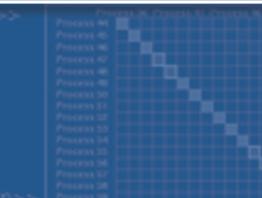




SOFTWARE



0.00 <<time step loop>>
0.00 updatedt
6.62 updateX
372.85 updateLEN
0.00 gene
0.00 <<iteration loop>>
293.65 genBC



PRODUCTIVITY

FAST SOLUTIONS

- PAPI_L1_DCM
- PAPI_L1_ICM
- PAPI_L2_DCM
- PAPI_L2_ICM
- PAPI_L1_TCM
- PAPI_L2_TCM

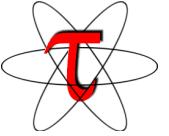
TAU PERFORMANCE SYSTEM

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Department of Computer and Information Science
University of Oregon





- Tuning and Analysis Utilities (18+ year project)
- Comprehensive performance profiling and tracing
 - Integrated, scalable, flexible, portable
 - Targets all parallel programming/execution paradigms
- Integrated performance toolkit
 - Instrumentation, measurement, analysis, visualization
 - Widely-ported performance profiling / tracing system
 - Performance data management and data mining
 - Open source (BSD-style license)
- Easy to integrate in application frameworks

<http://tau.uoregon.edu>

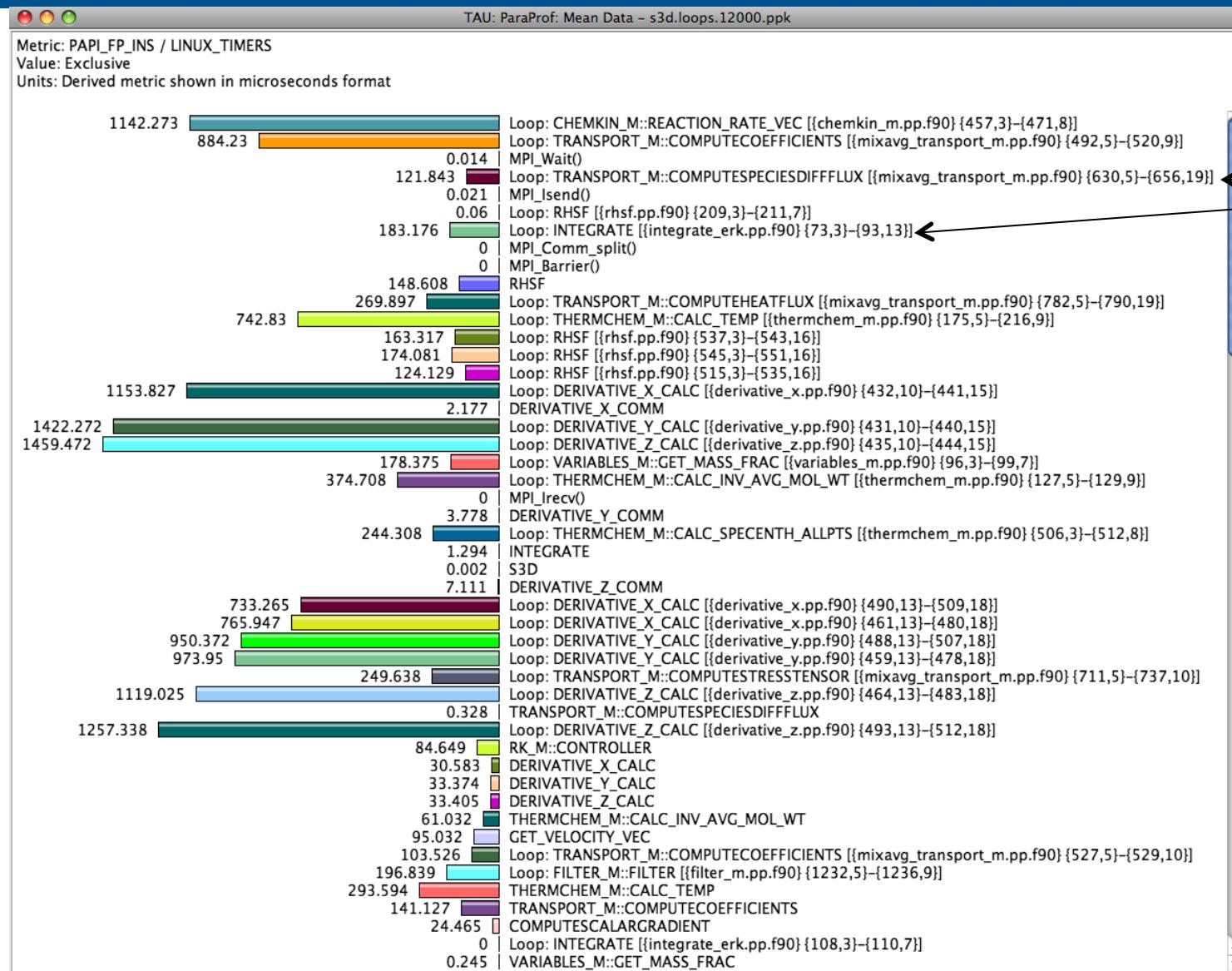
- TAU is a performance evaluation tool
- It supports parallel profiling and tracing
- Profiling shows you how much (total) time was spent in each routine
- Tracing shows you *when* the events take place in each process along a timeline
- Profiling and tracing can measure time as well as hardware performance counters (cache misses, instructions) from your CPU
- TAU can automatically instrument your source code using a package called PDT for routines, loops, I/O, memory, phases, etc.
- TAU runs on most 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's automatic source instrumentation, you may set a couple of environment variables and substitute the name of your compiler with a TAU shell script**

- How much time is spent in each application routine and outer **loops**? Within loops, what is the contribution of each **statement**?
- How many instructions are executed in these code regions? Floating point, Level 1 and 2 **data cache misses**, hits, branches taken?
- What is the **peak heap memory** usage of the code? When and where is memory allocated/de-allocated? Are there any memory leaks?
- How much time does the application spend performing **I/O**? What is the peak read and write **bandwidth** of individual calls, total volume?
- What is the contribution of different **phases** of the program? What is the time wasted/spent waiting for collectives, and I/O operations in Initialization, Computation, I/O phases?
- How does the application **scale**? What is the efficiency, runtime breakdown of performance across different core counts?

- Uninstrumented code:
 - % mpirun –np 8 ./a.out
- With TAU:
 - % mpirun –np 8 **tau_exec** ./a.out
 - % paraprof

ParaProf: Mflops Sorted by Exclusive Time

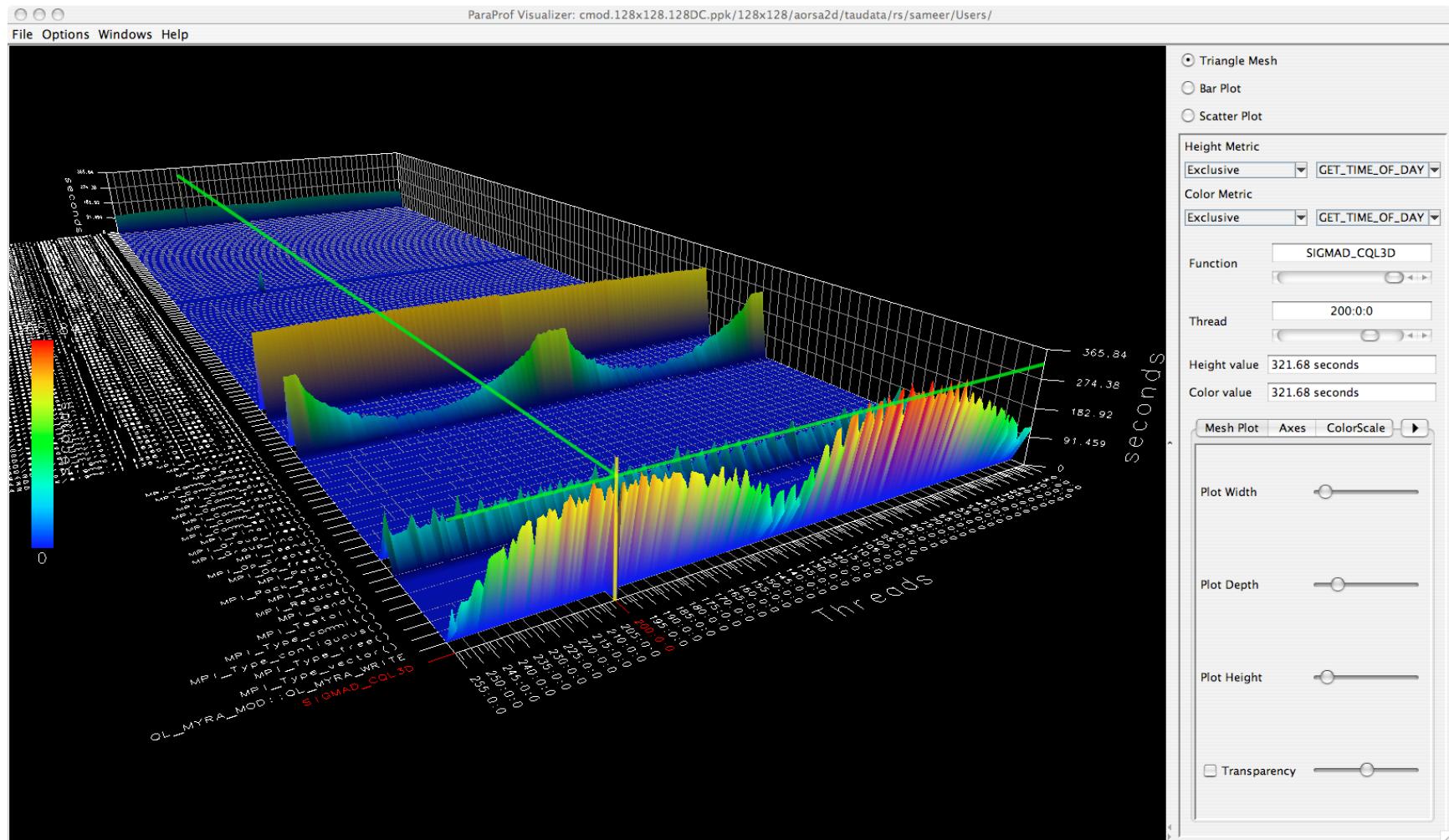
VI-HPS



low mflops in loops?

Parallel Profile Visualization: ParaProf

VI-HPS



- **Instrumentation:** Adds probes to perform measurements
 - Source code instrumentation using pre-processors and compiler scripts
 - Wrapping external libraries (I/O, MPI, Memory, CUDA, OpenCL, pthread)
 - Rewriting the binary executable
- **Measurement:** Profiling or Tracing using wallclock time or hardware counters
 - Direct instrumentation (Interval events measure exclusive or inclusive duration)
 - Indirect instrumentation (Sampling measures statement level contribution)
 - Throttling and runtime control of low-level events that execute frequently
 - Per-thread storage of performance data
 - Interface with external packages (Scalasca, VampirTrace, Score-P, PAPI)
- **Analysis:** Visualization of profiles and traces
 - 3D visualization of profile data in paraprof, perfexplorer tools
 - Trace conversion & display in external visualizers (Vampir, Jumpshot, ParaVer)

- TAU supports several measurement and thread options
 - Phase profiling, profiling with hardware counters, trace with Score-P...
- Each measurement configuration of TAU corresponds to a unique stub makefile and library that is generated when you configure it
- To instrument source code automatically using PDT
 - Choose an appropriate TAU stub makefile in <arch>/lib:
`% export TAU_MAKEFILE=$TAU/Makefile.tau-mpi-pdt`
`% export TAU_OPTIONS=' -optVerbose ...' (see tau_compiler.sh)`
Use tau_f90.sh, tau_cxx.sh or tau_cc.sh as F90, C++ or C compilers:
`% mpif90 foo.f90 changes to`
`% tau_f90.sh foo.f90`
- Set runtime environment variables, execute application and analyze performance data:
`% pprof (for text based profile display)`
`% paraprof (for GUI)`

Choosing an Appropriate TAU_MAKEFILE



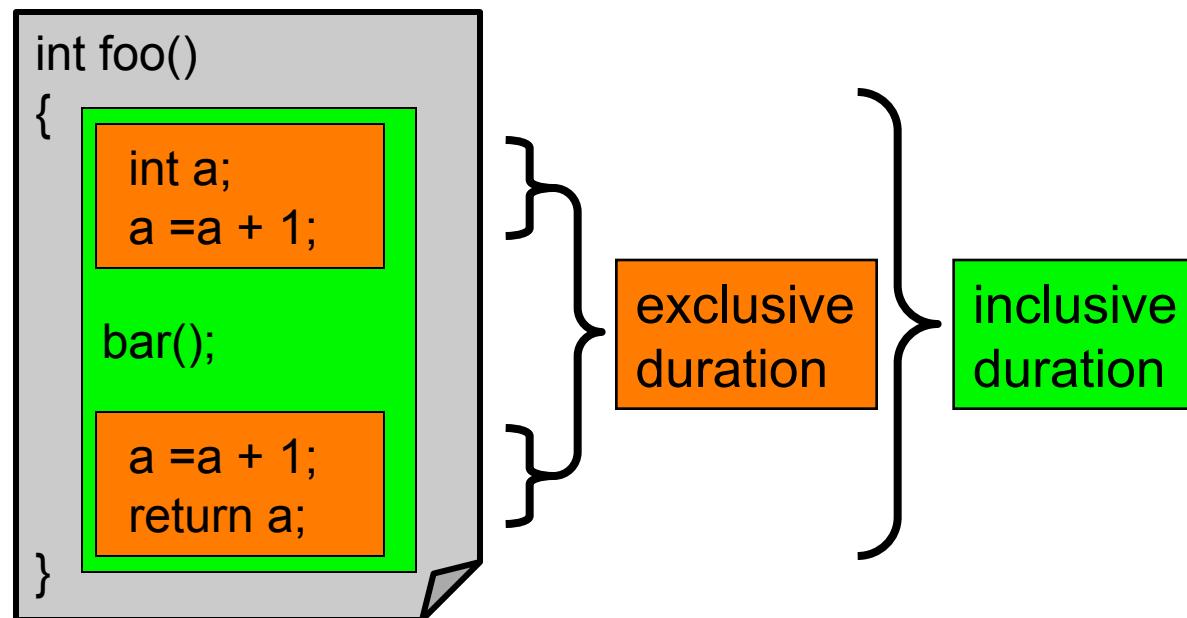
```
% cd $TAUROOTDIR/<arch>/lib; ls Makefile.*  
Makefile.tau-pdt  
Makefile.tau-mpi-pdt  
Makefile.tau-pthread-pdt  
Makefile.tau-papi-mpi-pdt  
Makefile.tau-mpi-pthread-pdt  
Makefile.tau-papi-pthread-pdt  
Makefile.tau-opari-openmp-mpi-pdt  
Makefile.tau-papi-mpi-pdt-epilog-scalasca-trace  
Makefile.tau-papi-mpi-pdt-vampirtrace-trace ...
```

- For an MPI+F90 application, you may choose **Makefile.tau-mpi-pdt**
 - Supports MPI instrumentation & PDT for automatic source instrumentation
 - % export TAU_MAKEFILE=\$TAU/Makefile.tau-mpi-pdt
 - % tau_f90.sh matrix.f90 -o matrix
 - % mpirun -np 8 ./matrix
 - % paraprof

- Supports both direct and indirect performance observation
 - Direct instrumentation of program (system) code (probes)
 - Instrumentation invokes performance measurement
 - Event measurement: performance data, meta-data, context
 - Indirect mode supports sampling based on periodic timer or hardware performance counter overflow based interrupts
- Support for user-defined events
 - **Interval** (Start/Stop) events to measure exclusive & inclusive duration
 - **Atomic events** (Trigger at a single point with data, e.g., heap memory)
 - Measures total, samples, min/max/mean/std. deviation statistics
 - **Context events** (are atomic events with executing context)
 - Measures above statistics for a given calling path

- Event types
 - Interval events (begin/end events)
 - Measures exclusive & inclusive durations between events
 - Metrics monotonically increase
 - Atomic events (trigger with data value)
 - Used to capture performance data state
 - Shows extent of variation of triggered values (min/max/mean)
- Code events
 - Routines, classes, templates
 - Statement-level blocks, loops

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



Interval Events, Atomic Events in TAU

VI-HPS

%Time	Exclusive msec	Inclusive total msec	#Call	#Subrs	Inclusive Name usec/call
100.0	0.187	1.105	1	44	1105659 int main(int, char **) C
93.2	1.030	1.030	1	0	1030654 MPI_Init()
5.9	0.879	65	40	320	1637 void func(int, int) C
4.6	51	51	40	0	1277 MPI_Barrier()
1.2	13	13	120	0	111 MPI_Recv()
0.8	9	9	1	0	9328 MPI_Finalize()
0.0	0.137	0.137	120	0	1 MPI_Send()
0.0	0.086	0.086	40	0	2 MPI_Bcast()
0.0	0.002	0.002	1	0	2 MPI_Comm_size()
0.0	0.001	0.001	1	0	1 MPI_Comm_rank()

Interval events
e.g., routines
(start/stop) show
duration

USER EVENTS Profile :NODE 0, CONTEXT 0, THREAD 0						
NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.	Event Name	
365	5.138E+04	44.39	3.09E+04	1.234E+04	Heap Memory Used (KB) : Entry	
365	5.138E+04	2064	3.115E+04	1.21E+04	Heap Memory Used (KB) : Exit	
40	40	40	40	0	Message size for broadcast	

27.1

1%

Atomic events
(triggered with
value) show
extent of variation
(min/max/mean)

```
% export TAU_CALLPATH_DEPTH=0
% export TAU_TRACK_HEAP=1
```

Atomic Events, Context Events

VI-HPS

%Time	Exclusive msec	Inclusive total msec	#Call	#Subrs	Inclusive Name usec/call
100.0	0.253	1.106	1	44	1106701 int main(int, char **) C
93.2	1.031	1.031	1	0	1031311 MPI_Init()
6.0	1	66	40	320	1650 void func(int, int) C
5.7	63	63	40	0	1588 MPI_BARRIER()
0.8	9	9	1	0	9119 MPI_Finalize()
0.1	1	1	120	0	10 MPI_Recv()
0.0	0.141	0.141	120	0	1 MPI_Send()
0.0	0.085	0.085	40	0	2 MPI_Bcast()
0.0	0.001	0.001	1	0	1 MPI_Comm_size()
0.0	0	0	1	0	0 MPI_Comm_rank()

USER EVENTS Profile :NODE 0, CONTEXT 0, THREAD 0					
NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.	Event Name
40	40	40	40	0	Message size for broadcast
365	5.139E+04	44.39	3.091E+04	1.234E+04	Heap Memory Used (KB) : Entry
40	5.139E+04	3097	3.114E+04	1.227E+04	Heap Memory Used (KB) : Entry : MPI_BARRIER()
40	5.139E+04	1.13E+04	3.134E+04	1.187E+04	Heap Memory Used (KB) : Entry : MPI_Bcast()
1	2067	2067	2067	0	Heap Memory Used (KB) : Entry : MPI_Comm_rank()
1	2066	2066	2066	0	Heap Memory Used (KB) : Entry : MPI_Comm_size()
1	5.139E+04	5.139E+04	5.139E+04	0.0006905	Heap Memory Used (KB) : Entry : MPI_Finalize()
1	57.56	57.56	57.56	0	Heap Memory Used (KB) : Entry : MPI_Init()
120	5.139E+04	1.13E+04	3.134E+04	1.187E+04	Heap Memory Used (KB) : Entry : MPI_Recv()
120	5.139E+04	1.129E+04	3.134E+04	1.187E+04	Heap Memory Used (KB) : Entry : MPI_Send()
1	44.39	44.39	44.39	0	Heap Memory Used (KB) : Entry : int main(int, char **) C
40	5.036E+04	2068	3.011E+04	1.227E+04	Heap Memory Used (KB) : Entry : void func(int, int) C

4.9 1%

Atomic events

Context events
=atomic event
+ executing
context

% export TAU_CALLPATH_DEPTH=1

Controls depth of executing context shown in profiles

% export TAU_TRACK_HEAP=1

Context Events (Default)

VI-HPS

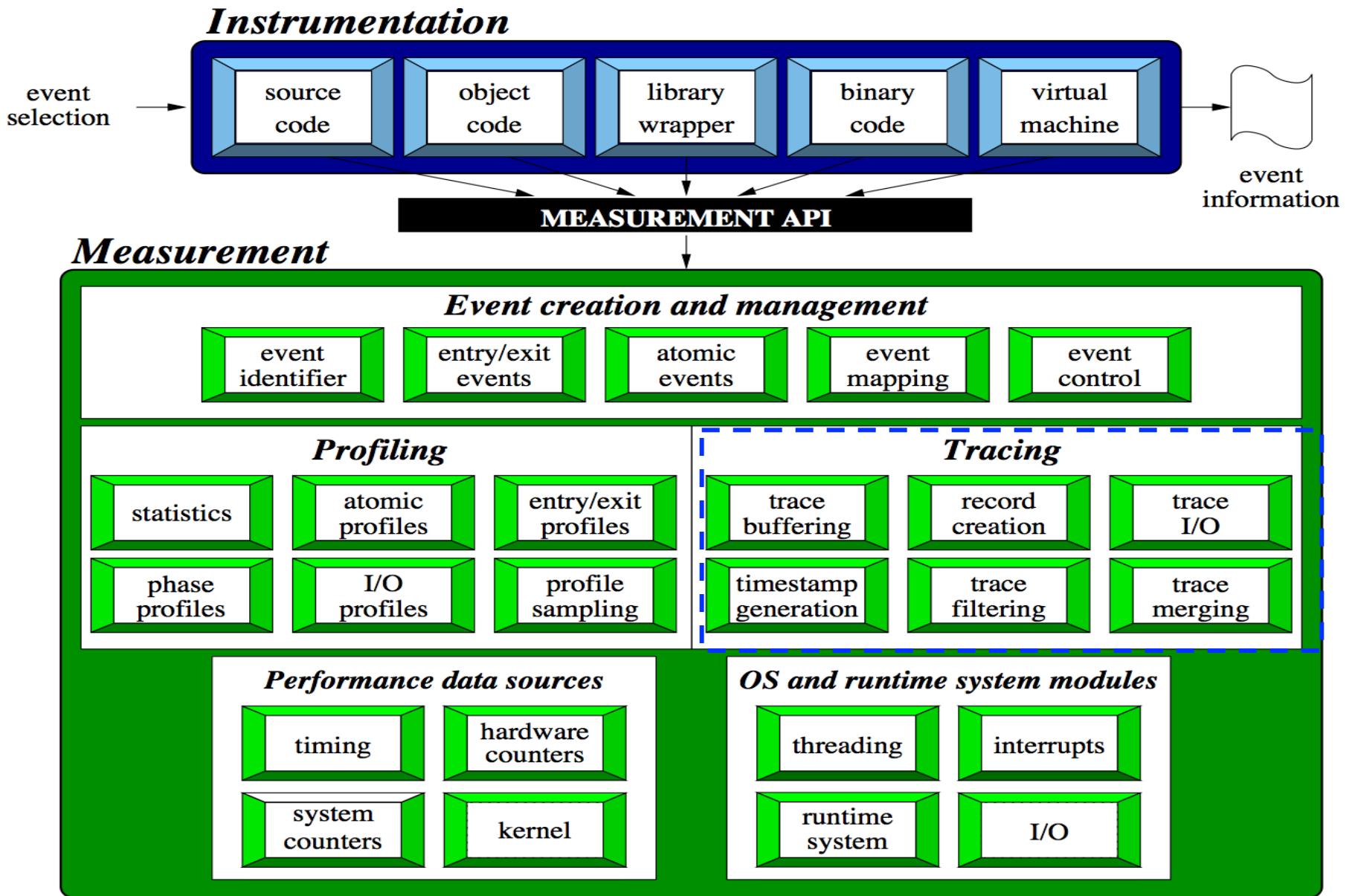
NODE 0:CONTEXT 0;THREAD 0:					
%Time	Exclusive msec	Inclusive total msec	#Call	#Subrs	Inclusive Name usec/call
100.0	0.357	1.114	1	44	1114040 int main(int, char **) C
92.6	1.031	1.031	1	0	1031066 MPI_Init()
6.7	72	74	40	320	1865 void func(int, int) C
0.7	8	8	1	0	8002 MPI_Finalize()
0.1	1	1	120	0	12 MPI_Recv()
0.1	0.608	0.608	40	0	15 MPI_BARRIER()
0.0	0.136	0.136	120	0	1 MPI_Send()
0.0	0.095	0.095	40	0	2 MPI_Bcast()
0.0	0.001	0.001	1	0	1 MPI_Comm_size()
0.0	0	0	1	0	0 MPI_Comm_rank()

USER EVENTS Profile :NODE 0, CONTEXT 0, THREAD 0					
NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.	Event Name
365	5.139E+04	44.39	3.091E+04	1.234E+04	Heap Memory Used (KB) : Entry
1	44.39	44.39	44.39	0	Heap Memory Used (KB) : Entry : int main(int, char **) C
1	2068	2068	2068	0	Heap Memory Used (KB) : Entry : int main(int, char **) C => MPI_Comm_rank()
1	2066	2066	2066	0	Heap Memory Used (KB) : Entry : int main(int, char **) C => MPI_Comm_size()
1	5.139E+04	5.139E+04	5.139E+04	0	Heap Memory Used (KB) : Entry : int main(int, char **) C => MPI_Finalize()
1	57.58	57.58	57.58	0	Heap Memory Used (KB) : Entry : int main(int, char **) C => MPI_Init()
40	5.036E+04	2069	3.011E+04	1.228E+04	Heap Memory Used (KB) : Entry : int main(int, char **) C => void func(int, int) C
40	5.139E+04	3098	3.114E+04	1.227E+04	Heap Memory Used (KB) : Entry : void func(int, int) C => MPI_BARRIER()
40	5.139E+04	1.13E+04	3.134E+04	1.187E+04	Heap Memory Used (KB) : Entry : void func(int, int) C => MPI_Bcast()
120	5.139E+04	1.13E+04	3.134E+04	1.187E+04	Heap Memory Used (KB) : Entry : void func(int, int) C => MPI_Recv()
120	5.139E+04	1.13E+04	3.134E+04	1.187E+04	Heap Memory Used (KB) : Entry : void func(int, int) C => MPI_Send()
365	5.139E+04	2065	3.116E+04	1.21E+04	Heap Memory Used (KB) : Exit

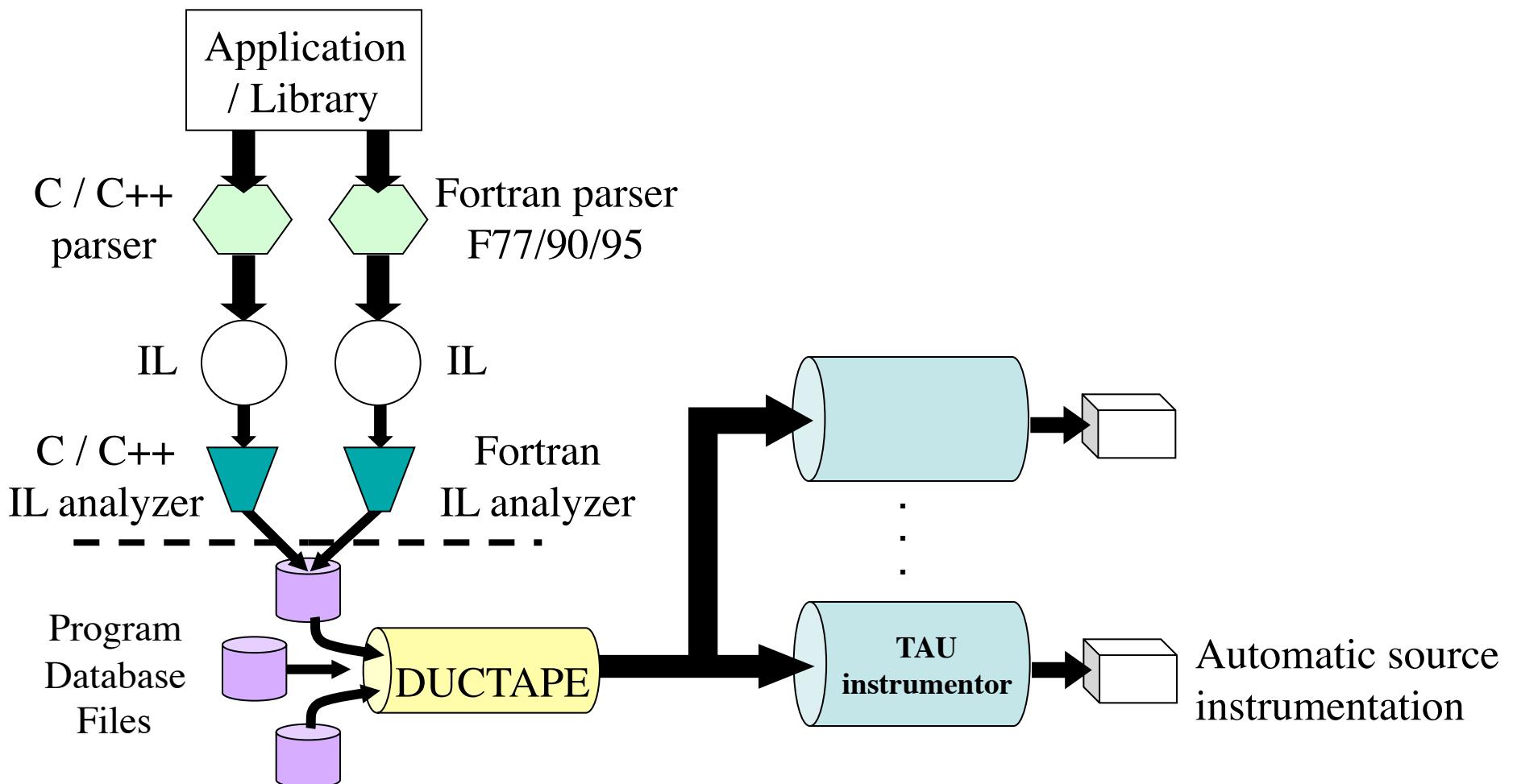
```
% export TAU_CALLPATH_DEPTH=2
% export TAU_TRACK_HEAP=1
```

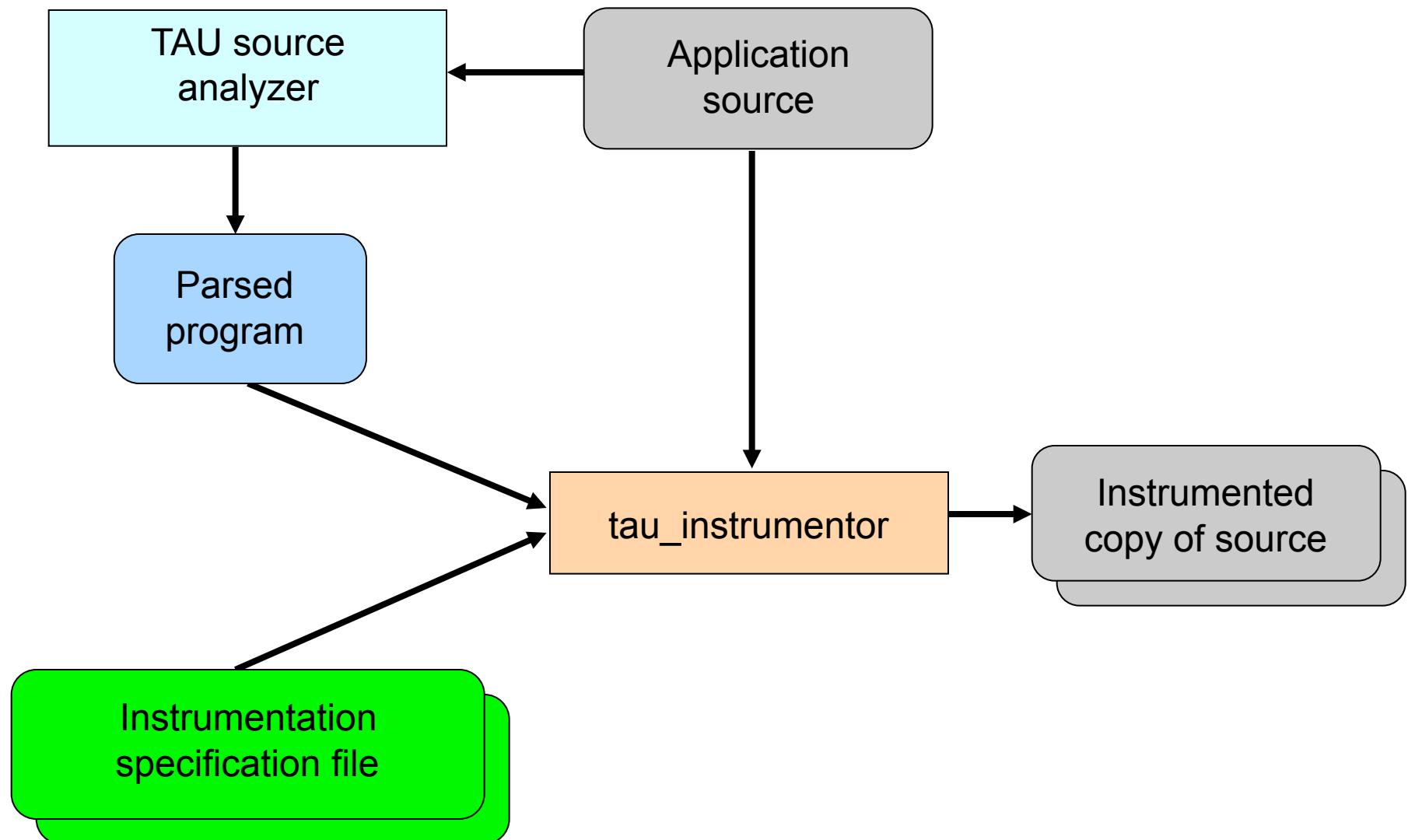
3.7
Context event
=atomic event
+ executing
context

1%



- Source Code Instrumentation
 - Manual instrumentation
 - Automatic instrumentation using pre-processor based on static analysis of source code (PDT), creating an instrumented copy
 - Compiler generates instrumented object code
- Library Level Instrumentation
 - Wrapper libraries for standard MPI libraries using PMPI interface
 - Wrapping external libraries where source is not available
- Runtime pre-loading and interception of library calls
- Binary Code instrumentation
 - Rewrite the binary, runtime instrumentation
- Virtual Machine, Interpreter, OS level instrumentation

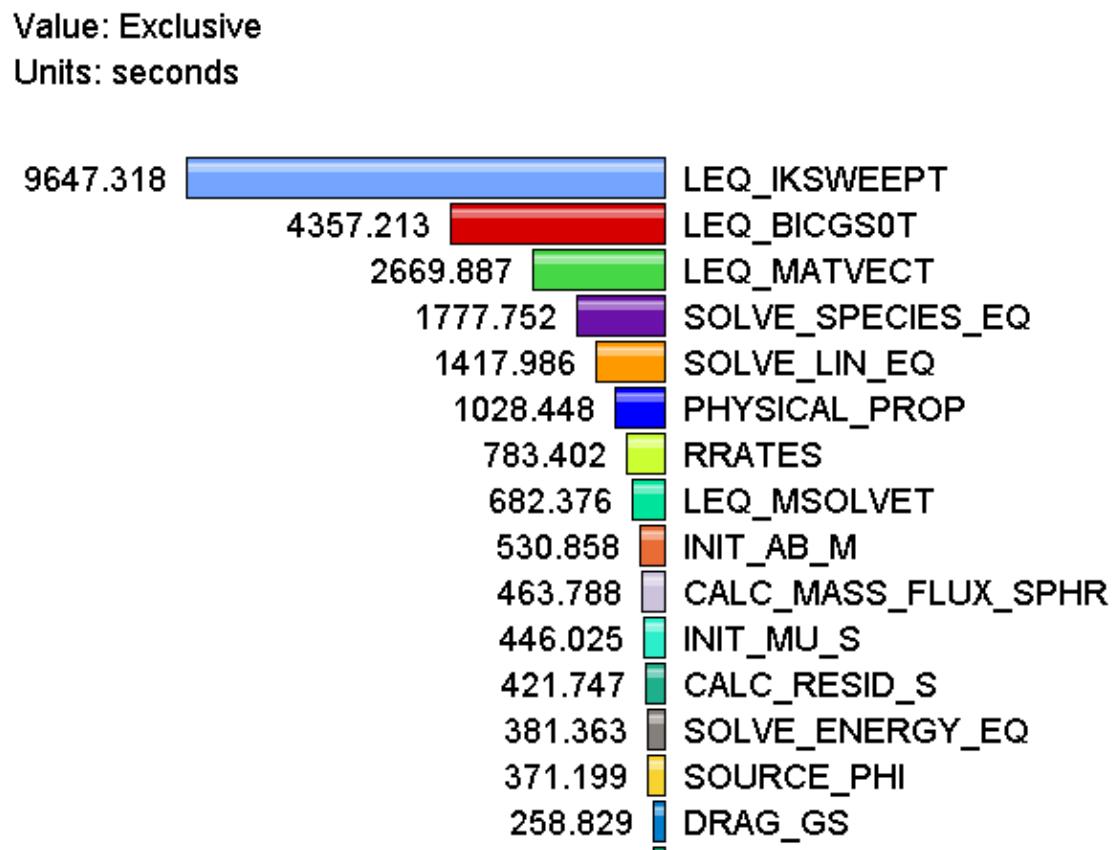




- To instrument source code using PDT
 - Choose an appropriate TAU stub makefile from <taudir>/<arch>/lib/Makefile.tau*: (typically, *arch*=i386_linux, x86_64, craycnl, bgp, cygwin ... and *taudir*=/usr/local/packages/tau on LiveDVD)

```
% export TAU_MAKEFILE=$TAU/Makefile.tau-mpi-pdt
% make CC=tau_cc.sh CXX=tau_cxx.sh F90=tau_f90.sh
```
- Execute application and analyze performance data:
 - % pprof (for text based profile display)**
 - % paraprof (for GUI)**

- How much time is spent in each application routine?



Solution: Generating a flat profile with MPI



```
% export TAU_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-mpi-pdt
```

```
% export PATH=<taudir>/<arch>/bin:$PATH
```

Or

```
% module load tau
```

```
% make F90=tau_f90.sh
```

Or

```
% tau_f90.sh matmult.f90
```

```
% mpirun -np 8 ./a.out
```

```
% paraprof
```

To view. To view the data locally on the workstation,

```
% paraprof --pack app.ppk
```

Move the app.ppk file to your desktop.

```
% paraprof app.ppk
```

Click on the "node 0" label to see profile for that node. Right click to see other options. Windows -> 3D Visualization for 3D window.

- We now provide compiler wrapper scripts
 - Simply replace `CC` with `tau_cxx.sh`
 - Automatically instruments C++ and C source code, links with TAU MPI Wrapper libraries.
- Use `tau_cc.sh` and `tau_f90.sh` for C and Fortran

Before

```
CXX = mpicxx
F90 = mpif90
CXXFLAGS =
LIBS = -lm
OBJS = f1.o f2.o f3.o ... fn.o

app: $(OBJS)
    $(CXX) $(LDFLAGS) $(OBJS) -o $@
    $(LIBS)

.cpp.o:
    $(CXX) $(CXXFLAGS) -c $<
```

After

```
CXX = tau_cxx.sh
F90 = tau_f90.sh
CXXFLAGS =
LIBS = -lm
OBJS = f1.o f2.o f3.o ... fn.o

app: $(OBJS)
    $(CXX) $(LDFLAGS) $(OBJS) -o $@
    $(LIBS)

.cpp.o:
    $(CXX) $(CXXFLAGS) -c $<
```

- See `<taudir>/<arch>/bin/tau_compiler.sh -help`

- Compilation:

```
% ftn -c foo.f90
```

Changes to

```
% gfpars e foo.f90 $(OPT1)  
% tau_instrumentor foo.pdb foo.f90 -o foo.inst.f90 $(OPT2)  
% ftn -c foo.inst.f90 -o foo.o $(OPT3)
```

- Linking:

```
% ftn foo.o bar.o -o app
```

Changes to

```
% ftn foo.o bar.o -o app <taulibs> $(OPT4)
```

- Where options OPT[1-4] default values may be overridden by the user:

F90 = tau_f90.sh

Compile-Time Environment Variables



- Optional parameters for the TAU_OPTIONS environment variable:

% tau_compiler.sh	
-optVerbose	Turn on verbose debugging messages
-optComInst	Use compiler based instrumentation
-optNoComInst	Do not revert to compiler instrumentation if source instrumentation fails.
-optTrackIO	Wrap POSIX I/O call and calculates vol/bw of I/O operations (Requires TAU to be configured with <i>-iowrapper</i>)
-optKeepFiles	Does not remove intermediate .pdb and .inst.* files
-optPreProcess	Preprocess Fortran sources before instrumentation
-optTauSelectFile=<file>	Specify selective instrumentation file for <i>tau_instrumentor</i>
-optTauWrapFile=<file>	Specify path to <i>link_options.tau</i> generated by <i>tau_gen_wrapper</i>
-optHeaderInst	Enable Instrumentation of headers
-optLinking=""	Options passed to the linker. Typically \$(TAU_MPI_FLIBS) \$(TAU_LIBS) \$(TAU_CXXLIBS)
-optCompile=""	Options passed to the compiler. Typically \$(TAU_MPI_INCLUDE) \$(TAU_INCLUDE) \$(TAU_DEFS)
-optPdtF95Opts=""	Add options for Fortran parser in PDT (f95parse/gfparse)
-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)
-optPdtCxxOpts=""	Options for C++ parser in PDT (cxxparse). Typically \$(TAU_MPI_INCLUDE) \$(TAU_INCLUDE) \$(TAU_DEFS) ...

- 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='-optComplInst -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=select.tau -optVerbose -optPreProcess'`
`% cat select.tau`
BEGIN_INSTRUMENT_SECTION
loops routine="#"
this statement instruments all outer loops in all routines. # is wildcard as well as comment in first column.
END_INSTRUMENT_SECTION

Runtime Environment Variables in TAU

Environment Variable	Default	Description
TAU_TRACE	0	Setting to 1 turns on tracing
TAU_CALLPATH	0	Setting to 1 turns on callpath profiling
TAU_TRACK_MEMORY_LEAKS	0	Setting to 1 turns on leak detection (for use with tau_exec -memory ./a.out)
TAU_TRACK_HEAP or TAU_TRACK_HEADROOM	0	Setting to 1 turns on tracking heap memory/headroom at routine entry & exit using context events (e.g., Heap at Entry: main=>foo=>bar)
TAU_CALLPATH_DEPTH	2	Specifies depth of callpath. Setting to 0 generates no callpath or routine information, setting to 1 generates flat profile and context events have just parent information (e.g., Heap Entry: foo)
TAU_TRACK_IO_PARAMS	0	Setting to 1 with –optTrackIO or tau_exec –io captures arguments of I/O calls
TAU_SAMPLING	1	Generates sample based profiles
TAU_COMM_MATRIX	0	Setting to 1 generates communication matrix display using context events
TAU_THROTTLE	1	Setting to 0 turns off throttling. Enabled by default to remove instrumentation in lightweight routines that are called frequently
TAU_THROTTLE_NUMCALLS	100000	Specifies the number of calls before testing for throttling
TAU_THROTTLE_PERCALL	10	Specifies value in microseconds. Throttle a routine if it is called over 100000 times and takes less than 10 usec of inclusive time per call
TAU_COMPENSATE	0	Setting to 1 enables runtime compensation of instrumentation overhead
TAU_PROFILE_FORMAT	Profile	Setting to “merged” generates a single file. “snapshot” generates xml format
TAU_METRICS	TIME	Setting to a comma separated list generates other metrics. (e.g., TIME:P_VIRTUAL_TIME:PAPI_FP_INS:PAPI_NATIVE_<event>\:<subevent>)

Usage Scenarios: Loop Level Instrumentation

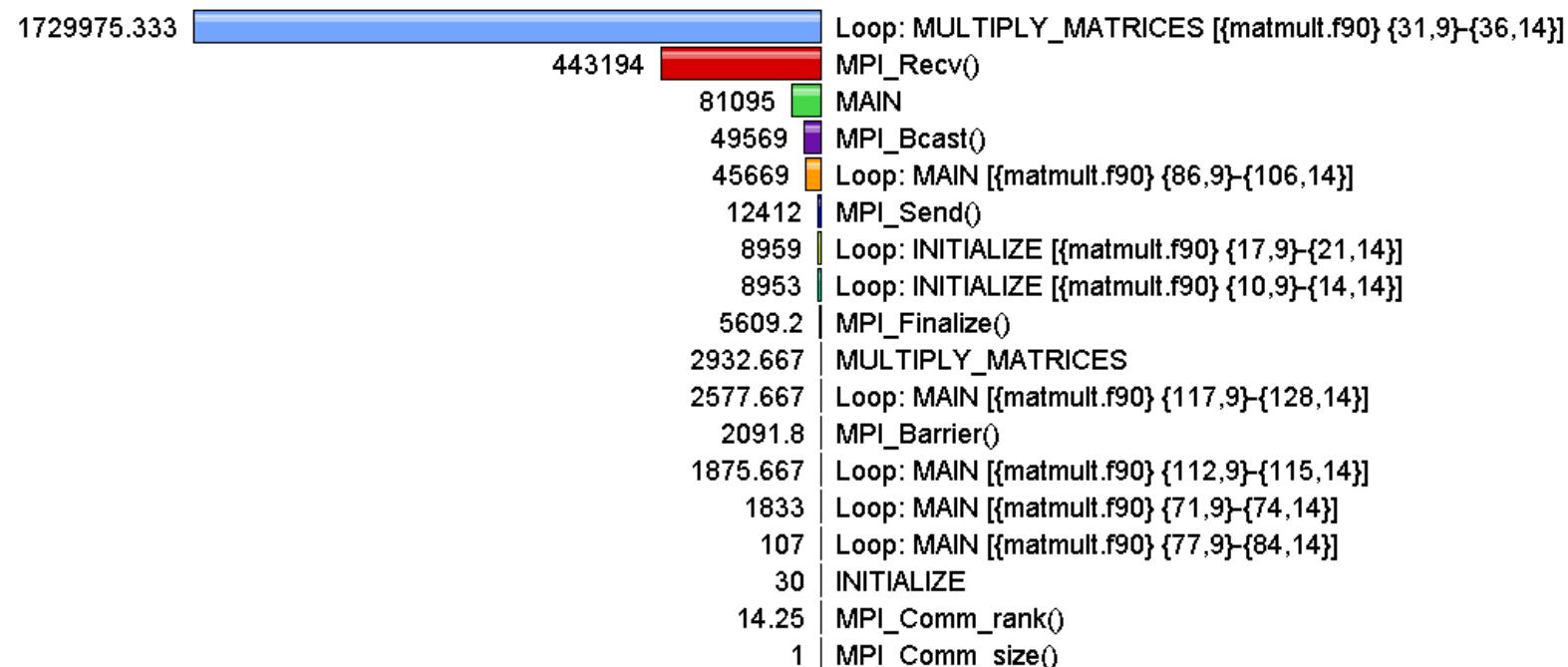
VI-HPS

- Goal: What loops account for the most time? How much?
- Flat profile with wallclock time with loop instrumentation:

Metric: GET_TIME_OF_DAY

Value: Exclusive

Units: microseconds



Solution: Generating a loop level profile

```
% export TAU_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-mpi-pdt
% export TAU_OPTIONS='-optTauSelectFile=select.tau -optVerbose'
% cat select.tau
BEGIN_INSTRUMENT_SECTION
loops routine="#"
END_INSTRUMENT_SECTION

% module load tau
% make F90=tau_f90.sh
(Or edit Makefile and change F90=tau_f90.sh)
% mpirun -np 8 ./a.out
% paraprof --pack app.ppk
Move the app.ppk file to your desktop.

% paraprof app.ppk
```

Computing Floating Point Instructions Executed Per Second in Loops

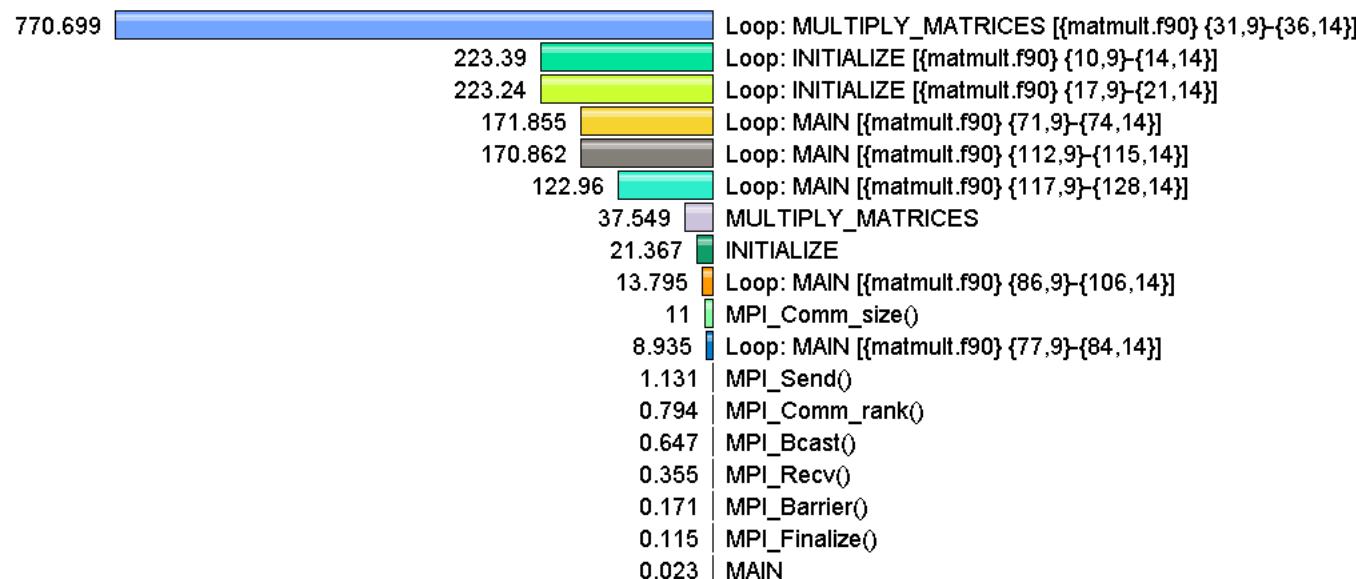
VI-HPS

- Goal: What execution rate do my application loops get in mflops?
- Flat profile with PAPI_FP_INS and time with loop instrumentation:

Metric: PAPI_FP_INS / GET_TIME_OF_DAY

Value: Exclusive

Units: Derived metric shown in microseconds format



Generate a PAPI profile with 2 or more counters



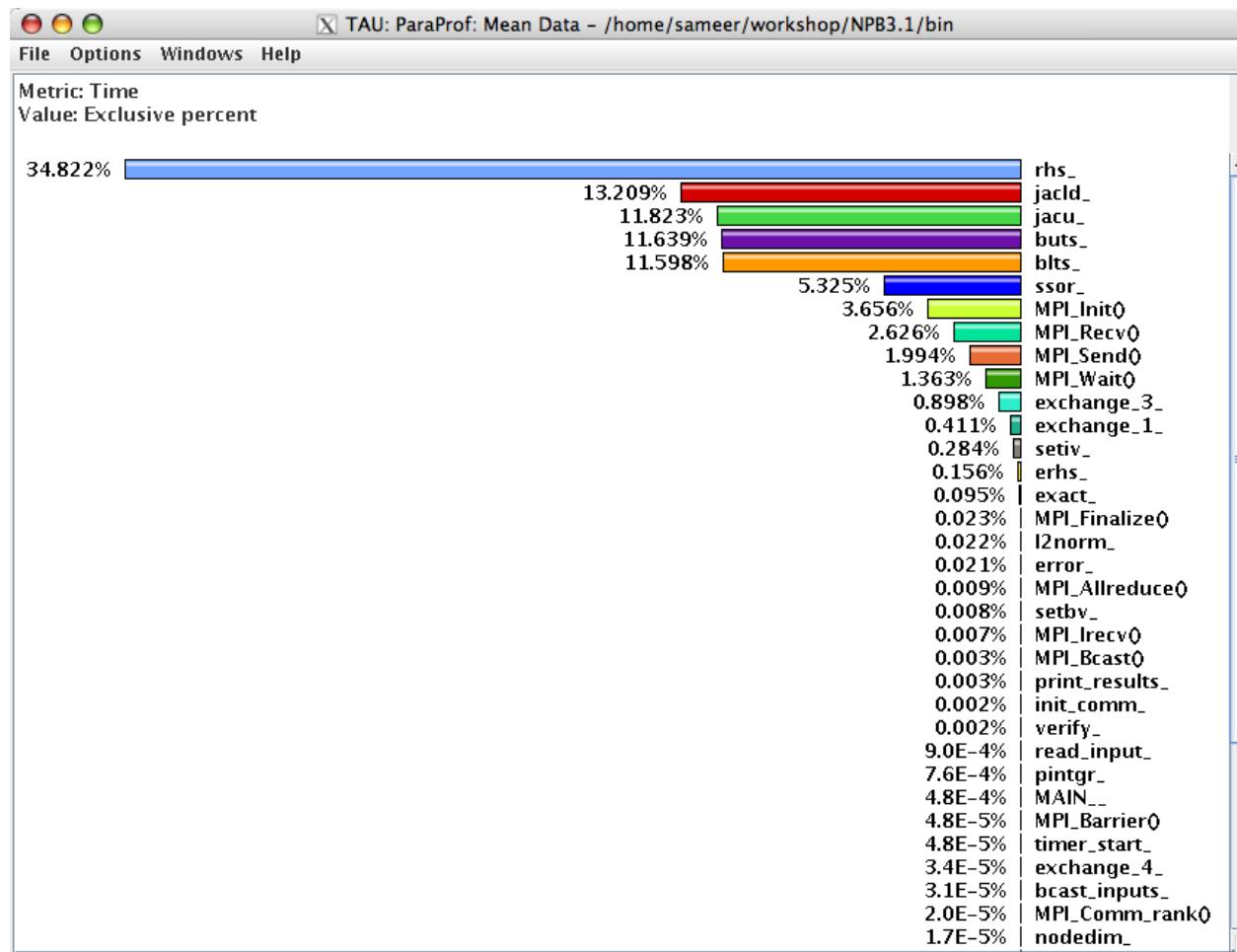
```
% export TAU_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-papi-mpi-pdt
% export TAU_OPTIONS=' -optTauSelectFile=select.tau -optVerbose'
% cat select.tau
BEGIN_INSTRUMENT_SECTION
loops routine="#"
END_INSTRUMENT_SECTION

% make F90=tau_f90.sh
(Or edit Makefile and change F90=tau_f90.sh)
% export TAU_METRICS=TIME:PAPI_FP_INS
% mpirun -np 8 ./a.out
% paraprof --pack app.ppk
Move the app.ppk file to your desktop.
% paraprof app.ppk
Choose Options -> Show Derived Panel -> Click PAPI_FP_INS,
Click "/", Click TIME, Apply, Choose new metric by double clicking.
```

Usage Scenarios: Compiler-based Instrumentation

VI-HPS

- Use the compiler to automatically emit instrumentation calls in the object code instead of parsing the source code using PDT.



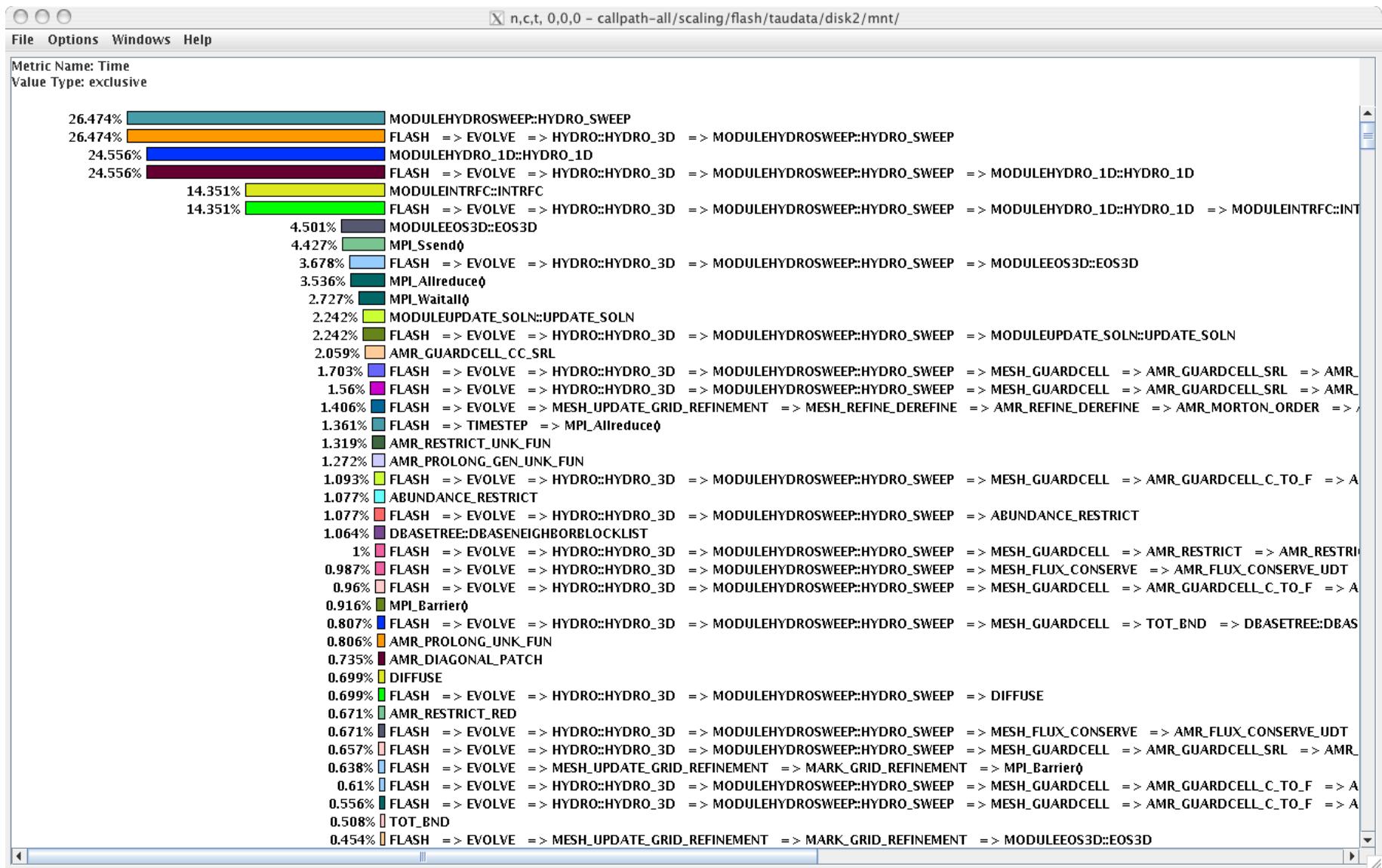
```
% export TAU_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-mpi-pdt  
% export TAU_OPTIONS='-optCompInst -optQuiet'  
  
% make CC=tau_cc.sh CXX=tau_cxx.sh F90=tau_f90.sh
```

NOTE: You may also use the short-hand scripts taucc, tauf90, taucxx instead of specifying TAU_OPTIONS and using the traditional tau_<cc,cxx,f90>.sh scripts. These scripts use compiler-based instrumentation by default.

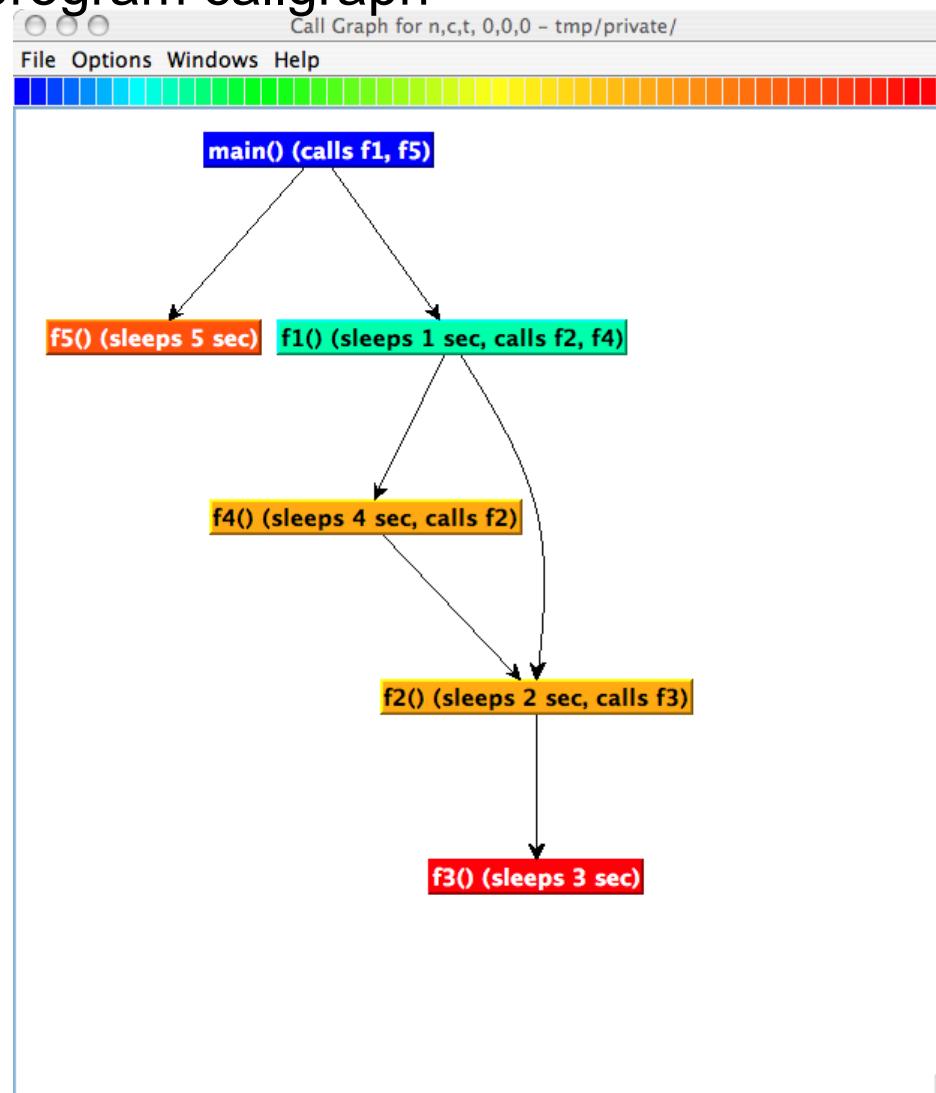
```
% make CC=taucc CXX=taucxx F90=tauf90  
% mpirun -np 8 ./a.out  
% paraprof --pack app.ppk  
  Move the app.ppk file to your desktop.  
% paraprof app.ppk
```

Generate a Callpath Profile

VI-HPS



- Generates program callgraph



Generate a Callpath Profile

```
% export TAU_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-mpi-pdt
% export PATH=<taudir>/<arch>/bin:$PATH
% make F90=tau_f90.sh
(Or edit Makefile and change F90=tau_f90.sh)

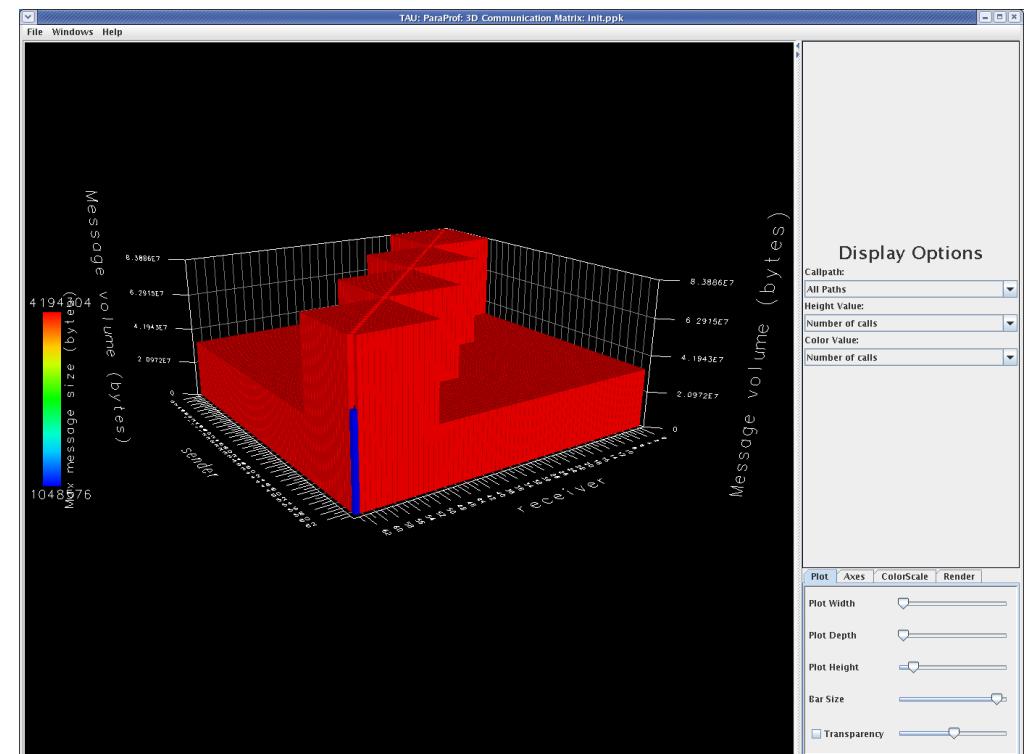
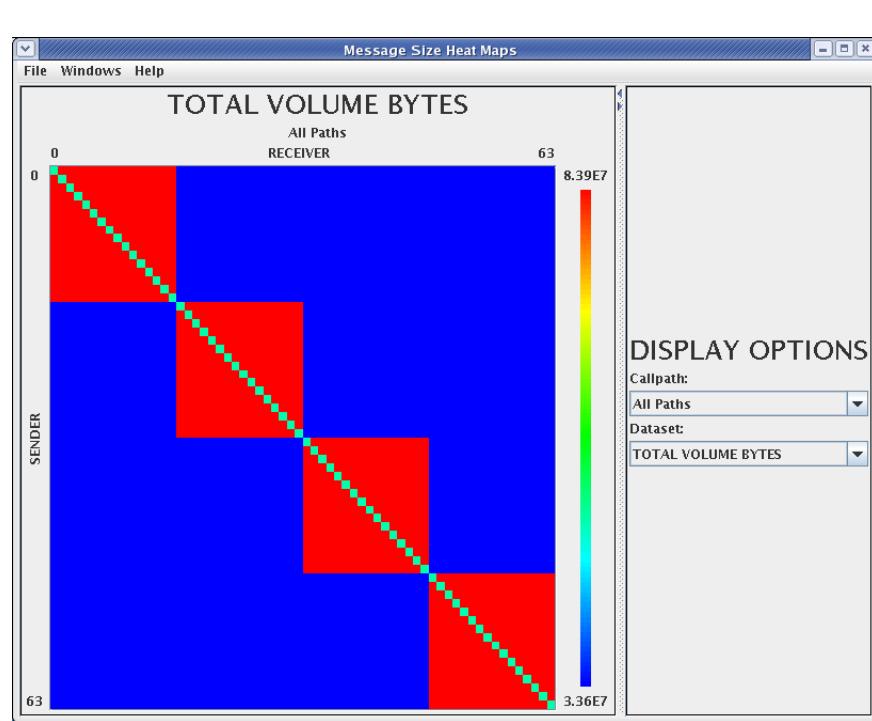
% export TAU_CALLPATH=1
% export TAU_CALLPATH_DEPTH=100
(truncates all calling paths to a specified depth)

% mpirun -np 8 ./a.out
% paraprof --pack app.ppk
Move the app.ppk file to your desktop.
% paraprof app.ppk
(Windows -> Thread -> Call Graph)
```

Communication Matrix Display

VI-HPS

- Goal: What is the volume of inter-process communication? Along which calling path?



Evaluate Scalability using PerfExplorer Charts



```
% export TAU_MAKEFILE=$TAU/Makefile.tau-mpi-pdt
% export PATH=<taudir>/<arch>/bin:$PATH
% make F90=tau_f90.sh
(Or edit Makefile and change F90=tau_f90.sh)
% export TAU_COMM_MATRIX=1

% mpirun -np 8 ./a.out

% paraprof
(Windows -> Communication Matrix)
(Windows -> 3D Communication Matrix)
```

- Pre-processor based substitution by re-defining a call (e.g., `read`)
 - Tool defined header file with same name `<unistd.h>` takes precedence
 - Header redefines a routine as a different routine using macros
 - Substitution: `read()` substituted by preprocessor as `tau_read()` at callsite
- Preloading a library at runtime
 - Library preloaded (`LD_PRELOAD` env var in Linux) in the address space of executing application intercepts calls from a given library
 - Tool's wrapper library defines `read()`, gets address of global `read()` symbol (`dlsym`), internally calls timing calls around call to global `read`
- Linker based substitution
 - Wrapper library defines `__wrap_read` which calls `__real_read` and linker is passed `-Wl,-wrap,read` to substitute all references to `read` from application's object code with the `__wrap_read` defined by the tool

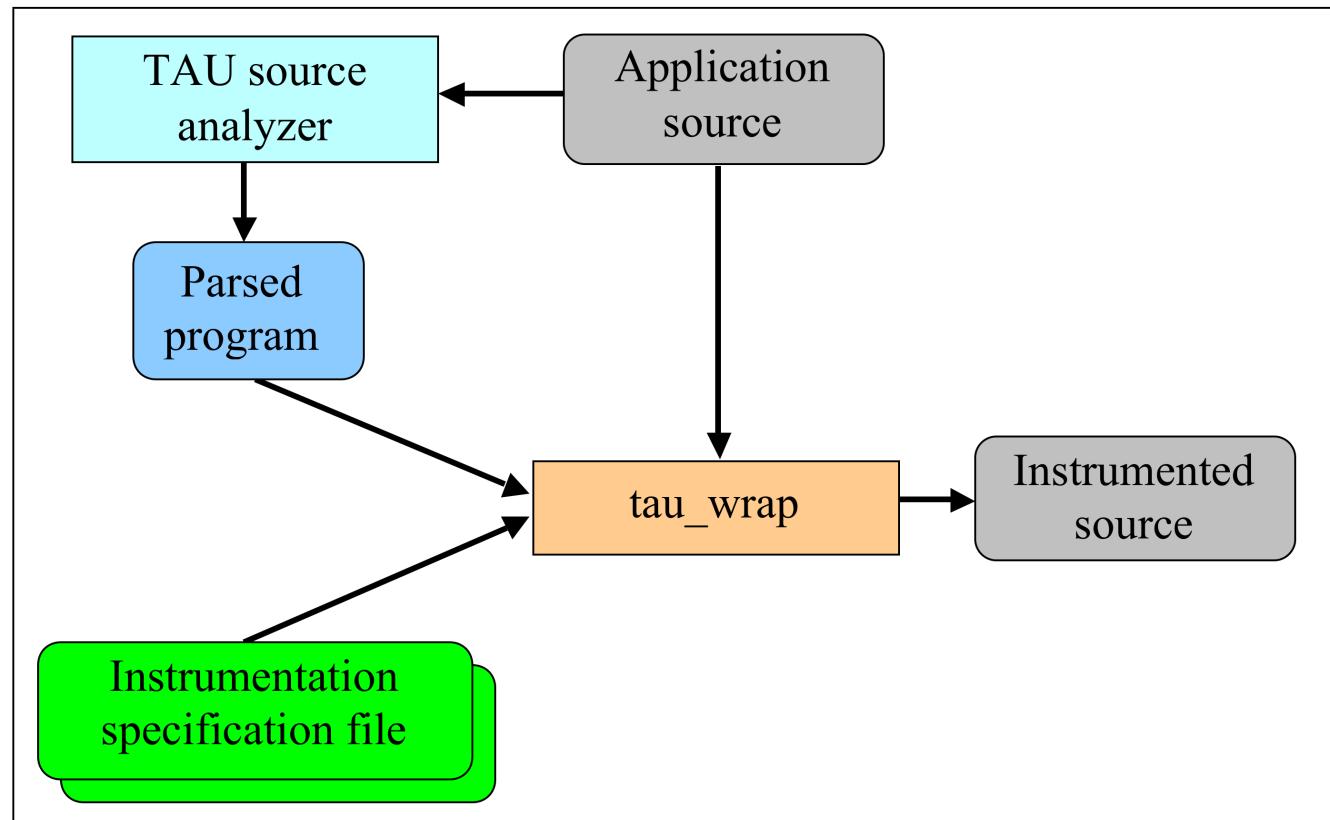
- Pre-processor based substitution by re-defining a call
 - Compiler replaces read() with tau_read() in the body of the source code
- Advantages:
 - Simple to instrument
 - Preprocessor based replacement
 - A header file redefines the calls
 - No special linker or runtime flags required
- Disadvantages
 - Only works for C & C++ for replacing calls in the body of the code.
 - Incomplete instrumentation: fails to capture calls in uninstrumented libraries (e.g., libhdf5.a)

- Linker based substitution
 - Wrapper library defines __wrap_read which calls __real_read and linker is passed -WI,-wrap, read
- Advantages
 - Tool can intercept all references to a given call
 - Works with static as well as dynamic executables
 - No need to recompile the application source code, just re-link the application objects and libraries with the tool wrapper library
- Disadvantages
 - Wrapping an entire library can lengthen the linker command line with multiple –WI,-wrap,<func> arguments. It is better to store these arguments in a file and pass the file to the linker
 - Approach does not work with un-instrumented binaries

- Automates creation of wrapper libraries using TAU
- Input:
 - header file (foo.h)
 - library to be wrapped (/path/to/libfoo.a)
 - technique for wrapping
 - Preprocessor based redefinition (-d)
 - Runtime preloading (-r)
 - Linker based substitution (-w: default)
 - Optional selective instrumentation file (-f select)
 - Exclude list of routines, or
 - Include list of routines
- Output:
 - wrapper library
 - optional *link_options.tau* file (-w), pass –optTauWrapFile=<file> in TAU_OPTIONS environment variable

- *tau_gen_wrapper* shell script:
 - parses source of header file using static analysis tool Program Database Toolkit (PDT)
 - Invokes *tau_wrap*, a tool that generates
 - instrumented wrapper code,
 - an optional *link_options.tau* file (for linker-based substitution, -w)
 - Makefile for compiling the wrapper interposition library
 - Builds the wrapper library using make
- Use TAU_OPTIONS environment variable to pass location of *link_options.tau* file using

```
% export TAU_OPTIONS='--optTauWrapFile=<path/to/  
link_options.tau> -optVerbose'
```
- Use *tau_exec --loadlib=<wrapperlib.so>* to pass location of wrapper library for preloading based substitution



HDF5 Library Wrapping

VI-HPS

```
[sameer@zorak]$ tau_gen_wrapper hdf5.h /usr/lib/libhdf5.a -f select.tau
```

Usage : tau_gen_wrapper <header> <library> [-r|-d|-w (default)] [-g groupname] [-i headerfile] [-c|-c++|-fortran] [-f <instr_spec_file>]

- instruments using runtime preloading (-r), or -Wl,-wrap linker (-w), redirection of header file to redefine the wrapped routine (-d)
- instrumentation specification file (select.tau)
- group (hdf5)
- tau_exec loads libhdf5_wrap.so shared library using –loadlib=<libwrap_pkg.so>
- creates the wrapper/ directory

NODE 0;CONTEXT 0;THREAD 0:

%Time	Exclusive msec	Inclusive total msec	#Call	#Subrs	Inclusive Name usec/call
100.0	0.057	1	1	13	1236 .TAU Application
70.8	0.875	0.875	1	0	875 hid_t H5Fcreate()
9.7	0.12	0.12	1	0	120 herr_t H5Fcclose()
6.0	0.074	0.074	1	0	74 hid_t H5Dcreate()
3.1	0.038	0.038	1	0	38 herr_t H5Dwrite()
2.6	0.032	0.032	1	0	32 herr_t H5Dclose()
2.1	0.026	0.026	1	0	26 herr_t H5check_version()
0.6	0.008	0.008	1	0	8 hid_t H5Screate_simple()
0.2	0.002	0.002	1	0	2 herr_t H5Tset_order()
0.2	0.002	0.002	1	0	2 hid_t H5Tcopy()
0.1	0.001	0.001	1	0	1 herr_t H5Sclose()
0.1	0.001	0.001	2	0	0 herr_t H5open()
0.0	0	0	1	0	0 herr_t H5Tclose()

- Setting environment variable `TAU_OPTIONS=-optTrackIO` links in TAU's wrapper interposition library using linker-based substitution
- Instrumented application generates bandwidth, volume data
- Workflow:
 - `% export TAU_OPTIONS='-optTrackIO -optVerbose'`
 - `% export TAU_MAKEFILE=/path/to/tau/x86_64/lib/Makefile.tau-mpi-pdt`
 - `% make CC=tau_cc.sh CXX=tau_cxx.sh F90=tau_f90.sh`
 - `% mpirun -np 8 ./a.out`
 - `% paraprof`
- Get additional data regarding individual arguments by setting environment variable `TAU_TRACK_IO_PARAMS=1` prior to running

- Preloading a library at runtime
 - Tool defines `read()`, gets address of global `read()` symbol (`dlsym`), internally calls timing calls around call to global `read`
 - *tau_exec* tool uses this mechanism to intercept library calls
- Advantages
 - No need to re-compile or re-link the application source code
 - Drop-in replacement library implemented using `LD_PRELOAD` environment variable under Linux, Cray CNL, IBM BG/P CNK, Solaris...
- Disadvantages
 - Only works with dynamic executables. Default compilation mode under Cray XE6 and IBM BG/P is to use static executables
 - Not all operating systems support preloading of dynamic shared objects (DSOs)

- Runtime instrumentation by pre-loading the measurement library
- Works on dynamic executables (default under Linux)
- Can substitute I/O, MPI, SHMEM, CUDA, OpenCL, and memory allocation/deallocation routines with instrumented calls
- Track interval events (e.g., time spent in write()) as well as atomic events (e.g., how much memory was allocated) in wrappers
- Accurately measure I/O and memory usage
- Preload any wrapper interposition library in the context of the executing application

Preloading a Specific TAU Measurement Library

VI-HPS

```
% ./configure -pdt=<dir> -mpi -papi=<dir>; make install  
Creates in <taudir>/<arch>/lib:
```

```
Makefile.tau-papi-mpi-pdt  
shared-papi-mpi-pdt/libTAU.so
```

```
% ./configure -pdt=<dir> -mpi; make install creates  
Makefile.tau-mpi-pdt  
shared-mpi-pdt/libTAU.so
```

To explicitly choose preloading of shared-<options>/libTAU.so change:

```
% mpirun -np 8 ./a.out      to  
% mpirun -np 8 tau_exec -T <comma_separated_options> ./a.out
```

```
% mpirun -np 8 tau_exec -T papi,mpi,pdt ./a.out
```

Preloads <taudir>/<arch>/shared-papi-mpi-pdt/libTAU.so

```
% mpirun -np 8 tau_exec -T papi ./a.out
```

Preloads <taudir>/<arch>/shared-papi-mpi-pdt/libTAU.so by matching.

```
% mpirun -np 8 tau_exec -T papi,mpi,pdt -s ./a.out
```

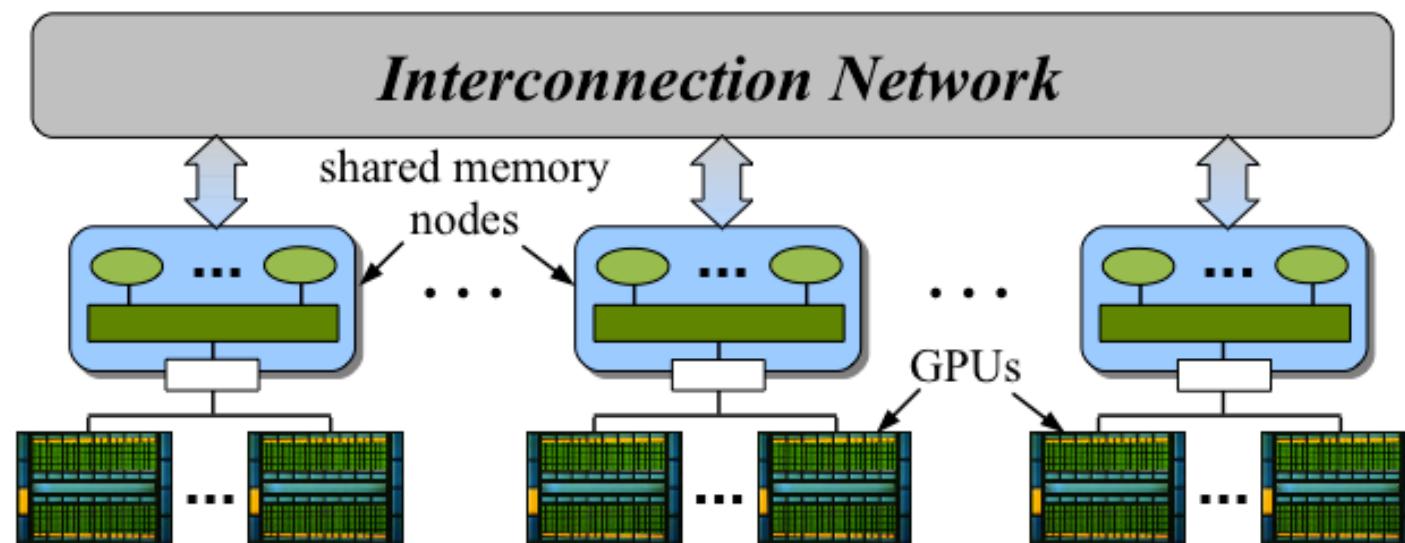
Does not execute the program. Just displays the library that it will preload if executed without the **-s** option.

NOTE: -mpi configuration is selected by default. Use **-T serial** for Sequential programs.

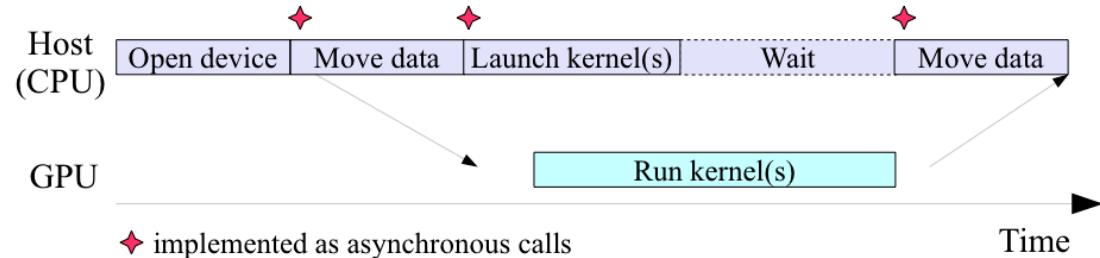
- Uninstrumented execution
 - % mpirun –np 8 ./a.out
- Track MPI performance
 - % mpirun –np 8 **tau_exec** ./a.out
- Track POSIX I/O and MPI performance (MPI enabled by default)
 - % mpirun –np 8 **tau_exec –io** ./a.out
- Track memory operations
 - % setenv TAU_TRACK_MEMORY_LEAKS 1
 - % mpirun –np 8 **tau_exec –memory** ./a.out
- Use event based sampling (compile with –g)
 - % mpirun –np 8 **tau_exec –ebs** ./a.out
 - Also –ebs_source=<PAPI_COUNTER> -ebs_period=<overflow_count>
- Load wrapper interposition library
 - % mpirun –np 8 **tau_exec –loadlib=<path/libwrapper.so>** ./a.out
- **Track GPGPU operations**
 - % mpirun –np 8 **tau_exec –cuda** ./a.out
 - % mpirun –np 8 **tau_exec –opencl** ./a.out

- GPGPU compilers (e.g., CAPS hmpp and PGI) can now automatically generate GPGPU code using manual annotation of loop-level constructs and routines (hmpp)
- The loops (and routines for HMPP) are transferred automatically to the GPGPU
- TAU intercepts the runtime library routines and examines the arguments
- Shows events as seen from the host
- Profiles and traces GPGPU execution

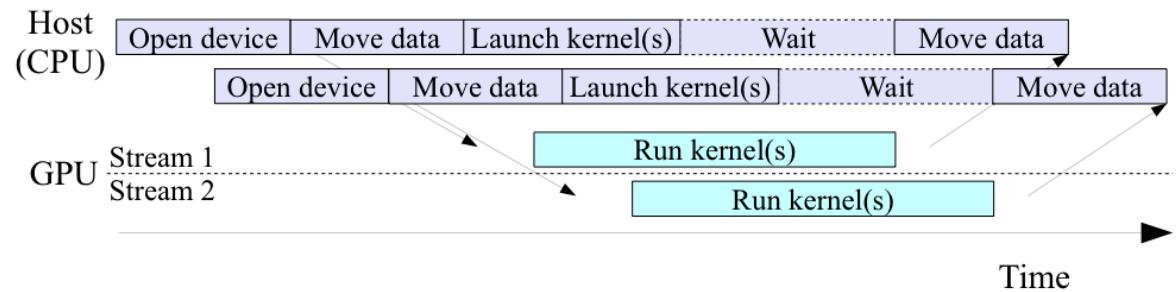
- Multi-CPU, multicore shared memory nodes
- GPU accelerators connected by high-BW I/O
- Cluster interconnection network



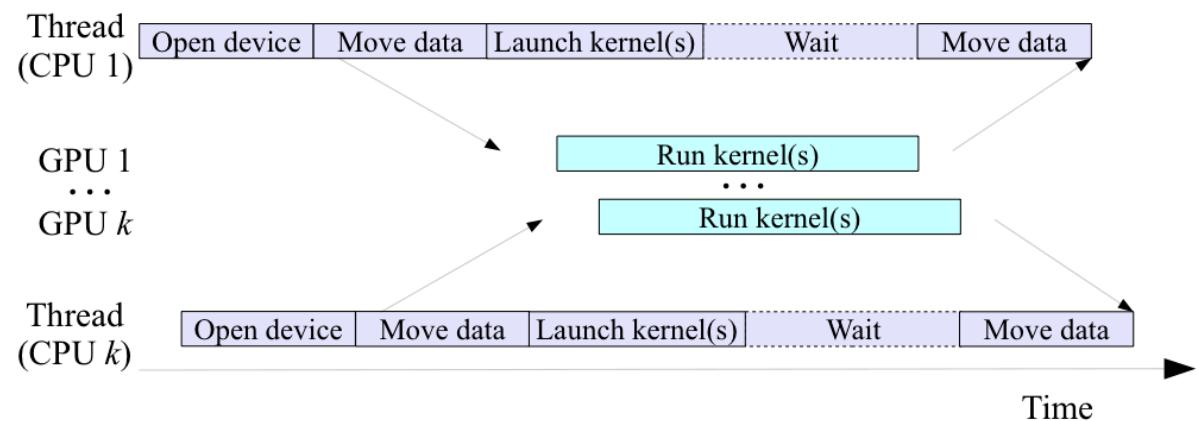
- Single GPU



- Multi-stream



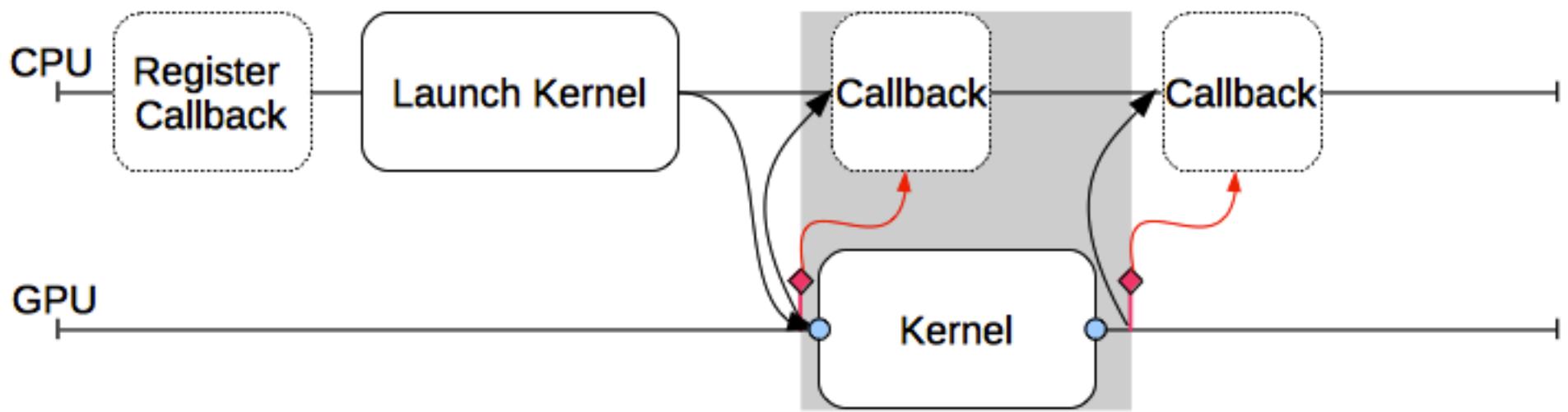
- Multi-CPU,
Multi-GPU



Host-GPU Measurement – Callback Method

VI-HPS

- GPU driver libraries provide callbacks for certain routines and captures measurements
- Measurement tool registers the callbacks and processes performance data
- Application code is not modified

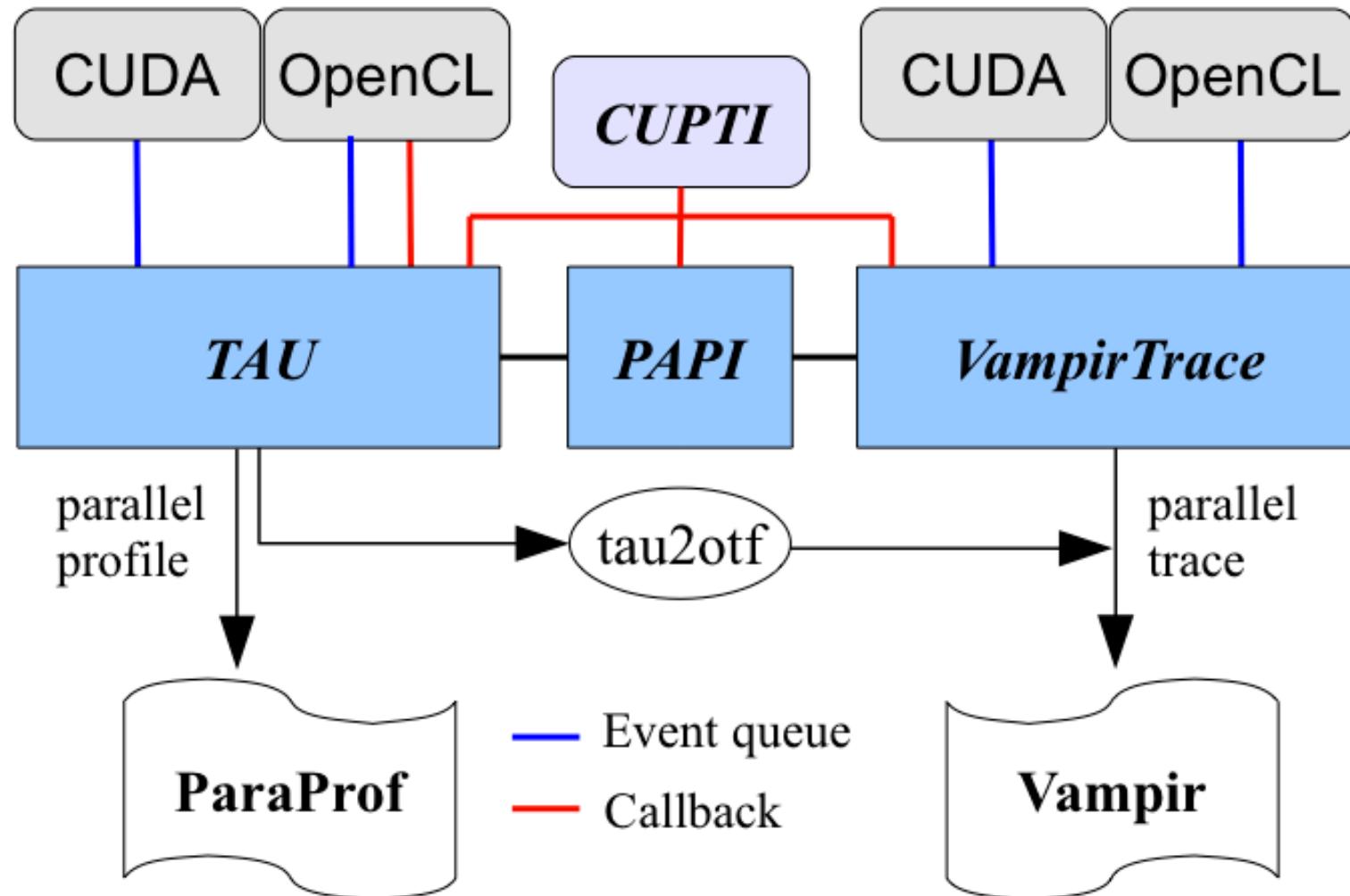


- Synchronous method
 - Place instrumentation appropriately around GPU calls (kernel launch, library routine, ...)
 - Wrap (synchronous) library with performance tool
- Event queue method
 - Utilize CUDA and OpenCL event support
 - Again, need instrumentation to create and insert events in the streams with kernel launch and process events
 - Can be implemented with driver library wrapping
- Callback method
 - Utilize language-level callback support in OpenCL
 - Utilize NVIDIA CUDA Performance Tool Interface (CUPTI)
 - Need to appropriately register callbacks

- Support the Host-GPU performance perspective
- Provide integration with existing measurement system to facilitate tool use
- Utilize support in GPU driver library and device
- Tools
 - TAU performance system
 - Vampir
 - PAPI
 - NVIDIA CUPTI

GPU Performance Tool Interoperability

VI-HPS



- NVIDIA is developing CUPTI to enable the creation of profiling and tracing tools
- Callback API
 - Interject tool code at the entry and exit to each CUDA runtime and driver API call
- Counter API
 - Query, configure, start, stop, and read the counters on CUDA-enabled devices
- CUPTI is delivered as a dynamic library
- CUPTI is released with CUDA 4.0

- Multiple performance perspectives
- Integrate Host-GPU support in TAU measurement framework
 - Enable use of each measurement approach
 - Include use of PAPI and CUPTI
 - Provide profiling and tracing support
- Tutorial
 - Use TAU library wrapping of libraries
 - Use `tau_exec` to work with binaries

```
% ./a.out  (uninstrumented)
% tau_exec -T serial -cuda ./a.out
% paraprof
```

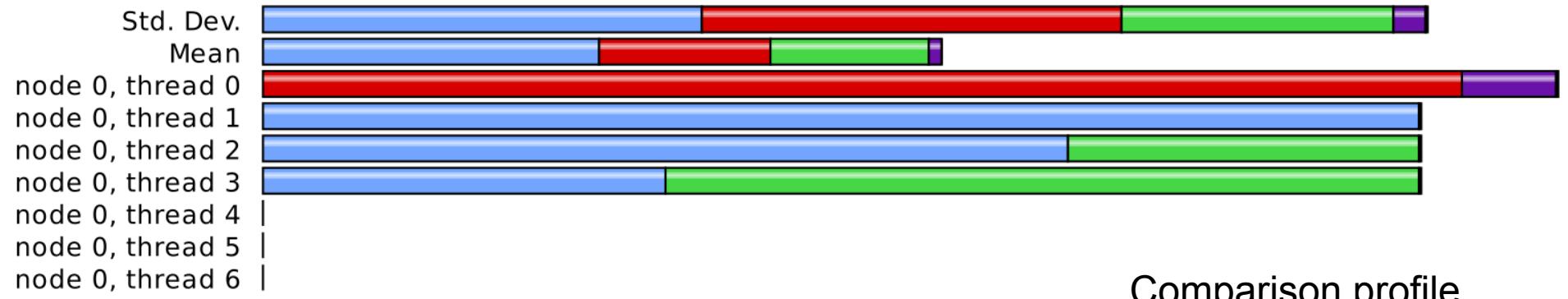
- Demonstration of multiple GPU device use
- *main* → *solverThread* → *reduceKernel*
- One Keeneland node with three GPUs
- Performance profile for:
 - One *main* thread
 - Three *solverThread* threads
 - Three *reduceKernel* “threads”

simpleMultiGPU Profile

VI-HPS

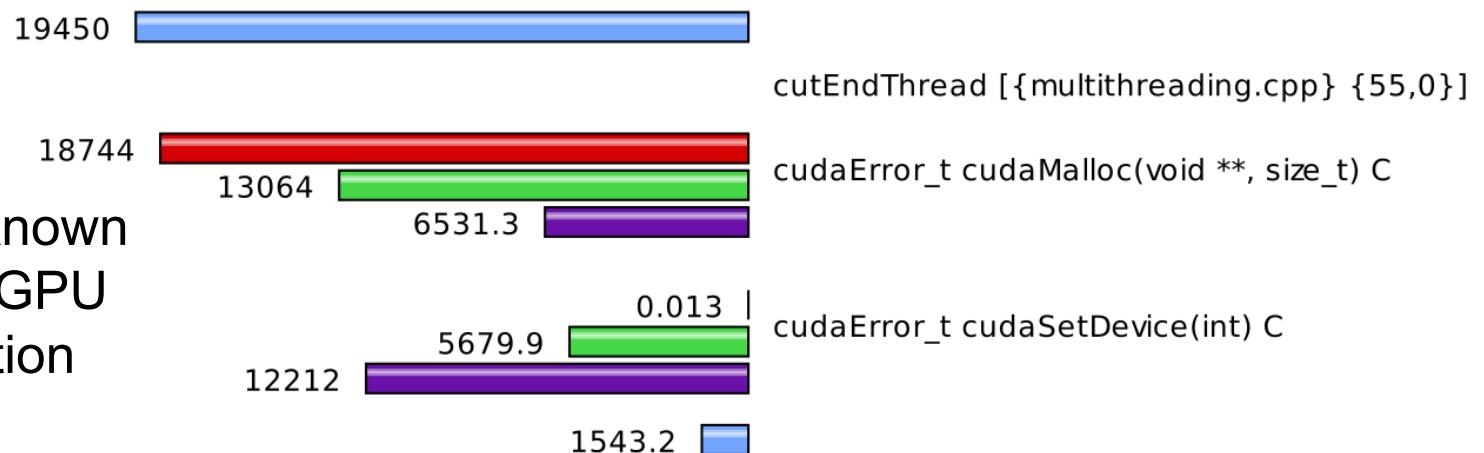
Metric: TIME

Value: Exclusive



Metric: TIME
Value: Exclusive
Units: milliseconds

node 0, thread 0
node 0, thread 1
node 0, thread 2
node 0, thread 3



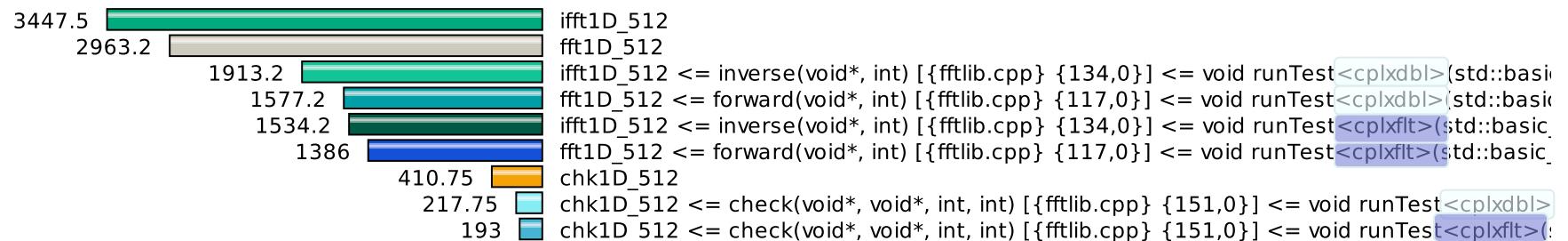
Identified a known overhead in GPU context creation

- TAU is able to associate callsite context information with kernel launch so that different kernel calls can be distinguished

Metric: TAUGPU_TIME

Value: Exclusive

Units: microseconds

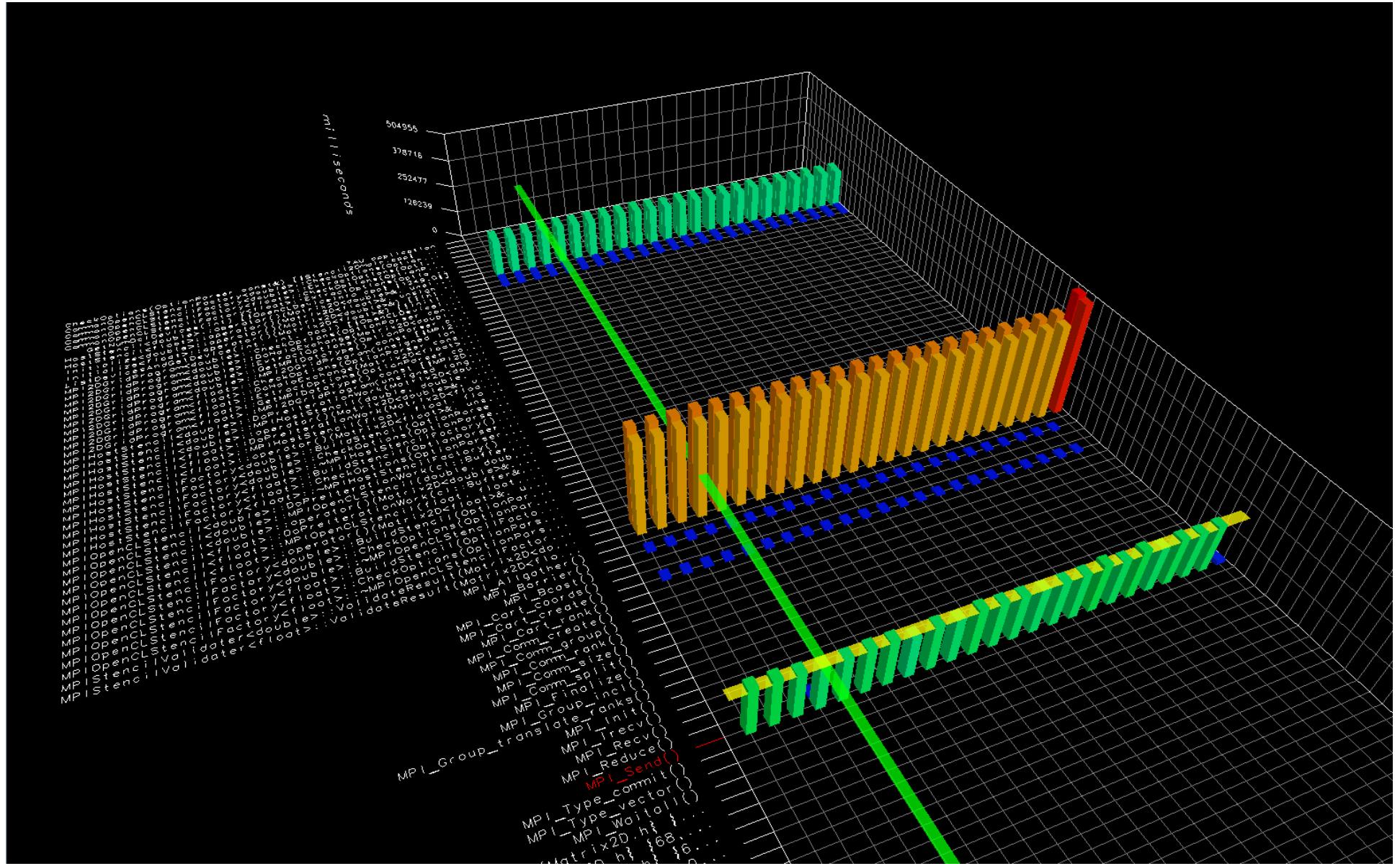


Each kernel (iff1D_512, fft1D_512 and chk1D_512) is broken down by callsite, either during the single precession or double precession step.

- Compute 2D, 9-point stencil
 - Multiple GPUs using MPI
 - CUDA and OpenCL versions
- One Keeneland node with 3 GPUs
- Eight Keeneland nodes with 24 GPUs
- Performance profile and trace
 - Application events
 - Communication events
 - Kernel execution

Stencil2D Parallel Profile

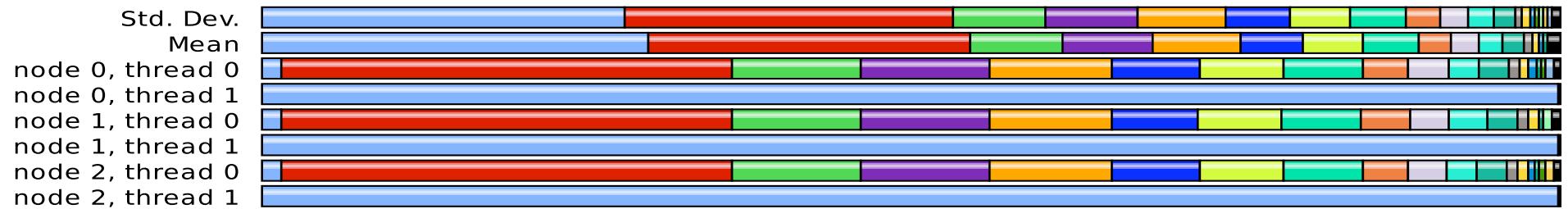
VI-HPS



Stencil2D Parallel Profile / Trace in Vampir

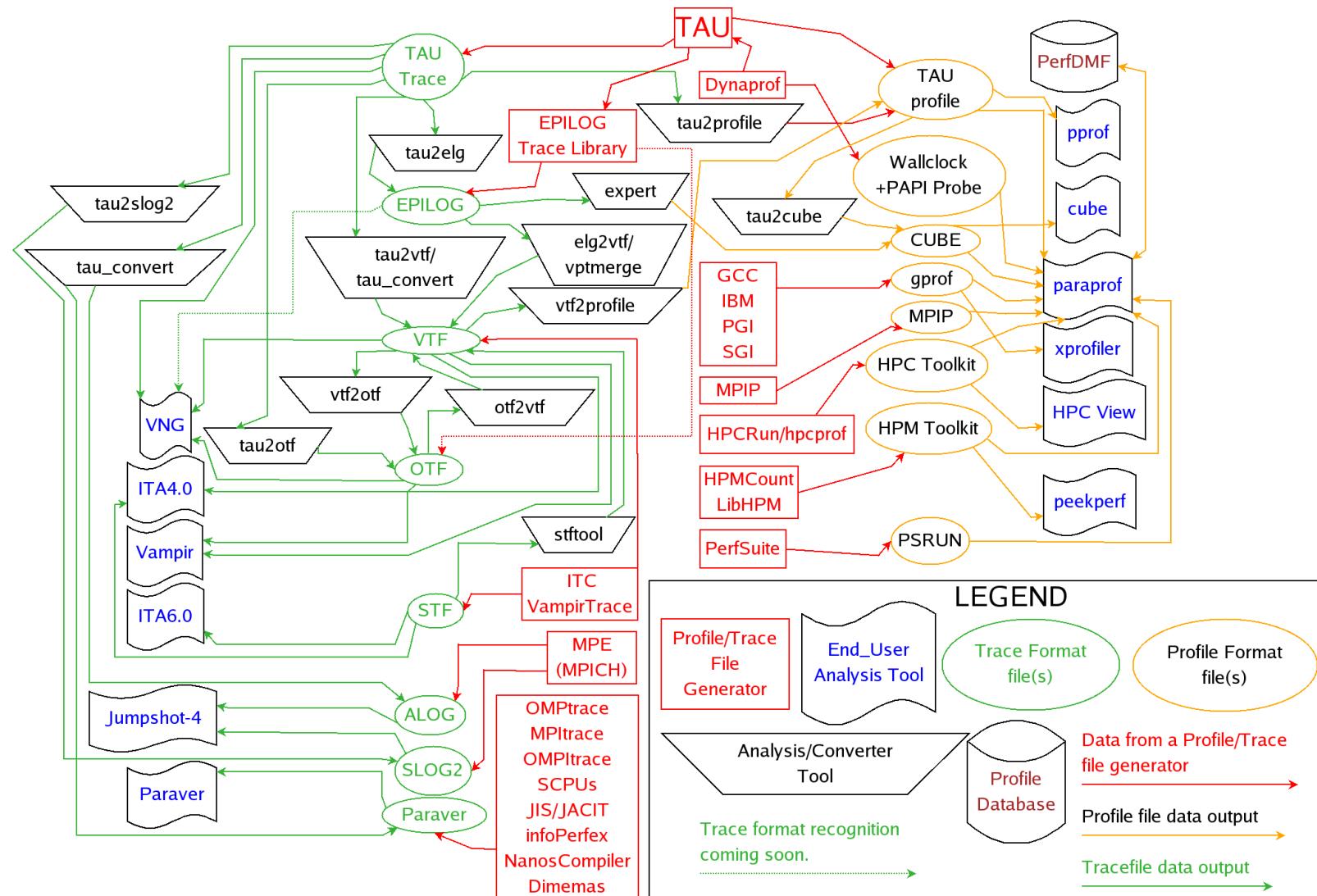
VI-HPS

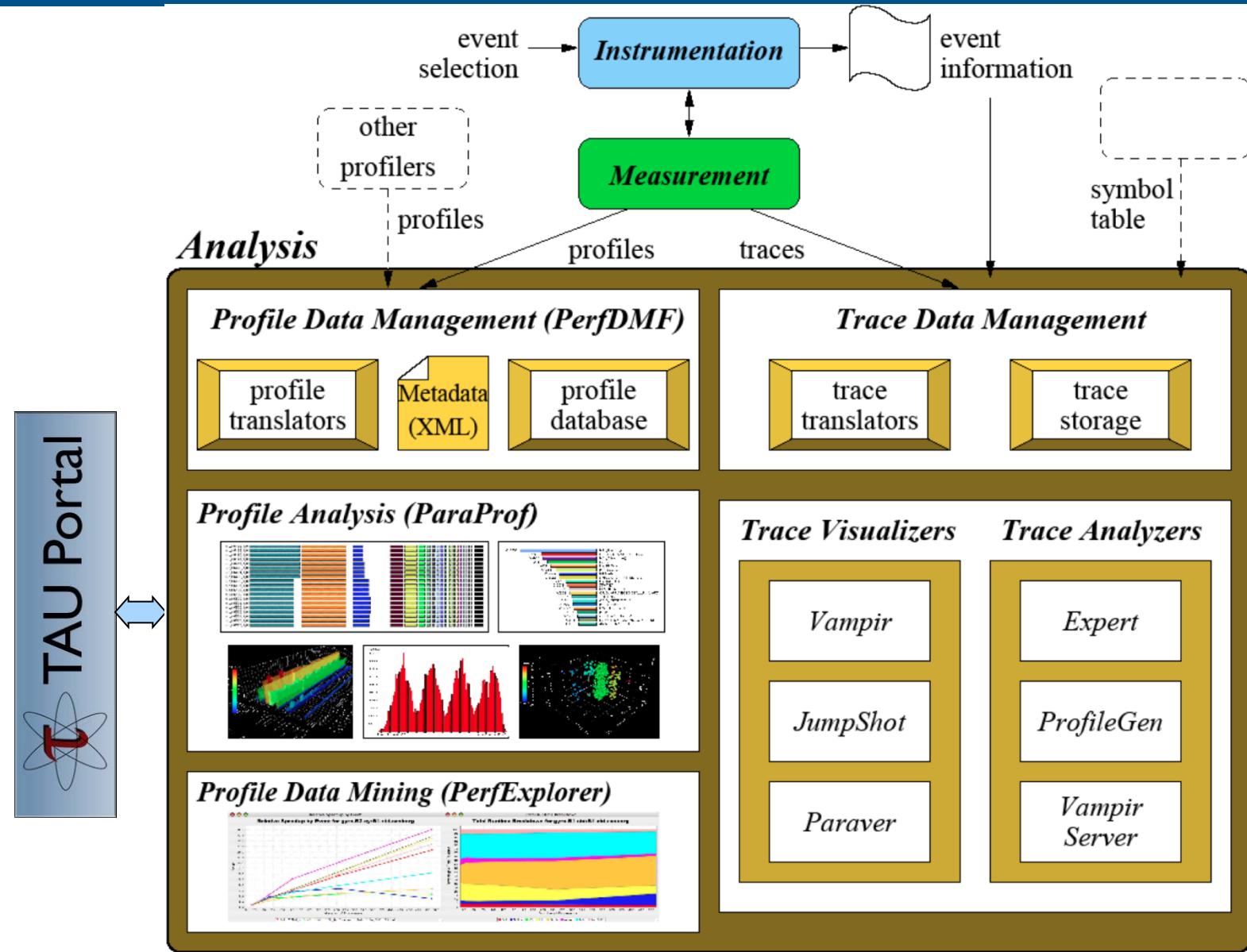
Metric: TAUGPU_TIME
Value: Exclusive



Building Bridges to Other Tools

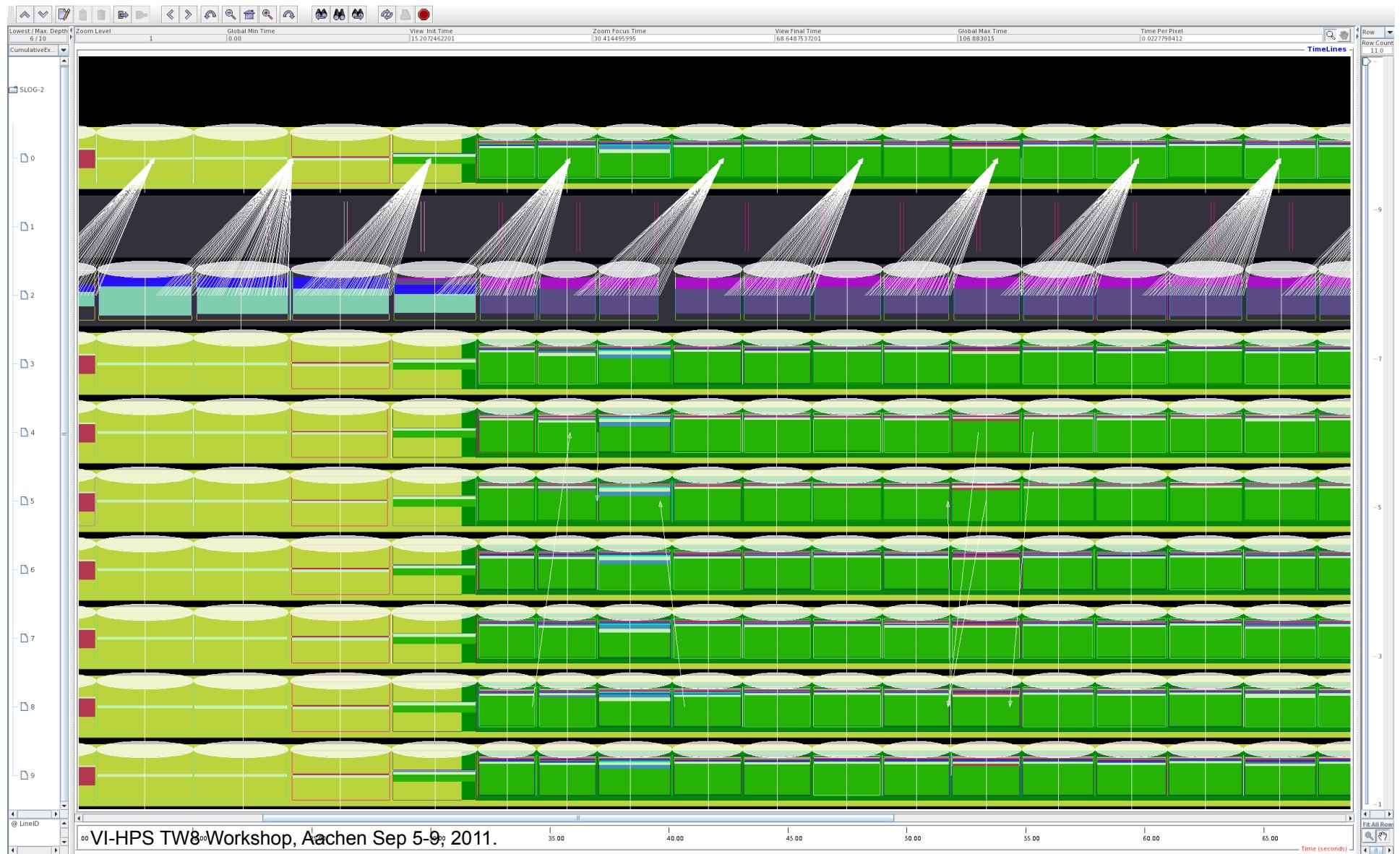
VI-HPS





Example: NAMD with CUPTI

VI-HPS



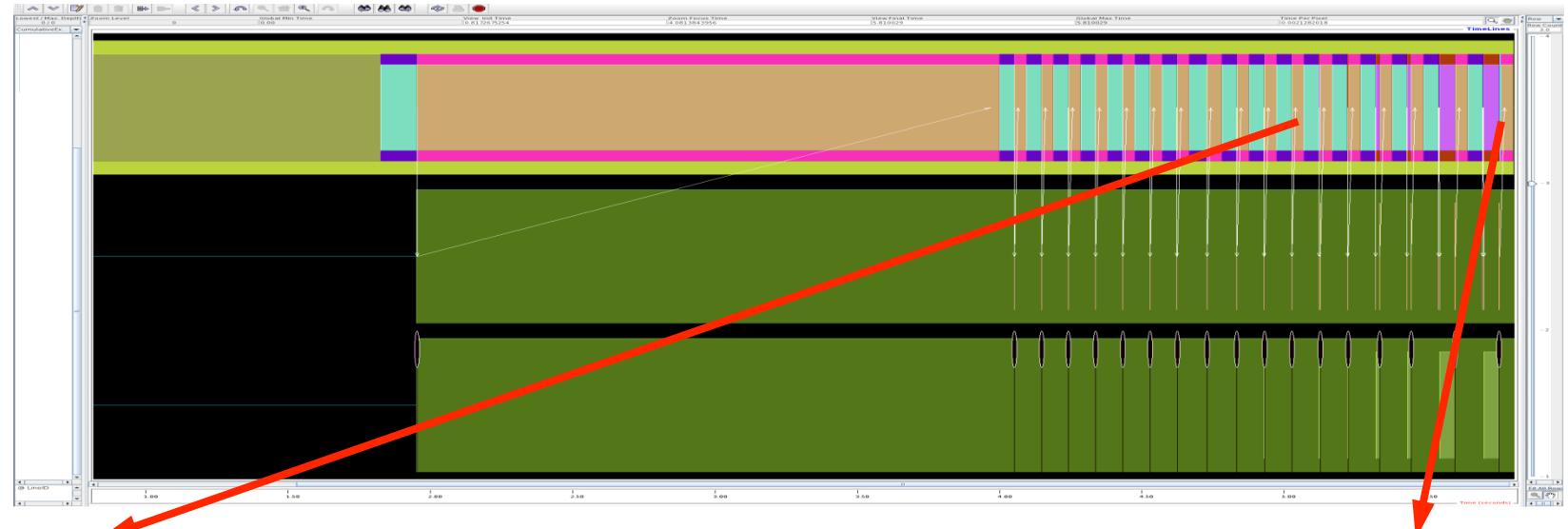
HMPP SGEMM (CAPS Enterprise)

VI-HPS

Host
Process

Transfer
Kernel

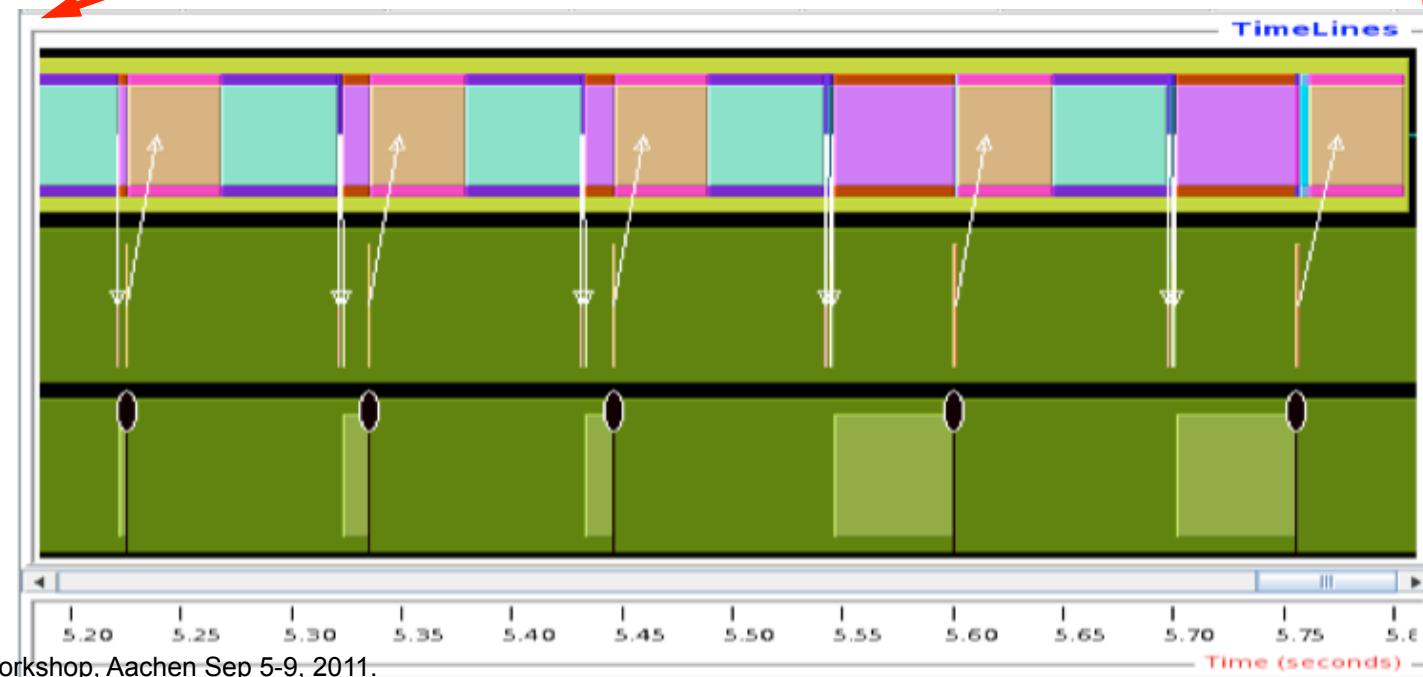
Compute
Kernel



Host
Process

Transfer
Kernel

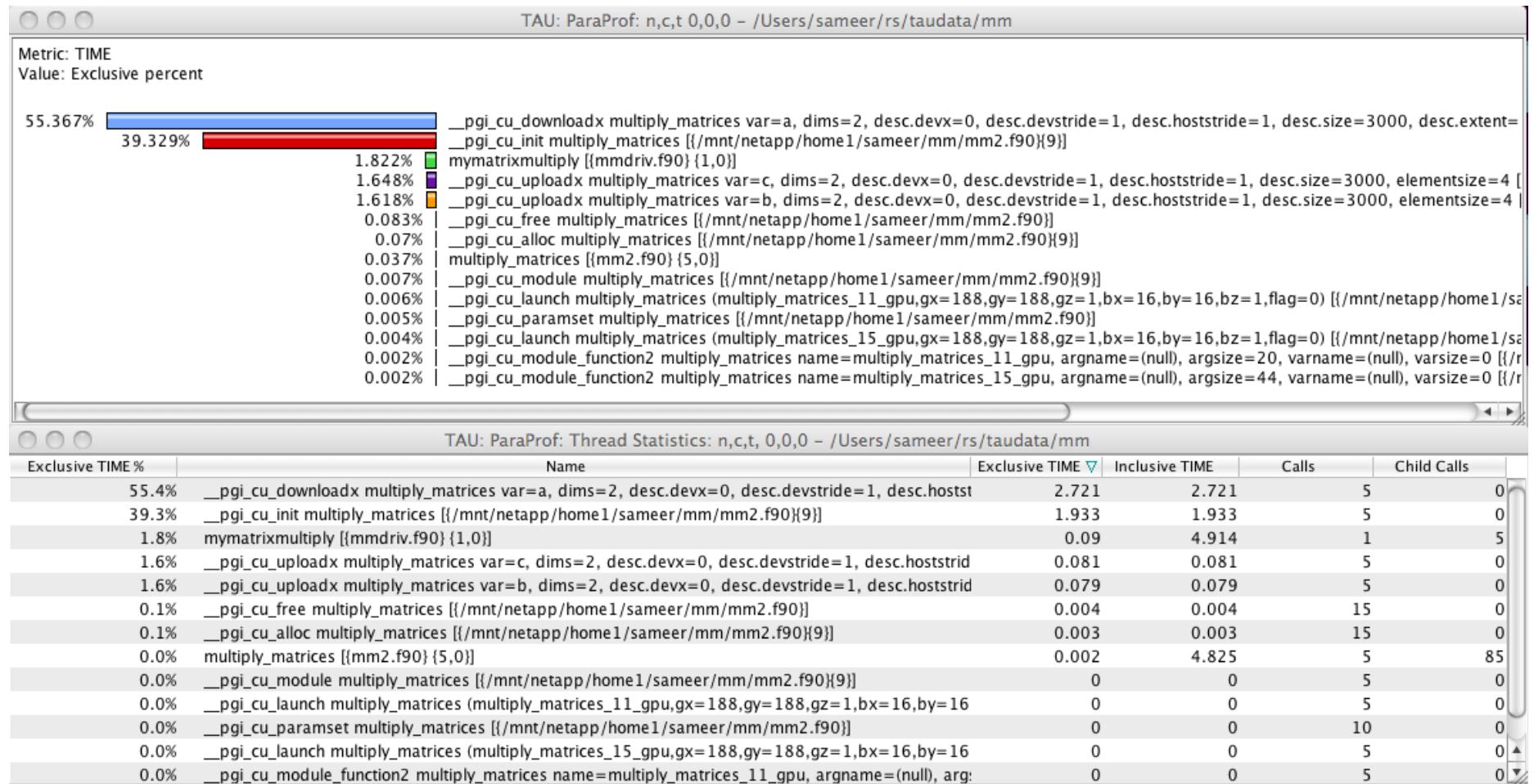
Compute
Kernel



- PGI compiler allows users to annotate source code to identify loops that should be accelerated
- When a program is compiled with TAU, its measurement library intercepts the PGI runtime library layer to measure time spent in the runtime library routines and data transfers
- TAU also captures the arguments:
 - array data dimensions and sizes, strides, upload and download times, variable names, source file names, row and column information, and routines

Example: PGI GPU-accelerated MM

VI-HPS



The screenshot shows two windows from the TAU ParaProf tool. The bottom window is a 'Source Browser' displaying the following Fortran code:

```
1 ! Simple matmul example
2
3     module mymm
4         contains
5             subroutine multiply_matrices( a, b, c, m )
6                 real, dimension(:,:) :: a,b,c
7                 i = 0
8
9                 !$acc region
10                do j = 1,m
11                    do i = 1,m
12                        a(i,j) = 0.0
13                    enddo
14                    do k = 1,m
15                        do i = 1,m
16                            a(i,j) = a(i,j) + b(i,k) * c(k,j)
17                        enddo
18                    enddo
19                enddo
20                !$acc end region
21            end subroutine
22        end module
23
```

The top window is a 'Function Data Window' for the subroutine `multiply_matrices`. It displays the following details:

- Name: `__pgi_cu_downloadx multiply_matrices var=a, dims=2, desc.devx=0, desc.devstride=1, desc.hoststride=1, desc.size=3000, desc.extent=3000, elementsize=4 [{/mnt/netapp/home1/sameer/mm/mm2.f90}{20}]`
- Metric Name: TIME
- Value: Exclusive
- Units: seconds

A progress bar indicates a value of 2.722, and the text "node 0" is shown next to it. A context menu is open over the function data window, listing the following options:

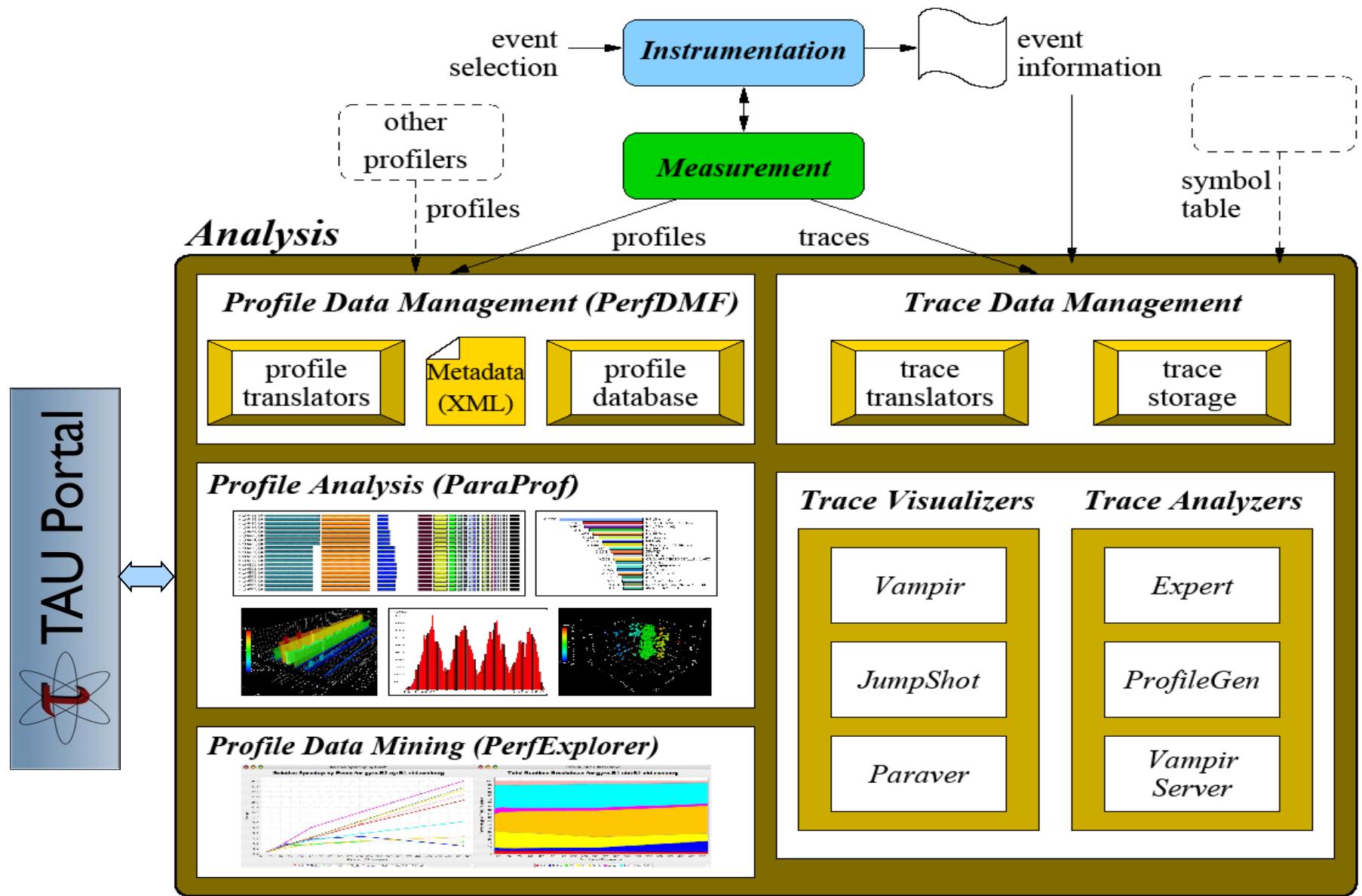
- Show Source Code
- Show Function Bar Chart
- Show Function Histogram
- Assign Function Color
- Reset to Default Color
- Rename

- Support for both static and dynamic executables
- Specify the list of routines to instrument/exclude from instrumentation
- Specify the TAU measurement library to be injected
- Simplify the usage of TAU:
 - To instrument:
`% tau_run a.out -o a.inst`
 - To perform measurements, execute the application:
`% mpirun -np 8 ./a.inst`
 - To analyze the data:
`% paraprof`

tau_run with NAS PBS

```
livetau@paratools01:~
```

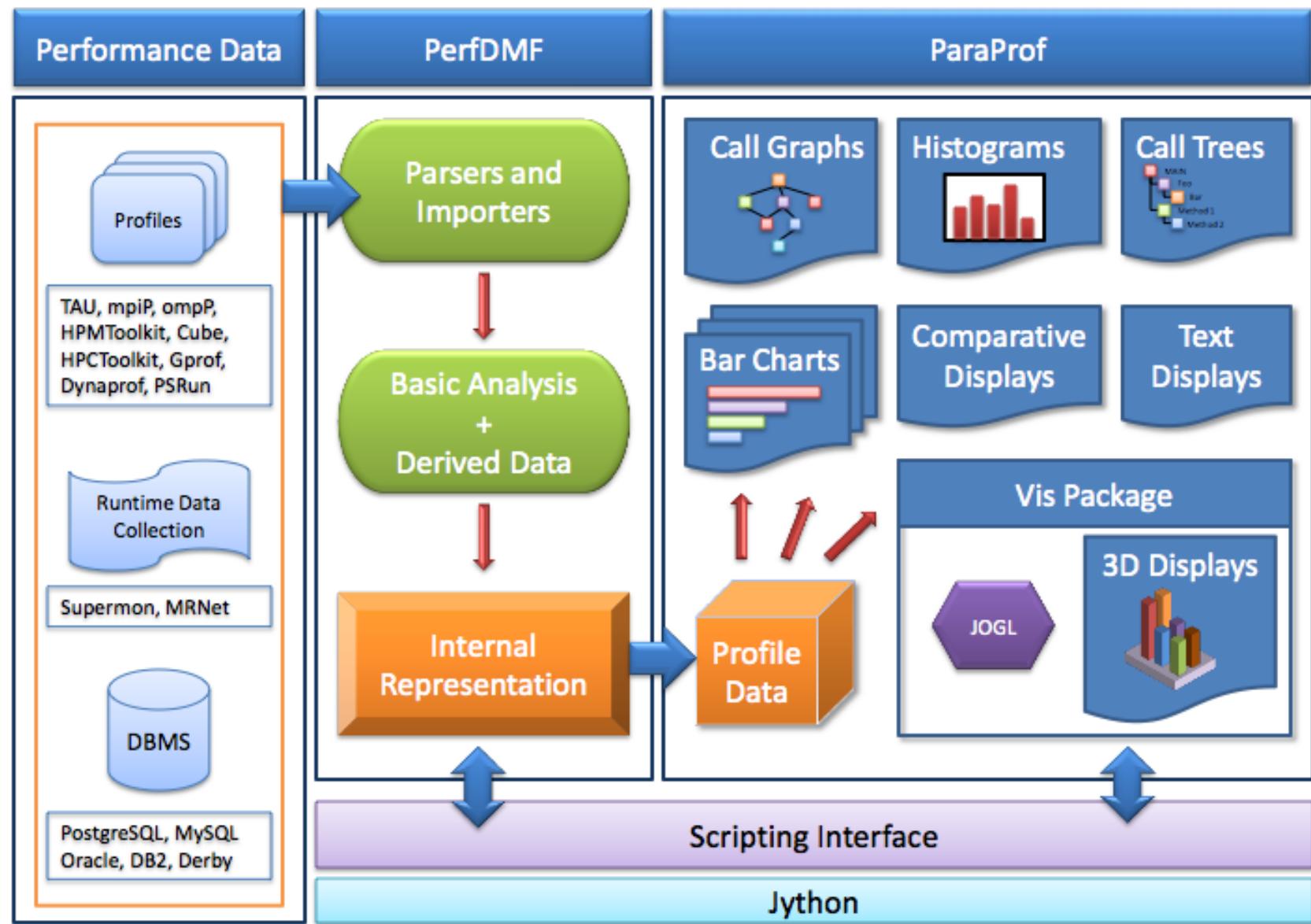
```
/home/livetau% cd ~/tutorial
/home/livetau/tutorial% # Build an uninstrumented bt NAS Parallel Benchmark
/home/livetau/tutorial% make bt CLASS=W NPROCS=4
/home/livetau/tutorial% cd bin
/home/livetau/tutorial/bin% # Run the instrumented code
/home/livetau/tutorial/bin% mpirun -np 4 ./bt_W.4
/home/livetau/tutorial/bin%
/home/livetau/tutorial/bin% # Instrument the executable using TAU with DyninstAPI
/home/livetau/tutorial/bin%
/home/livetau/tutorial/bin% tau_run ./bt_W.4 -o ./bt.i
/home/livetau/tutorial/bin% rm -rf profile.* MULT*
/home/livetau/tutorial/bin% mpirun -np 4 ./bt.i
/home/livetau/tutorial/bin% paraprof
/home/livetau/tutorial/bin%
/home/livetau/tutorial/bin% # Choose a different TAU configuration
/home/livetau/tutorial/bin% ls $TAU/libTAUsh
libTAUsh-depthlimit-mpi-pdt.so*          libTAUsh-papi-pdt.so*
libTAUsh-mpi-pdt.so*                     libTAUsh-papi-pthread-pdt.so*
libTAUsh-mpi-pdt-upc.so*                  libTAUsh-param-mpi-pdt.so*
libTAUsh-mpi-python-pdt.so*                libTAUsh-pdt.so*
libTAUsh-papi-mpi-pdt.so*                 libTAUsh-pdt-trace.so*
libTAUsh-papi-mpi-pdt-upc.so*              libTAUsh-phase-papi-mpi-pdt.so*
libTAUsh-papi-mpi-pdt-upc-udp.so*         libTAUsh-pthread-pdt.so*
libTAUsh-papi-mpi-pdt-vampirtrace-trace.so* libTAUsh-python-pdt.so*
libTAUsh-papi-mpi-python-pdt.so*
/home/livetau/tutorial/bin%
/home/livetau/tutorial/bin% tau_run -XrunTAUsh-papi-mpi-pdt-vampirtrace-trace bt_W.4 -o bt.vpt
/home/livetau/tutorial/bin% setenv VT_METRICS PAPI_FP_INS:PAPI_L1_DCM
/home/livetau/tutorial/bin% mpirun -np 4 ./bt.vpt
/home/livetau/tutorial/bin% vampir bt.vpt.otf &
```

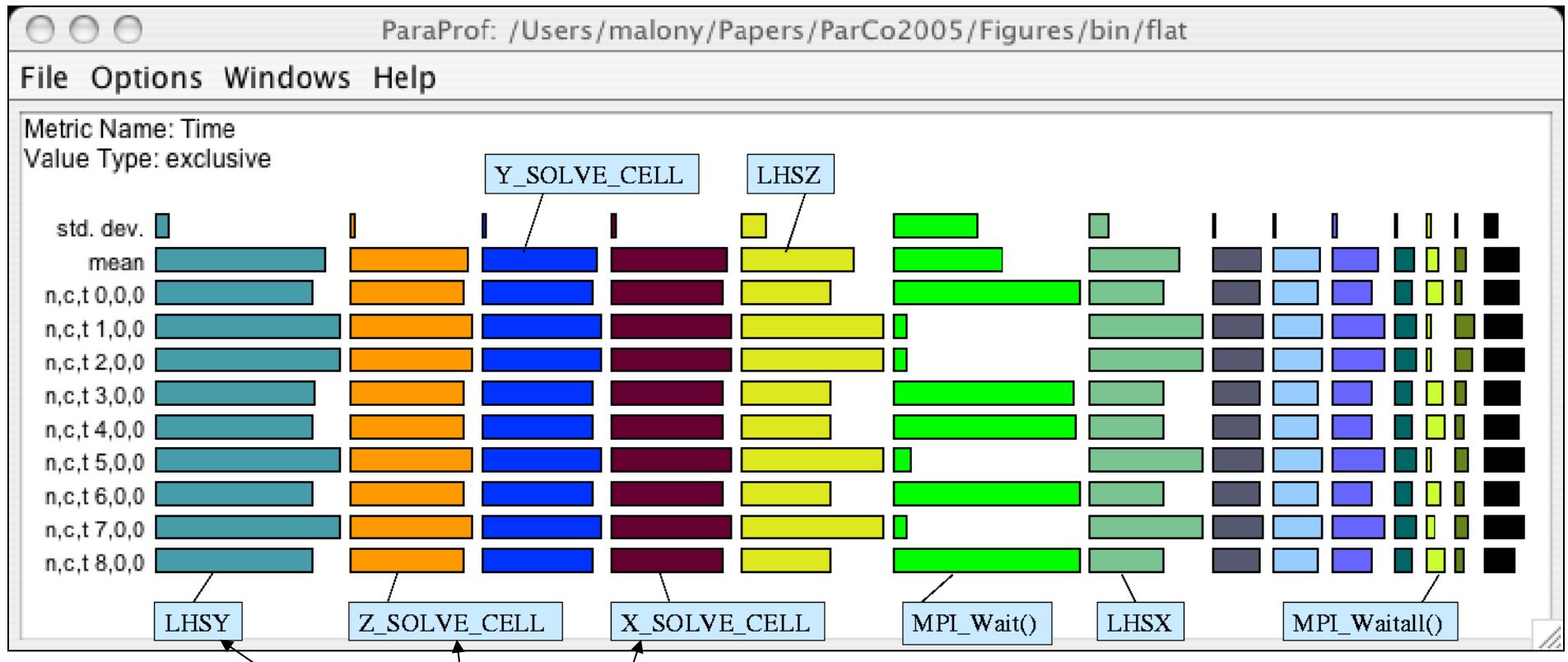


- Analysis of parallel profile and trace measurement
- Parallel profile analysis (ParaProf)
 - Java-based analysis and visualization tool
 - Support for large-scale parallel profiles
- Performance data management framework (PerfDMF)
- Parallel trace analysis
 - Translation to VTF (V3.0), EPILOG, OTF formats
 - Integration with Vampir / Vampir Server (TU Dresden)
 - Profile generation from trace data
- Online parallel analysis and visualization
- Integration with CUBE browser (Scalasca, UTK / FZJ)

ParaProf Profile Analysis Framework

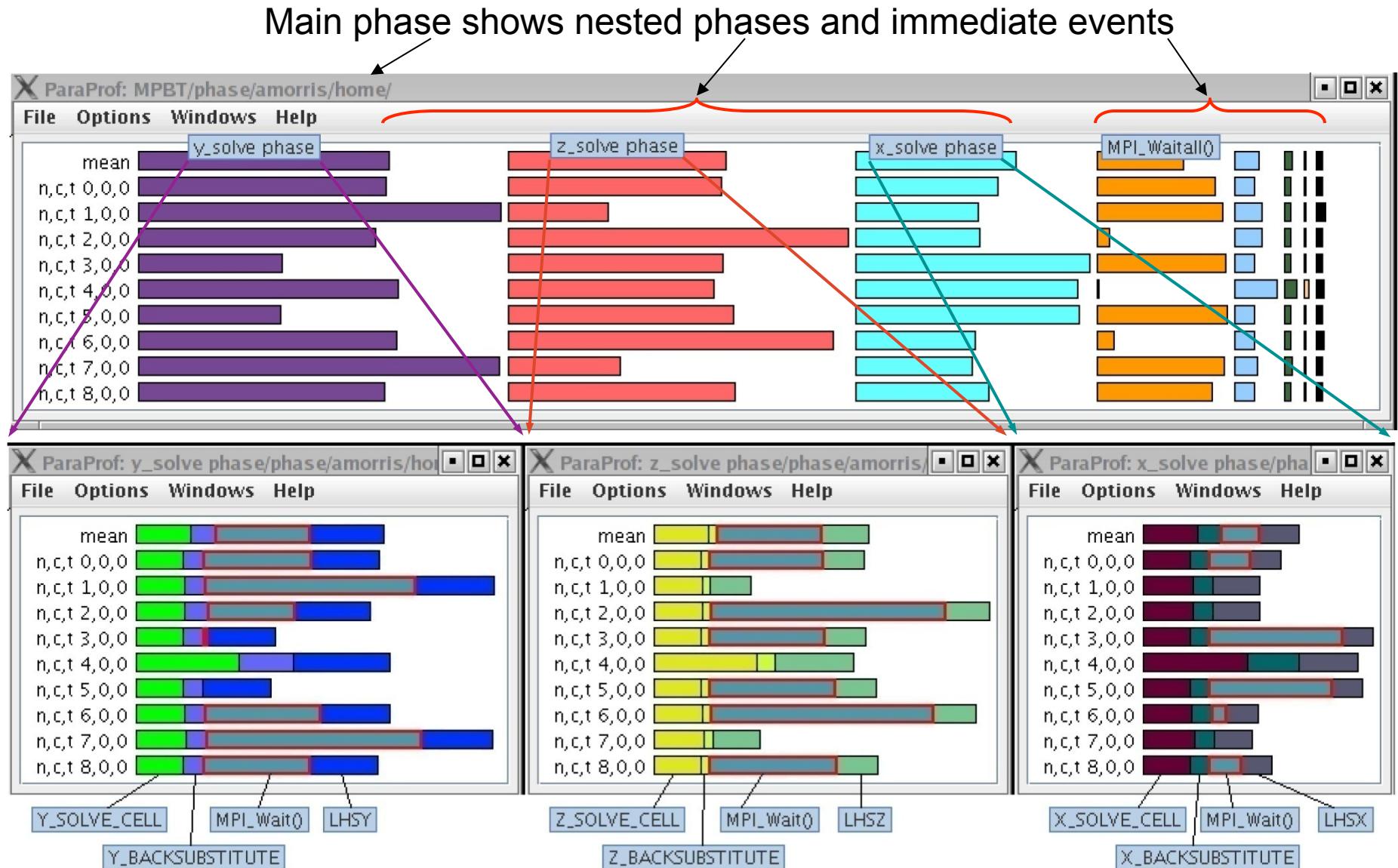
VI-HPS





Application routine names reflect phase semantics

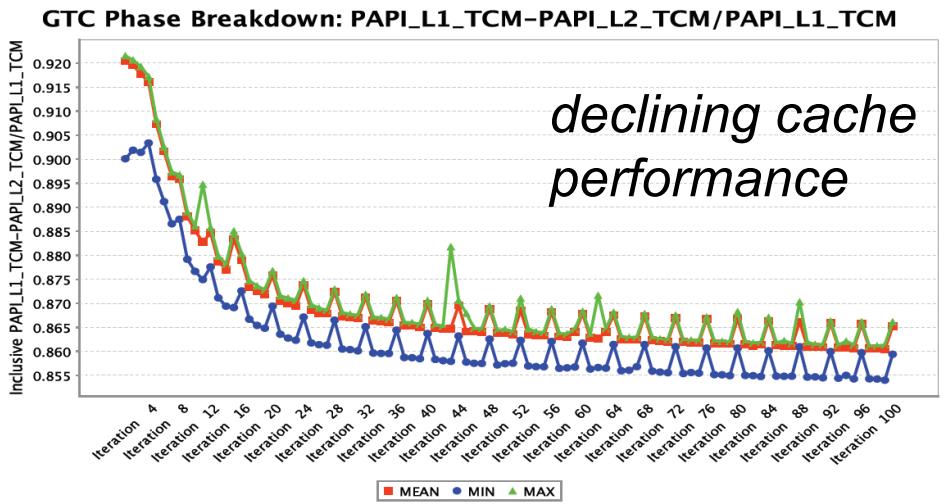
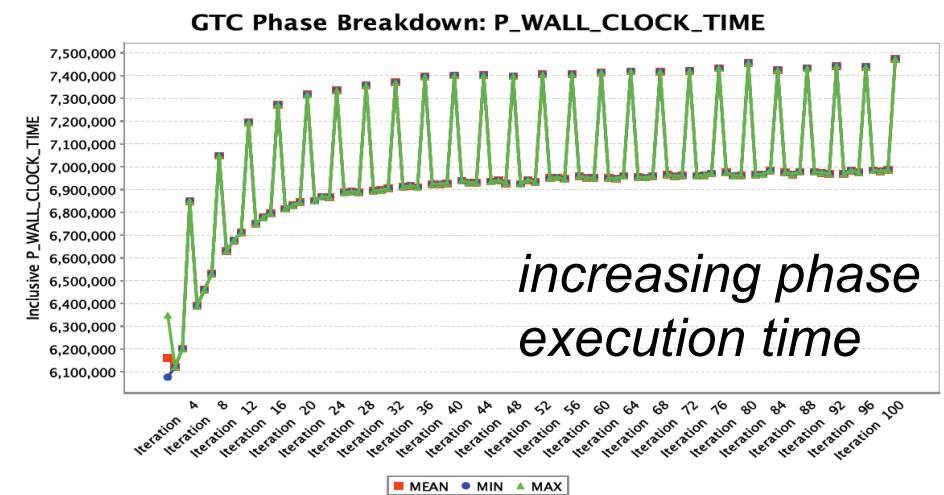
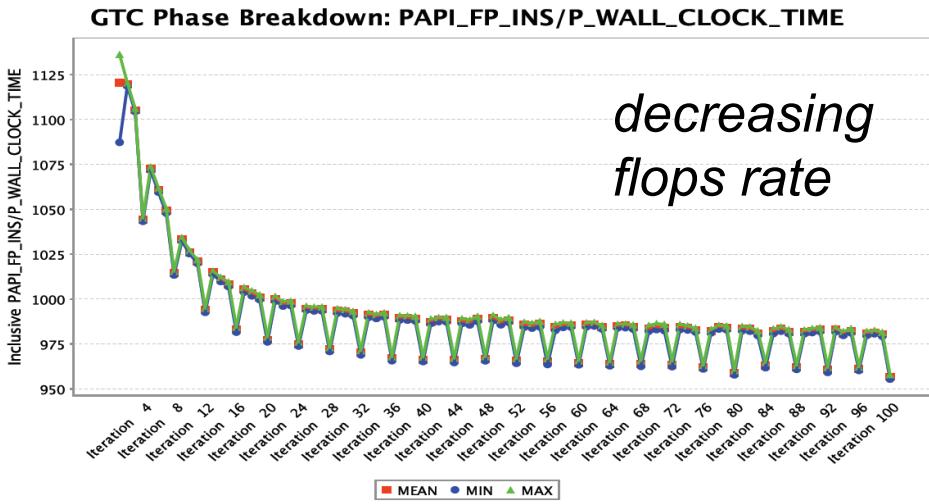
How is MPI_Wait()
distributed relative to
solver direction?



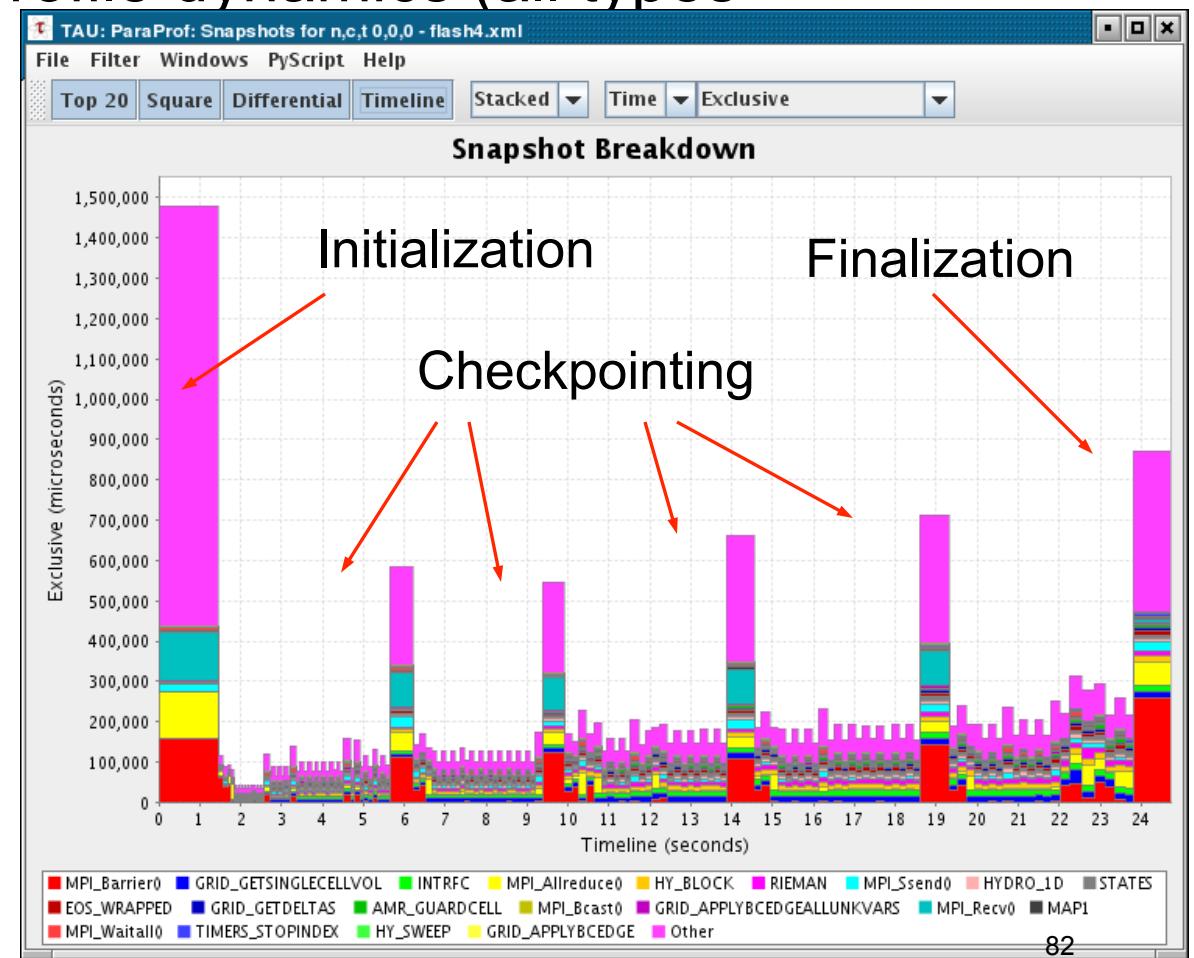
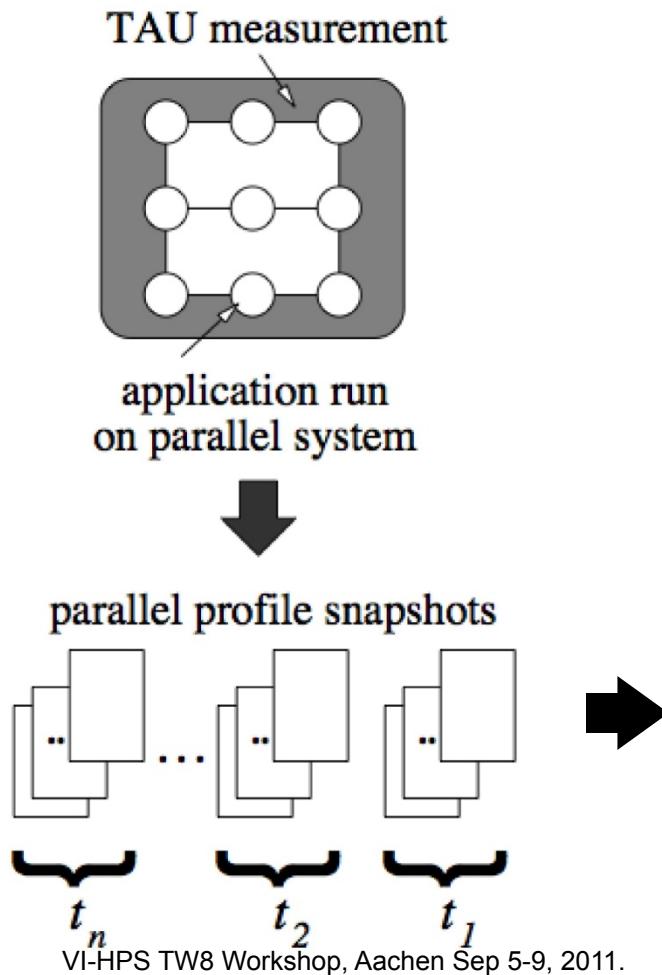
Phase Profiling of HW Counters

VI-HPS

- GTC particle-in-cell simulation of fusion turbulence
- Phases assigned to iterations
- Poor temporal locality for one important data
- Automatically generated by PE2 python script



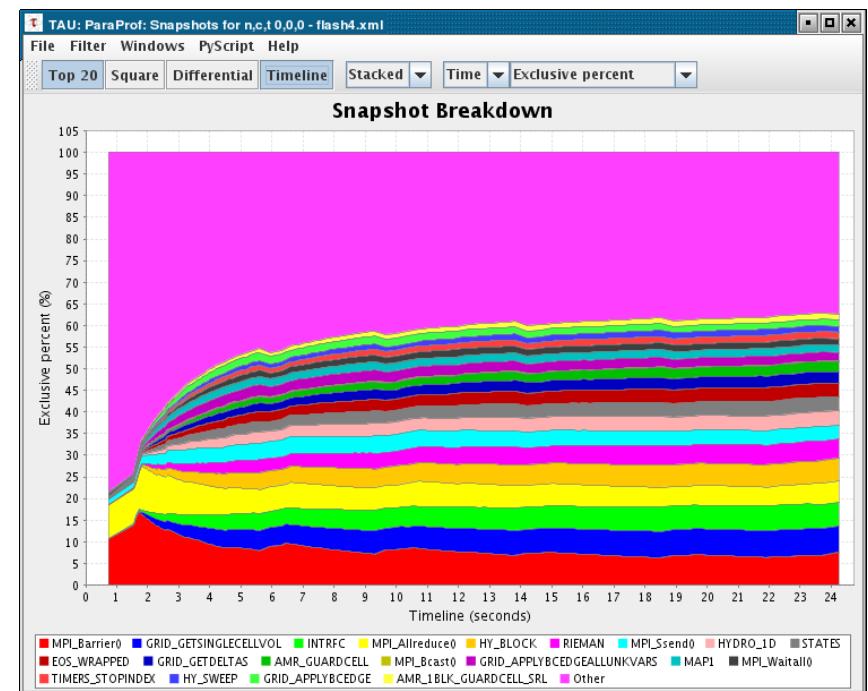
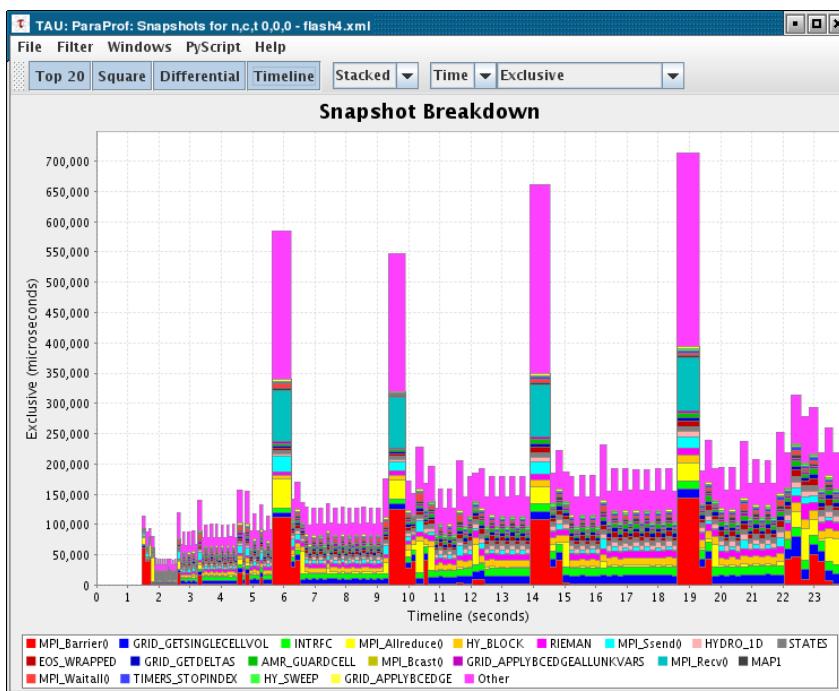
- Profile snapshots are parallel profiles recorded at runtime
- Shows performance profile dynamics (all types)



Profile Snapshot Views

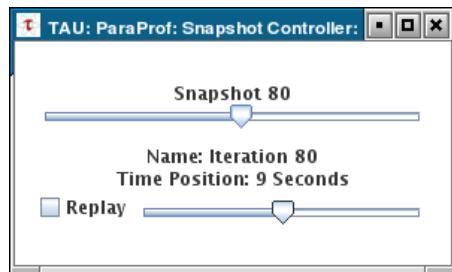
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- Percentage breakdown
- Only show main loop

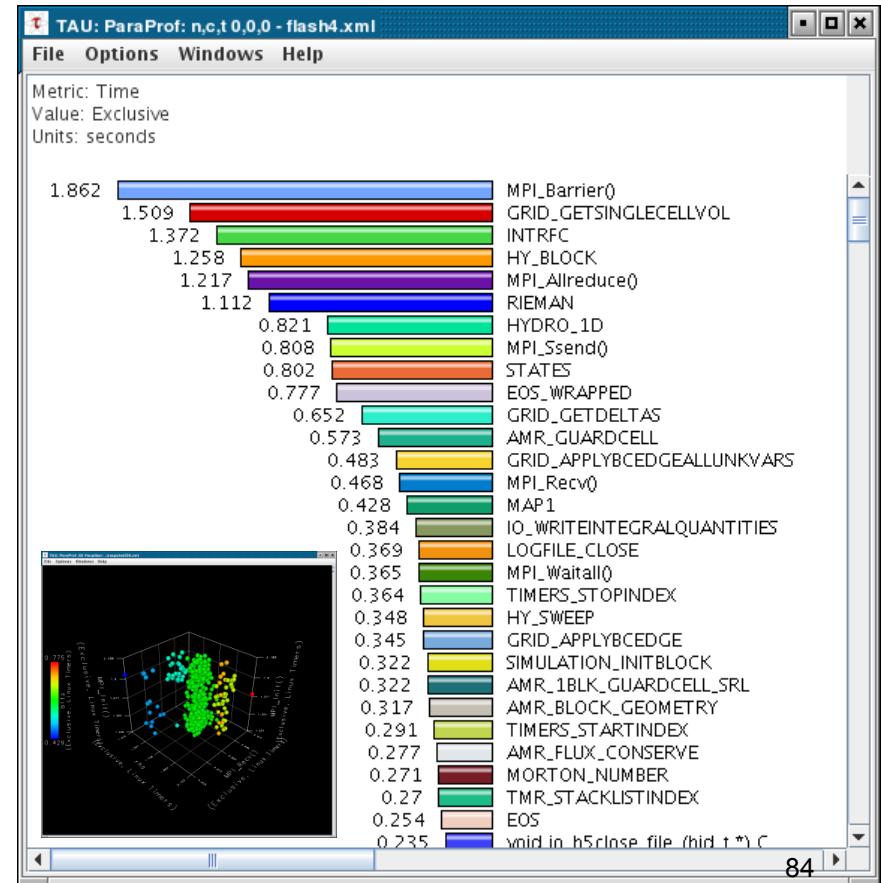
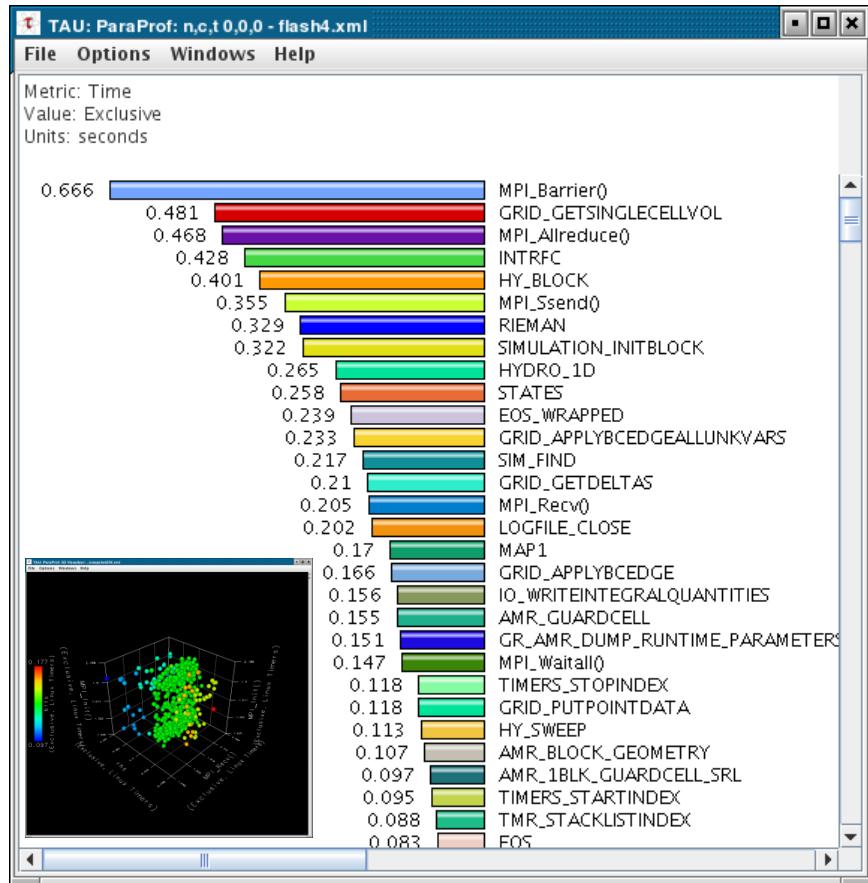
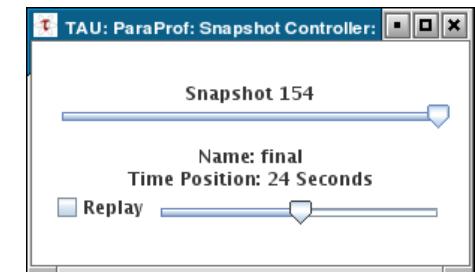


Snapshot Replay in ParaProf

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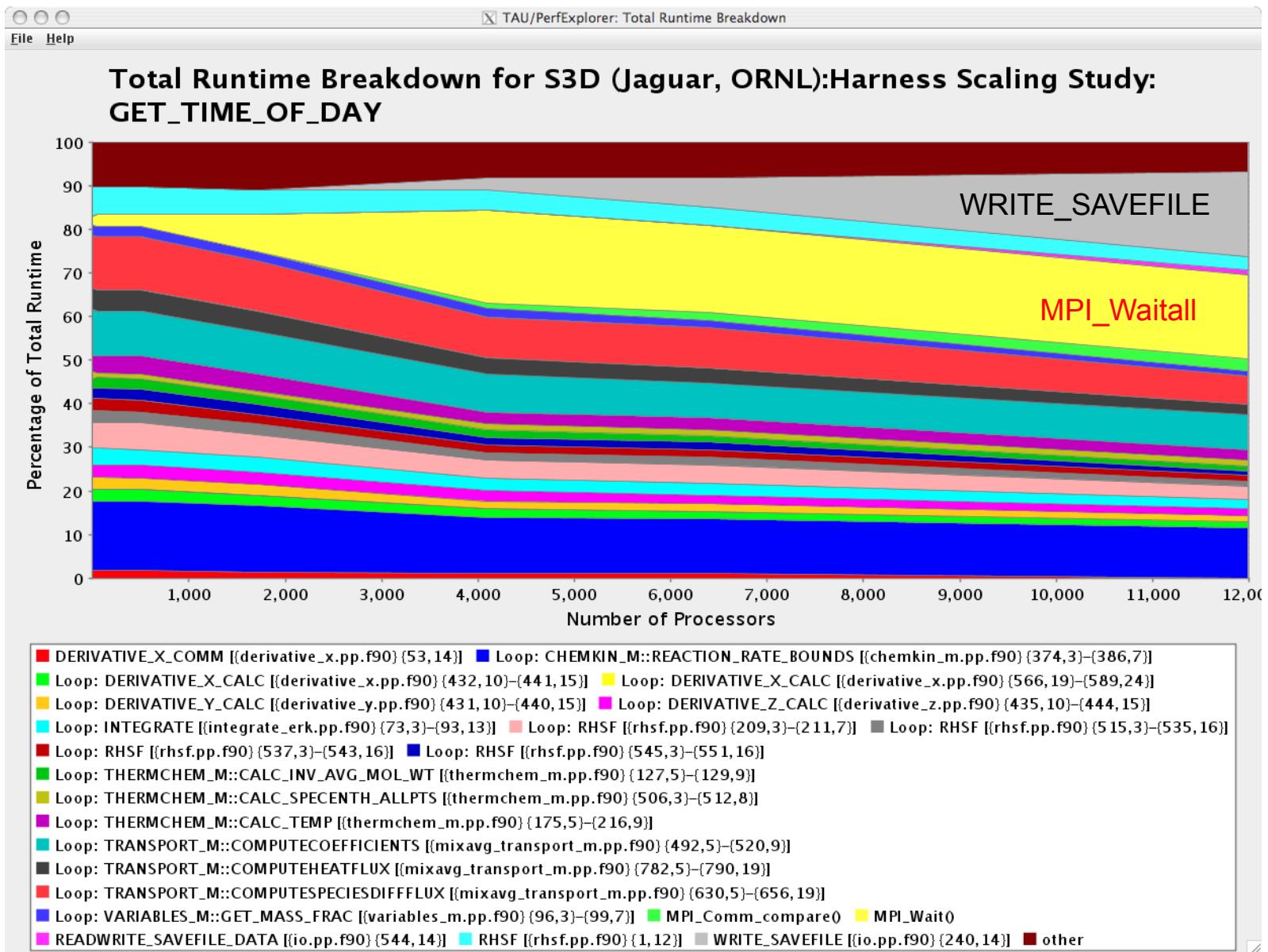


All windows dynamically update

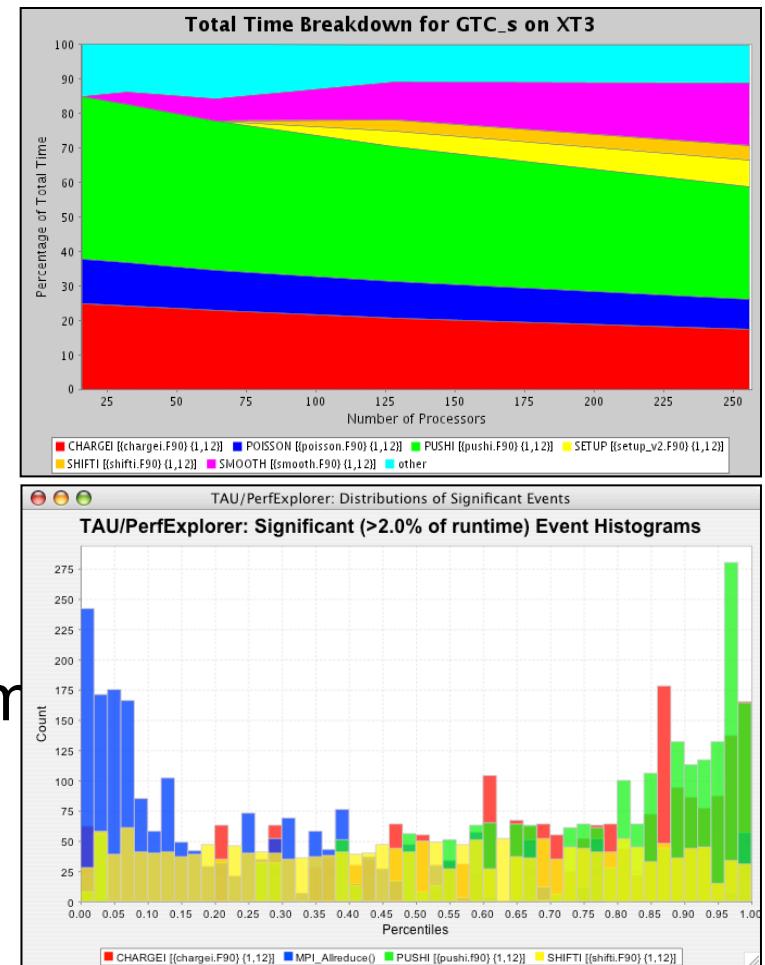


PerfExplorer – Runtime Breakdown

VI-HPS



- Total execution time
- Timesteps per second
- Relative efficiency
- Relative efficiency per event
- Relative speedup
- Relative speedup per event
- Group fraction of total
- Runtime breakdown
- Correlate events with total runtime
- Relative efficiency per phase
- Relative speedup per phase
- Distribution visualizations

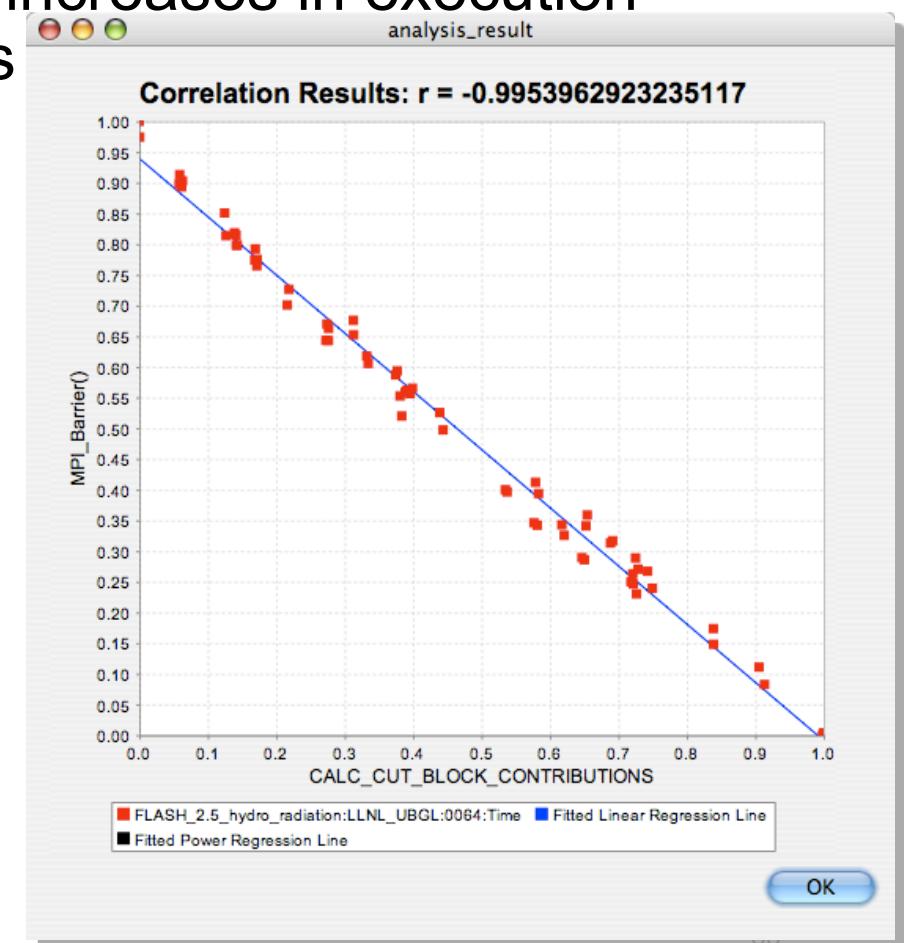


PerfExplorer – Correlation Analysis

VI-HPS

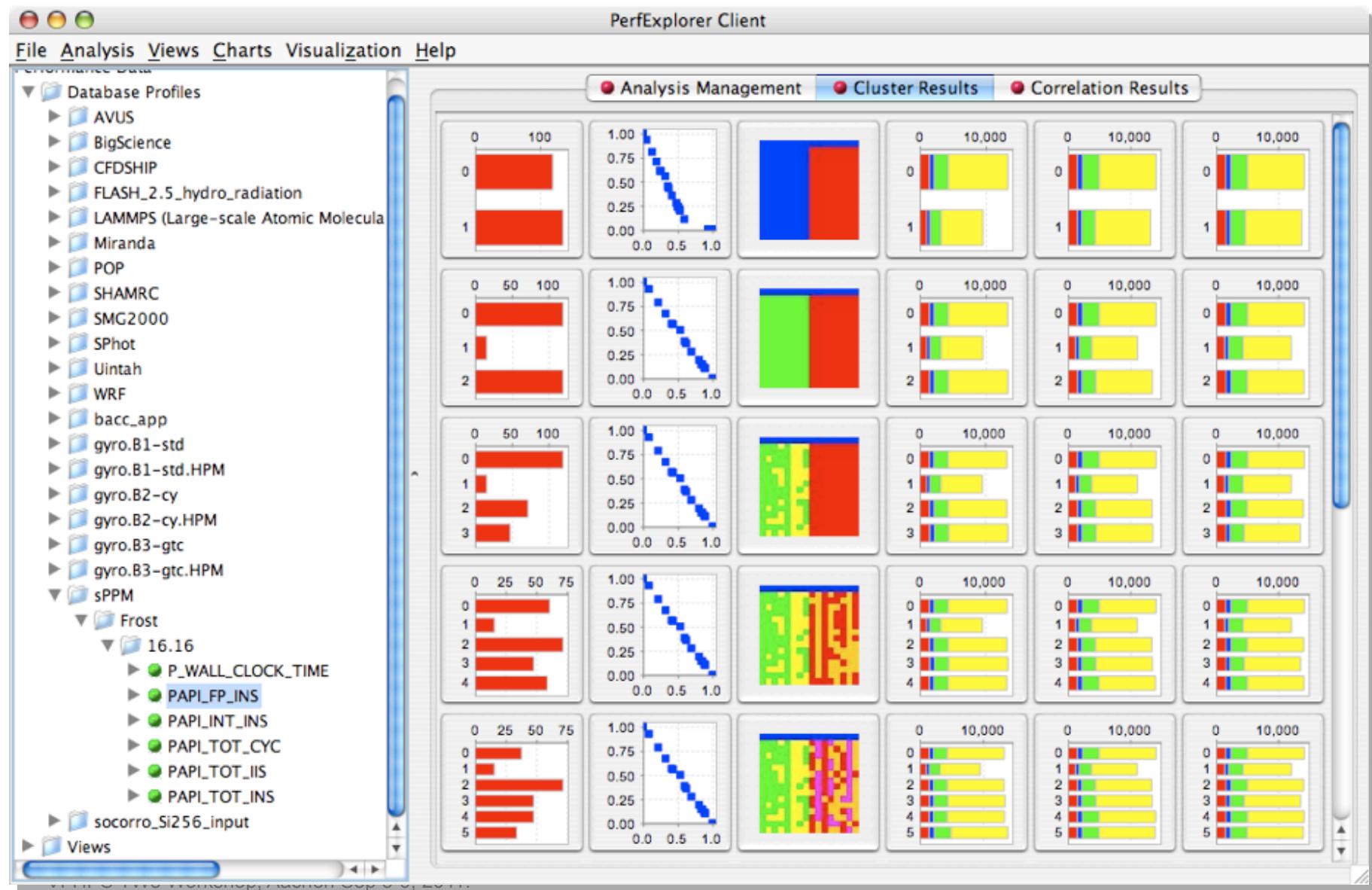


- -0.995 indicates strong, negative relationship
- As `CALC_CUT_BLOCK_CONTRIBUTIONS()` increases in execution time, `MPI_Barrier()` decreases

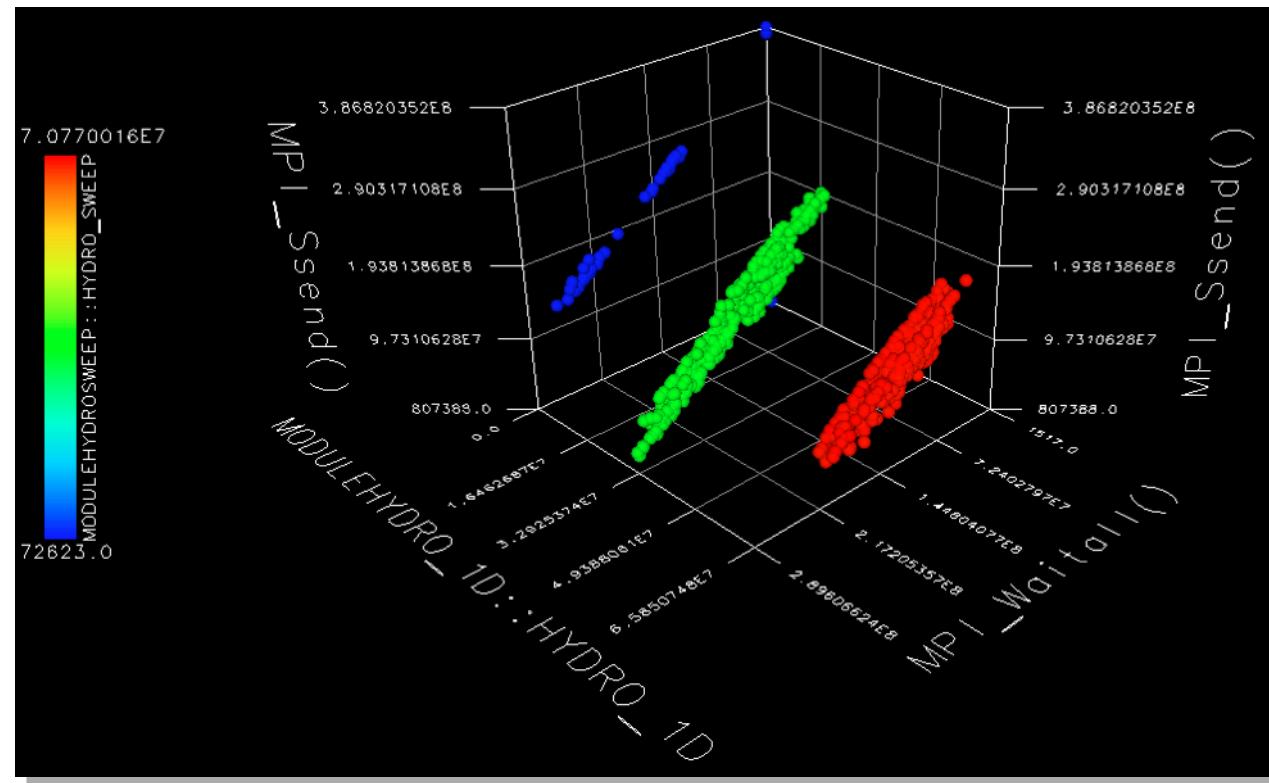


PerfExplorer – Cluster Analysis

VI-HPS

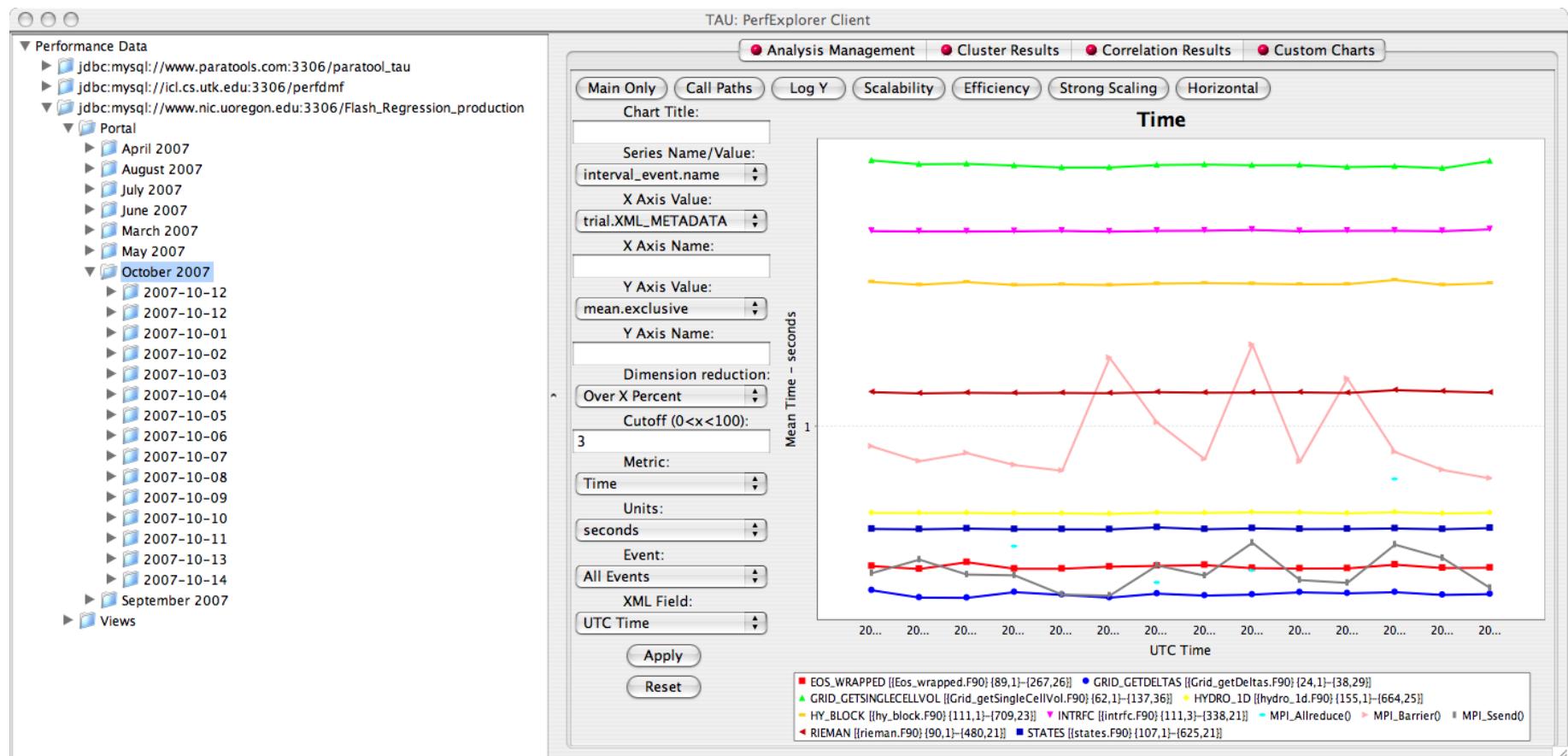


- Four significant events automatically selected
- Clusters and correlations are visible



PerfExplorer – Performance Regression

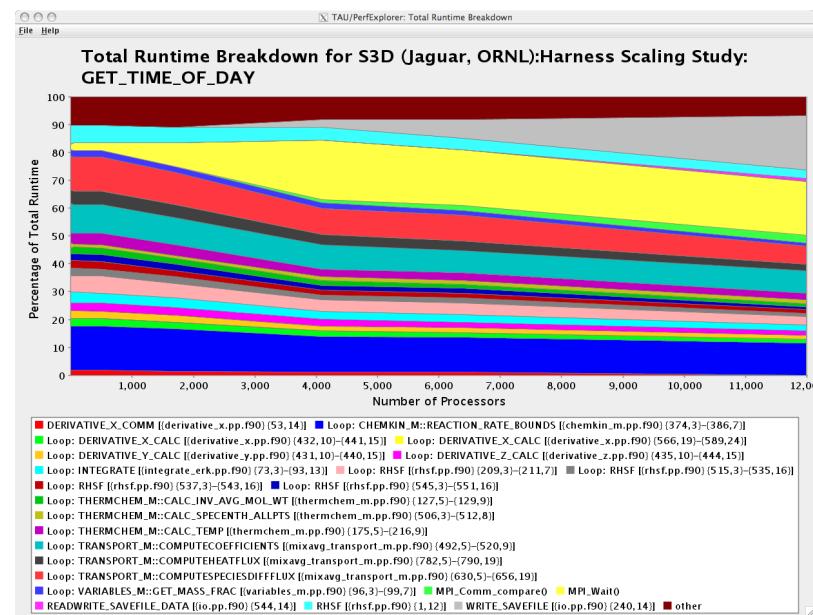
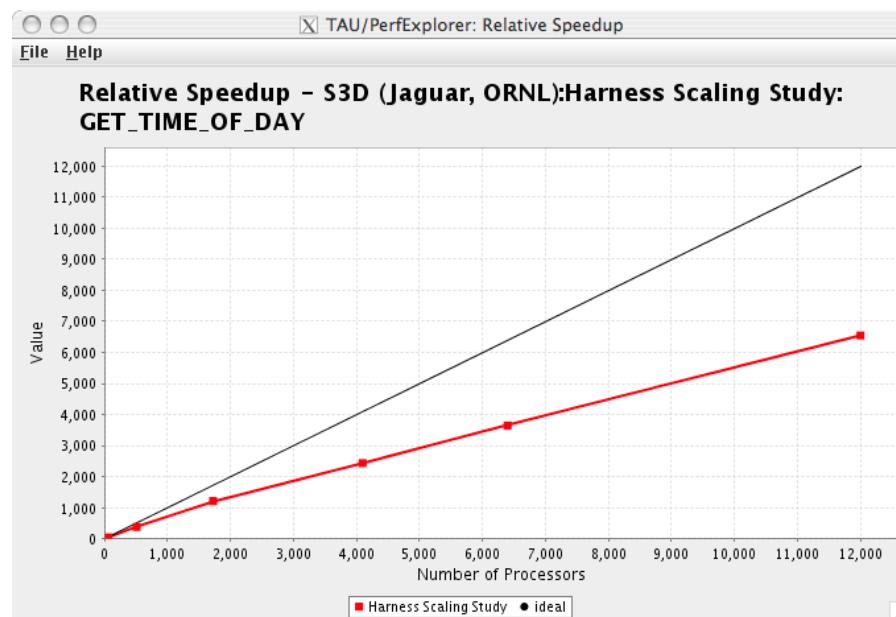
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Usage Scenarios: Evaluate Scalability

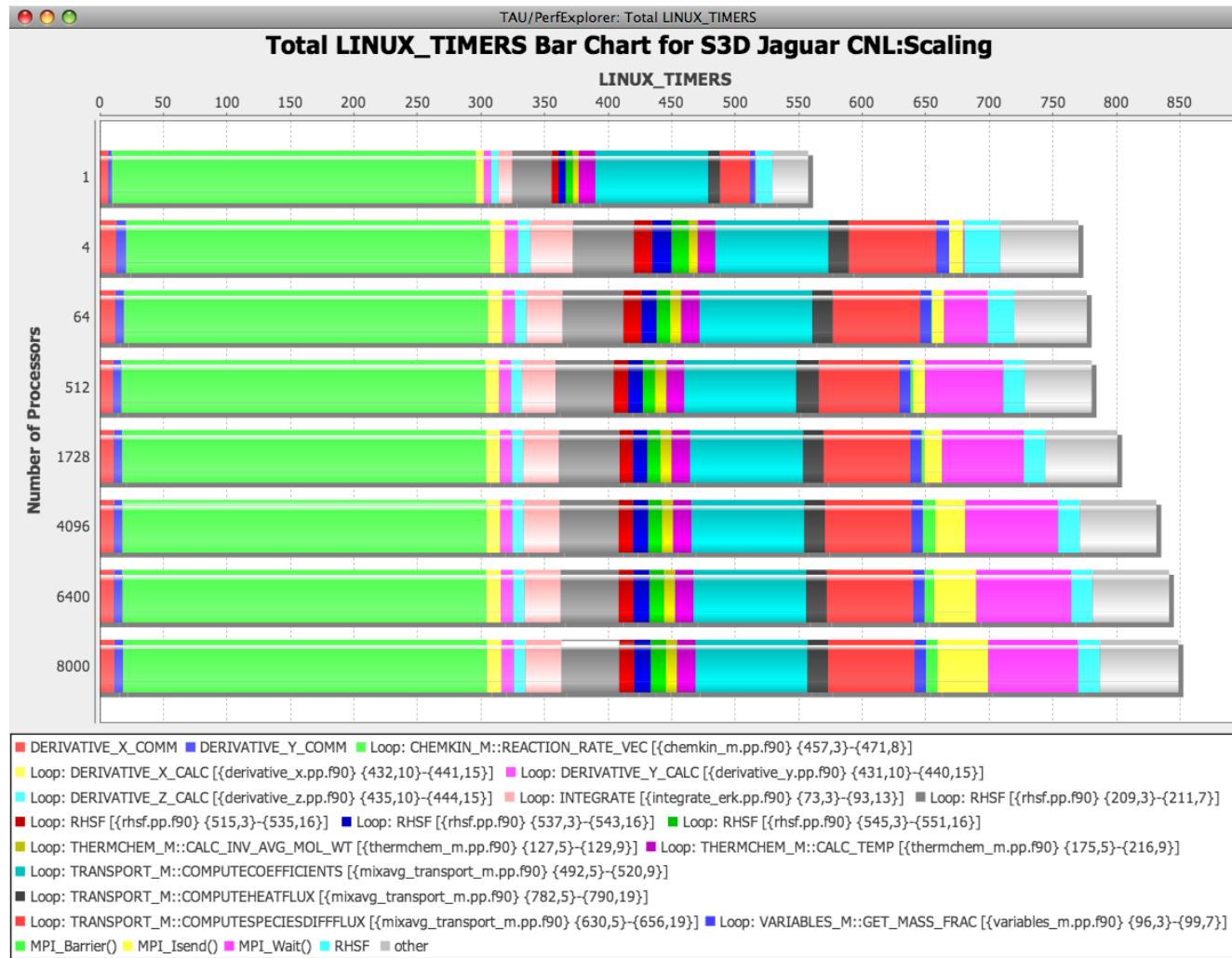
VI-HPS

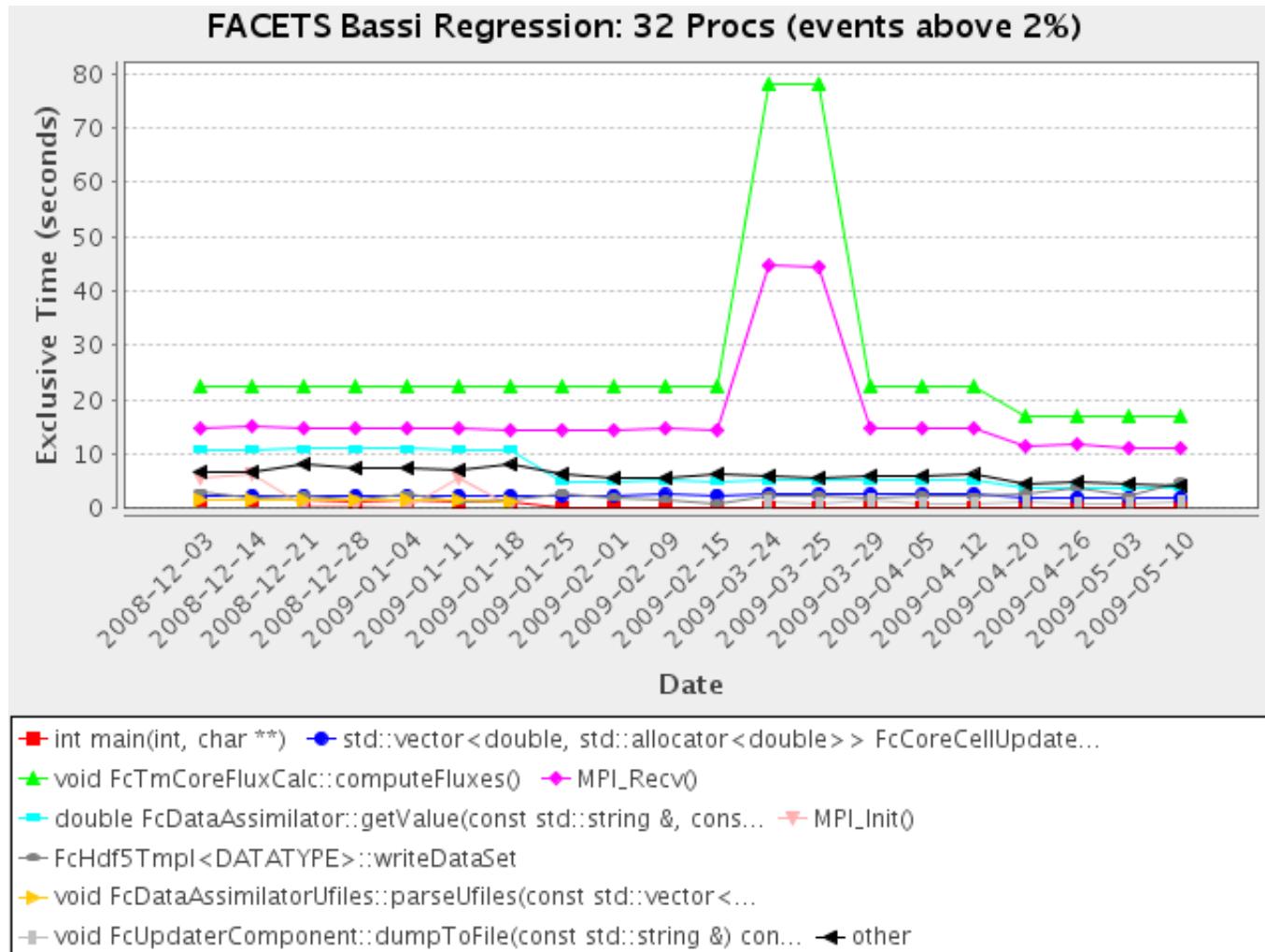
- Goal: How does my application scale? What bottlenecks at what CPU counts?
- Load profiles in PerfDMF database and examine with PerfExplorer



Usage Scenarios: Evaluate Scalability

VI-HPS





```
% export TAU_MAKEFILE=<taudir>/<arch>
                  /lib/Makefile.tau-mpi-pdt
% export PATH=<taudir>/<arch>/bin:$PATH
% make F90=tau_f90.sh
(Or edit Makefile and change F90=tau_f90.sh)
% qsub run1p.job
% paraprof --pack 1p.ppk
% qsub run2p.job ...
% paraprof --pack 2p.ppk ... and so on.

On your client:
% perfdfmf_configure
(Choose derby, blank user/passwd, yes to save passwd, defaults)
% perfexplorer_configure
(Yes to load schema, defaults)
% paraprof
(load each trial: DB -> Add Trial -> Type (Paraprof Packed
Profile) -> OK, OR use perfdfmf_loadtrial on the commandline)
% perfexplorer
(Charts -> Speedup)
```

- TAU Portal
 - Support collaborative performance study
- Kernel-level system measurements (KTAU)
 - Application to OS noise analysis and I/O system analysis
- TAU performance monitoring
 - TAUoverSupermon and TAUoverMRNet
- PerfExplorer integration and expert-based analysis
 - OpenUH compiler optimizations
 - Computational quality of service in CCA
- Eclipse CDT and PTP integration
- Performance tools integration (NSF POINT project)

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 - Dr. Markus Geimer, Dr. Brian Wylie



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ParaTools



- TAU Website:
<http://tau.uoregon.edu>
 - Software
 - Release notes
 - Documentation