PAPIVIRTUAL]       ?	-COMPENSATE Specifies online compensation of performance perturbation. When this option is used, TAU computes its overhead and subtracts it from the profiles. It can be only used when profiling is chosen. This option works with MULTIPLECOUNTERS as well, but while it is relevant for removing perturbation with wallclock time, it cannot accurately account for perturbation with hardware performance counts (e.g., L1 Data cache misse
Multiple Counters [-MULTIPLECOUNTERS] ? onfigure	See TAU Publication [Europar04] for further information on this option.
Configure Tau Make Tau	Configure Tau Make Tau
Install Tau	./installtau
Reset Exit	Reset Exit
	12

#### **TAU Measurement Configuration – Examples**

% cd \$(PET\_HOME)/tau/x86\_64/lib; Is Makefile.\*pgi

Makefile.tau-pdt

Makefile.tau-mpi-pdt

Makefile.tau-callpath-mpi-pdt

Makefile.tau-mpi-pdt-trace

Makefile.tau-mpi-compensate-pdt

Makefile.tau-mpi-papi-pdt

Makefile.tau-mpi-papi-pdt-trace

Makefile.tau-mpi-papi-pdt-epilog-scalasca-trace

Makefile.tau-pdt...

#### • For an MPI+F90 application, you may want to start with:

Makefile.tau-mpi-pdt

- Supports MPI instrumentation & PDT for automatic source instrumentation for PGI compilers



### **TAU's MPI Wrapper Interposition Library**

- Uses standard MPI Profiling Interface
  - Provides name shifted interface
    - MPI\_Send = PMPI\_Send
    - Weak bindings
- Interpose TAU's MPI wrapper library between MPI and TAU
   Impi replaced by –ITauMpi –Ipmpi –Impi
- No change to the source code!
  - Just re-link the application to generate performance data
  - export TAU\_MAKEFILE=<dir>/<arch>/lib/Makefile.tau-mpi -[options]
  - Use tau\_cxx.sh, tau\_f90.sh and tau\_cc.sh as compilers



### **Runtime MPI Shared Library Instrumentation**

- We can now interpose the MPI wrapper library for applications that have already been compiled
  - No re-compilation or re-linking necessary!
- Uses LD\_PRELOAD for Linux
- On AIX, TAU uses MPI\_EUILIB / MPI\_EUILIBPATH
- Simply compile TAU with MPI support and prefix your MPI program with tauex
  - % mpirun -np 4 tauex a.out
- Requires shared library MPI does not work on XT3
- Approach will work with other shared libraries



### -PROFILE Configuration Option

- Generates flat profiles (one for each MPI process)
  - It is the default option.
- Uses wallclock time (gettimeofday() sys call)
- Calculates exclusive, inclusive time spent in each timer and number of calls

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Readin	g Profile fil	es in profile.*					
NODE O	;CONTEXT O;TH	READ O:					_
//Time	msec		#Call	#Subrs	Inclusive usec/call	Name	
$\begin{array}{c} - & 0 & 0 \\ 99.6 \\ 67.1 \\ 44.5 \\ 41.0 \\ 29.52 \\ 16.29 \\ 33.4 \\ 3.4 \\ 0.22 \\ 0.11 \\ 0.11 \\ 0.0 \\$	$\begin{bmatrix} 1 \\ 3,667 \\ 491 \\ 6,461 \\ 1:18.436 \\ 50,142 \\ 24,451 \\ 7,501 \\ 838 \\ 6,590 \\ 4,989 \\ 0.44 \\ 338 \\ 140 \\ 131 \\ 89 \\ 0.966 \\ 24 \\ 140 \\ 131 \\ 131 \\ 89 \\ 0.966 \\ 24 \\ 140 \\ 131 \\ 11 \\ 0.16 \\ 0.512 \\ 0.26 \\ 24 \\ 15 \\ 15 \\ 15 \\ 26 \\ 24 \\ 15 \\ 15 \\ 0.26 \\ 24 \\ 10 \\ 121 \\ 0.121 \\ $	3:11.293 3:10.463 2:08.326 1:25.159 1:18.436 56,407 50,142 31,031 7,501 6,594 6,590 4,989 4,989 4,989 247 131 103 96 95 444 244 15 12 8 33 31 0.837 0.512 0.353	$\begin{array}{c} 9300\\ 18600\\ 9300\\ 19204\\ 301\\ 9300\\ 604\\ 9300\\ 608\\ 1\\ 1\\ 57252\\ 1\\ 1\\ 57252\\ 1\\ 1\\ 608\\ 1\\ 1\\ 3\\ 8\\ 1\\ 1\\ 3\\ 8\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\ 1\\$	37200 18600 0 18600 0 0 1812 0 0 1812 0 4 39 47616 0 2 2 0 0 0 0 0 0 0 0 0 0 0 0 0	63487925 3450 9157 4217 6065 2611 103096 807 10918 309634 247086 90458 90458 90458 10603 44878 400 12335 2893 491 3874 1007 837 512 353	<pre>bcast_inputs exchange_1 buts MPI_Recv() blts MPI_Send() rhs jacld exchange_3 jacu MPI_Wait() init_comm MPI_INI() setiv exact erbs read_input MPI_Bcast() error MPI_Finalize() setbv l2norm MPI_Irecv() MPI_Finalize() pintgr MPI_Barrier() exchange_4 MPI_Keyval_create() exchange_5</pre>	
0.0	0.024 0.103	0.191 0.103	1 6	2 0		exchange_6 MPI_Type_contiguous(	)
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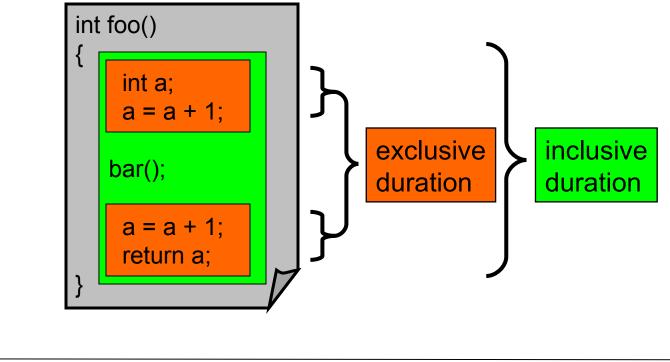
### Profiling

- Recording of aggregated information
  - Counts, time, ...
- ... about program and system entities
  - Functions, loops, basic blocks, ...
  - Processes, threads
- Methods
  - Event-based sampling (indirect, statistical)
  - Direct measurement (deterministic)

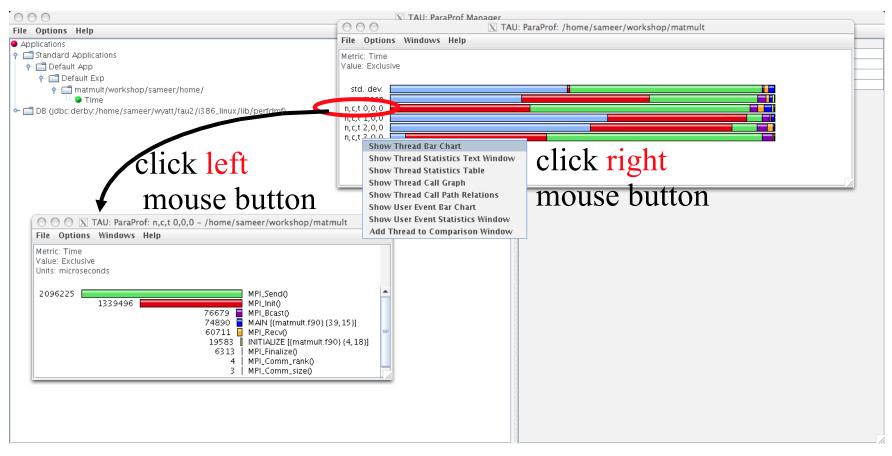


#### **Inclusive and Exclusive Profiles**

- Performance with respect to code regions
- Exclusive measurements for region only
- Inclusive measurements includes child regions



#### **ParaProf Main Window**



% paraprof matmult.ppk

# -PAPI Configuration Option

- Instead of one metric, profile or trace with more than one metric
   % export TAU METRICS=TIME:PAPI L2 DCM:PAPI FP OPS...
- When used with –TRACE option, the first counter **must** be TIME
  - % export TAU\_METRICS=TIME:...
  - Provides a globally synchronized real time clock for tracing
- -papi appears in the name of the stub Makefile
- Often used with –papi=<dir> to measure hardware performance counters and time
- papi\_native\_avail and papi\_avail are two useful tools



### -PROFILECALLPATH Configuration Option

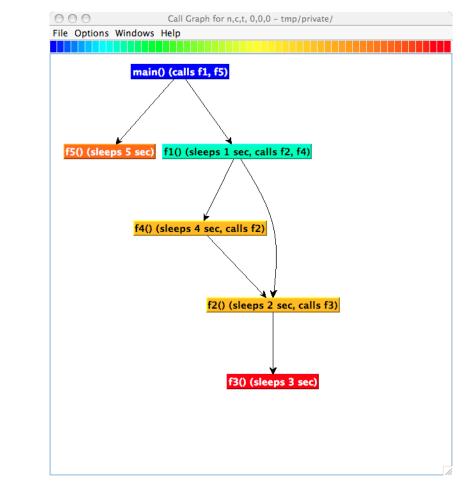
- Generates profiles that show the calling order (edges & nodes in callgraph)
  - A=>B=>C shows the time spent in C when it was called by B and B was called by A
  - Control the depth of callpath using TAU\_CALLPATH\_DEPTH env. Variable
  - - callpath in the name of the stub Makefile name
  - In TAU 2.18.2+, any executable can generate callpath profiles using
  - % export TAU\_CALLPATH=1

000	n,c,t 0,0,0 - tmp/private/
File Options Windows Help	
Metric: Time Value: Inclusive Units: seconds	
20.062 15.052 10.036 9.029 9.029 6.02 5.019 5.016 5.009 3.01 3.01	$ \begin{array}{l} \text{main}() \ (\text{calls } f1, f5) \\ f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) \\ f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) \\ f4() \ (\text{sleeps } 4 \ \text{sec, calls } f3) \\ f4() \ (\text{sleeps } 4 \ \text{sec, calls } f2) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f4() \ (\text{sleeps } 4 \ \text{sec, calls } f2) \\ f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f4() \ (\text{sleeps } 4 \ \text{sec, calls } f2) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) \\ f5() \ (\text{sleeps } 5 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 5 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) => f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) => f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f2() \ (\text{sleeps } 4 \ \text{sec, calls } f3) => f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f4() \ (\text{sleeps } 4 \ \text{sec, calls } f2) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) => f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f4() \ (\text{sleeps } 4 \ \text{sec, calls } f2) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) => f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => f4() \ (\text{sleeps } 4 \ \text{sec, calls } f2) => f2() \ (\text{sleeps } 2 \ \text{sec, calls } f3) => f3() \ (\text{sleeps } 3 \ \text{sec}) \\ \text{main}() \ (\text{calls } f1, f5) => f1() \ (\text{sleeps } 1 \ \text{sec, calls } f2, f4) => $



### -PROFILECALLPATH Configuration Option

• Generates program callgraph



### **Profile Measurement – Three Flavors**

- Flat profiles
  - Time (or counts) spent in each routine (nodes in callgraph).
  - Exclusive/inclusive time, no. of calls, child calls
  - E.g,: MPI\_Send, foo, ...

#### Callpath Profiles

- Flat profiles, **plus**
- Sequence of actions that led to poor performance
- Time spent along a calling path (edges in callgraph)
- E.g., "main=> f1 => f2 => MPI\_Send" shows the time spent in MPI\_Send when called by f2, when f2 is called by f1, when it is called by main. Depth of this callpath = 4 (TAU\_CALLPATH\_DEPTH environment variable)

#### Phase based profiles

- Flat profiles, plus
- Flat profiles under a phase (nested phases are allowed)
- Default "main" phase has all phases and routines invoked outside phases
- Supports static or dynamic (per-iteration) phases
- E.g., "IO => MPI\_Send" is time spent in MPI\_Send in IO phase

# -DEPTHLIMIT Configuration Option

- Allows users to enable instrumentation at runtime based on the depth of a calling routine on a callstack.
  - Disables instrumentation in all routines a certain depth away from the root in a callgraph
- TAU\_DEPTH\_LIMIT environment variable specifies depth % export TAU\_DEPTH\_LIMIT=1 enables instrumentation in only "main" % export TAU\_DEPTH\_LIMIT=2 enables instrumentation in main and routines that are directly called by main
- Stub makefile has -depthlimit in its name: export TAU\_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-mpi-depthlimit-pdt



### -COMPENSATE Configuration Option

- Specifies online compensation of performance perturbation
- TAU computes its timer overhead and subtracts it from the profiles
- Works well with time or instructions based metrics
- Does not work with level 1/2 data cache misses
- export TAU\_COMPENSATE=1 (in TAU v2.18.2+)



# -TRACE Configuration Option

- Generates event-trace logs, rather than summary profiles
- Traces show when and where an event occurred in terms of location and the process that executed it
- Traces from multiple processes are merged:

% tau\_treemerge.pl

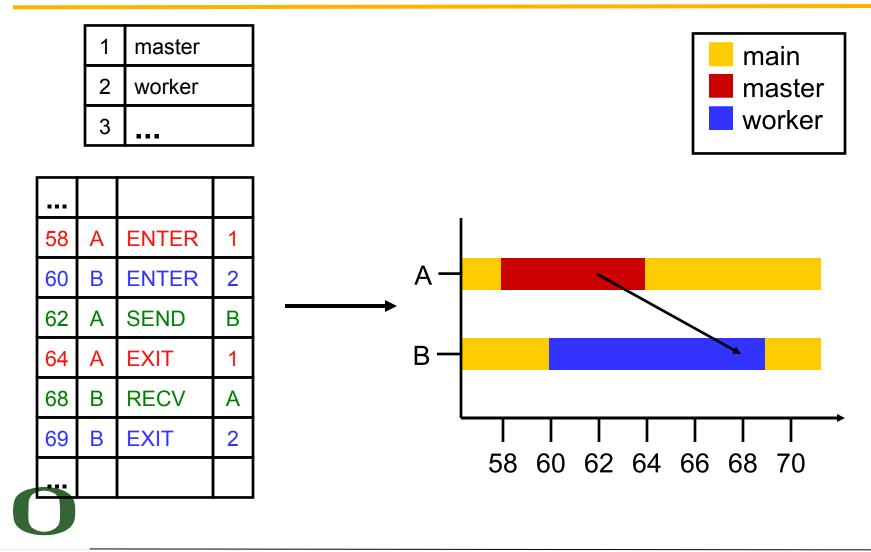
- generates tau.trc and tau.edf as merged trace and event definition file
- TAU traces can be converted to Vampir's OTF/VTF3, Jumpshot SLOG2, Paraver trace formats:

% tau2otf tau.trc tau.edf app.otf % tau2vtf tau.trc tau.edf app.vpt.gz % tau2slog2 tau.trc tau.edf -o app.slog2 % tau\_convert -paraver tau.trc tau.edf app.prv

 Activated by environment variable % export TAU\_TRACE=1



#### **Tracing Analysis and Visualization**



#### **Trace Formats**

- Different tools produce different formats
  - Differ by event types supported
  - Differ by ASCII and binary representations
    - Vampir Trace Format (VTF)
    - KOJAK (EPILOG)
    - Jumpshot (SLOG-2)
    - Paraver
- Open Trace Format (OTF)
  - Supports interoperation between tracing tools



#### -PROFILEPARAM Configuration Option

- Idea: partition performance data for individual functions based on runtime parameters
- Enable by configuring with –PROFILEPARAM
- TAU call: TAU\_PROFILE\_PARAM1L (value, "name")
- Simple example:

```
void foo(long input) {
   TAU_PROFILE("foo", "", TAU_DEFAULT);
   TAU_PROFILE_PARAM1L(input, "input");
   .... }
```

#### **Workload Characterization**

- 5 seconds spent in function "foo" becomes
  - 2 seconds for "foo [ <input> = <25> ]"
  - 1 seconds for "foo [ <input> = <5> ]"

- ...

- Currently used in MPI wrapper library
  - Allows for partitioning of time spent in MPI routines based on parameters (message size, message tag, destination node)
  - Can be extrapolated to infer specifics about the MPI subsystem and system as a whole



#### **Workload Characterization**

#### • MPI Results (NAS Parallel Benchmark 3.1, LU class D on

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File Options Windows Help	X nct000	lu.16.D.optix.mpiparam.ppk	• •
Metric: P_WALL_CLOCK_TIME		s Windows Help	
Value: Exclusive		s minuows neip	
Jnits: seconds	Metric: P_WA	L_CLOCK_TIME	
	Value: Exclus		
885.68	HS Units: second	s	
	ACU	3.0E-5	MPI_Comm_free()
672.84 E	LTS	1.0E-6	•
578.41 E	UTS	1.0E-6	
179.16 M	IPI_Rec	1.012	MPI_Finalize()
179.16 N	IPI_Rec	0.004	MPI_Init()
	SOR	0.047	MPI_Irecv()
42.013 📃 M	-	179.16	MPI_Recv()
26.29 🔲 M		179.16	MPI_Recv() [ <message size=""> = &lt;4040&gt; ]</message>
23.318 📘 N		42.013	MPI_Send()
23.317 📱 N			MPI_Send() [ <message size=""> = &lt;3329280&gt; ]</message>
15.723 🛽 N			MPI_Send() [ <message size=""> = &lt;4040&gt; ]</message>
-	XCHAN		MPI_Wait()
8.173 S		4.5E-4	
	XCHAN RHS	2.6E-4	
	RHS IPI_Allri	5.4E-4	
	IPI_Fina		MPI_Wait() [ <message size=""> = &lt;3329280&gt; ]</message>
	RROR	1.0E-6	
	ETBV	3.0E-6 0.006	
	ZNORM	1.5E-4	
	PI_Irec	1.0E-6	-
	INTGR	0.003	
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	EAD_IN	4.0E-6	
	PPLU	3.2E-5	
		8.173	
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#### **Workload Characterization**

#### Two different message sizes (~3.3MB and ~4K)

Name 🛆	Inclusive Ex	clusive	Calls (	Child
— MPI_Comm_free()	0	0	1	C
– MPI_Comm_rank()	0	0	1	C
- MPI_Comm_size()	0	0	2	C
– MPI_Finalize()	1.012	1.012	1	C
— MPI_Init()	0.004	0.004	1	C
— MPI_Irecv()	0.047	0.047	612	C
- MPI_Recv()	179.165	179.165	,	C
- MPI_Recv() [ <message size=""> = &lt;4040&gt; ]</message>	179 165		244,412	0
- MPI_Send()	42.013		245,020	C
-MPI_Send() [ <message size=""> = &lt;3329280&gt; ]</message>	26.29	26.29	608	C
<pre>-MPI_Send() [ <message size=""> = &lt;4040&gt; ]</message></pre>	15.723		2,4,412	C
- MPI_Wait()	23.319	22 318	612	C
—MPI_Wait() [ <message size=""> = &lt;1632&gt; ]</message>	0	0	1	C
—MPI_Wait() [ <message size=""> = &lt;1664&gt; ]</message>	0	0	1	C
—MPI_Wait() [ <message size=""> = &lt;3264&gt; ]</message>	0.001	0.001	2	C
—MPI_Wait() [ <message size=""> = &lt;3329280&gt; ]</message>	23.317	23.317	608	C
- NEIGHBORS	0	0	1	C
- NODEDIM	0	0	1	C
- PINTGR	0.008	0.006	1	6
- PRINT_RESULTS	0	0	1	C

# Memory Profiling in TAU

- Configuration option PROFILEMEMORY
  - Records global heap memory utilization for each function
  - Takes one sample at beginning of each function and associates the sample with function name
- Configuration option -PROFILEHEADROOM
  - Records headroom (amount of free memory to grow) for each function
  - Takes one sample at beginning of each function and associates it with the callstack [TAU\_CALLPATH\_DEPTH env variable]
  - Useful for debugging memory usage on IBM BG/L.
- Independent of instrumentation/measurement options selected
- No need to insert macros/calls in the source code
- User defined atomic events appear in profiles/traces



#### **Memory Profiling in TAU (Atomic events)**

Sorted By: number	r of userEvents				
NumSamples	Max	Min	Mean	Std. Dev	Name
252032	2022.7	1181.2	1534.3	410.04	MODULEHYDRO_1D::HYDRO_1D - Heap Memory (KB)
252032	2022.8	1181.7	1534.3	410.04	MODULEINTRFC::INTRFC - Heap Memory (KB)
104559	2023.2	331.13	1526.6	409.54	MODULEEOS3D::EOS3D - Heap Memory (KB)
63008	2022.7	1182	1534.3	410.01	MODULEUPDATE_SOLN::UPDATE_SOLN - Heap Memory (KB)
55545	2023.3	333.07	1514.2	408.31	DBASETREE::DBASENEIGHBORBLOCKLIST - Heap Memory (KB)
51374	2023	1179.4	1497.7	402.53	AMR_PROLONG_GEN_UNK_FUN - Heap Memory (KB)
42120	2022.7	1187.5	1533.5	409.83	ABUNDANCE_RESTRICT - Heap Memory (KB)
41958	2023	346.12	1514.9	408.39	AMR_RESTRICT_UNK_FUN - Heap Memory (KB)
31832	2022.8	1187.4	1534.1	409.91	AMR_RESTRICT_RED - Heap Memory (KB)
31504	2022.7	1181.8	1534.3	410.04	DIFFUSE - Heap Memory (KB)
26042	2023	1179.2	1501.9	403.61	AMR_PROLONG_UNK_FUN - Heap Memory (KB)

Flash2 code profile (-PROFILEMEMORY) on IBM BlueGene/L [MPI rank 0]



#### **Detecting Memory Leaks in C/C++**

- TAU wrapper library for malloc/realloc/free
- During instrumentation, specify

   optDetectMemoryLeaks option to TAU\_COMPILER
   % export TAU\_OPTIONS='-optVerbose -optDetectMemoryLeaks'
   % export TAU\_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-mpi-pdt...
   % tau\_cxx.sh foo.cpp ...
- Tracks each memory allocation/de-allocation in parsed files
- Correlates each memory event with the executing callstack
- At the end of execution, TAU detects memory leaks
- TAU reports leaks based on allocations and the executing callstack
- Set **TAU\_CALLPATH\_DEPTH** environment variable to limit callpath data
  - default is 2
- Future work
  - Support for C++ new/delete planned
  - Support for Fortran 90/95 allocate/deallocate planned



#### **Memory Leak Detection**

8 8	mall free free mall mall free mall free free free	oc size <file=simpl size <file=simple.i size <file=simple.i oc size <file=simpl oc size <file=simpl size <file=simple.i size <file=simple.i< th=""><th>nst.cpp, line=28&gt; nst.cpp, line=28&gt; : in e.inst.cpp, line=18&gt; e.inst.cpp, line=18&gt; : nst.cpp, line=21&gt; nst.cpp, line=21&gt; : in</th><th>t main(int, char **) = int main(int, char **) t main(int, char **) =</th><th><pre>=&gt; int foo(int) =&gt; int bar(int) &gt;&gt; int foo(int) =&gt; int bar(int) =&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int) &gt;&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int)</pre></th></file=simple.i<></file=simple.i </file=simpl </file=simpl </file=simple.i </file=simple.i </file=simpl 	nst.cpp, line=28> nst.cpp, line=28> : in e.inst.cpp, line=18> e.inst.cpp, line=18> : nst.cpp, line=21> nst.cpp, line=21> : in	t main(int, char **) = int main(int, char **) t main(int, char **) =	<pre>=&gt; int foo(int) =&gt; int bar(int) &gt;&gt; int foo(int) =&gt; int bar(int) =&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int) &gt;&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int)</pre>
ile Options Windows	Help	File Options Win	ndows Help AK! malloc size <file=sim< th=""><th>User Event Window: memo</th><th><pre>ain(int, char **) =&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int)  pryleakdetect/taudata/rs/sameer/Users/  t main(int, char **) =&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int)  Mean n,c,t 0,0,0 D   Std. Dev. </pre></th></file=sim<>	User Event Window: memo	<pre>ain(int, char **) =&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int)  pryleakdetect/taudata/rs/sameer/Users/  t main(int, char **) =&gt; int foo(int) =&gt; int g(int) =&gt; int bar(int)  Mean n,c,t 0,0,0 D   Std. Dev. </pre>
NumSamples		Min	Mean	Std. Dev	Name
3 3 2 1 1 1 1 1 1 1	80 80 52 80 80 180 180 180 180	48 48 80 80 180 180 180 180 180	60 60 50 80 180 180 180 180 180	14.236 14.236 2 0 0 0 0 0 0 0 0 0 0	<pre>malloc size <file=simple.inst.cpp, line="18"> malloc size <file=simple.inst.cpp, line="18"> : int main(int, c MEMORY LEAK! malloc size <file=simple.inst.cpp, line="21"> free size <file=simple.inst.cpp, line="21"> : int main(int, cha malloc size <file=simple.inst.cpp, line="26"> malloc size <file=simple.inst.cpp, line="26"> : int main(int, cha free size <file=simple.inst.cpp, line="28"> free size <file=simple.inst.cpp, line="28"> : int main(int, cha free size <file=simple.inst.cpp, line="38"> : int main(i</file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></file=simple.inst.cpp,></pre>
Close Find:					Next Previous Highlight Match

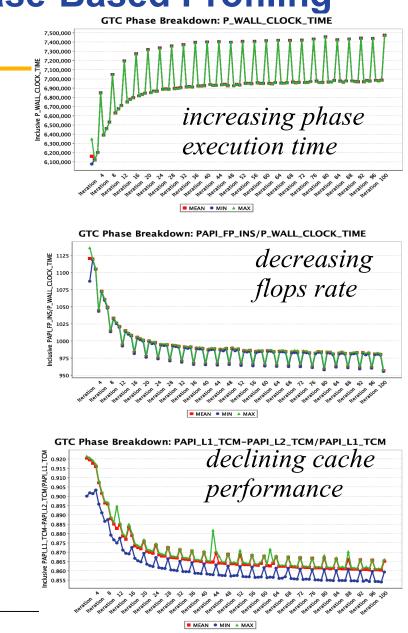
# **TAU Timers and Phases**

- Static timer
  - Shows time spent in all invocations of a routine (foo)
  - E.g., "foo()" 100 secs, 100 calls
- Dynamic timer
  - Shows time spent in each invocation of a routine
  - E.g., "foo() 3" 4.5 secs, "foo 10" 2 secs (invocations 3 and 10 respectively)
- Static phase
  - Shows time spent in all routines called (directly/indirectly) by a given routine (foo)
  - E.g., "foo() => MPI\_Send()" 100 secs, 10 calls shows that a total of 100 secs were spent in MPI\_Send() when it was called by foo.
- Dynamic phase
  - Shows time spent in all routines called by a given invocation of a routine.
  - E.g., "foo() 4 => MPI\_Send()" 12 secs, shows that 12 secs were spent in MPI\_Send when it was called by the 4<sup>th</sup> invocation of foo.



#### **Performance Dynamics: Phase-Based Profiling**

- Profile phases capture performance with respect to application-defined 'phases' of execution
  - Separate full profile produced for each phase
- GTC particle-in-cell simulation of fusion turbulence
- Phases assigned to iterations
- Data change affects cache





#### **TAU\_COMPILER Commandline Options**

- See <taudir>/<arch>/bin/tau\_compiler.sh -help
- Compilation:

```
% mpxlf90 -c foo.f90
Changes to
% f95parse foo.f90 $(OPT1)
% tau_instrumentor foo.pdb foo.f90 -o foo.inst.f90 $(OPT2)
% ftn -c foo.inst.f90 $(OPT3)
Linking:
% ftn foo.o bar.o -o app
Changes to
% ftn foo.o bar.o -o app $(OPT4)
Where options OPTI1-41 default values may be overridden by the user:
```

Where options OPT[1-4] default values may be overridden by the user:
 F90 = tau\_f90.sh



# **TAU\_COMPILER Options**

Optional parameters for \$(TAU COMPILER): [tau compiler.sh –help] -optVerbose Turn on verbose debugging messages -optCompInst Use compiler based instrumentation -optDetectMemoryLeaks Turn on debugging memory allocations/ de-allocations to track leaks -optKeepFiles Does not remove intermediate .pdb and .inst.\* files -optPreProcess Preprocess Fortran sources before instrumentation -optTauSelectFile="" Specify selective instrumentation file for tau instrumentor Options passed to the linker. Typically -optLinking="" \$(TAU MPI FLIBS) \$(TAU LIBS) \$(TAU CXXLIBS) Options passed to the compiler. Typically -optCompile="" \$(TAU MPI INCLUDE) \$(TAU INCLUDE) \$(TAU DEFS) Add options for Fortran parser in PDT (f95parse/gfparse) -optPdtF95Opts="" -optPdtF95Reset="" Reset options for Fortran parser in PDT (f95parse/gfparse) -optPdtCOpts="" Options for C parser in PDT (cparse). Typically \$(TAU MPI INCLUDE) \$(TAU INCLUDE) \$(TAU DEFS) Options for C++ parser in PDT (cxxparse). Typically -optPdtCxxOpts="" \$(TAU MPI INCLUDE) \$(TAU INCLUDE) \$(TAU DEFS)

. . .

# **Compiling Codes with TAU**

- If your Fortran code uses free format in .f files (fixed is default for .f), you may use: % export TAU\_OPTIONS='-optPdtF95Opts="-R free" -optVerbose '
- To use the compiler based instrumentation instead of PDT (source-based): % export TAU\_OPTIONS='-optCompInst -optVerbose'
- If your Fortran code uses C preprocessor directives (#include, #ifdef, #endif): % export TAU\_OPTIONS='-optPreProcess -optVerbose -optDetectMemoryLeaks'
- To use an instrumentation specification file: % export TAU\_OPTIONS='-optTauSelectFile=mycmd.tau -optVerbose -optPreProcess' % cat mycmd.tau BEGIN\_INSTRUMENT\_SECTION memory file="foo.f90" routine="#" # instruments all allocate/deallocate statements in all routines in foo.f90 loops file="\*" routine="#" io file="abc.f90" routine="FOO" END\_INSTRUMENT\_SECTION



#### **Optimization of Program Instrumentation**

- Need to eliminate instrumentation in frequently executing lightweight routines
- Throttling of events at runtime (default in tau-2.17.2+):
  - % export TAU\_THROTTLE=1

Turns off instrumentation in routines that execute over 100000 times (TAU\_THROTTLE\_NUMCALLS) and take less than 10 microseconds of inclusive time per call (TAU\_THROTTLE\_PERCALL). Use TAU\_THROTTLE=0 to disable.

- Selective instrumentation file to filter events
  - % tau\_instrumentor [options] -f <file> OR
  - % export TAU\_OPTIONS='-optTauSelectFile=tau.txt'
- Compensation of local instrumentation overhead

```
% configure -COMPENSATE
```

or

```
% export TAU COMPENSATE=1 (in tau-2.18.2+)
```



#### **ParaProf: Creating Selective Instrumentation File**

File Options Help			
Applications		TrialField	Value
- 📑 Standard Applications		Name	200m4_p256.ppk
		Application ID	0
		Experiment ID	0
← ☐ 200m4_p256.ppk		Trial ID	0
- S Time		BGP Coords	(7,3,7)
E Contraction Cont	Export Profile	BGP DDRSize (MB)	2048
	convert to thase thome	BGP Location	R00-M1-N15-J32
epsilon (jdbc:derby:/home/u		BGP Node Mode	Coprocessor (22270944)
⊢ 📑 kevin (jdbc:postgresql://spa	AUU MEAN LU CUMBANSUN WINUUW 🔊	BGP Processor ID	0
🗝 🗂 pt (jdbc:postgresql://www.p	Upload Trial to DB	BGP Size	(8,4,8)
	Delete	BGP isTorus	(0,0,0)
	Delete	BGP numNodesInPset	1
		BGP numPsets	256
		BGP psetNum	3
		BGP rankinPset	24
		CPU Type	450 Blue Gene/P DD2
		CWD	/gpfs/home/kaman/FronTier/src/gas
		Executable	/sbin.rd/ioproxy
		Hostname	ion-16
		Local Time	2008-08-22T12:50:33-05:00
		MPI Processor Name	Rank 255 of 256 <7,3,7,0> R00-M1-N15-J32
		Memory Size	1816608 kB
		Node Name	ion-16
		OS Machine	BGP
		OS Name	CNK
		OS Release	2.6.19.2
		OS Version	1
		Starting Timestamp	1219427292054274
		TAU Architecture	bgp
		TAU Config	-arch=bgp -pdt=/soft/apps/tau/pdtoolkit-3.12 -
		TAU Version	2.17.1
		Timestamp	1219427456121879
		UTC Time	2008-08-22T17:50:33Z
		pid	355

#### **Choosing Rules for Excluding Routines**

ontier/select.tau	
10	
100000	
*, int) ⊂	close
	uble) C le, double, double, double) C e *, int) C

### **Selective Instrumentation File**

- Specify a list of routines to exclude or include (case sensitive)
- # is a wildcard in a routine name. It cannot appear in the first column.
   BEGIN\_EXCLUDE\_LIST
   Foo
   Bar
   D#EMM
   END\_EXCLUDE\_LIST
- Specify a list of routines to include for instrumentation BEGIN\_INCLUDE\_LIST int main(int, char \*\*) F1 F3 END INCLUDE LIST
- Specify either an include list or an exclude list!



#### **Selective Instrumentation File**

- Optionally specify a list of files to exclude or include (case sensitive)
- \* and ? may be used as wildcard characters in a file name BEGIN\_FILE\_EXCLUDE\_LIST f\*.f90 Foo?.cpp END\_FILE\_EXCLUDE\_LIST
- Specify a list of routines to include for instrumentation BEGIN\_FILE\_INCLUDE\_LIST main.cpp foo.f90 END\_FILE\_INCLUDE\_LIST



#### **Selective Instrumentation File**

- User instrumentation commands are placed in INSTRUMENT section
- ? and \* used as wildcard characters for file name, # for routine name
- \ as escape character for quotes
- Routine entry/exit, arbitrary code insertion
- Outer-loop level instrumentation

```
BEGIN_INSTRUMENT_SECTION
loops file="foo.f90" routine="matrix#"
memory file="foo.f90" routine="#"
io routine="matrix#"
[static/dynamic] phase routine="MULTIPLY"
dynamic [phase/timer] name="foo" file="foo.cpp" line=22 to line=35
file="foo.f90" line = 123 code = " print *, \" Inside foo\""
exit routine = "int foo()" code = "cout <<\"exiting foo\"<<endl;"
END_INSTRUMENT_SECTION
```

### Instrumentation of OpenMP Constructs

- OpenMP Pragma And Region Instrumentor [UTK, FZJ]
- Source-to-Source translator to insert POMP calls around OpenMP constructs and API functions



- Done: Supports
  - Fortran77 and Fortran90, OpenMP 2.0
  - C and C++, OpenMP 1.0
  - POMP Extensions
  - EPILOG and TAU POMP implementations
  - Preserves source code information (#line line file)
- tau\_ompcheck
  - Balances OpenMP constructs (DO/END DO) and detects errors
  - Invoked by tau\_compiler.sh prior to invoking Opari
- KOJAK Project website http://icl.cs.utk.edu/kojak



#### **OpenMP API Instrumentation**

- Transform
  - $\text{ omp} #\_lock() \rightarrow \text{ pomp} #\_lock()$
  - omp\_#\_nest\_lock() → pomp\_#\_nest\_lock()

#### [# = init | destroy | set | unset | test]

#### • POMP version

- Calls omp version internally
- Can do extra stuff before and after call



### **Dynamic Instrumentation**

- TAU uses DyninstAPI for runtime code patching
- Developed by U. Wisconsin and U. Maryland
- http://www.dyninst.org
- *tau\_run* (mutator) loads measurement library
- Instruments mutatee
- MPI issues:
  - one mutator per executable image [TAU, DynaProf]
  - one mutator for several executables [Paradyn, DPCL]



#### **Virtual Machine Performance Instrumentation**

- Integrate performance system with VM
  - Captures robust performance data (e.g., thread events)
  - Maintain features of environment
    - portability, concurrency, extensibility, interoperation
  - Allow use in optimization methods
- JVM Profiling Interface (JVMPI)
  - Generation of JVM events and hooks into JVM
  - Profiler agent (TAU) loaded as shared object
    - registers events of interest and address of callback routine
  - Access to information on dynamically loaded classes
  - No need to modify Java source, bytecode, or JVM



# **Generate a Python Profile**

```
% export TAU MAKEFILE=/projects/tau/tau latest/ibm64
                /lib/Makefile.tau-python-pdt
% set path=(/projects/tau/tau latest/ibm64/bin $path)
% cat wrapper.py
  import tau
  def OurMain():
      import foo
  tau.run(`OurMain()')
Uninstrumented:
% ./foo.py
Instrumented:
% export PYTHONPATH= <taudir>/ibm64/<lib>/bindings-python-pdt
(same options string as TAU MAKEFILE)
% export LD LIBRARY PATH=<taudir>/x86 64/lib/bindings-python-pdt:
$LD LIBRARY PATH
% ./wrapper.py
Wrapper invokes foo and generates performance data
% pprof/paraprof
```

# **Python Instrumentation: SciPy**

	rs Help	
Metric: Time		
Value: Exclusive	percent	
31.656%		write_array [/usr/lib/python2.4/site-packages/Gnuplot/utils.py, line=46]
26.056%		? [ <string>, line=1]</string>
	13.3%	write
	5.402%	init [/usr/lib/python2.4/site-packages/Gnuplot/PlotItems.py, line=430]
	4.561%	tolist
	2.954%	
		join [/usr/lib/python2.4/string.py, line=308]
		choice [/usr/lib/python2.4/random.py, line=247]
	0.803%	
		next [/usr/lib/python2.4/tempfile.py, line=127]
		call [/usr/lib/python2.4/site-packages/Gnuplot/_Gnuplot.py, line=192]
		Data [/usr/lib/python2.4/site-packages/Gnuplot/PlotItems.py, line=476] get_command_option_string [/usr/lib/python2.4/site-packages/Gnuplot/PlotItems.py, line=17
	0.493%	
		OurMain [hi.py, line=8]
	0.414%	
	0.384%	-
		normpath [/usr/lib/python2.4/posixpath.py, line=374]
		seed [/usr/lib/python2.4/random.py, line=98]
	0.339%	
	0.334%	
	0.319%	
	0.297%	
	0.295%	

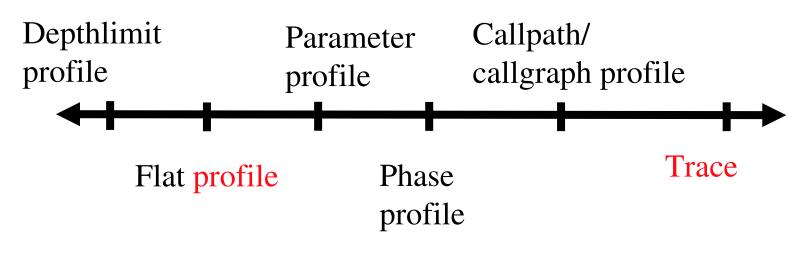


#### **Critical issues**

- Accuracy
  - Timing and counting accuracy depends on resolution
  - Any performance measurement generates overhead
    - Execution on performance measurement code
  - Measurement overhead can lead to intrusion
  - Intrusion can cause perturbation
    - alters program behavior
- Granularity
  - How many measurements are made
  - How much overhead per measurement
- Tradeoff (general wisdom)
  - Accuracy is inversely correlated with granularity



#### **Performance Evaluation Alternatives**



Each alternative has:

- one metric/counter
- multiple counters

Volume of performance data



# **Profiling / Tracing Comparison**

- Profiling
  - © Finite, bounded performance data size
  - ③ Applicable to both direct and indirect methods
  - Coses time dimension (not entirely)
  - ☺ Lacks ability to fully describe process interaction
- Tracing
  - Control Temporal and spatial dimension to performance data
  - © Capture parallel dynamics and process interaction
  - Some inconsistencies with indirect methods
  - Onbounded performance data size (large)
  - ☺ Complex event buffering and clock synchronization



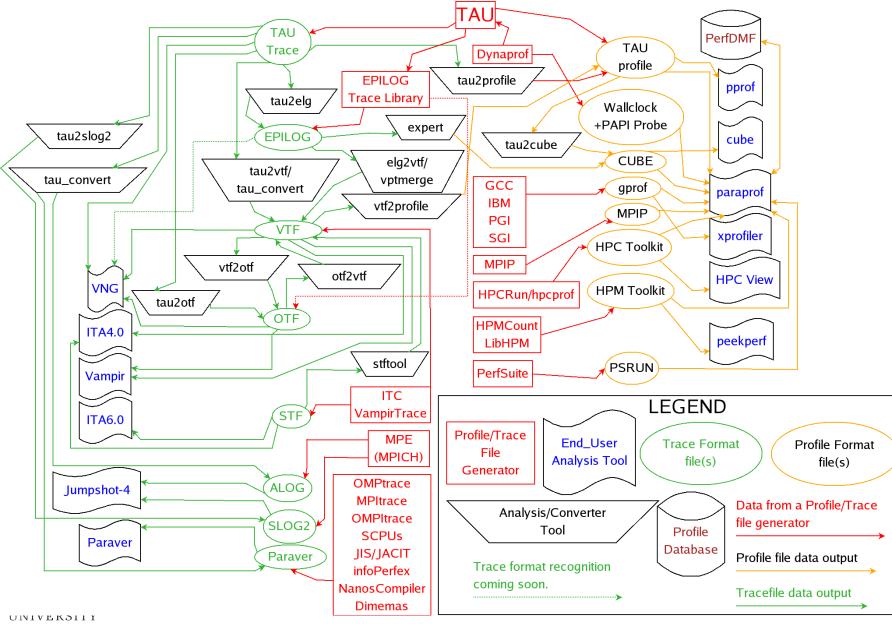
# **TAU Performance System Interfaces**

- PDT [U. Oregon, LANL, FZJ] for instrumentation of C++, C99, F95 source code
- PAPI [UTK] for accessing hardware performance counters data
- DyninstAPI [U. Maryland, U. Wisconsin] for runtime instrumentation
- KOJAK [FZJ, UTK]
  - Epilog trace generation library
  - CUBE callgraph visualizer
  - Opari OpenMP directive rewriting tool
- Vampir/VNG Trace Analyzer [TU Dresden]
- VTF3/OTF trace generation library [TU Dresden] (available from TAU website)
- Paraver trace visualizer [CEPBA]
- Jumpshot-4 trace visualizer [MPICH, ANL]
- JVMPI from JDK for Java program instrumentation [Sun]
- Paraprof profile browser/PerfDMF database supports:
  - TAU format
  - Gprof [GNU]
  - HPM Toolkit [IBM]
  - MpiP [ORNL, LLNL]
  - Dynaprof [UTK]
     PSRun INCSA1





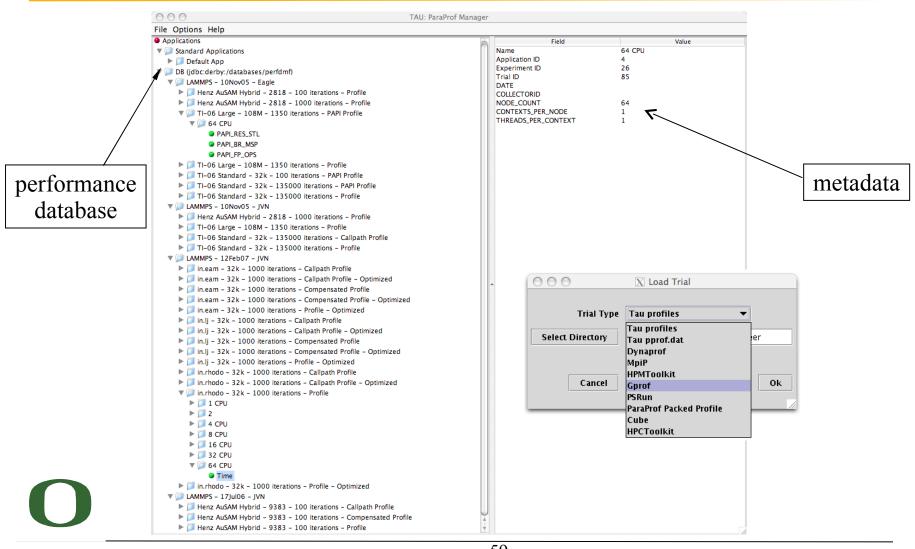
#### **Building Bridges to Other Tools: TAU**



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#### **ParaProf – Manager Window**



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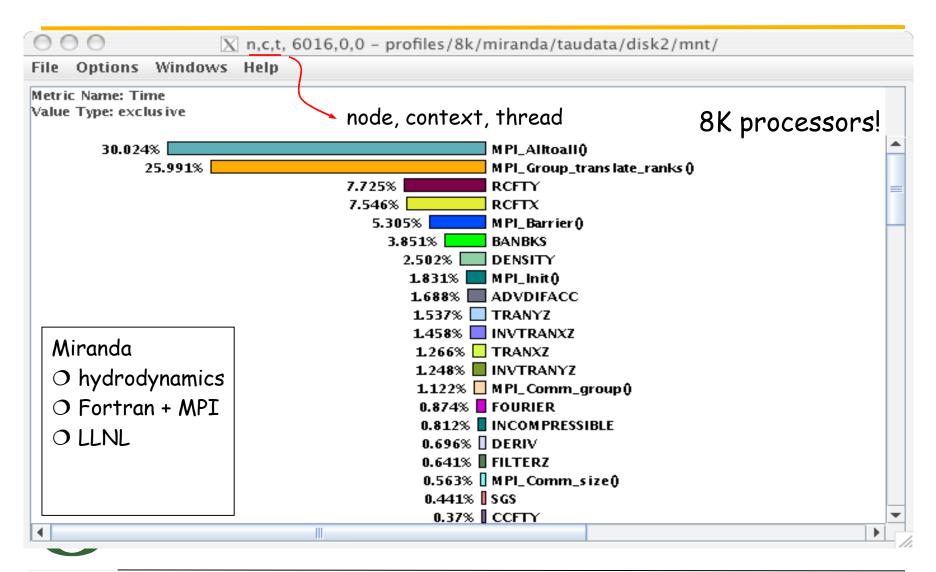
#### **Performance Database: Storage of MetaData**

Applications	Field	Value	
<ul> <li>File Options Help</li> <li>Applications</li> <li>Standard Applications</li> <li>Default App</li> <li>Default Exp</li> <li>16pAIX200iter/s3d/taudata/rs/sameer/Users/</li> <li>Time</li> <li>Runtime Applications</li> <li>AORSA2D</li> <li>Basic run-time profiling for Socorro</li> <li>Heap memory management for Socorro</li> <li>Heap memory management for Socorro</li> <li>hydroshock</li> <li>MFIX</li> <li>S3D</li> <li>AIX</li> <li>16pAIX10iter/s3d/taudata/rs/sameer/Users/</li> <li>Time</li> <li>I6pAIX200iter/s3d/taudata/rs/sameer/Users/</li> <li>Time</li> <li>Time</li> <li>Time</li> </ul>	Field Name Application ID Experiment ID Trial ID time problem_definition node_count contexts_per_node threads_per_context userdata	Value 16pAIXcall200iter/s3d/taudata/rs/sameer/Users/ 8 16 34 nx_g=400, ny_g=400, npx=1, npx=4, npy=4, npz=1 16 1 1 i_time_end=200, i_time_save=200,TAU_CALLPATH_DEPTH=2	
	Select D	Load Trial Trial Type Tau profiles irectory /Users/sameer/rs/taudata/s3d Cancel Ok	

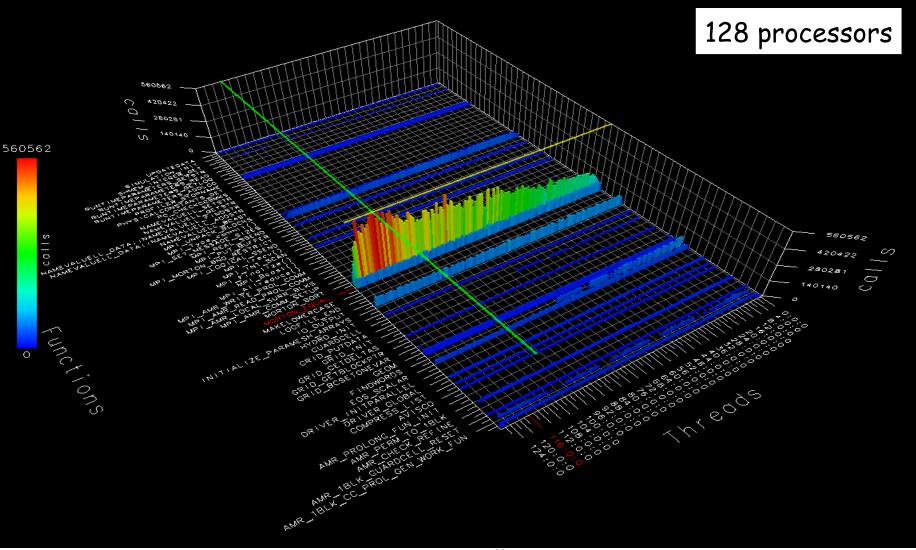
#### ParaProf Main Window (Lammps)



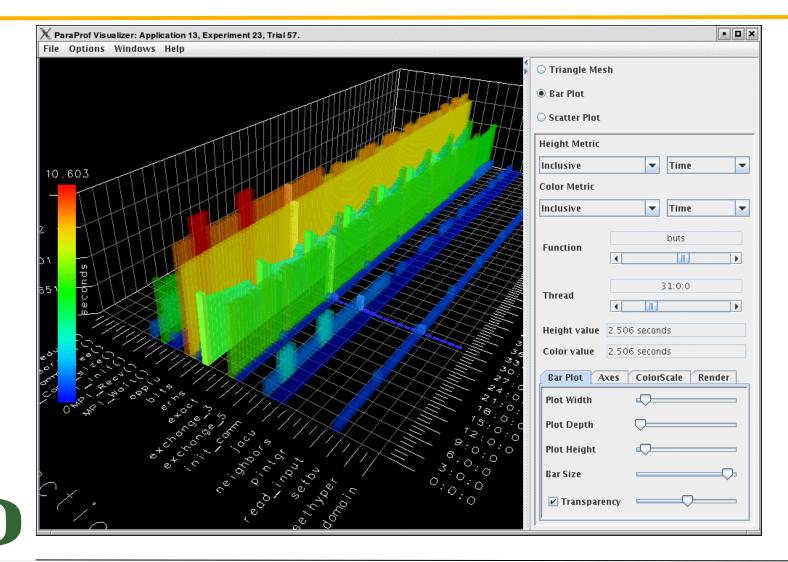
#### ParaProf – Flat Profile (Miranda)



#### ParaProf – 3D Full Profile Bar Plot (Flash)



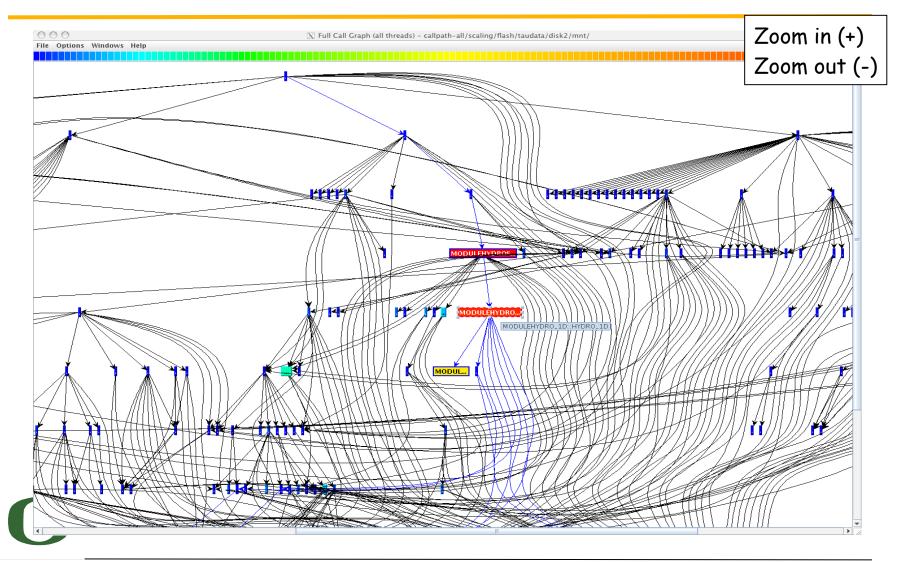
#### ParaProf Bar Plot (Zoom in/out +/-)



#### **ParaProf – Callpath Profile (Flash)**

000	🔀 n,c,t, 0,0,0 – callpath-all/scaling/flash/taudata/disk2/mnt/
File Options Windows Help	
Metric Name: Time Value Type: exclusive	
26.474%	
26.474%	FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP MODULEHYDRO_1D::HYDRO_1D
24.556%	FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MODULEHYDRO_1D::HYDRO_1D
14.351%	MODULEINTRFC::INTRFC
14.351%	FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MODULEHYDRO_1D::HYDRO_1D => MODULEINTRFC::INT 501% MODULEEOS3D::EOS3D
	427% MPL_Ssendo
	.678% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MODULEEOS3D::EOS3D
2	3.536% MPI_Allreduce¢
	2.727% MPL_Waitall¢
	2.242% MODULEUPDATE_SOLN::UPDATE_SOLN 2.242% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MODULEUPDATE_SOLN::UPDATE_SOLN
	2.059% AMR_GUARDCELL_CC_SRL
	1.703% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_SRL => AMR_
	$1.56\%$ FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_SRL => AMR_I A
	1.406% FLASH => EVOLVE => MESH_UPDATE_GRID_REFINEMENT => MESH_REFINE_DEREFINE => AMR_REFINE_DEREFINE => AMR_MORTON_ORDER => 1.361% FLASH => TIMESTEP => MPI_AIIreduceo
	1.319% AMR_RESTRICT_UNK_FUN
	1.272% AMR_PROLONG_GEN_UNK_FUN
	1.093% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_C_TO_F => A
	1.077% ABUNDANCE_RESTRICT 1.077% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => ABUNDANCE_RESTRICT
	1.064% DBASETREE:DBASENEIGHBORBLOCKLIST
Flash	$1\%$ FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_RESTRICT => AMR_RESTRICT
1 10511	0.987% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_FLUX_CONSERVE => AMR_FLUX_CONSERVE_UDT
O thermonuclear	0.96% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_C_TO_F => A
	0.916% MPI_Barrier¢ 0.807% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEER::HYDRO_SWEEP => MESH_GUARDCELL => TOT_BND => DBASETREE::DBAS
flashes	0.806% AMR_PROLONG_UNK_FUN
1 Iusries	0.735% AMR_DIAGONAL_PATCH
O Fortran + MPI	0.699% DIFFUSE
	0.699% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => DIFFUSE 0.671% AMR_RESTRICT_RED
OU. Chicago	0.671% AMR_RESTRICT_RED 0.671% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_FLUX_CONSERVE => AMR_FLUX_CONSERVE_UDT
	0.657% [FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_SRL => AMR_
	0.638% [FLASH => EVOLVE => MESH_UPDATE_GRID_REFINEMENT => MARK_GRID_REFINEMENT => MPI_Barrier¢
	$0.61\%$ [FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_C_TO_F => A
	0.556% FLASH => EVOLVE => HYDRO::HYDRO_3D => MODULEHYDROSWEEP::HYDRO_SWEEP => MESH_GUARDCELL => AMR_GUARDCELL_C_TO_F => A 0.508% TOT_BND
	0.454% I FLASH => EVOLVE => MESH_UPDATE_GRID_REFINEMENT => MARK_GRID_REFINEMENT => MODULEEOS3D::EOS3D
•	

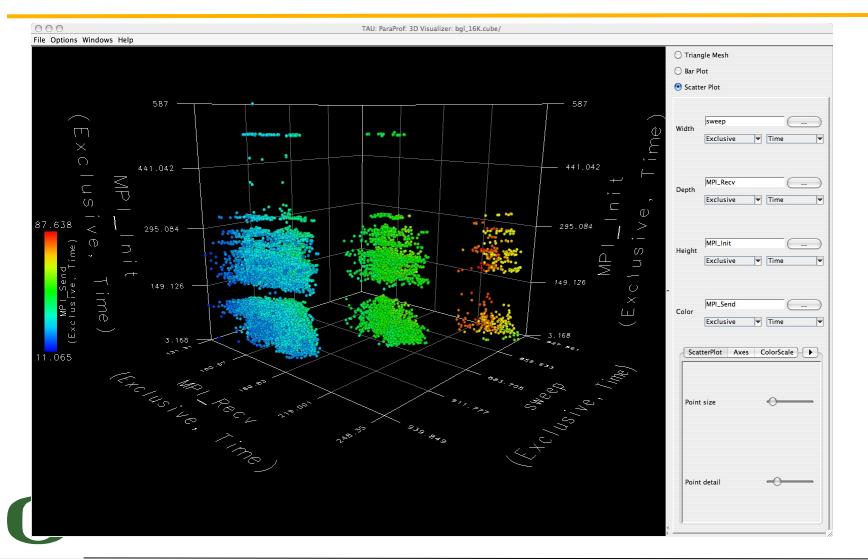
#### ParaProf – Callgraph Zoomed (Flash)



#### **ParaProf - Thread Statistics Table (GSI)**

Ie Options Windows Help	ics: n,c,t, 0,0,0 – comp.ppk/			
le Options windows help				
Name	Inclusive Time	Exclusive Time ▽	Calls	Child Calls
GSI	5,223.564	0.098	1	
SPECMOD::INIT_SPEC_VARS	0.26	0.26	1	-
MPI_Init()	0.056	0.054	1	
▼ GSISUB	5,223.094	0.012	1	
RADINFO::RADINFO_READ	0.103	0.101	1	
PCPINFO::PCPINFO_READ	0.042	0.042	1	
V GLBSOI	5,212.171	0.024	1	
MPI_Finalize()	1.004	1.004	1	
DBS_PARA	3.635	0.181	1	
JFUNC::CREATE_JFUNC	0.142	0.142	1	
GUESS_GRIDS::CREATE_GES_BIAS_GRIDS	0.059	0.059	1	
READ_GUESS	1,406.412	0.023	1	
READ_OBS	3,770.188	0.016	1	
MPI_Allreduce()	3,725.802	3,725.802	3	
READ_BUFRTOVS	44.369	0.254	1	871,53
SATTHIN::MAKEGVALS	0	0	1	
W3FS2 1	0	0	1	
BINARY_FILE_UTILITY::OPEN_BINARY_FILE	0.025	0.012	1	
▶ NITIALIZE::INITIALIZE_RTM	0.099	0.001	1	
GUESS_GRIDS::CREATE_SFC_GRIDS	0	0	1	
M_FVANAGRID::ALLGETLIST_	30.582	0	1	1
ERROR_HANDLER::DISPLAY_MESSAGE	0	0	1	
JFUNC::SET_POINTER	0	0	1	
OZINFO::OZINFO_READ	0.016	0.016	1	
DETER_SUBDOMAIN	0.008	0.008	1	
GRIDMOD::CREATE_MAPPING	0.005	0.005	1	
INIT_COMMVARS	0.004	0.004	1	
M_FVANAGRID::ALLGETLIST_	10.711	0	1	
GRIDMOD::CREATE_GRID_VARS	0	0	1	. (

#### ParaProf – 3D Scatterplot (SWEEP3D CUBE)



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#### Vampir – Trace Zoomed (S3D)

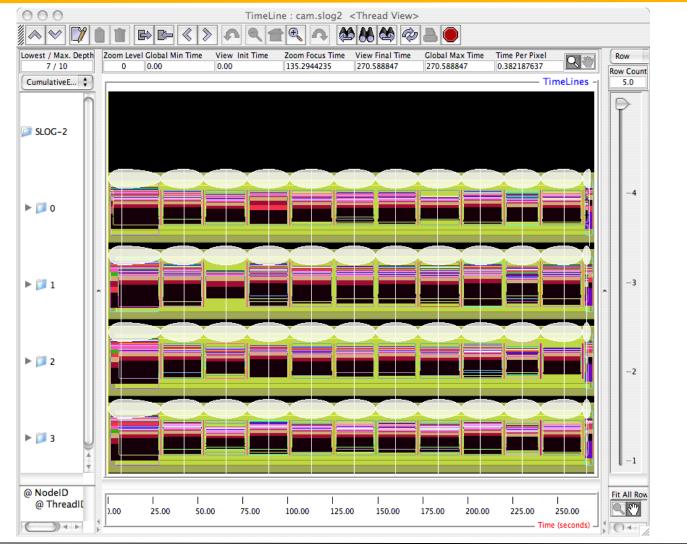
15.63		vpt (15.623 s - 15.652 s = 29.355 ms). 15.64 s	s) 15.645 s	15.65 s	
Process 0 109 83 THERMCHEM_M::CALC_TEMP		ISF_NEW 94	<b>36</b> 97 84 <b>58</b> 97	MPI	ALARGRADIENT
				DERIVATIV	E_X
Process 1 THERMCHEM_M::CALC_TEMP	RHSF_NEW	MPI_Recv()		38 110 DERIVATIV	E_Z
				RHSF_NEW	_M::CALC_INV_AVG_MOL_WT
Process 2 THERMCHEM_M::CALC_TEMP	RHSF_NEW	69 04 59 MPI_Recv()	97 S8 97		_M::CALC_TEMP
Process 3 THERMCHEM_M::CALC_TEMP	RHSF_NEW	97 68 97 MPI_Recv	/O 1 58 58		_M::GET_MASS_FRAC
				11/1:10	
Process 4 30 THERMCHEM_M::CALC_TEMP	84 RHSF_NEW	14 MPI_Recv()	96 94 99 9		
Process 5 83 THERMCHEM_M::CALC_TEMP	RHSF_NEW	P4 (PI_Recv()	38 84 (33 )	8 84 1 88	
Process 6 THERMCHEM_M::CALC_TEMP	RHSF_NEW	58 84 17 MPI_Recv()	54 B7 (158 B	7 //84 //58 //	
Process 7 30 THERMCHEM_M::CALC_TEMP	RHSF_NEW	35 17 38 MPI_Rec	cv() 94	8 56 (1 <mark>110)/</mark>	
			; / // //		
Process 8 80 THERMCHEM_M::CALC_TEMP	84 RHSF_NEW	P4 39 MP1_Recv()		112 36 36	
Process 9 80 THERMCHEM_M::CALC_TEMP	RHSF_NEW	34 39 1F1 Recv()	) <b>3</b> 7 <b>B</b> 4	99 96 96 /	
Process 10 80 THERMCHEM_M::CALC_TEMP	RHSF_NEW;	34 39 121_Recv()		58 55 69	
Process 11 80 THERMCHEM_M::CALC_TEMP	84 RHSF_NEW	94 38 97 MP1 R	i / 58 37	34 35 37	
				ANN /	
Process 12 THERMCHEM_M::CALC_TEMP	RHSF_NEW	<mark>58 58 </mark> 99 97 58 t	hPJ_Recv()	39 56 \ 36	
Process 13 30 THERMCHEM_M::CALC_TEMP	84 RHSF_NEW	38 49 38 495 /	MPI_Recv()		
Process 14 THERMCHEM_M::CALC_TEMP	84 RHSF_NEW	<mark>58 38 39 38 35 x</mark>	MPI_Recv()	35 58 36	
Process 15 30 THERMCHEM_M::CALC_TEMP	84 RHSF_NEW	38 39 36 54	MPI_Recv() 58	58 36	
	04 Intol Linco		:		

#### Jumpshot

- http://www-unix.mcs.anl.gov/perfvis/software/viewers/index.htm
- Developed at Argonne National Laboratory as part of the MPICH project
  - Also works with other MPI implementations
  - Installed on NAVO IBM and ERDC XT3/4
  - Jumpshot is bundled with the TAU package
- Java-based tracefile visualization tool for postmortem performance analysis of MPI programs
- Latest version is Jumpshot-4 for SLOG-2 format
  - Scalable level of detail support
  - Timeline and histogram views
  - Scrolling and zooming
  - Search/scan facility

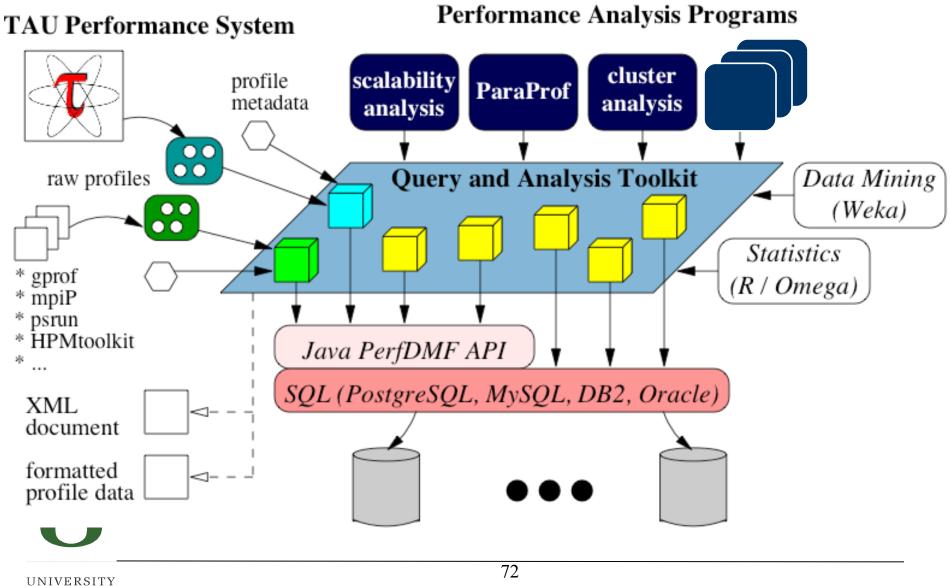


#### **Jumpshot**



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#### **PerfDMF: Performance Data Mgmt. Framework**



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# **Using Performance Database (PerfDMF)**

- Configure PerfDMF (Done by each user)
  - % perfdmf\_configure --create-default
    - Choose derby, PostgreSQL, MySQL, Oracle or DB2
    - Hostname
    - Username
    - Password
    - Say yes to downloading required drivers (we are not allowed to distribute these)
    - Stores parameters in your ~/.ParaProf/perfdmf.cfg file
- Configure PerfExplorer (Done by each user) % perfexplorer\_configure
- Execute PerfExplorer % perfexplorer



# **PerfDMF and the TAU Portal**



- Development of the TAU portal
  - Common repository for collaborative data sharing
  - Profile uploading, downloading, user management
  - Paraprof, PerfExplorer can be launched from the portal using Java Web Start (no TAU installation required)
- Portal URL

http://tau.nic.uoregon.edu



# **Performance Data Mining (Objectives)**

- Conduct parallel performance analysis process
  - In a systematic, collaborative and reusable manner
  - Manage performance complexity
  - Discover performance relationship and properties
  - Automate process
- Multi-experiment performance analysis
- Large-scale performance data reduction
  - Summarize characteristics of large processor runs
- Implement extensible analysis framework
  - Abstraction / automation of data mining operations
  - Interface to existing analysis and data mining tools

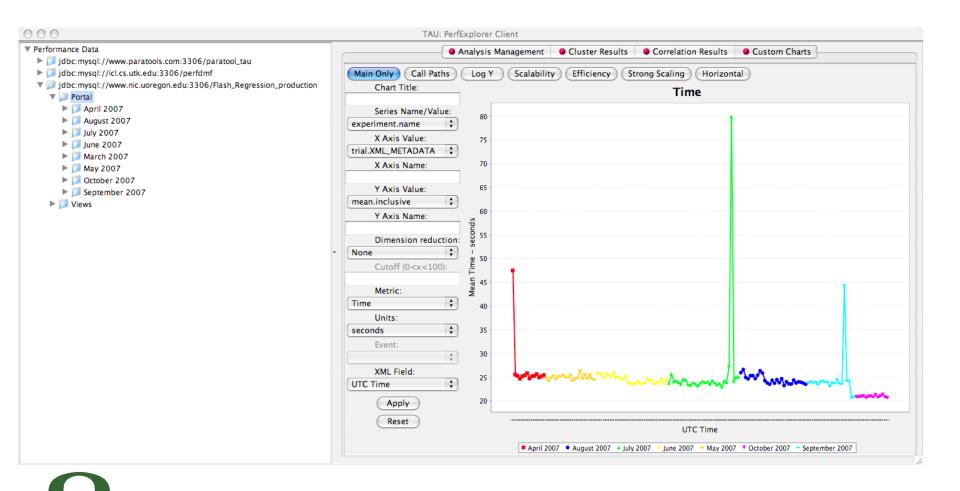


# **Performance Data Mining (PerfExplorer)**

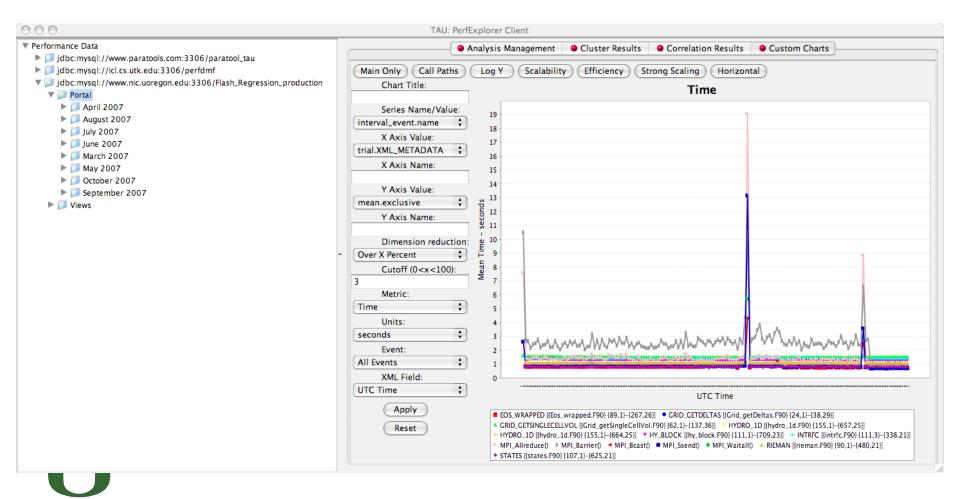
- Performance knowledge discovery framework
  - Data mining analysis applied to parallel performance data
    - comparative, clustering, correlation, dimension reduction, ...
  - Use the existing TAU infrastructure
    - TAU performance profiles, PerfDMF
  - Client-server based system architecture
- Technology integration
  - Java API and toolkit for portability
  - PerfDMF
  - WEKA data mining package
  - JFreeChart for visualization, vector output (EPS, SVG)



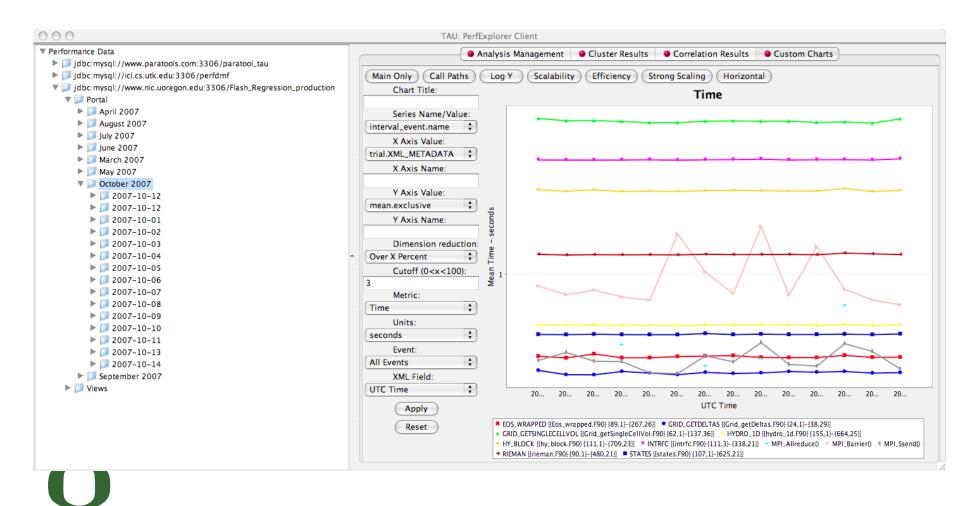
## **PerfExplorer: Regression Testing**



#### **PerfExplorer: Exclusive Time for Events (2007)**



#### PerfExplorer: Limiting Events (> 3%), Oct 2007

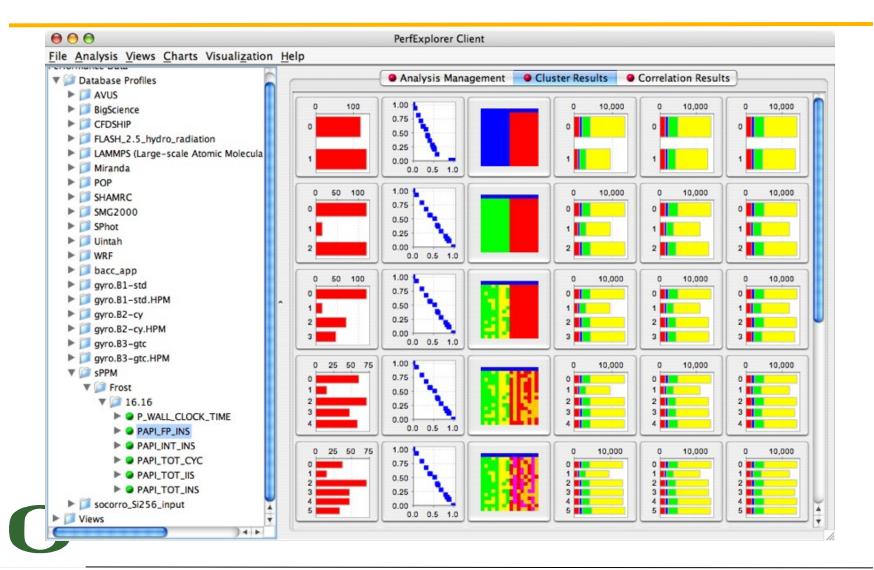


# **PerfExplorer - Analysis Methods**

- Data summaries, distributions, scatter plots
- Clustering
  - *k*-means
  - Hierarchical
- Correlation analysis
- Dimension reduction
  - PCA
  - Random linear projection
  - Thresholds
- Comparative analysis
- Data management views

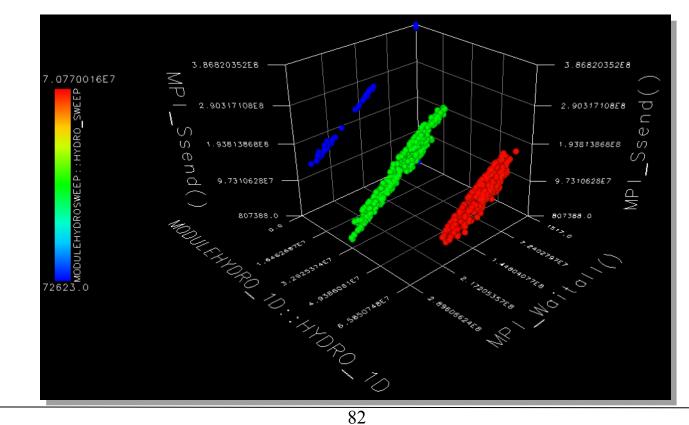


## **PerfExplorer - Cluster Analysis (sPPM)**



## **PerfExplorer - Cluster Analysis**

- Four significant events automatically selected (from 16K processors)
- Clusters and correlations are visible



## **PerfExplorer - Correlation Analysis (Flash)**

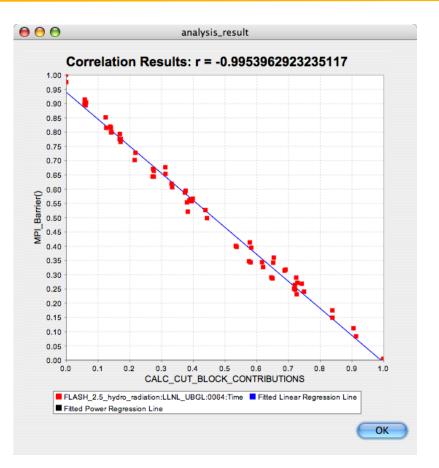
 Describes strength and direction of a linear relationship between two variables (events) in the data

Performance Data	Analysis Management     Cluster Results     Correlation Results					
	1.00 1.00 0.75 0.50 0.25 0.00 0.25 0.00					
▼ ↓ LLNL_UBGL ▼ ↓ 0064 ► ↓ 0124 ► ↓ 0256 ► ↓ 0512 ▼ ↓ 1024	1.00         0.5         1.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0         0.0					
Time     IdMMPS (Large-scale Atomic Molecular N     Miranda     POP     SHAMRC     SMG2000	1.00         0.5         1.0         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5         0.0         0.5					
SPhot     Uintah     WRF     bacc_app     gyro.81-std     gyro.82-cy	1.00         1.00         1.00         1.00         1.00         1.00         1.00         0.75         0.50 <td< td=""></td<>					
gyro.B2-cy.HPM     gyro.B3-gtc     gyro.B3-gtc     gyro.B3-gtc.HPM     gyro.B3-gtc.HPM     soporro_SI256_input     Views	1.00         1.00         1.00         1.00         1.00         1.00         1.00         1.00         1.00         1.00         0.75         1.00         0.75         1.00         0.75         0.50         0.75         0.50         0.50         0.75         0.50         0.50         0.50         0.50         0.50         0.50         0.50         0.50         0.50         0.50         0.50         0.50         0.25         0.50         0.25         0.50         0.25         0.50         0.25         0.50         0.25         0.50         0.25         0.50         0.25         0.00         0.50         1.00         0.0         0.50         0.25         0.00         0.0         0.50         1.00         0.0         0.50         0.0					
r 📦 1999	1.00         1.00         1.00         1.00         1.00         1.00         1.00         1.00         1.00         1.00         0.75         1.00         0.75         1.00         0.75         0.50 <td< td=""></td<>					
	1.00 1.00 1.00 1.00 1.00 1.00 1.00 1.00					

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# **PerfExplorer - Correlation Analysis (Flash)**

- -0.995 indicates strong, negative relationship
- As CALC\_CUT\_ BLOCK\_CONTRIBUTIO NS() increases in execution time, MPI\_Barrier() decreases



# **PerfExplorer - Comparative Analysis**

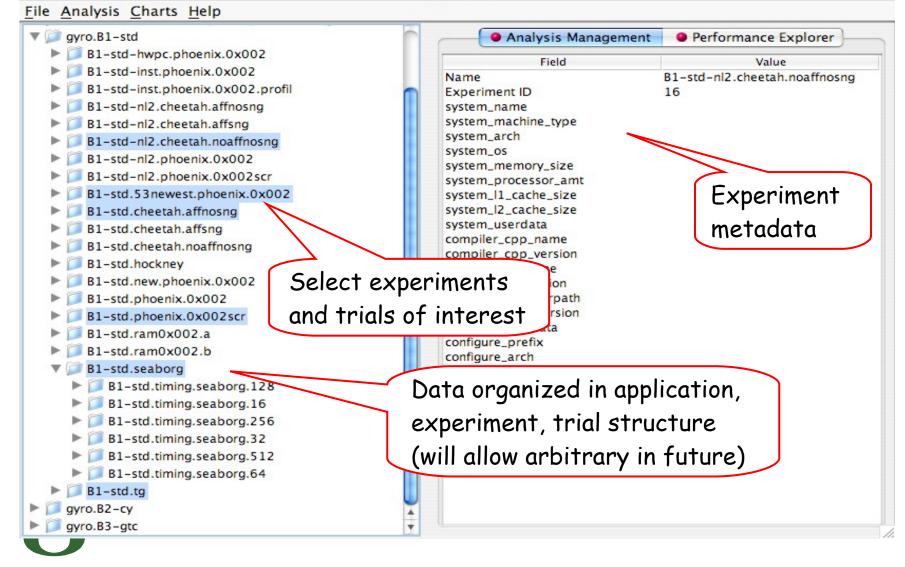
- Relative speedup, efficiency
  - total runtime, by event, one event, by phase
- Breakdown of total runtime
- Group fraction of total runtime
- Correlating events to total runtime
- Timesteps per second
- Performance Evaluation Research Center (PERC)
  - PERC tools study (led by ORNL, Pat Worley)
  - In-depth performance analysis of select applications
  - Evaluation performance analysis requirements
  - Test tool functionality and ease of use



## **PerfExplorer - Interface**



PerfExplorer Client

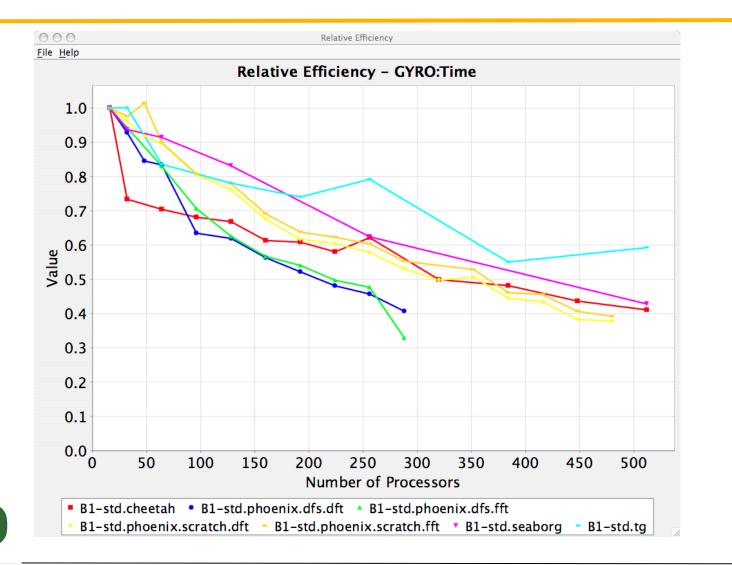


# **PerfExplorer - Interface**

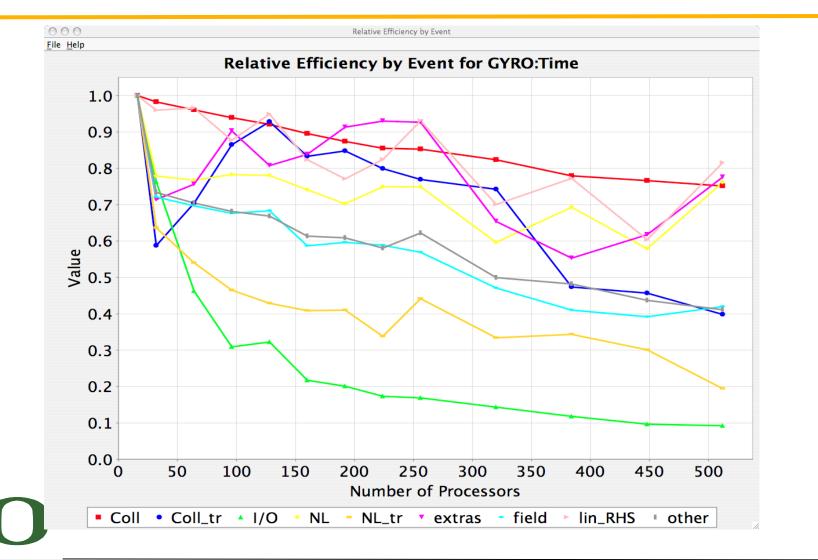
	enexplorer Client	
le       Analysis       Charts       Help         gyro.B1-s       Set Group Name         B1-stc       Set Metric of Interest         B1-stc       Set Total Number of Timesteps         B1-stc       Relative Efficiency         B1-stc       Relative Efficiency by Event         B1-stc       Relative Efficiency for One Event         B1-stc       Relative Speedup         B1-stc       Relative Speedup         B1-stc       Relative Speedup by Event         B1-stc       Relative Speedup for One Event         B1-stc       Communication Time / Total Runtime         B1-stc       Communication Time / Total Runtime         B1-stc       B1-std.hockney         B1-std.hockney       B1-std.new.phoenix.0x002         B1-std.ram0x002.a       B1-std.ram0x002.a         B1-std.timing.seaborg.128       B1-std.timing.seaborg.128         B1-std.timing.seaborg.128       B1-std.timing.seaborg.32         B1-std.timing.seaborg.32       B1-std.timing.seaborg.32         B1-std.timing.seaborg.512       B1-std.timing.seaborg.64	Analysis Management Field Name Experiment ID system_name system_arch system_os system_orcessor_amt system_l1_cache_size system_l2_cache_size tem_userdata Select analysis compiler_java_dirpath compiler_java_version comfigure_prefix configure_prefix configure_cc configure_ccb configure_jdk configure_profile configure_profile configure_profile configure_profile configure_profile configure_profile configure_userdata userdata	Performance Explorer     Value B1-std-nl2.cheetah.noaffnosng 16

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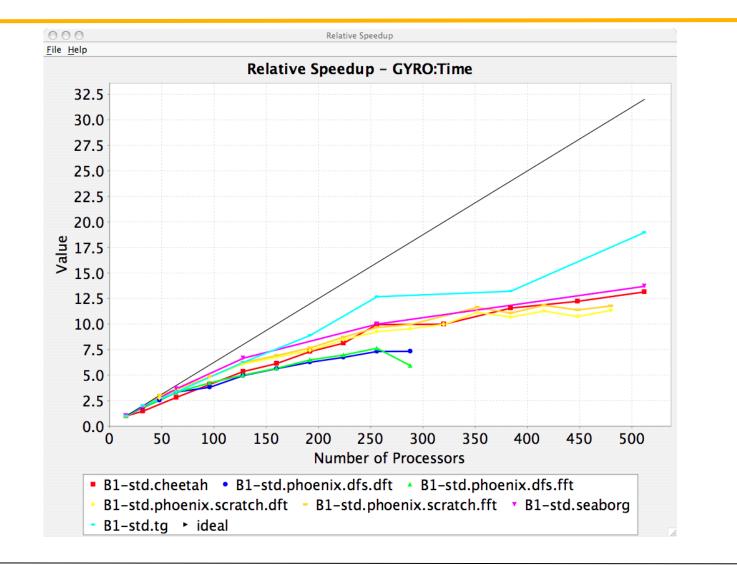
## **PerfExplorer - Relative Efficiency Plots**



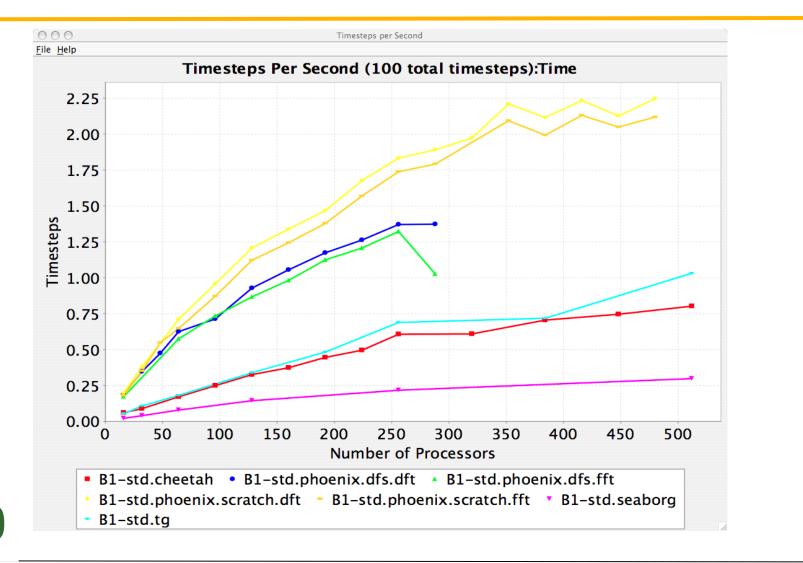
# **PerfExplorer - Relative Efficiency by Routine**



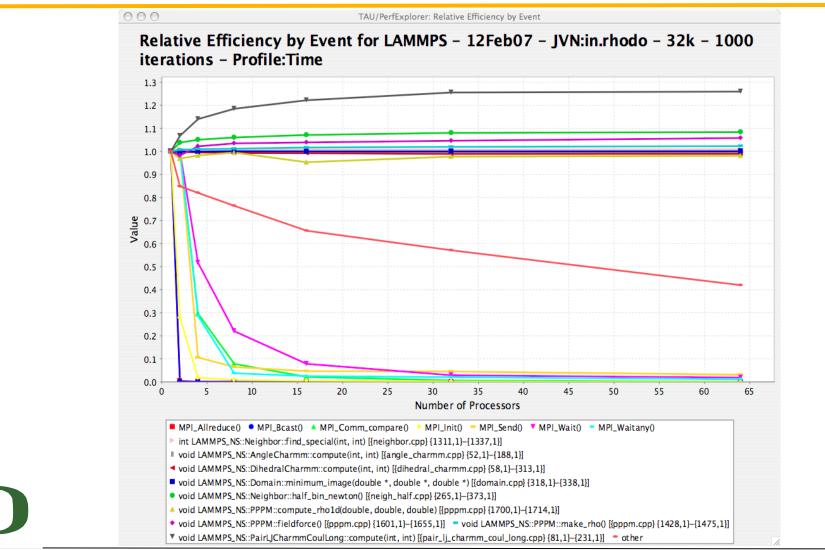
## **PerfExplorer - Relative Speedup**



## **PerfExplorer - Timesteps Per Second**



## **PerfExplorer - Relative Efficiency**

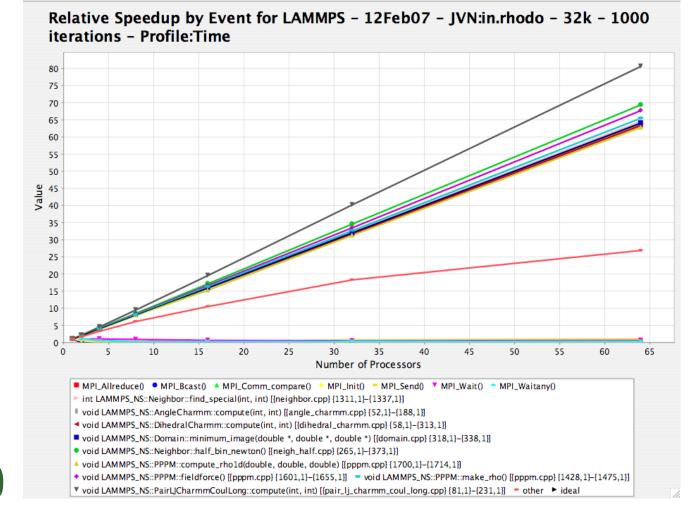


92

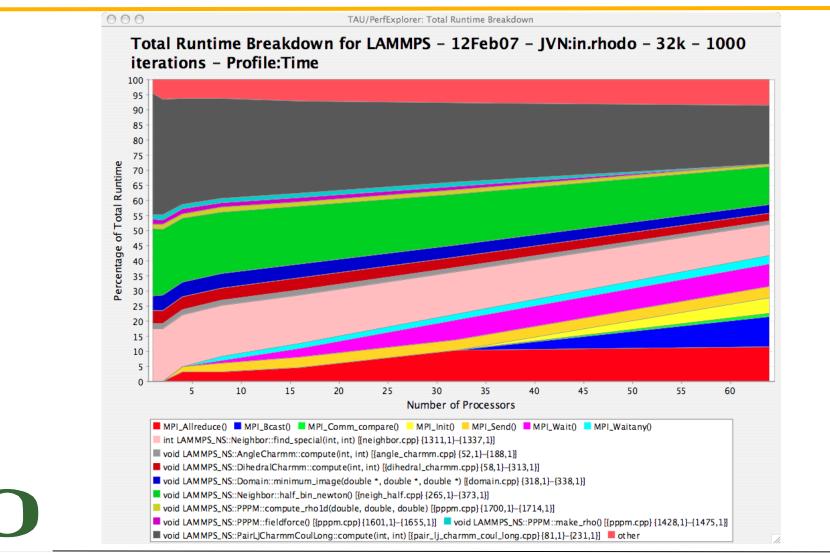
### **PerfExplorer - Relative Speedup by Event**



TAU/PerfExplorer: Relative Speedup by Event



## **PerfExplorer - Runtime Breakdown**

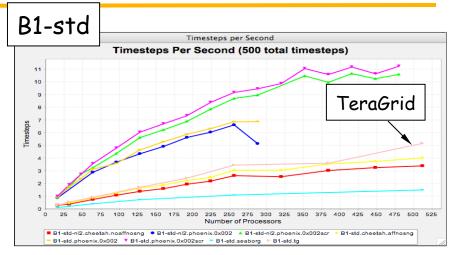


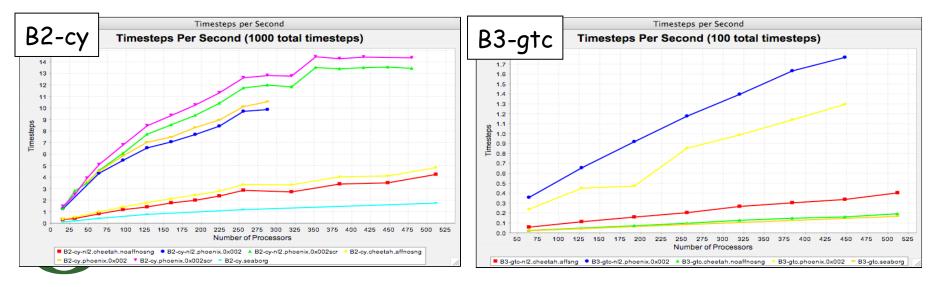
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## **PerfExplorer - Timesteps per Second for GYRO**

- Cray X1 is the fastest to solution
   In all 3 tests
- FFT (nl2) improves time
   B3-gtc only
- TeraGrid faster than p690

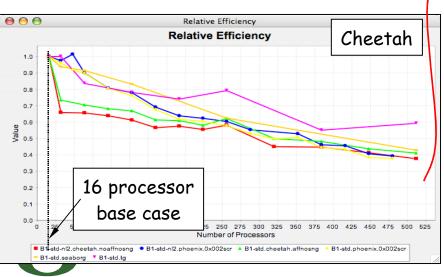
   For B1-std?
- All plots generated automatically

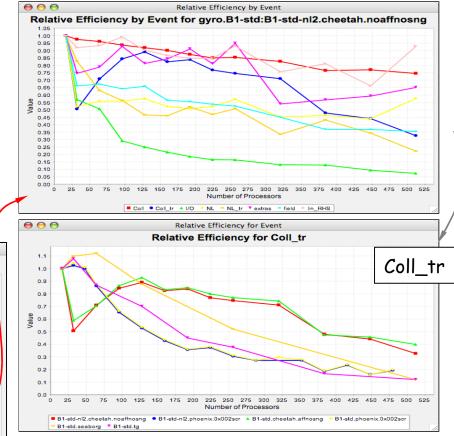




# **PerfExplorer - Relative Efficiency (B1-std)**

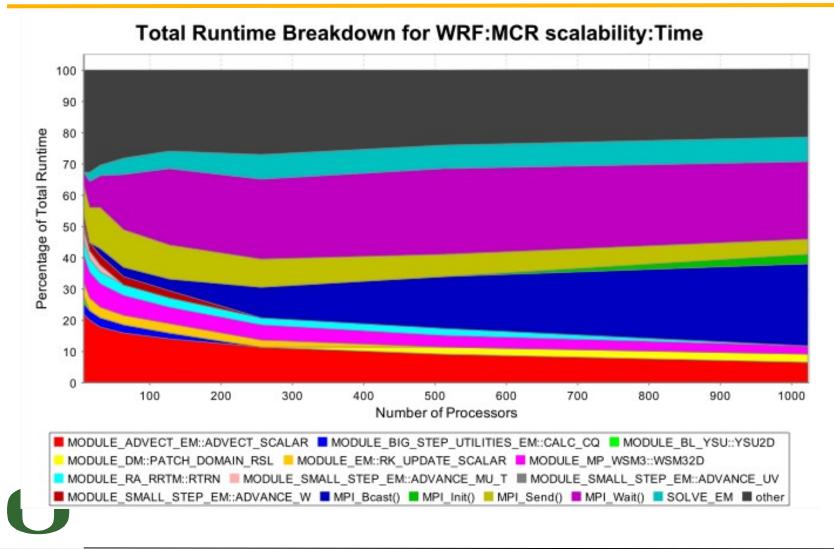
- By experiment (B1-std)
  - Total runtime (Cheetah (red))
- By event for one experiment
  - Coll\_tr (blue) is significant
- By experiment for one event
  - Shows how Coll\_tr behaves for all experiments



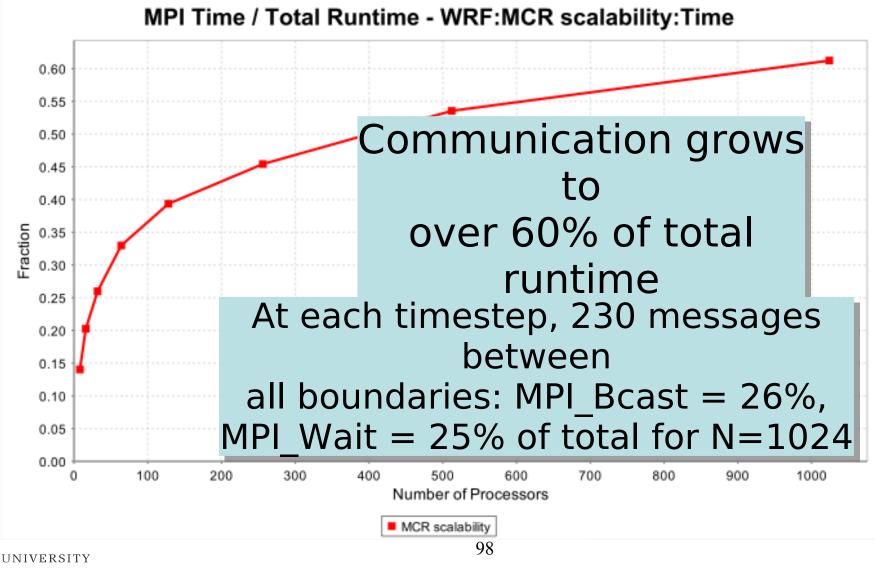


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### **PerfExplorer - Runtime Breakdown**



### **Group % of Total**



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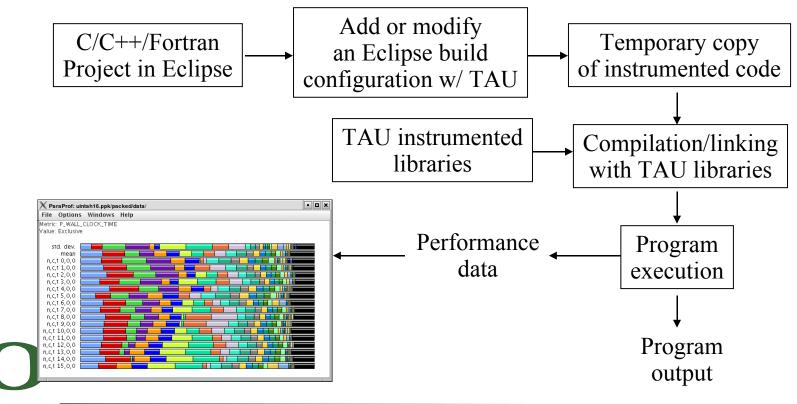
# **TAU Integration with IDEs**

- High performance software development environments
  - Tools may be complicated to use
  - Interfaces and mechanisms differ between platforms / OS
- Integrated development environments
  - Consistent development environment
  - Numerous enhancements to development process
  - Standard in industrial software development
- Integrated performance analysis
  - Tools limited to single platform or programming language
  - Rarely compatible with 3rd party analysis tools
  - Little or no support for parallel projects

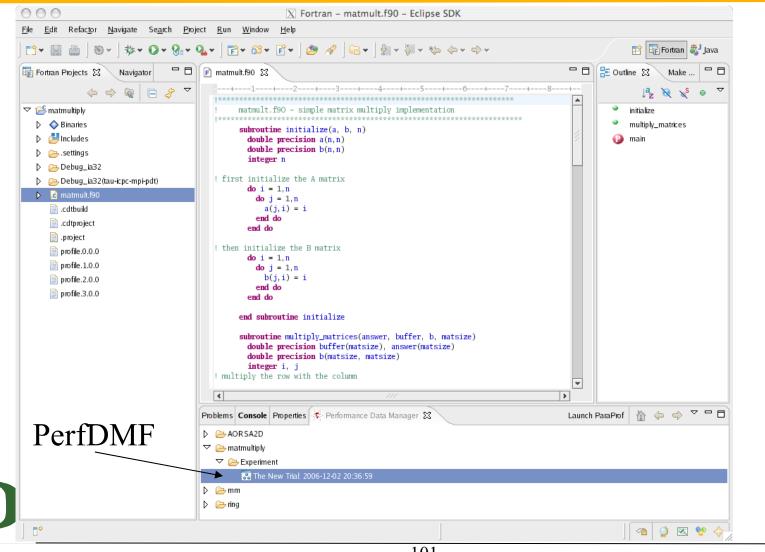


## **TAU and Eclipse**

- Provide an interface for configuring TAU's automatic instrumentation within Eclipse's build system
- Manage runtime configuration settings and environment variables for execution of TAU instrumented programs



#### **TAU and Eclipse**



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#### **Choosing PAPI Counters with TAU in Eclipse**

Profile ×				Ĭ		
Create, manage, and run configurations			Counter	Definition		
Create a configuration to launch a program to be instrumented and profiled by TAU.		PAPI_L1_DCM	Level 1 data cache misses			
j		,,		PAPI_L1_ICM	Level 1 instruction cache misses	
* 🗈 🗶 🖃 🔆	Name: lammps-10Nov05withTAU			PAPI_L2_DCM	Level 2 data cache misses	
				PAPI_L2_ICM	Level 2 instruction cache misses	
ype filter text	🖹 Main 🛛 🕬 🗎 Arg	🖹 Main 🕬= Arguments 🖾 Environment 😫 Parallel 🐼 Analysis 🔭			Level 1 cache misses	
C/C++ Local Applic	6	✓ PAPI Counters	×	PAPI_L2_TCM	Level 2 cache misses	
	MPI	PAPI Counters		PAPI_FPU_IDL	Cycles floating point units are idle	
lammps-10Nov0	Callpath Pro	Select the PAPI counters to use with TAU		PAPI_TLB_DM	Data translation lookaside buffer misses	
	Phase Base	PAPI_L1_DCM	<b>•</b>	PAPI_TLB_IM	Instruction translation lookaside buffer misses	
	Memory Pro	PAPI_L1_ICM		PAPI_TLB_TL	Total translation lookaside buffer misses	
		✓ PAPI_L2_DCM		PAPI_L1_LDM	Level 1 load misses	
	OPARI	□ PAPI_L2_ICM		PAPI_L1_STM	Level 1 store misses	
	OpenMP	PAPI_L1_TCM		PAPI_L2_LDM	Level 2 load misses	
	Epilog			PAPI_L2_STM	Level 2 store misses	
	🗹 PAPI		nters	PAPI_STL_ICY	Cycles with no instruction issue	
	Perflib	PAPI_TLB_DM		PAPI_HW_INT	Hardware interrupts	
				PAPI_BR_TKN	Conditional branch instructions taken	
	Trace			PAPI_BR_MSP	Conditional branch instructions mispredicted	
	Select Makefile			PAPI_TOT_INS	Instructions completed	
			<b>~</b>	PAPI_FP_INS	Floating point instructions	
	Selective Instru			PAPI_BR_INS	Branch instructions	
	None	Select All Deselect All Counter Dese	criptions	PAPI_VEC_INS	Vector/SIMD instructions	
	<ul> <li>Internal</li> </ul>			PAPI_RES_STL	Cycles stalled on any resource	
	O User Define	OK Ca	incel	PAPI_TOT_CYC	Total cycles	
			se	PAPI_L1_DCH	Level 1 data cache hits	
	<u> </u>			PAPI_L2_DCH	Level 2 data cache hits	
///		Appl <u>y</u> Re <u>v</u> ert		PAPI_L1_DCA	Level 1 data cache accesses	
				PAPI_L2_DCA	Level 2 data cache accesses	
Ð		Profile	Close	PAPI_L2_DCR	Level 2 data cache reads	
U Contraction of the second se		Profile	Crose	PAPI_L2_DCW	Level 2 data cache writes	

#### % /projects/tau/eclipse/eclipse

# **TAU Performance System Status**

- Computing platforms (selected)
  - IBM SP/pSeries/BGL/Cell PPE, SGI Altix/Origin, Cray T3E/SV-1/X1/XT3, HP (Compaq) SC (Tru64), Sun, Linux clusters (IA-32/64, Alpha, PPC, PA-RISC, Power, Opteron), Apple (G4/5, OS X), Hitachi SR8000, NEC SX Series, Windows …
- Programming languages
  - C, C++, Fortran 77/90/95, HPF, Java, Python
- Thread libraries (selected)
  - pthreads, OpenMP, SGI sproc, Java, Windows, Charm++
- Compilers (selected)
  - Intel, PGI, GNU, Fujitsu, Sun, PathScale, SGI, Cray, IBM, HP, NEC, Absoft, Lahey, Nagware, ...



### **More Information**

- PAPI References:
  - PAPI documentation page available from the PAPI website: http://icl.cs.utk.edu/papi/
- TAU References:
  - TAU Users Guide and papers available from the TAU website: <u>http://tau.uoregon.edu/</u>
- VAMPIR References
  - VAMPIR-NG website
     http://www.vampir-ng.de/
- Scalasca/KOJAK References
  - Scalasca documentation page http://www.scalasca.org/
- Eclipse PTP References
  - Documentation available from the Eclipse PTP website: http://www.eclipse.org/ptp/



## Acknowledgements

