

Python Performance Evaluation with the TAU Performance System

John C. Linfood, Sameer Shende, Allen Malony
{jlinford,sameer,malony}@paratools.com
ParaTools, Inc.

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www.paratools.com/emit15/TAU

Tutorial Overview

- Performance optimization of Python applications
- We will cover:
 - Profiling and debugging via the TAU Performance System
 - Performance analysis of Python, C/C++, Fortran
 - Python+X analysis
 - MPI and/or OpenMP analysis
 - Memory debugging
 - Hardware performance counters (PAPI)

Schedule

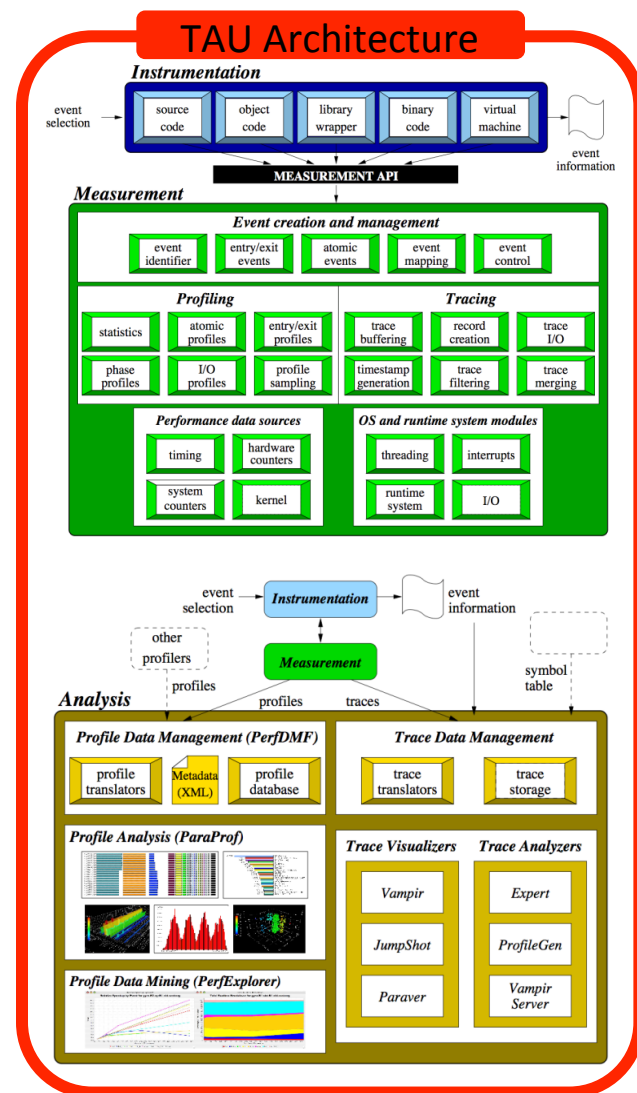
- The TAU Performance System from 10,000 feet
- Live demonstration of TAU + Python
- Hands-on TAU with:
 - Simple pure Python
 - Python + X
 - Let's build a CTM...
 - With Ipython!

Python Performance Evaluation

THE TAU PERFORMANCE SYSTEM

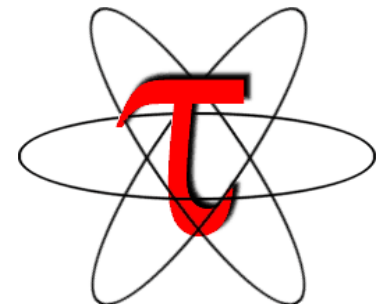
The TAU Performance System®

- *Integrated toolkit* for performance problem solving
 - Instrumentation, measurement, analysis, visualization
 - Portable profiling and tracing
 - Performance data management and data mining
- Direct and indirect measurement
- *Free, open source, BSD license*
- Available on all HPC platforms (and many non-HPC)
- <http://tau.uoregon.edu/>



The TAU Performance System®

- Tuning and Analysis Utilities (**20+ 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)
- Integrates with application frameworks



Questions TAU Can Answer

- **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, *vector instructions*?
- What is the **memory usage** of the code? When and where is memory allocated/de-allocated? Are there any *memory leaks*?
- What are the **I/O characteristics** of the code? What is the peak read and write *bandwidth* of individual calls, total volume?
- What is the **time spent waiting for collectives**?
- How does the application **scale**?

TAU Supports All HPC Platforms

C/C++
Fortran
pthreads
Intel
MinGW

CUDA
OpenACC
Intel MIC
GNU
LLVM
Linux
BlueGene
Android

UPC
OpenMP
MIC
PGI
Windows
Fujitsu
MPC

GPI
Java
OpenMP
Cray
AIX
ARM
OS X

Python
MPI
Sun

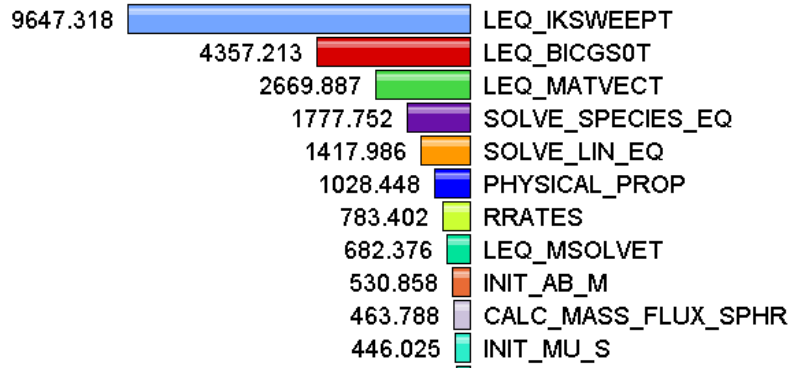
Insert
yours
here

Python Performance Evaluation

VOCABULARY

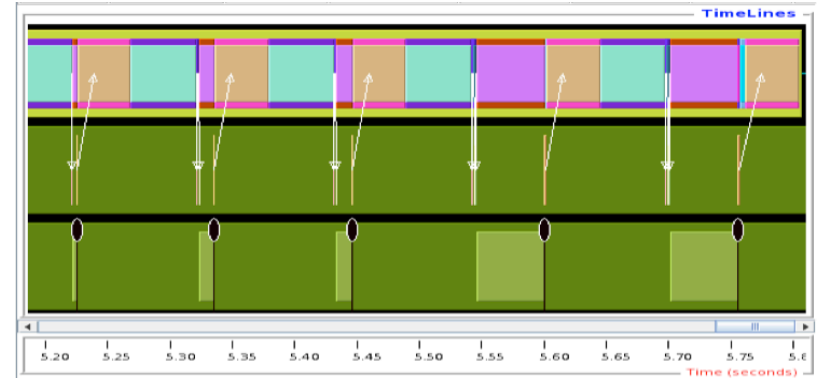
Measurement Approaches

Profiling



Shows
how much time was
spent in each
routine

Tracing

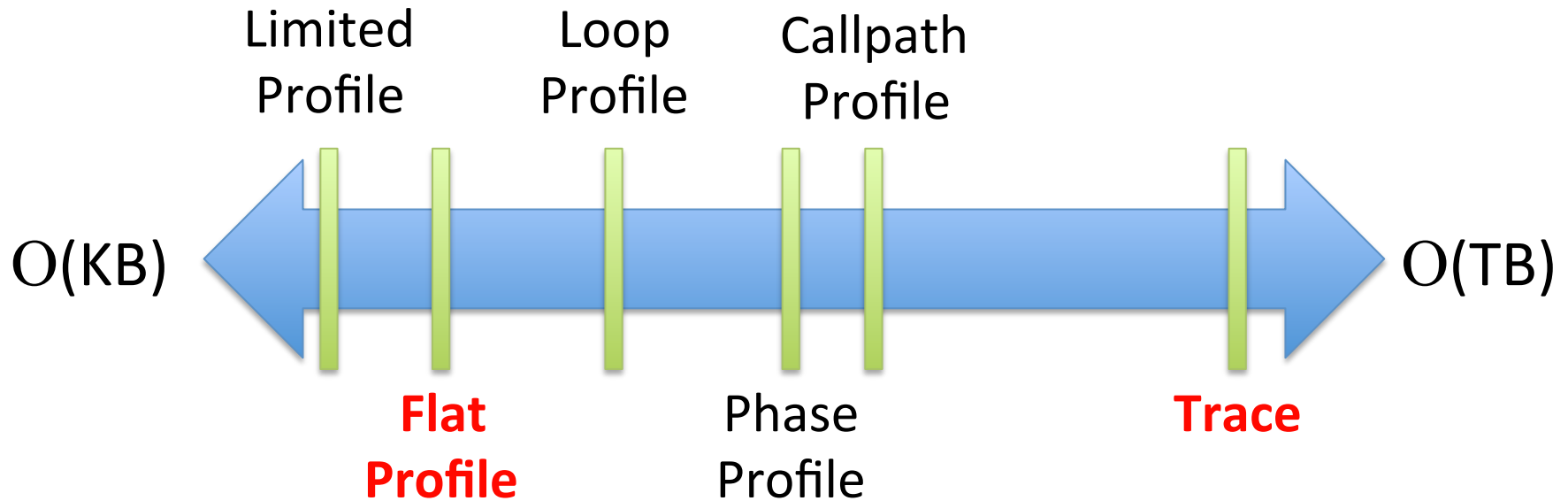


Shows
when events take
place on a timeline

Types of Performance Profiles

- *Flat* profiles
 - Metric (e.g., time) spent in an event
 - Exclusive/inclusive, # of calls, child calls, ...
- *Callpath* profiles
 - Time spent along a calling path (edges in callgraph)
 - “*main=> f1 => f2 => MPI_Send*”
 - Set the **TAU_CALLPATH_DEPTH** environment variable
- *Phase* profiles
 - Flat profiles under a phase (nested phases allowed)
 - Default “main” phase
 - Supports static or dynamic (e.g. per-iteration) phases

How much data do you want?



All levels support multiple metrics/counters

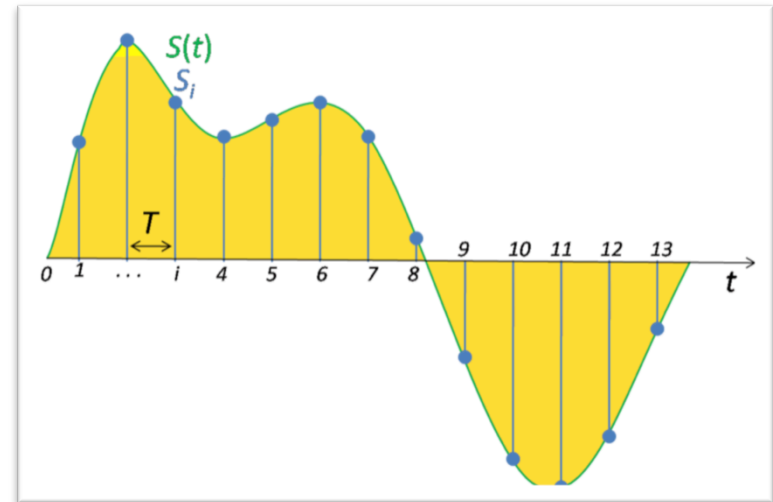
Performance Data Measurement

Direct via Probes

```
call TAU_START('potential')  
// code  
call TAU_STOP('potential')
```

- Exact measurement
- Fine-grain control
- Calls inserted into code

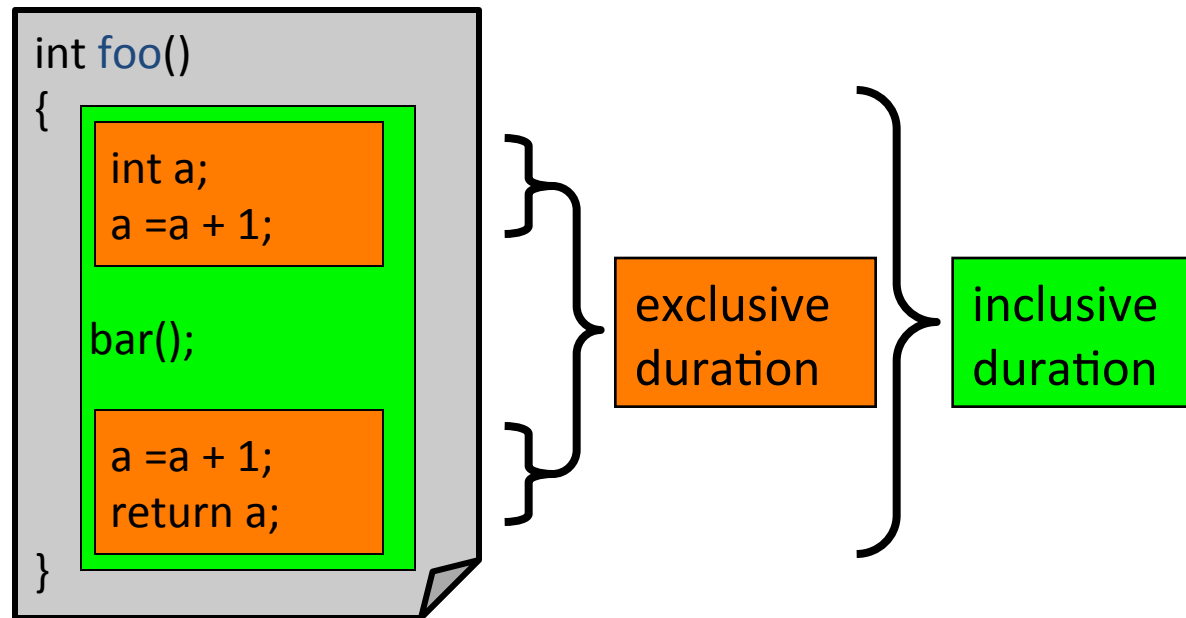
Indirect via Sampling



- No code modification
- Minimal effort
- Relies on debug symbols (-g option)

Inclusive vs. Exclusive Measurements

- **Exclusive** measurements for **region only**
- **Inclusive** measurements **includes child** regions



Python Performance Evaluation

PERFORMANCE ANALYSIS WORKFLOW

TAU Architecture and Workflow

Instrumentation

Source

- C, C++, Fortran, UPC, ...
- Python, Java, ...
- Robust parsers (PDT)

Library

- Interposition (PMPI, GASNET, ...)
- Wrapper generation

Linker

- Static, Dynamic
- Preloading (LD_PRELOAD)

Executable

- Dynamic (Dyninst)
- Binary (Dininst, MAQAO, PEBIL)

Measurement

Events

- Static, Dynamic
- Routine, Block, Loop
- Threading, Communication
- Heterogeneous

Profiling

- Flat, Callpath, Phase, Snapshot
- Probe, Sampling, Compiler, Hybrid

Tracing

- TAU, Scalasca, ScoreP
- Open Trace Format (OTF)

Metadata

- System
- User defined

Analysis

Profiles

- ParaProf analyzer & visualizer
 - 3D profile data visualization
 - Communication matrix
 - Callstack analysis
 - Graph generation
- PerfDMF
- PerfExplorer profile data miner

Traces

- OTF, SLOG-2
- Vampir
- Jumpshot

Online

- Event unification
- Statistics calculation

Instrument: Add Probes

- *Source code* instrumentation
 - PDT parsers, pre-processors
- *Wrap* external libraries
 - I/O, MPI, Memory, CUDA, OpenCL, pthread
- *Rewrite* the binary executable
 - Dyninst, MAQAO

Insert TAU API Calls Automatically

- Use TAU's compiler wrappers
 - Replace C++ compiler with `tau_cxx.sh`, etc.
 - Automatically instruments source code, links with TAU libraries.
- Use `tau_cc.sh` for C, `tau_f90.sh` for Fortran, etc.

Makefile without TAU

```
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 $<
```

Makefile with TAU

```
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 $<
```

Measure: Gather Data

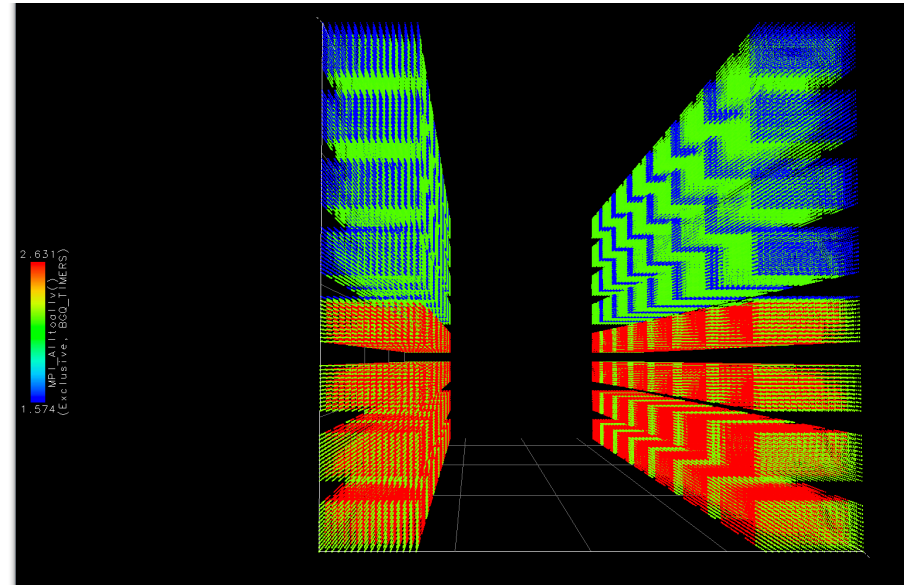
- Direct measurement via *probes*
- Indirect measurement via *sampling*
- Throttling and runtime control
- Interface with external packages (PAPI)

Direct Observation Events

- Interval events (begin/end events)
 - Measures exclusive & inclusive durations between events
 - Metrics monotonically increase
 - Example: Wall-clock timer
- Atomic events (trigger with data value)
 - Used to capture performance data state
 - Shows extent of variation of triggered values (min/max/mean)
 - Example: heap memory consumed at a particular point
- Code events
 - Routines, classes, templates
 - Statement-level blocks, loops
 - Example: for-loop begin/end

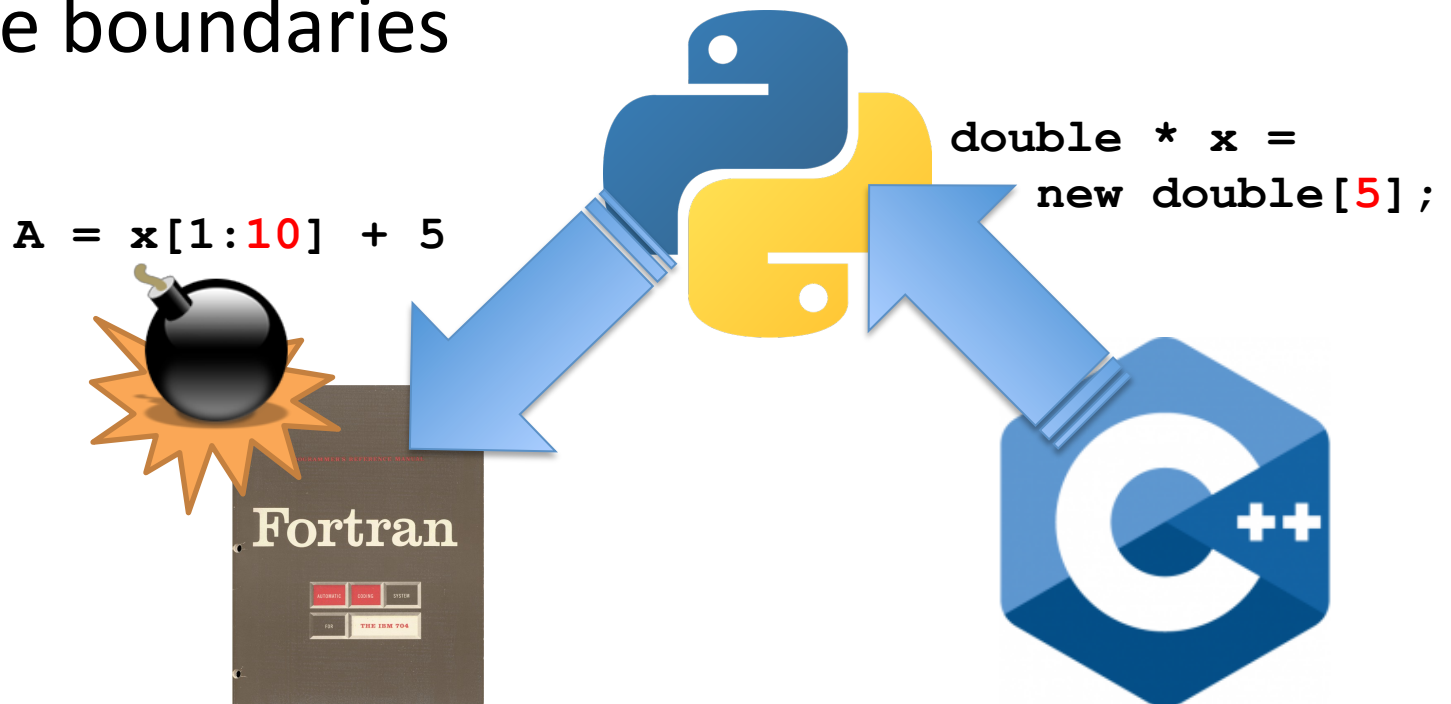
Analyze: Synthesize Knowledge

- Data *visualization*
- Data *mining*
- Statistical analysis
- Import/export performance data



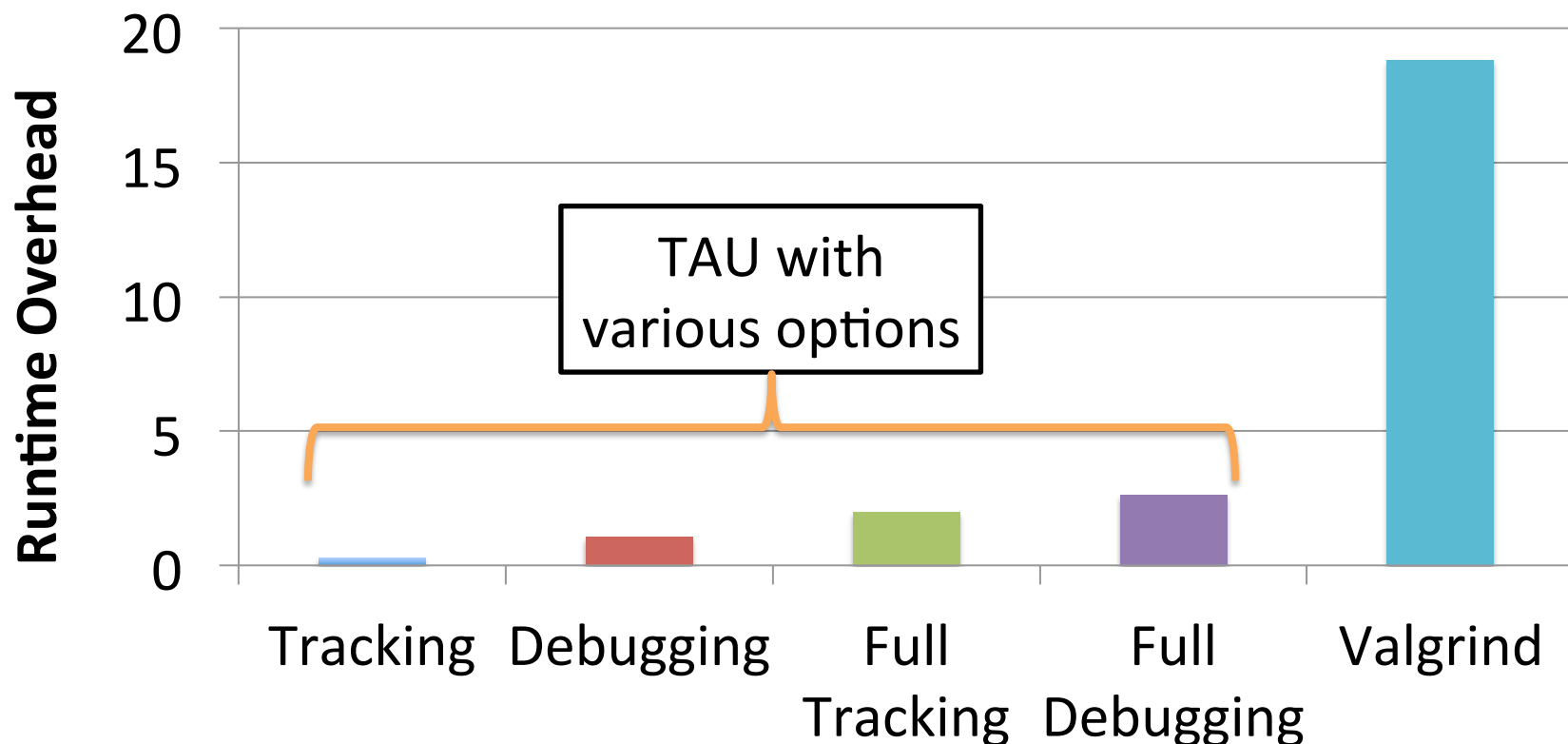
Multi-Language Debugging

- Identify the source location of a crash by unwinding the system callstack
- Identify memory errors (off-by-one, etc.) across language boundaries



Memory debugging

MPI/Pthread/Python/C++/Fortran

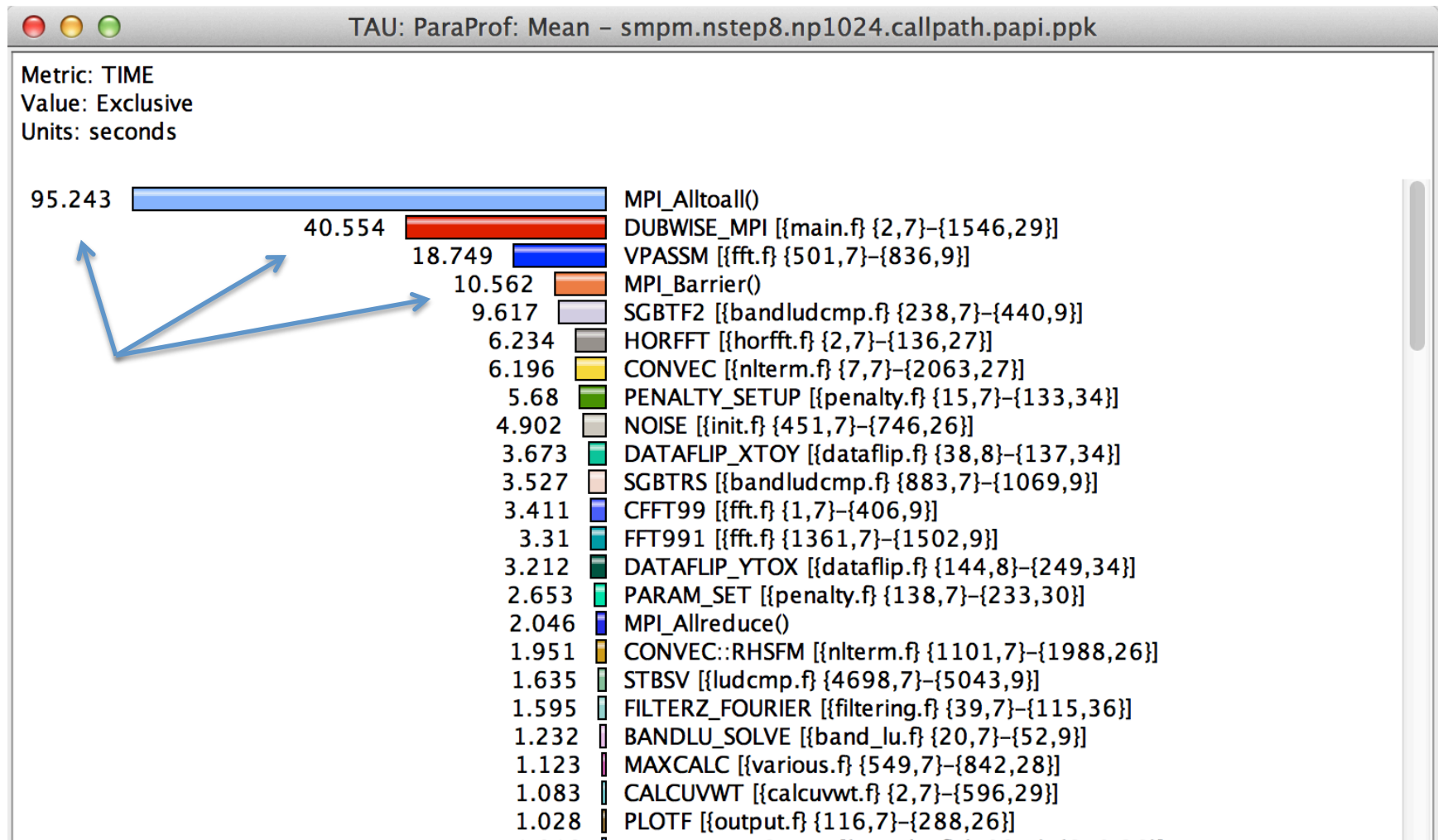


Note: Requires working mprotect() so BGQ not supported

Python Performance Evaluation

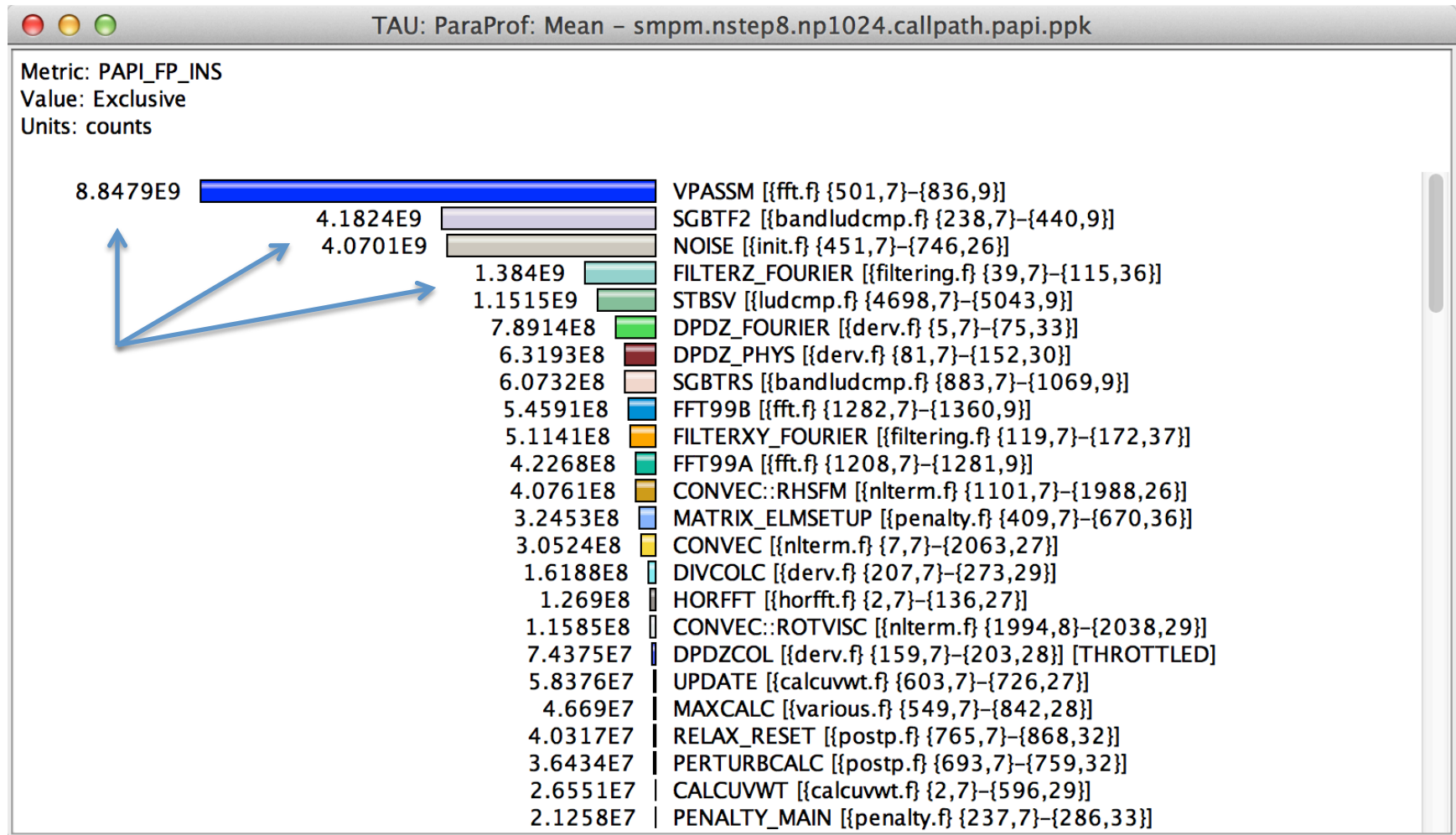
ANALYSIS EXAMPLES

How Much Time per Code Region?



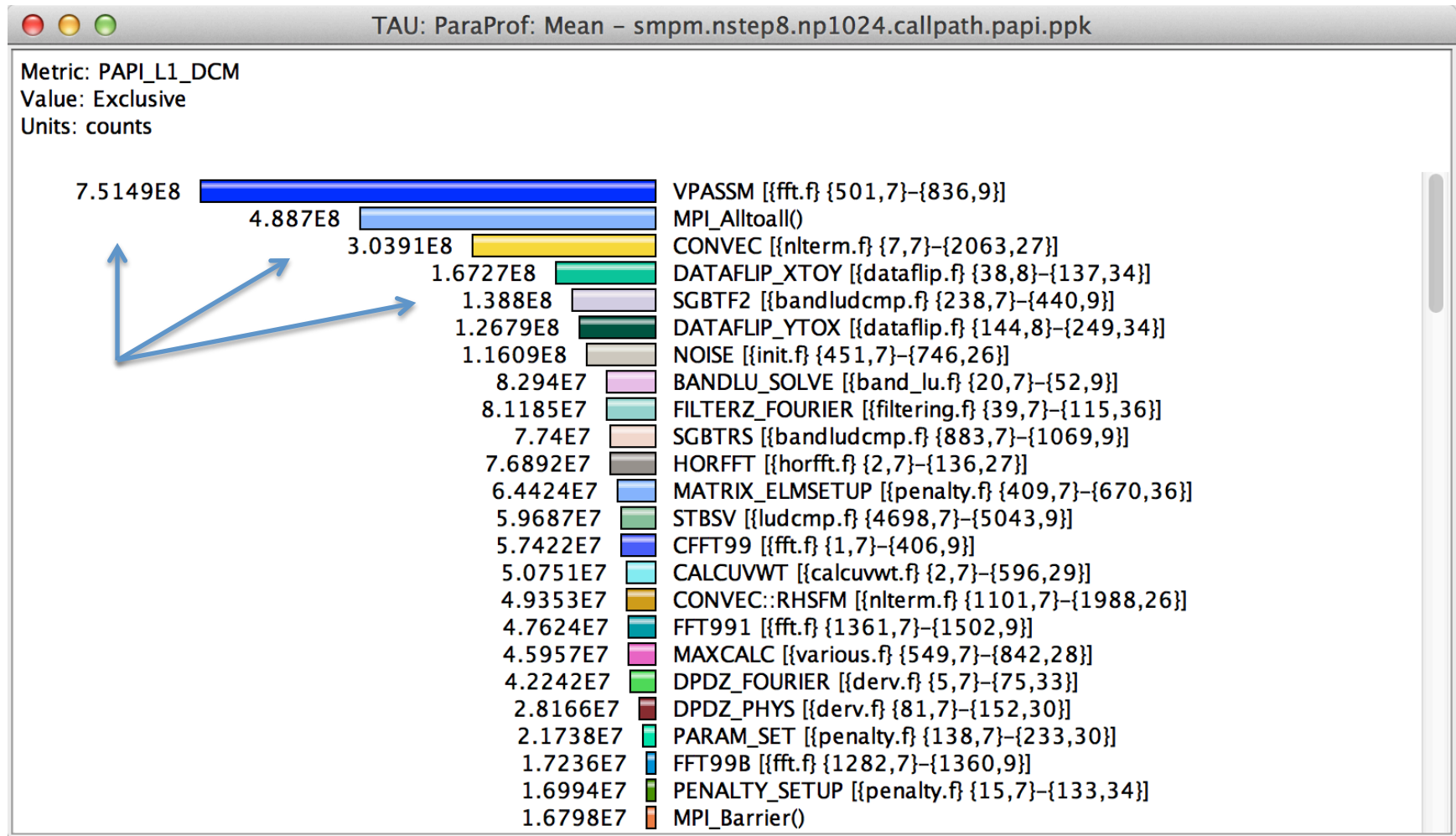
% **paraprof** (Click on label, e.g. "Mean" or "node 0")

How Many Instructions per Code Region?



% paraprof (Options → Select Metric... → Exclusive... → PAPI_FP_INS)

How Many L1 or L2 Cache Misses?



% paraprof (Options → Select Metric... → Exclusive... → PAPI_L1_DCM)

How Much Memory Does the Code Use?

Name Δ	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
▼ TAU application						
free size (bytes)	14,236,992.16	27,169.781	49,152	1	524.001	2,013.103
malloc size (bytes)	13,132,932	23,292	262,144	1	563.839	4,492.057
▶ MPI_Finalize()						
▼ OurMain()						
free size (bytes)	1,298,918.679	1,495.125	461,766.25	4	868.769	16,928.073
malloc size (bytes)	48,150	20	36,032	11	2,407.5	7,911.992
▼ OurMain						
free size (bytes)	3,465	9	769	32	385	260.2
malloc size (bytes)	4,314	12	769	32	359.5	240.981
▼ <module>						
free size (bytes)	293,088	449	32,564	32	652.757	1,526.875
malloc size (bytes)	311,966	493	32,564	32	632.791	1,460.941
▶ staticCFD						
▶ __init__						
▶ <module>						
Memory Utilization (heap, in KB)		849,270.344	192,825.168	0.078	147,832.141	62,621.576
Message size for all-gather	4,096	1	4,096	4,096	4,096	0
Message size for all-reduce	23,340	843	320	4	27.687	64.653
Message size for all-to-all	104	26	4	4	4	0
Message size for broadcast	24,923	206	8,788	4	120.985	860.992
Message size for reduce	8,912	8	8,788	4	1,114	2,900.511
free size (bytes)	27,417,881,391.51	413,600.719	24,025,667	1	66,290.701	199,538.234
malloc size (bytes)	27,468,709,355.914	435,669.625	24,025,667	0	63,049.402	195,561.193

High-water mark



⌘ paraprof (Right-click label [e.g. "node 0"] → Show Context Event Window)

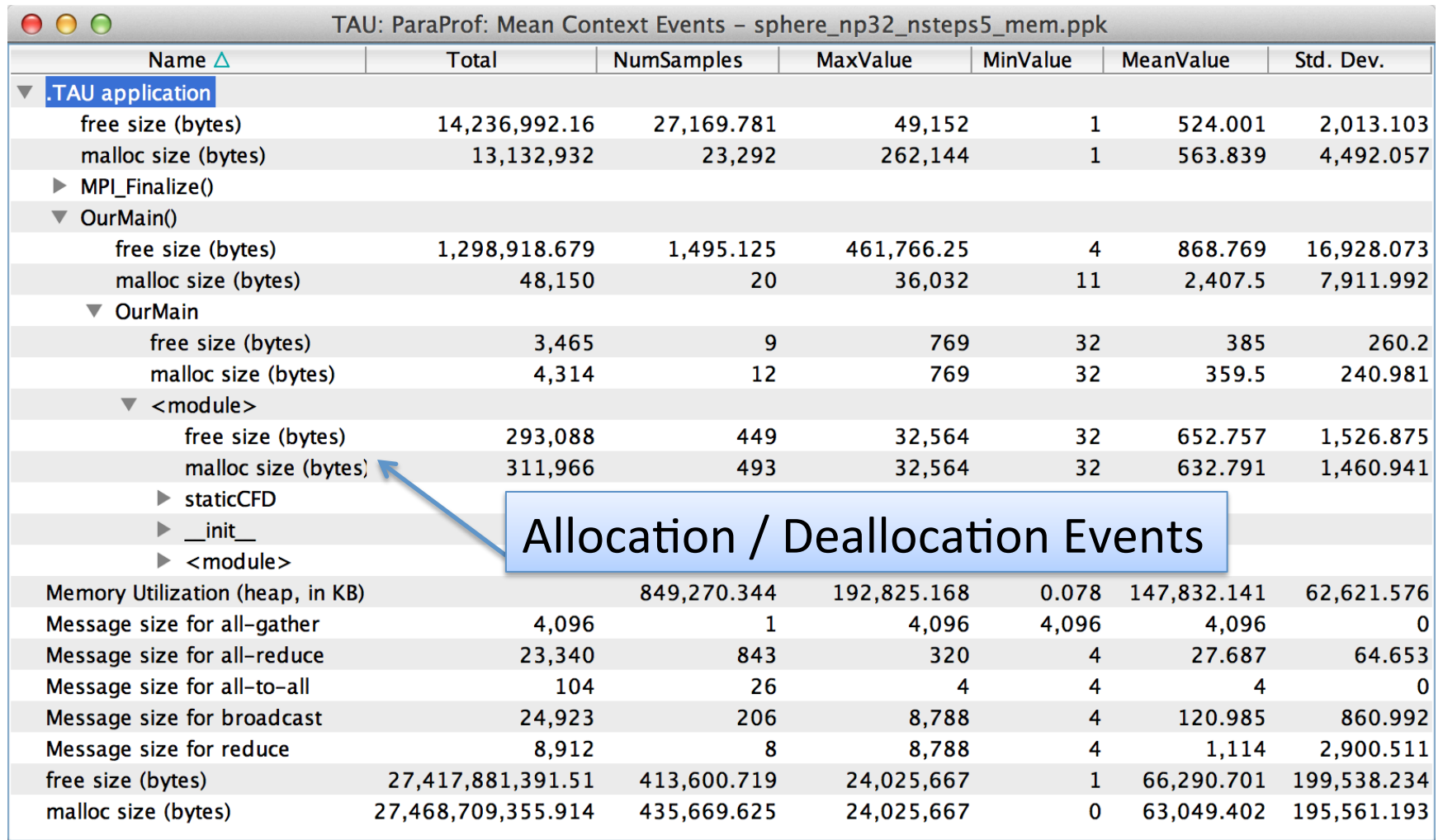
How Much Memory Does the Code Use?

Name Δ	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
▼ TAU application						
free size (bytes)	14,236,992.16	27,169.781	49,152	1	524.001	2,013.103
malloc size (bytes)	13,132,932	23,292	262,144	1	563.839	4,492.057
▶ MPI_Finalize()						
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malloc size (bytes)	48,150	20	36,032	11	2,407.5	7,911.992
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free size (bytes)	27,417,881,391.51	413,600.719	24,025,667	1	66,290.701	199,538.234
malloc size (bytes)	27,468,709,355.914	435,669.625	24,025,667	0	63,049.402	195,561.193

Total allocated/deallocated

⌘ paraprof (Right-click label [e.g “node 0”] → Show Context Event Window)

Where is Memory Allocated / Deallocated?



Name Δ	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
▼ TAU application						
free size (bytes)	14,236,992.16	27,169.781	49,152	1	524.001	2,013.103
malloc size (bytes)	13,132,932	23,292	262,144	1	563.839	4,492.057
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malloc size (bytes)	48,150	20	36,032	11	2,407.5	7,911.992
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Message size for all-gather	4,096	1	4,096	4,096	4,096	0
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Message size for reduce	8,912	8	8,788	4	1,114	2,900.511
free size (bytes)	27,417,881,391.51	413,600.719	24,025,667	1	66,290.701	199,538.234
malloc size (bytes)	27,468,709,355.914	435,669.625	24,025,667	0	63,049.402	195,561.193

⌘ paraprof (Right-click label [e.g “node 0”] → Show Context Event Window)

What are the I/O Characteristics?

TAU: ParaProf: Context Events for thread: n,c,t, 1,0,0 - samarc_obe_4p_iomem_cp.ppk


Name	Total	MeanValue	NumSamples	MinValue	MaxValue	Std. Dev.
▼ .TAU application						
▶ read()						
▶ fopen64()						
▶ fclose()						
▼ OurMain()						
malloc size	25,235	1,097.174	23	11	12,032	2,851.143
free size	22,707	1,746.692	13	11	12,032	3,660.642
▼ OurMain [{{wrapper.py}}{3}]						
▶ read()						
malloc size	3,877	323.083	12	32	981	252.72
free size	1,536	219.429	7	32	464	148.122
▶ fopen64()						
▶ fclose()						
▼ <module> [{{obe.py}}{8}]						
▼ writeRestartData [{{samarcInterface.py}}{145}]						
▼ samarcWriteRestartData						
▼ write()						
WRITE Bandwidth (MB/s) <file="samarc/restore.00002/nodes.00004/proc.00001">		74.565	117	0	2,156.889	246.386
WRITE Bandwidth (MB/s) <file="samarc/restore.00001/nodes.00004/proc.00001">		77.594	117	0	1,941.2	228.366
WRITE Bandwidth (MB/s)		76.08	234	0	2,156.889	237.551
Bytes Written <file="samarc/restore.00002/nodes.00004/proc.00001">	2,097,552	17,927.795	117	1	1,048,576	133,362.946
Bytes Written <file="samarc/restore.00001/nodes.00004/proc.00001">	2,097,552	17,927.795	117	1	1,048,576	133,362.946
Bytes Written	4,195,104	17,927.795	234	1	1,048,576	133,362.946
▶ open64()						


Write bandwidth per file

Bytes written to each file

% **paraprof** (Right-click label [e.g “node 0”] → Show Context Event Window)

What are the I/O Characteristics?

Name 	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
▶ Incl						
▶ Initialize						
▶ LoadBodyEuler						
▶ LoadMesh						
MPI-IO Bytes Written	4,328,712	144	893,152	0	30,060.5	128,042.696
MPI-IO Write Bandwidth (MB/s)		144	196.86	0	3.421	16.87
▶ MPI_Allgatherv()						
▶ MPI_Bcast()						
▶ MPI_Comm_create()						
▶ MPI_File_close()						
▶ MPI_File_open()						
▶ MPI_File_write_all()						
▶ MPI_File_write_at()						
▶ MPI_Finalize()						
▶ MPI_Gather()						
▶ MPI_Gatherv()						



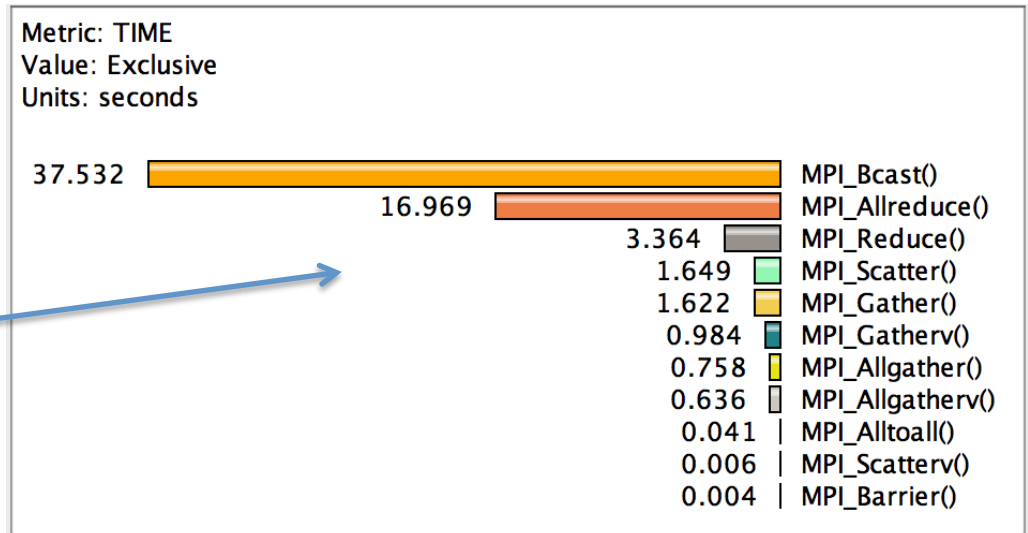
⌘ **paraprof** (Right-click label [e.g. “node 0”] → Show Context Event Window)

How Much Time is spent in Collectives?

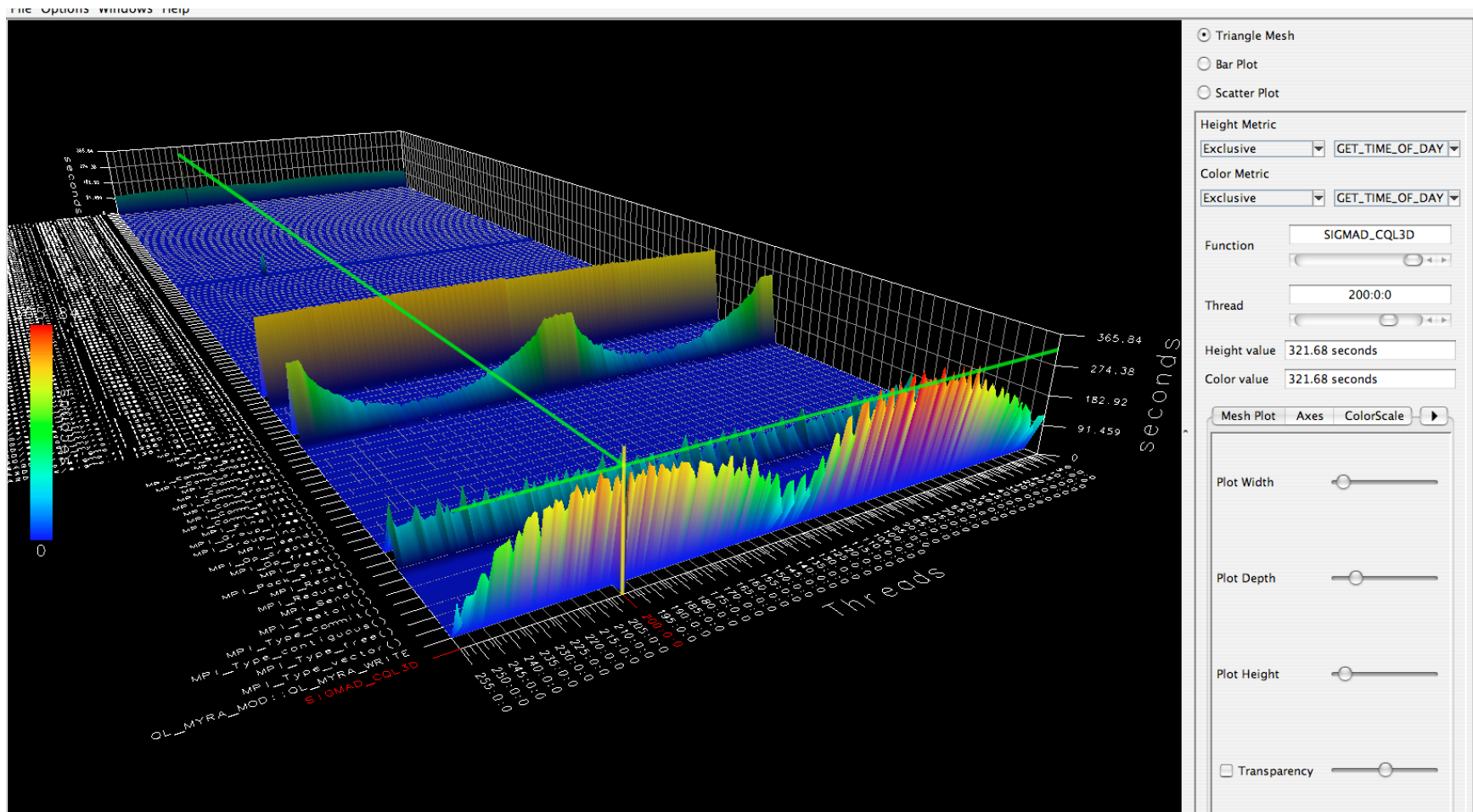
Name Δ	Total	Num...	MaxValue	MinValue	MeanValue	Std. Dev.
▶ MPI_Wait()						
▶ MPI_Waitall()						
Message size for all-gather	305,753,268	72	172,215,296	4	4,246,573.167	22,551,605.859
Message size for all-reduce	163,308	632	21,908	4	258.399	897.725
Message size for all-to-all	112	14	8	8	8	0
Message size for broadcast	692,208,045.5	3,346	18,117,620	0	206,876.284	1,284,673.036
Message size for gather	6,901,452.378	15.312	1,387,306.625	4	450,707.094	483,216.499
Message size for reduce	66,812	1,520	56	4	43.955	21.598
Message size for scatter	63,147.906	146	62,567.906	4	432.52	5,160.063

Message sizes

Time spent in collectives

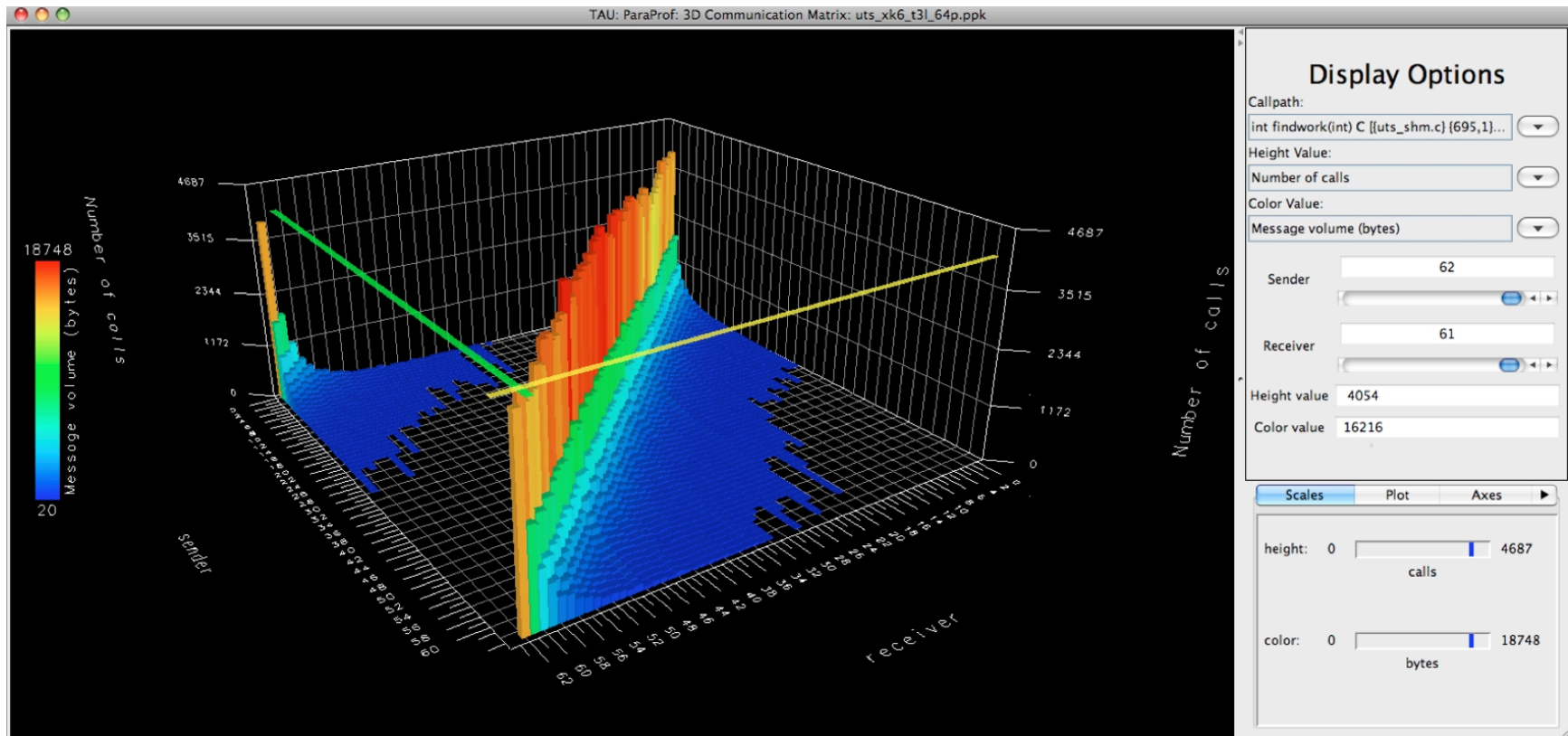


3D Profile Visualization



% paraprof (Windows → 3D Visualization)

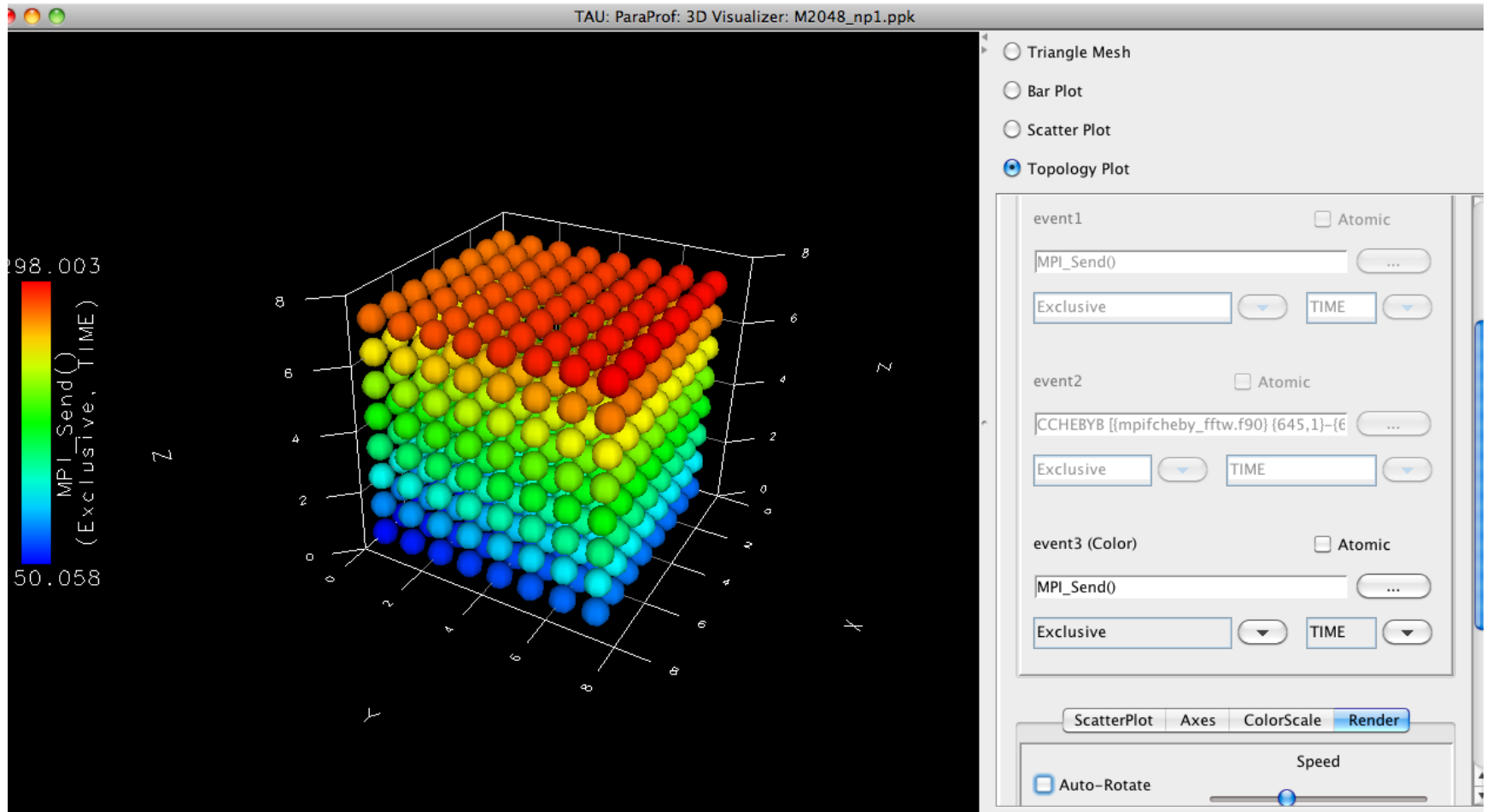
3D Communication Visualization



```
% qsub -env TAU_COMM_MATRIX=1 ...
```

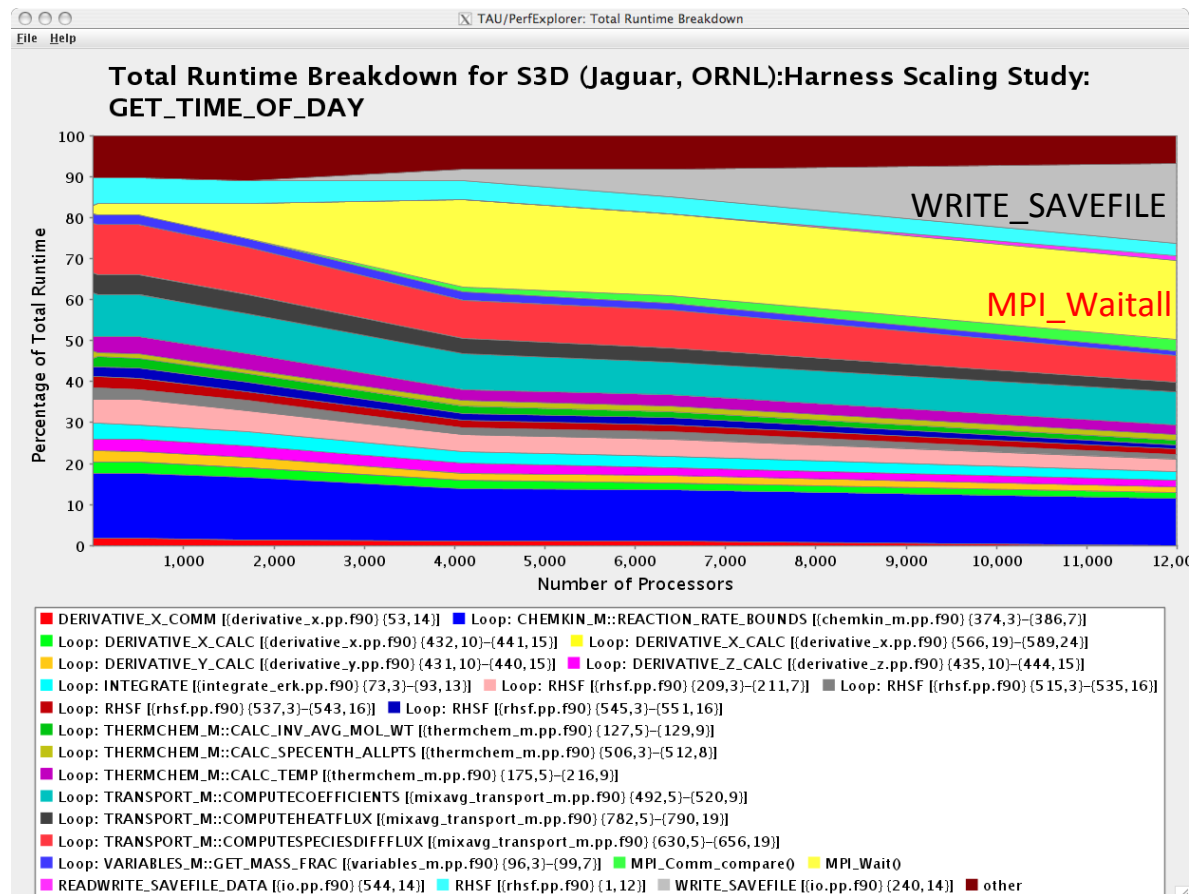
```
% paraprof (Windows → 3D Communication Matrix)
```

3D Topology Visualization



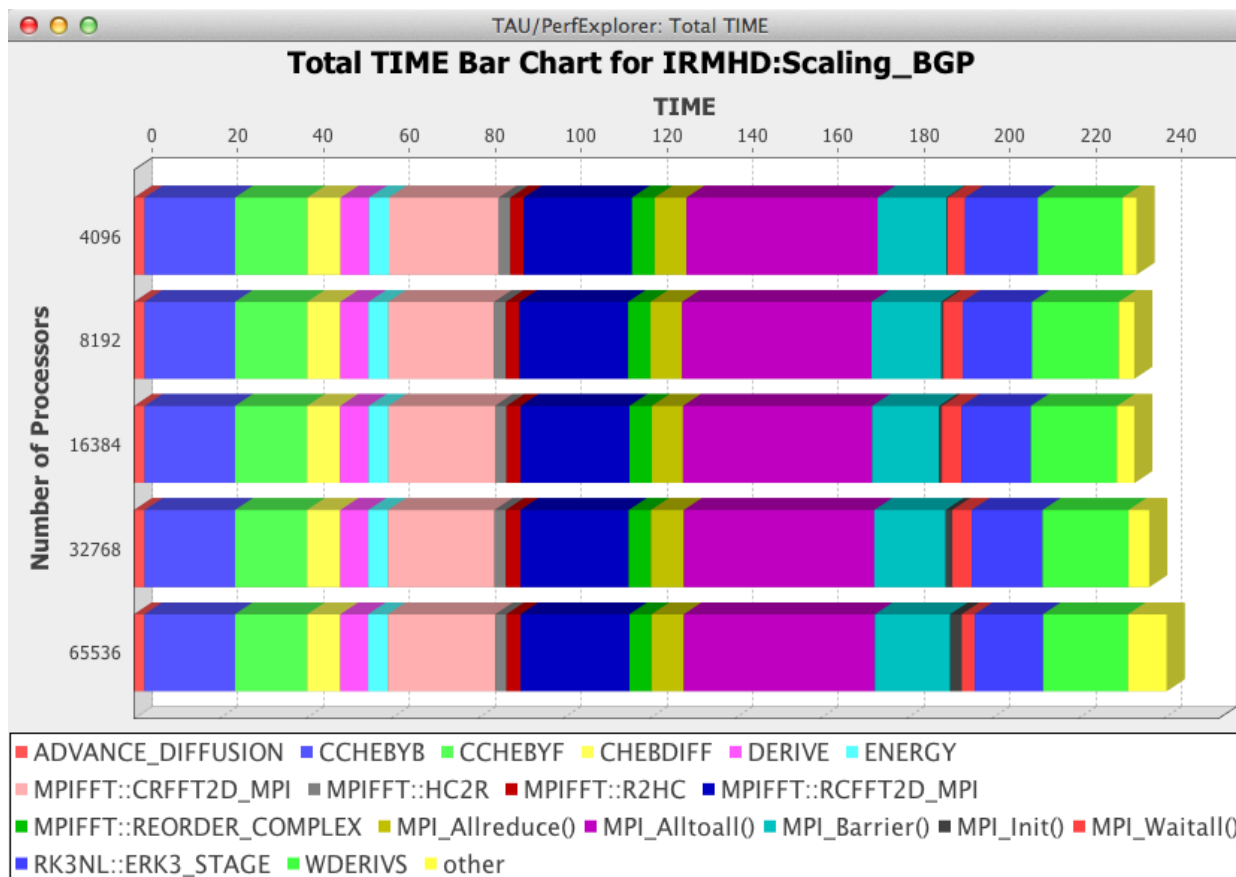
% **paraprof** (Windows → 3D Visualization → Topology Plot)

How Does Each Routine Scale?



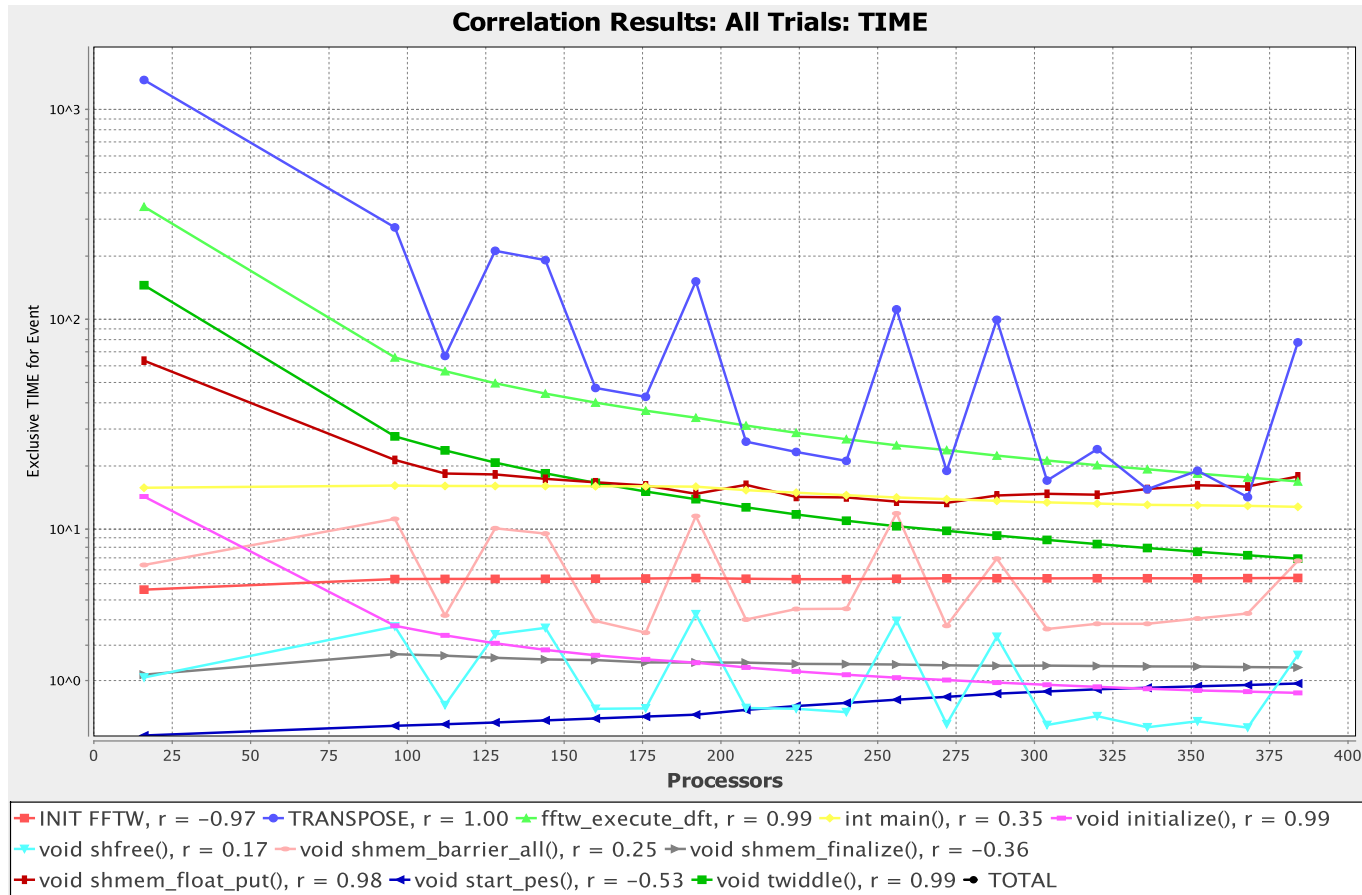
% perfexplorer (Charts → Runtime Breakdown)

How Does Each Routine Scale?



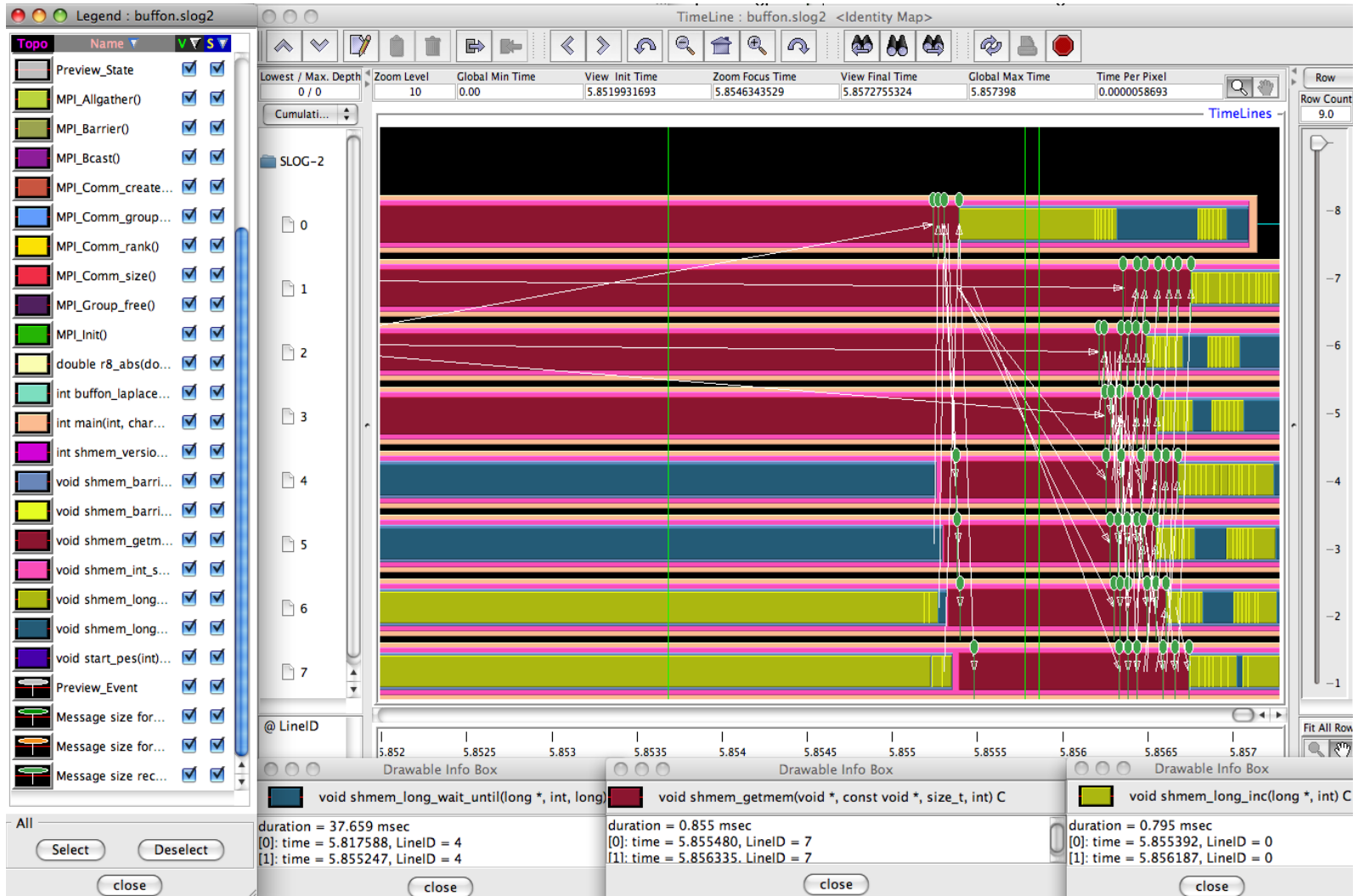
% **perfexplorer** (Charts → Stacked Bar Chart)

Which Events Correlate with Runtime?

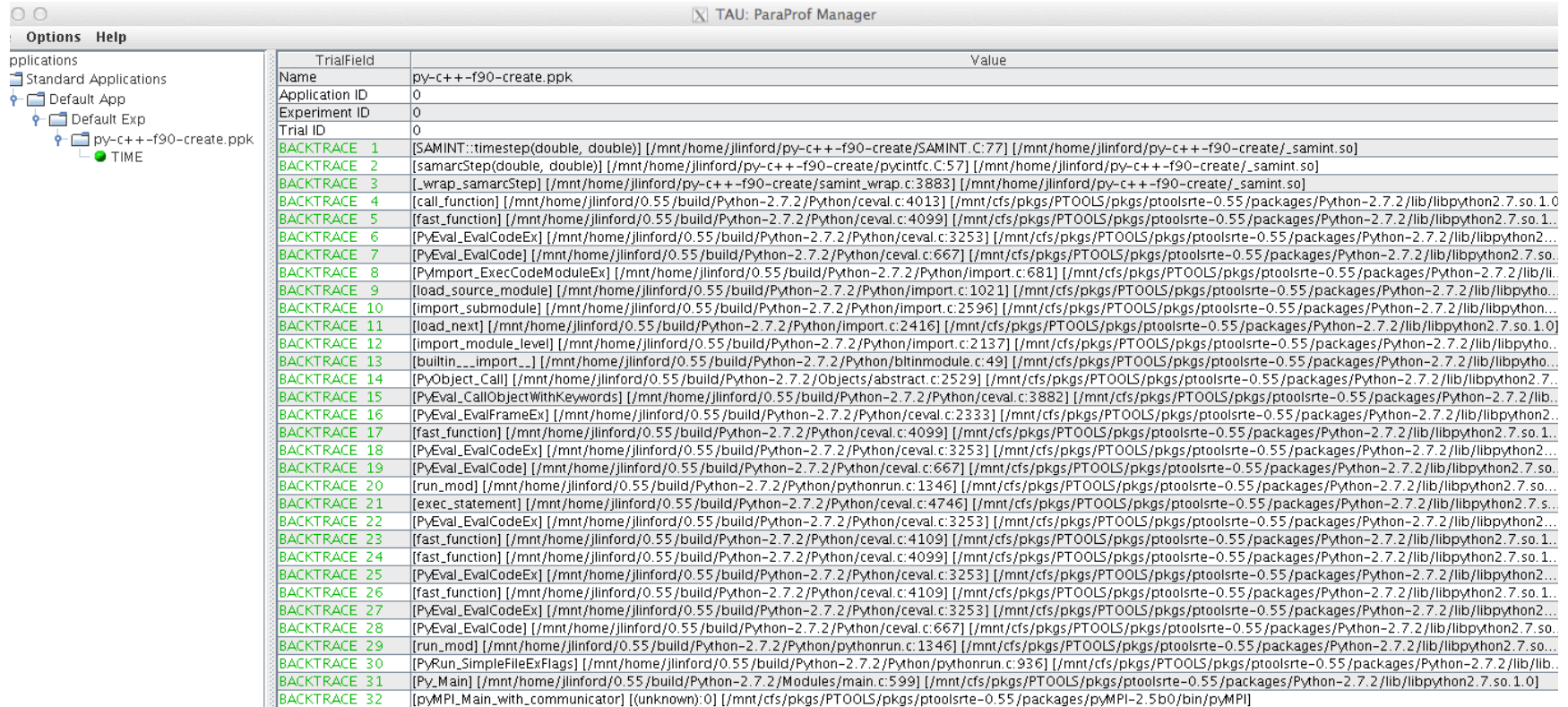


% **perfexplorer** (Charts → Correlate Events with Total Runtime)

When do Events Occur?



What Caused My Application to Crash?



The screenshot shows the TAU: ParaProf Manager interface. On the left, there is a sidebar with 'Options' and 'Help' buttons, and a tree view showing the application structure. The main area displays a backtrace table with columns for 'TrialField', 'Name', and 'Value'. The backtrace starts with 'BACKTRACE 1' and ends with 'BACKTRACE 32'. The application name is 'py-c++-f90-create.ppk'.

TrialField	Name	Value
	Name	py-c++-f90-create.ppk
	Application ID	0
	Experiment ID	0
	Trial ID	0
BACKTRACE 1	[SAMINT::timestep(double, double)]	[/mnt/home/jlinford/py-c++-f90-create/SAMINT.C:77] [/mnt/home/jlinford/py-c++-f90-create/_samint.so]
BACKTRACE 2	[samarcStep(double, double)]	[/mnt/home/jlinford/py-c++-f90-create/pycintfc.C:57] [/mnt/home/jlinford/py-c++-f90-create/_samint.so]
BACKTRACE 3	[_wrap_samarcStep]	[/mnt/home/jlinford/py-c++-f90-create/samint_wrap.c:3883] [/mnt/home/jlinford/py-c++-f90-create/_samint.so]
BACKTRACE 4	[call_function]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4013] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 5	[fast_function]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4099] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 6	[PyEval_EvalCodeEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 7	[PyEval_EvalCode]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:667] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 8	[PyImport_ExecCodeModuleEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:681] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 9	[load_source_module]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:1021] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 10	[import_submodule]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:2596] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 11	[load_next]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:2416] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 12	[import_module_level]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:2137] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 13	[builtin___import__]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/builtinmodule.c:49] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 14	[PyObject_Call]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Objects/abstract.c:2529] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 15	[PyEval_CallObjectWithKeywords]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3882] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 16	[PyEval_EvalFrameEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:2333] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 17	[fast_function]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4099] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 18	[PyEval_EvalCodeEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 19	[PyEval_EvalCode]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:667] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 20	[run_mod]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/pythonrun.c:1346] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 21	[exec_statement]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4746] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 22	[PyEval_EvalCodeEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 23	[fast_function]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4109] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 24	[fast_function]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4099] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 25	[PyEval_EvalCodeEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 26	[fast_function]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4109] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 27	[PyEval_EvalCodeEx]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 28	[PyEval_EvalCode]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:667] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 29	[run_mod]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/pythonrun.c:1346] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 30	[PyRun_SimpleFileExFlags]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/pythonrun.c:936] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 31	[Py_Main]	[/mnt/home/jlinford/0.55/build/Python-2.7.2/Modules/main.c:599] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 32	[pyMPI_Main_with_communicator]	[(unknown):0] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/pyMPI-2.5b0/bin/pyMPI]

% export **TAU_TRACK_SIGNALS=1**

% paraprof

What Caused My Application to Crash?

Right-click to see source code



Name	Value
BACKTRACE 1	[SAMINT::timestep(double, double)] [/mnt/home/jlinford/py-c++-f90-create/SAMI... jlinford/py-c++-f90-create/_samint.so]
BACKTRACE 2	[samarcStep(double, double)] [/mnt/home/jlinford/py-c++-f90-create/pycintfc.C... Show Source Code /py-c++-f90-create/_samint.so]
BACKTRACE 3	[_wrap_samarcStep] [/mnt/home/jlinford/py-c++-f90-create/samint_wrap.c:3883] [/mnt/home/jlinford/py-c++-f90-create/_samint.so]
BACKTRACE 4	[call_function] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4013] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 5	[fast_function] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4099] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 6	[PyEval_EvalCodeEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 7	[PyEval_EvalCode] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:667] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so....]
BACKTRACE 8	[PyImport_ExecCodeModuleEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:681] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/li....]
BACKTRACE 9	[load_source_module] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:1021] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython....]
BACKTRACE 10	[import_submodule] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:2596] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 11	[load_next] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:2416] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 12	[import_module_level] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/import.c:2137] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython....]
BACKTRACE 13	[builtin___import___] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/builtinmodule.c:49] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython....]
BACKTRACE 14	[PyObject_Call] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Objects/abstract.c:2529] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7....]
BACKTRACE 15	[PyEval_CallObjectWithKeywords] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3882] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib....]
BACKTRACE 16	[PyEval_EvalFrameEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:2333] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 17	[fast_function] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4099] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 18	[PyEval_EvalCodeEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 19	[PyEval_EvalCode] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:667] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so....]
BACKTRACE 20	[run_mod] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/pythonrun.c:1346] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so....]
BACKTRACE 21	[exec_statement] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4746] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so....]
BACKTRACE 22	[PyEval_EvalCodeEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 23	[fast_function] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4109] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 24	[fast_function] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4099] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 25	[PyEval_EvalCodeEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 26	[fast_function] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:4109] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 27	[PyEval_EvalCodeEx] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:3253] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2....]
BACKTRACE 28	[PyEval_EvalCode] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/ceval.c:667] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so....]
BACKTRACE 29	[run_mod] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/pythonrun.c:1346] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so....]
BACKTRACE 30	[PyRun_SimpleFileExFlags] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Python/pythonrun.c:936] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/lib....]
BACKTRACE 31	[Py_Main] [/mnt/home/jlinford/0.55/build/Python-2.7.2/Modules/main.c:599] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/Python-2.7.2/lib/libpython2.7.so.1.0]
BACKTRACE 32	[pyMPI_Main_with_communicator] [(unknown):0] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/pyMPI-2.5b0/bin/pyMPI]
BACKTRACE 33	[main] [(unknown):0] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/pyMPI-2.5b0/bin/pyMPI]
BACKTRACE 34	[_libc_start_main] [(unknown):0] [/lib64/libc-2.5.so]
BACKTRACE 35	[_start] [(unknown):0] [/mnt/cfs/pkgs/PTOOLS/pkgs/ptoolsrte-0.55/packages/pyMPI-2.5b0/bin/pyMPI]

What Caused My Application to Crash?

```
TAU: ParaProf: Source Browser: /mnt/home/jlinford/py-c++-f90-create/SAMINT.C
File Help
65  /*
66  *****
67  *
68  * Take a timestep - advance solution from "time" to "time + dt"
69  *
70  *****
71  */
72  void SAMINT::timestep(const double time,
73                      const double dt)
74  {
75      cout << "SAMINT::timestep()" << endl;
76      timestep_(time,dt);
77      int x = 4 / (4-4);
78      cout << " x = "<<x<<endl;
79  }
80
81  /*
82  *****
83  *
84  * Write data to output
85  * (visit, fieldview, or overgrid - set in samarc input file)
86  *
87  *****
88  */
89  void SAMINT::writePlotData(const double time,
90                           const int step)
91  {
92      cout << "SAMINT::writePlotData()" << endl;
93  }
```



Python Performance Evaluation

HANDS-ON

ParaTools Training Cluster

```
ssh -XY livetau@cerberus.nic.uoregon.edu  
Password: ****
```

Pick a number **XX** from [1, 39]

```
cd studentXX  
tar xvzf ~/workshop-python.tgz
```

Training materials

- `~livetau/workshop-python.tgz`
- <https://github.com/jlinford/workshop-python>
- <http://www.paratools.com/emit15/TAU>

Getting Started with TAU

- Each configuration of TAU corresponds to a unique stub makefile (*TAU_MAKEFILE*) in the TAU installation directory

```
% ls $TAU/Makefile.*
```

```
Makefile.tau-icpc-papi-mpi-pdt
```

```
Makefile.tau-icpc-papi-ompt-mpi-pdt-openmp
```

```
Makefile.tau-icpc-papi-ompt-pdt-openmp
```

```
...
```

```
Makefile.tau-mpi-pthread-python-pdt
```

```
Makefile.tau-mpi-python-pdt
```

```
Makefile.tau-mpi-python-pdt-openmp
```

```
Makefile.tau-pthread-python-pdt
```

```
Makefile.tau-python-pdt
```

```
19 TAU Makefiles on cerberus.nic.uoregon.edu
```

Basic TAU Workflow

1. Choose your TAU_MAKEFILE:

```
$ export TAU_MAKEFILE=  
    $TAU/Makefile.tau-mpi-python-pdt
```

2. Use `tau_f90.sh`, `tau_cxx.sh`, etc. as compiler:

```
$ mpif90 foo.f90  
changes to  
$ tau_f90.sh foo.f90
```

3. Edit Makefile or set compilers on command line:

```
$ make CC=tau_cc.sh
```

4. Execute application

5. Analyze performance data:

`pprof` (for text based profile display)

`paraprof` (for GUI)

TAU with Pure Python

```
$ cd workshop-python/00_matmult.py  
$ python mm.py
```

Run with `tau_python` to generate profiles:

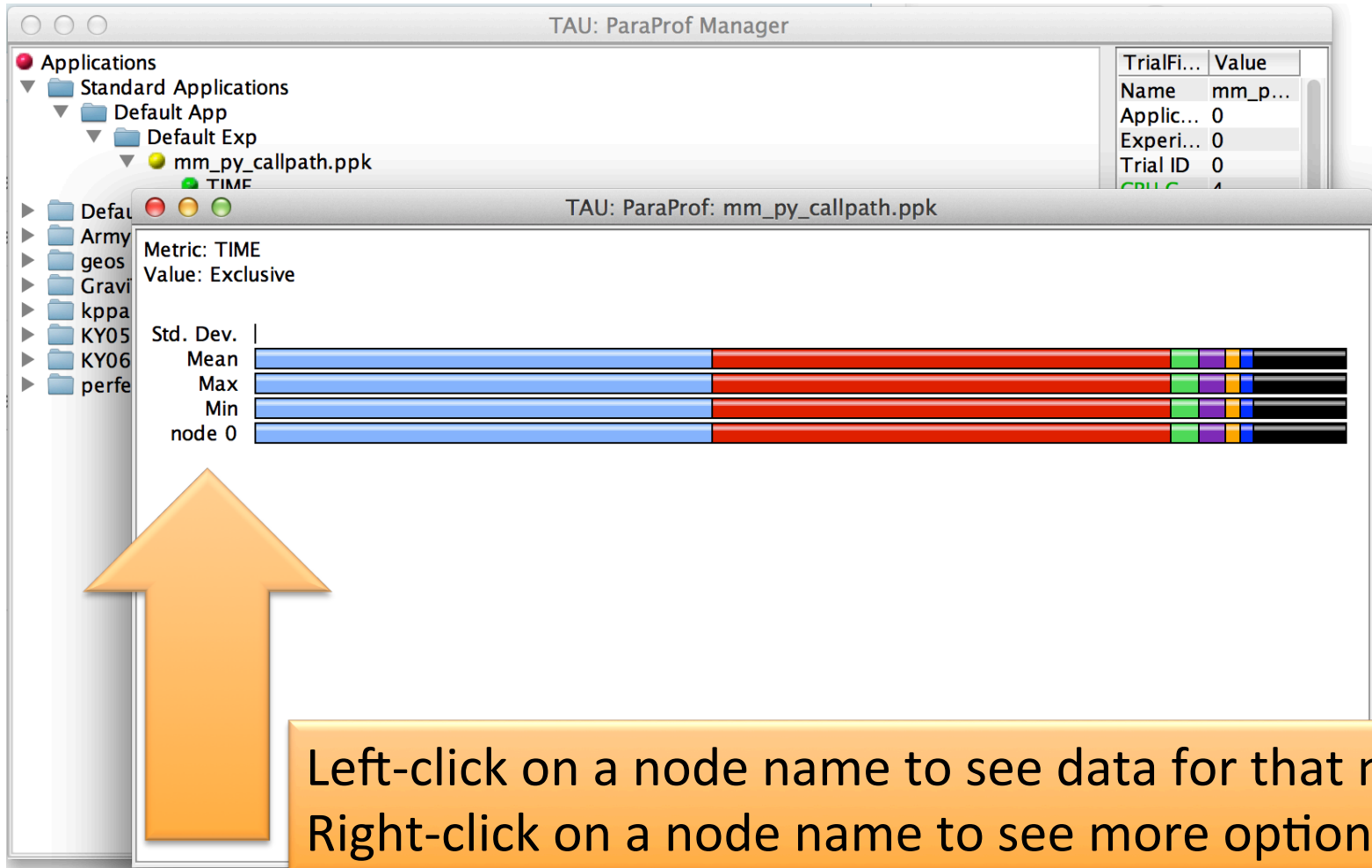
```
$ tau_python mm.py  
$ ls profile.* # shows profile.0.0.0  
$ paraprof --pack mm_py_flat.ppk
```

View the profiles:

```
$ pprof -a | less #Command line  
$ paraprof #GUI (Java, X11)
```

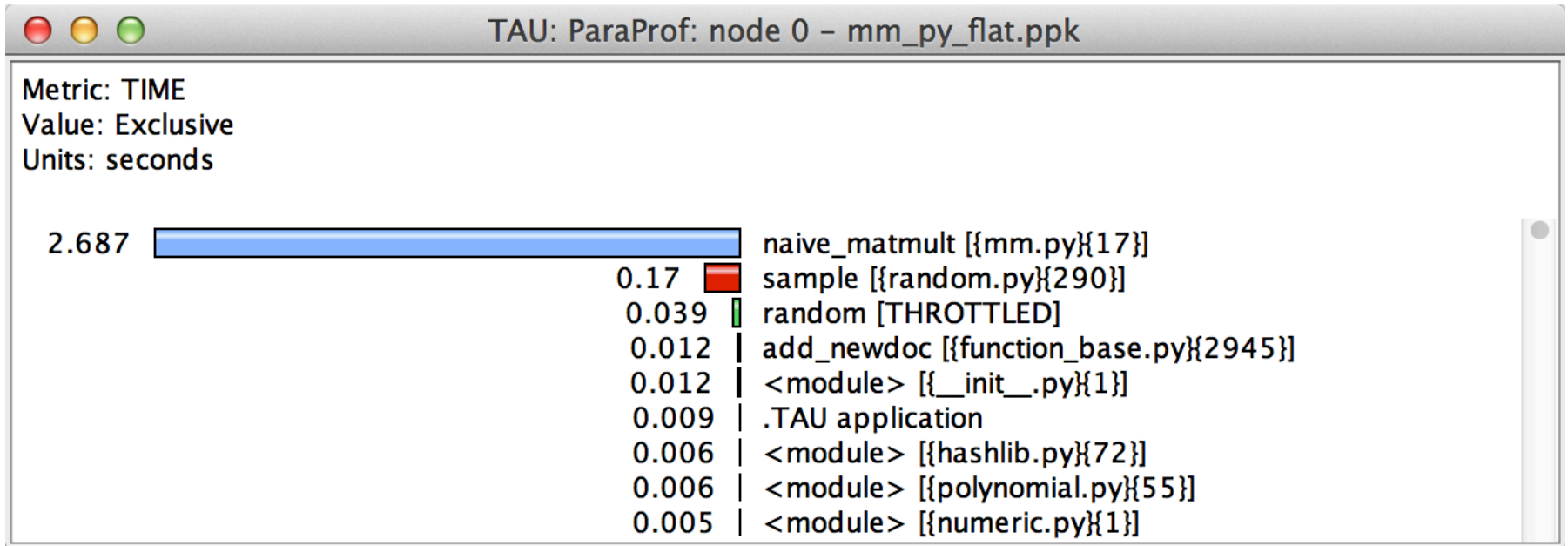
ParaProf Profile Visualizer

```
$ paraprof 00_matmult.py/analysis/mm_py_flat.ppk
```



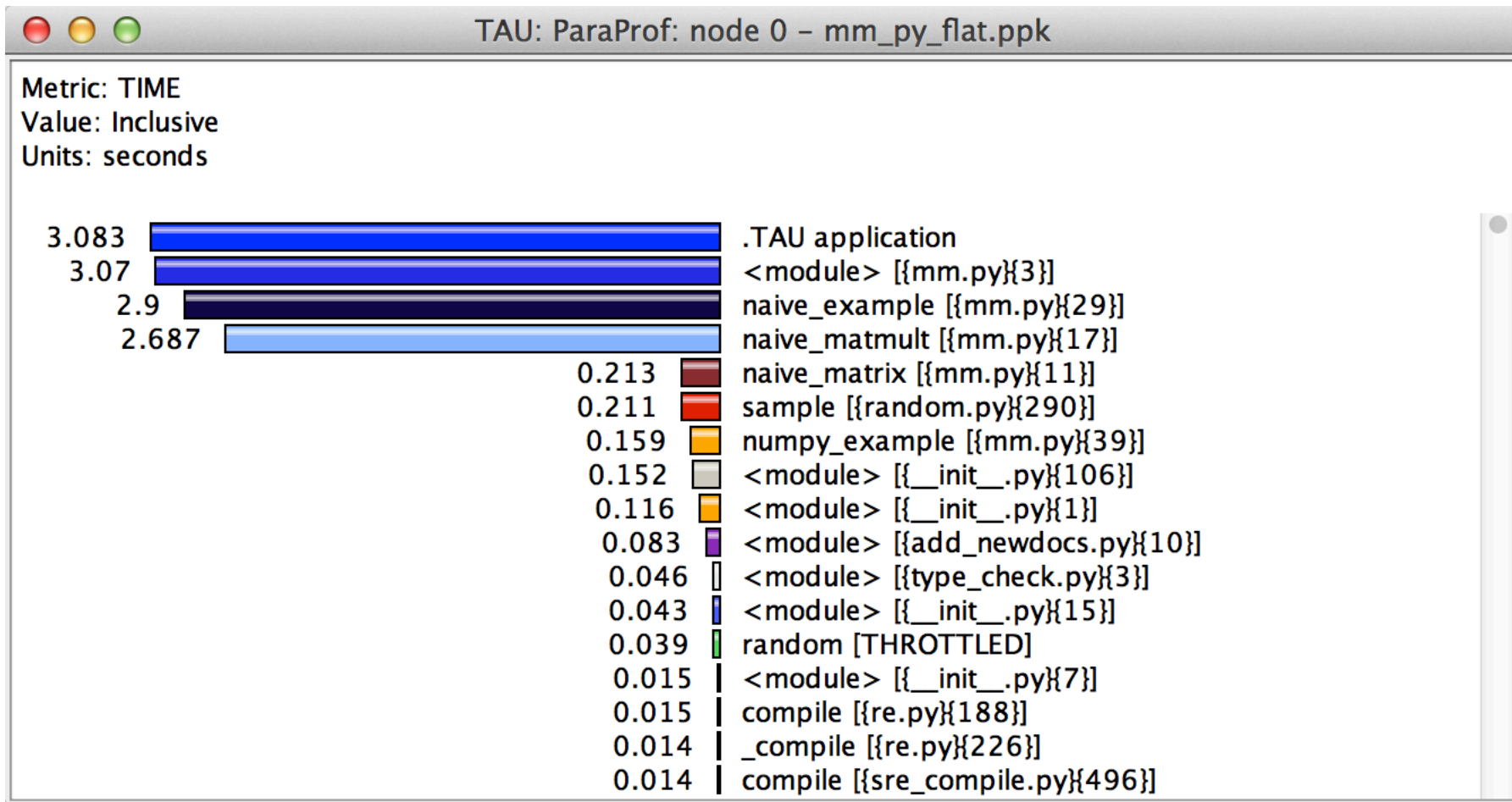
Left-click on a node name to see data for that node
Right-click on a node name to see more options

Exclusive Time in ParaProf



```
$ paraprof 00_matmult.py/analysis/mm_py_flat.ppk
```

Inclusive Time in ParaProf



Callpath Profiles with Pure Python

For callpath profiles:

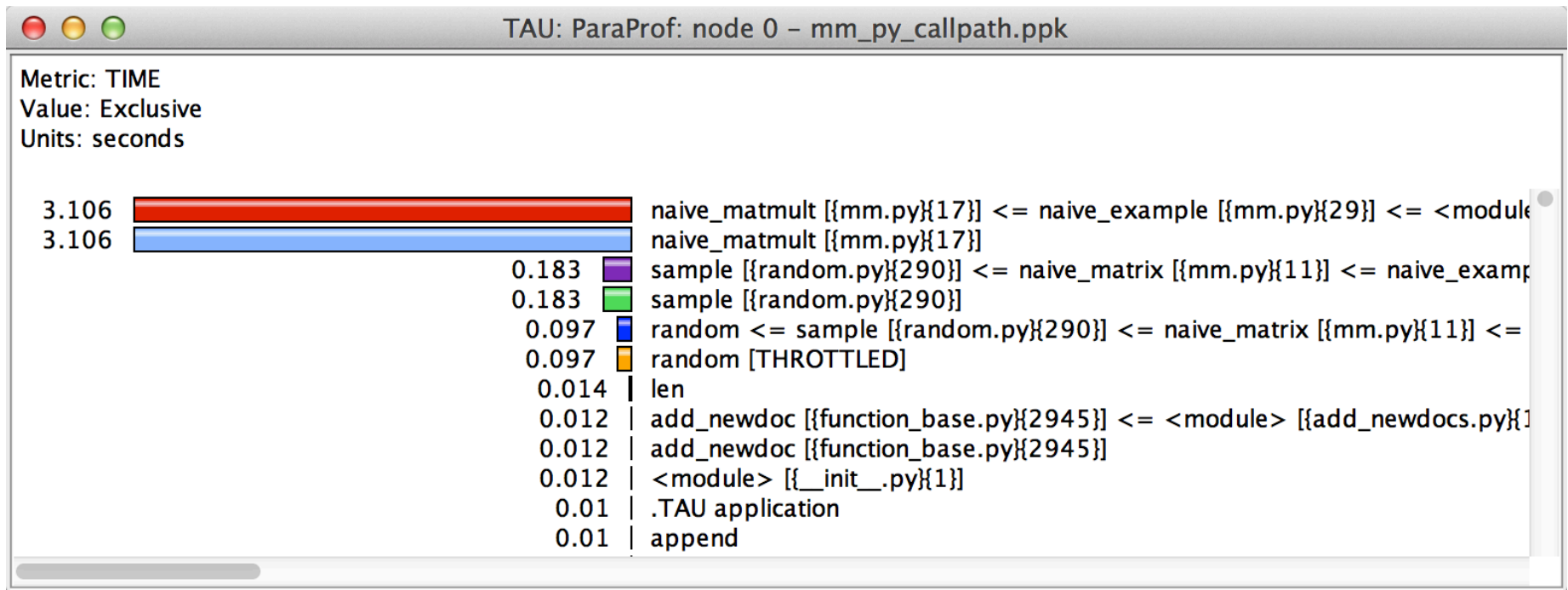
```
$ export TAU_CALLPATH=1
```

```
$ export TAU_CALLPATH_DEPTH=10
```

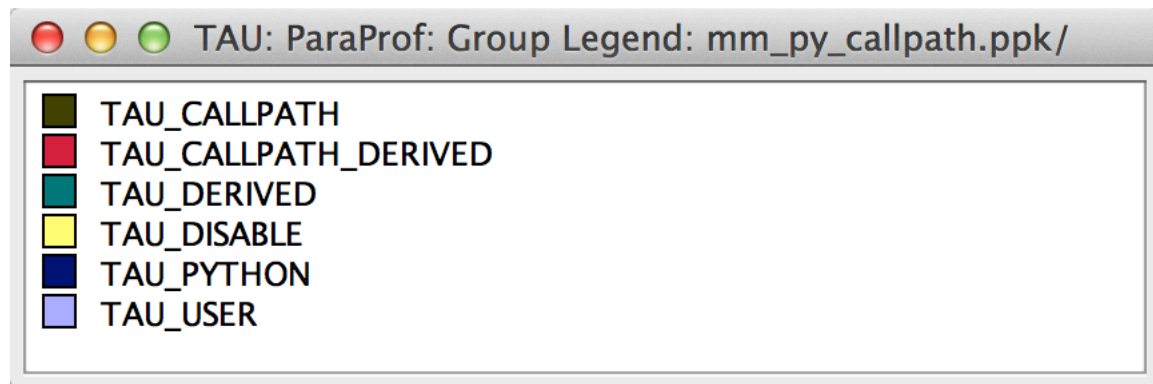
```
$ tau_python mm.py
```

TAU_CALLPATH_DEPTH controls the depth of the recorded callpath. “10” is usually more than enough.

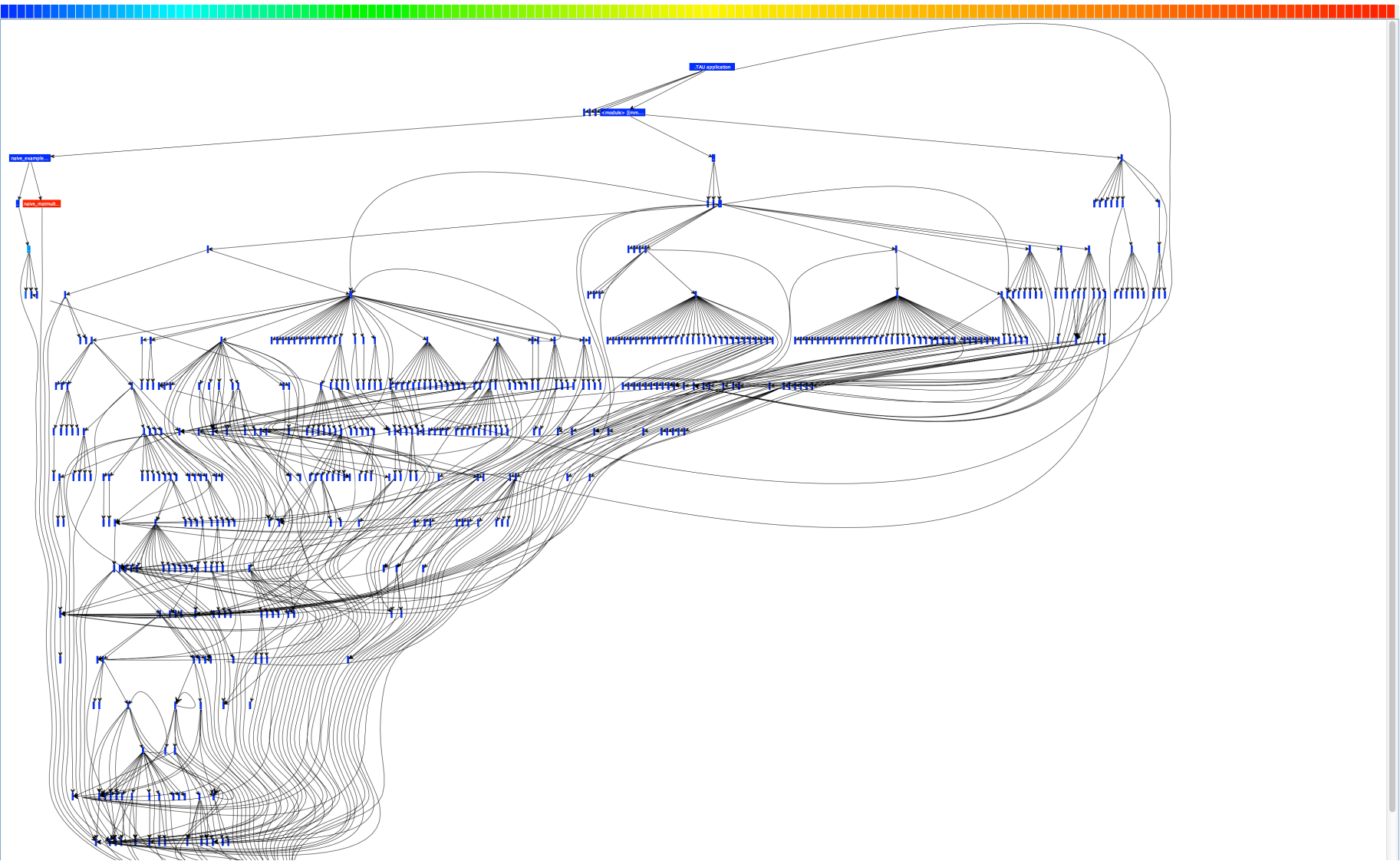
Callpath Profiles in ParaProf



Windows | Group Legend →
Right-click to hide groups



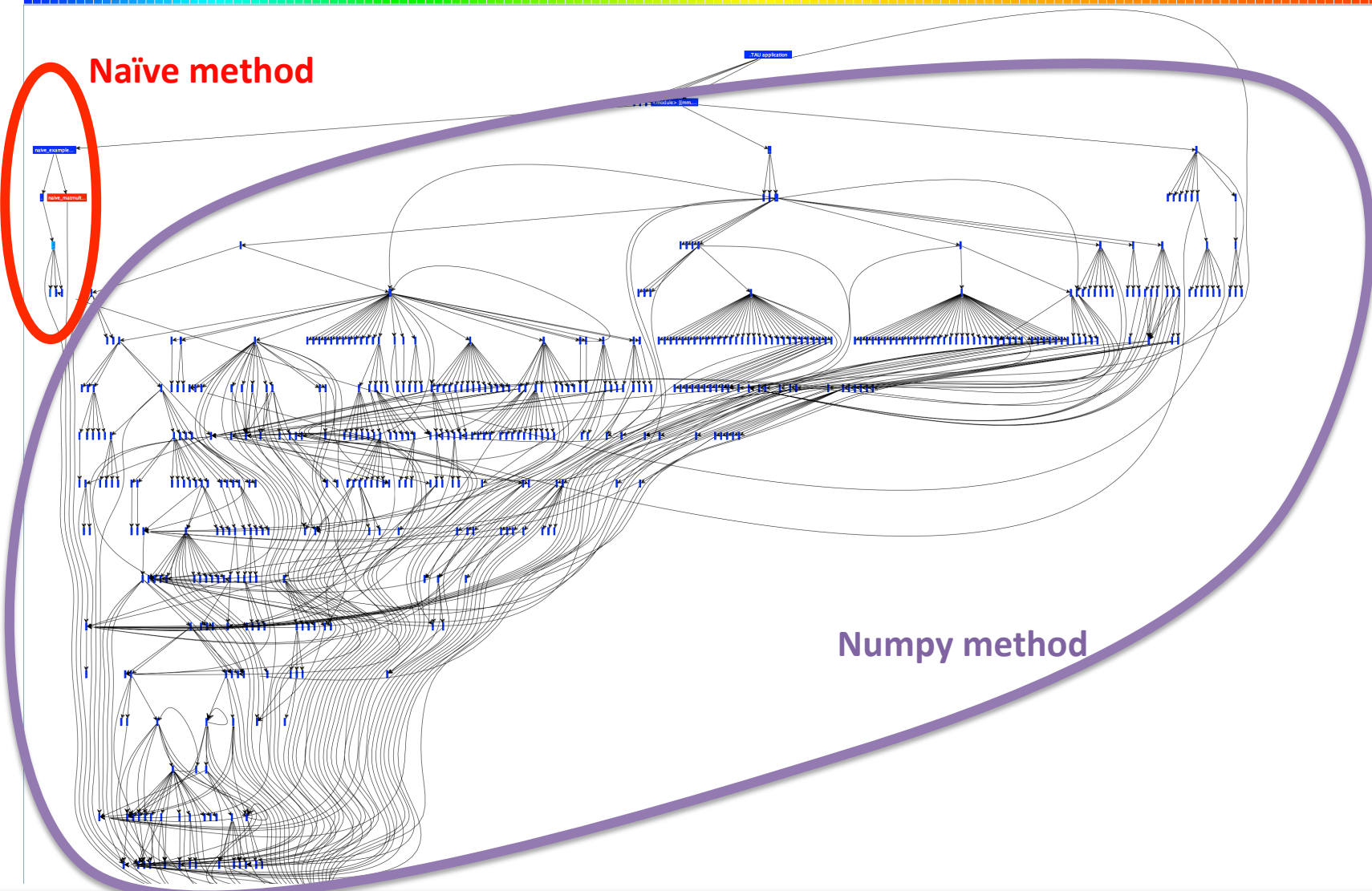
Callgraph in ParaProf



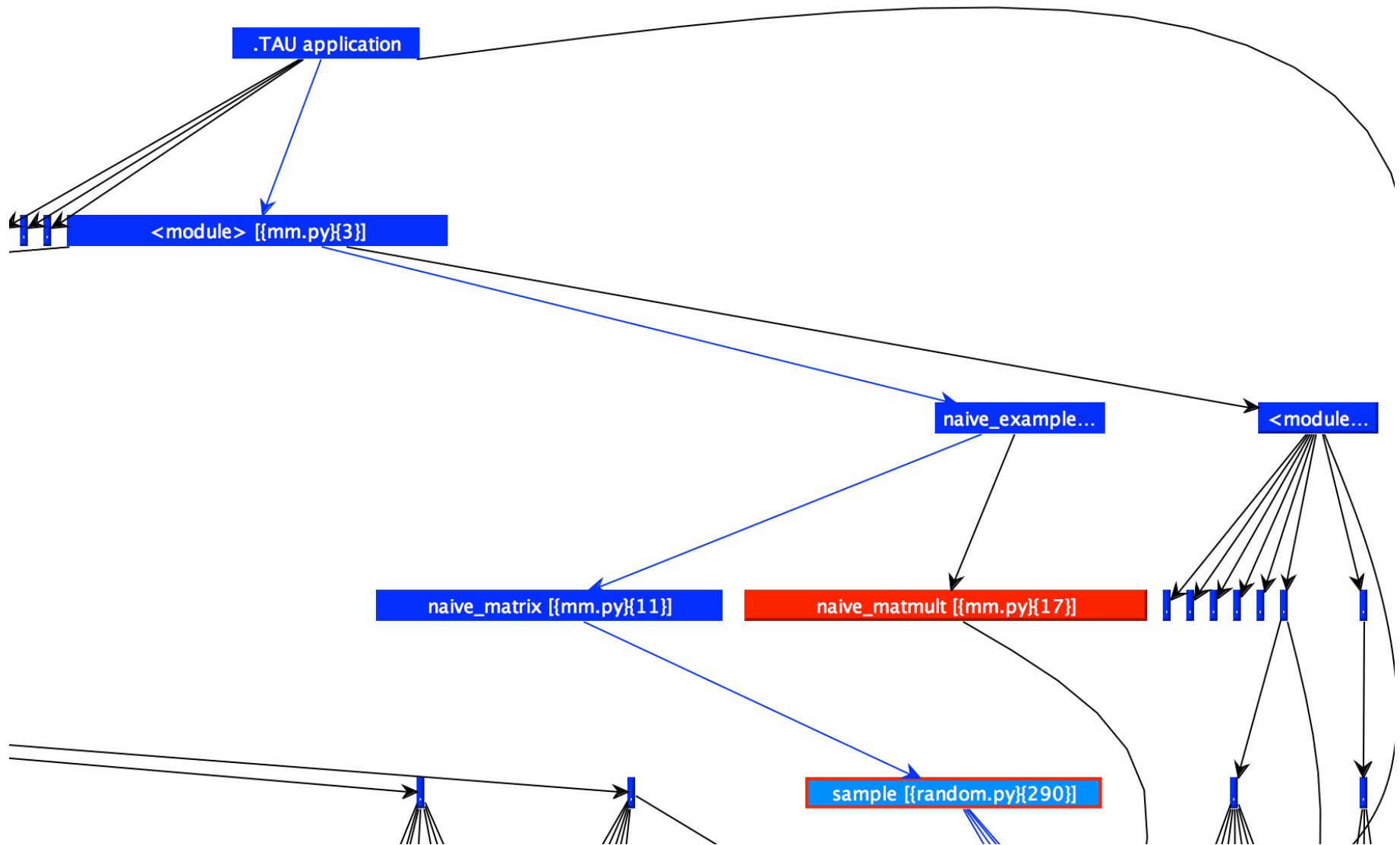
Callgraph in ParaProf

Naïve method

Numpy method



Callgraph in ParaProf



Traces with Pure Python

To generate traces:

```
$ unset TAU_CALLPATH      #recommended
$ export TAU_TRACE=1
$ tau_python mm.py
```

Trace files must be post-processed:

```
$ tau_treemerge.pl
$ tau2slog2 tau.trc tau.edf -o \
    mm_py.slog2
$ jumpshot mm_py.slog2
```

Jumpshot Trace Viewer

Legend : mm_py.slog2

Preview_State	Name	✓	✓
	TAU application	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<genexpr> [[abc.py]{89}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<genexpr> [[collections.py]{323}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<genexpr> [[collections.py]{347}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<genexpr> [[collections.py]{349}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<lambda> [[_inspect.py]{161}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<lambda> [[_inspect.py]{162}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<lambda> [[_inspect.py]{163}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[StringIO.py]{30}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_config_.py]{3}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{106}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{10}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{15}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{1}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{38}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{3}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{44}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{45}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{4}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{7}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_init_.py]{88}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[datasource.py]{333}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_endian.py]{4}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>
	<module> [[_import_tools.py]{1}]	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>

All

TimeLine : mm_py.slog2 <Identity Map>

Lowest / Max. Depth: 3 / 6

Zoom Level	Global Min Time	View Init Time	Zoom Focus Time	View Final Time	Global Max Time	Time Per Pixel
0	0.00	0.00	1.766655	3.53331	3.53331	0.004907375

Cumulati...

Time (seconds)

@ LineID

Row Count 1.0

Fit All f

Public Service Announcement

Don't forget to clean your environment!

(Some folks write scripts)

Show all TAU environment variables:

```
$ env | grep TAU
```

Unset the ones you don't need anymore:

```
$ unset TAU_TRACE
```

```
$ unset TAU_CALLPATH
```

etc.

Python Performance Evaluation

HANDS-ON: NATIVE LANGUAGES

TAU with C/C++

```
$ cd workshop-python/01_matmult.c  
$ make CC=tau_cc.sh
```

Run normally to generate profiles:

```
$ mpirun -np 4 ./matmult  
$ ls profile.* # Shows four files  
$ paraprof --pack mm_c_flat.ppk
```

View the profiles:

```
pprof -a | less #Command line  
paraprof #GUI (Java, X11)
```

TAU with Fortran

```
$ cd workshop-python/02_matmult.f90
$ make
```

Run normally to generate profiles:

```
$ mpirun -np 4 ./matmult
$ ls profile.*          # Shows four files
$ paraprof --pack mm_f90_flat.ppk
```

View the profiles:

```
pprof -a | less          #Command line
paraprof                 #GUI (Java, X11)
```

Python Performance Evaluation

HANDS-ON: PYTHON+MPI (MPI4PY)

FIXEDGRID

A simple chemical transport model in Python

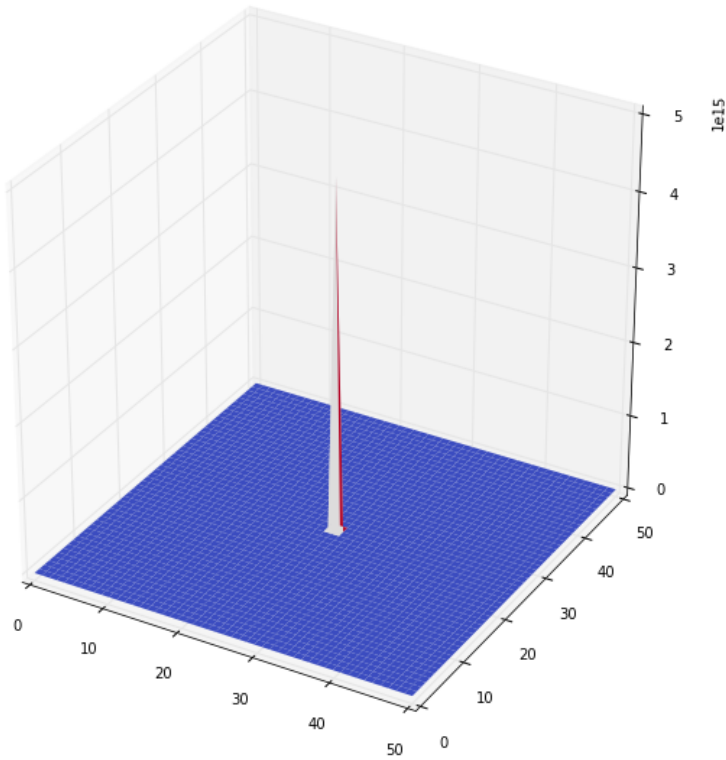
$$\frac{\partial \mathbf{c}_x^t}{\partial t} = \sum_{k=1}^d \left[\frac{\partial}{\partial x_k} \left(d_k(x, t) \frac{\partial \mathbf{c}_x^t}{\partial x_k} - a_k(x, t) \mathbf{c}_x^t \right) \right] + F$$

Advection: Upwind-biased 2nd order finite differences

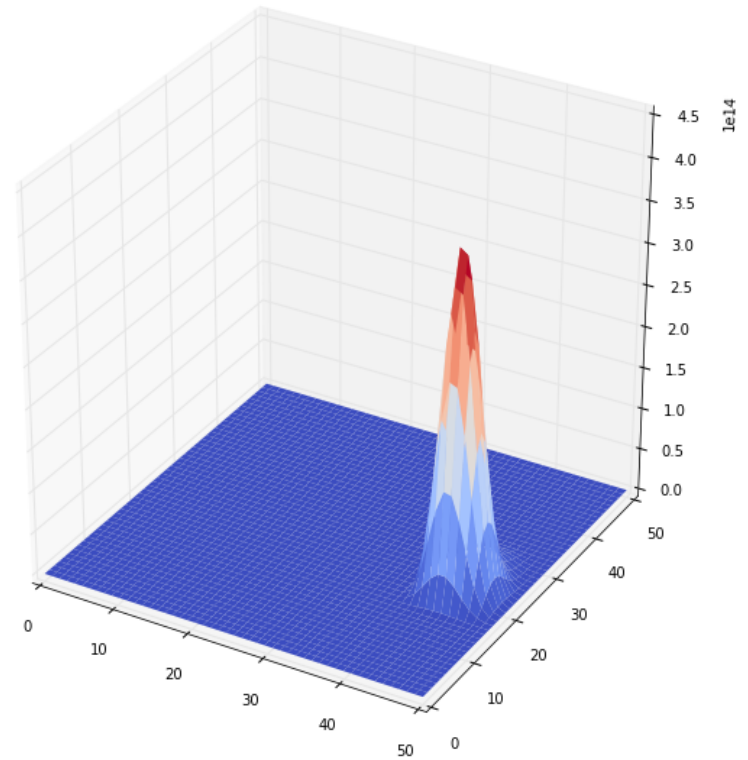
Diffusion: 3rd order finite differences

Chemistry: Rosenbrock time-stepping integrator

FIXEDGRID

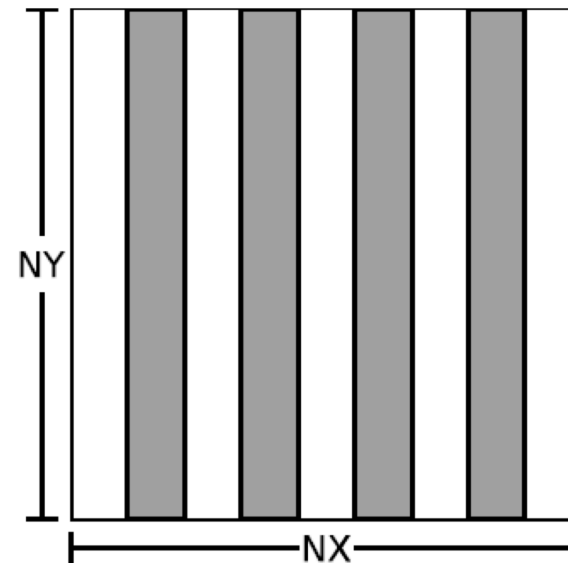
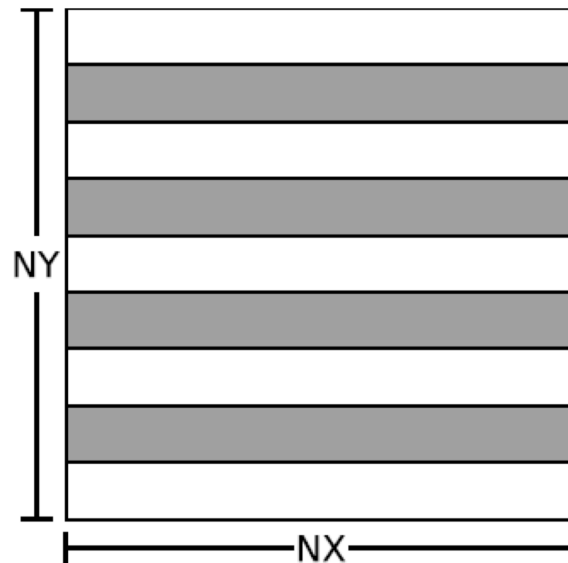
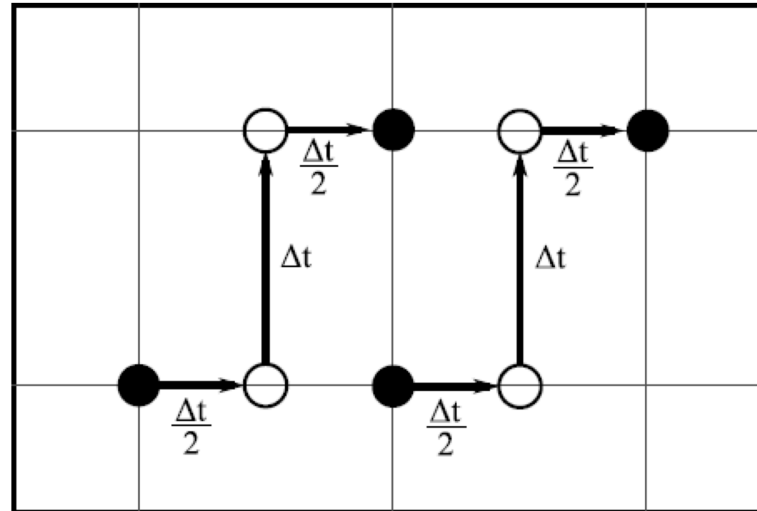


TIME = 0

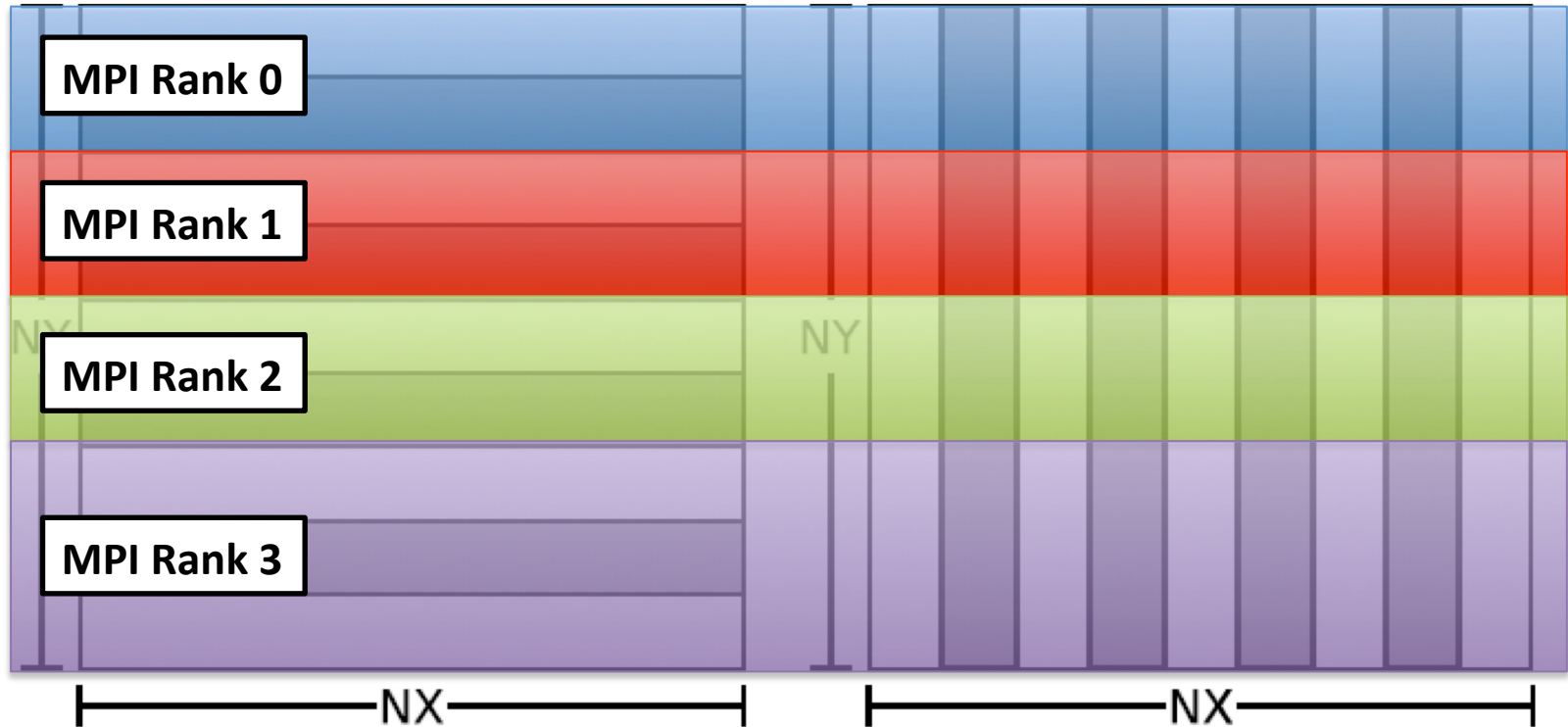


TIME = 900 seconds

2nd Order Dimension Split in FIXEDGRID



MPI in FIXEDGRID



TAU with mpi4py

```
$ cd 04_fixedgrid-mpi.py
```

```
$ mpirun -np 4 python fixedgrid.py
```

Run with `tau_exec` and `wrapper.py` to generate profiles:

```
$ mpirun -np 4 tau_exec -T python,mpi \  
python wrapper.py
```

View the profiles:

```
pprof -a | less
```

#Command line

```
paraprof
```

#GUI (Java, X11)

Multiple Layers of Instrumentation

```
$ mpirun -np 4 \  
    tau_exec -T python,mpi \  
    python wrapper.py
```

a.k.a

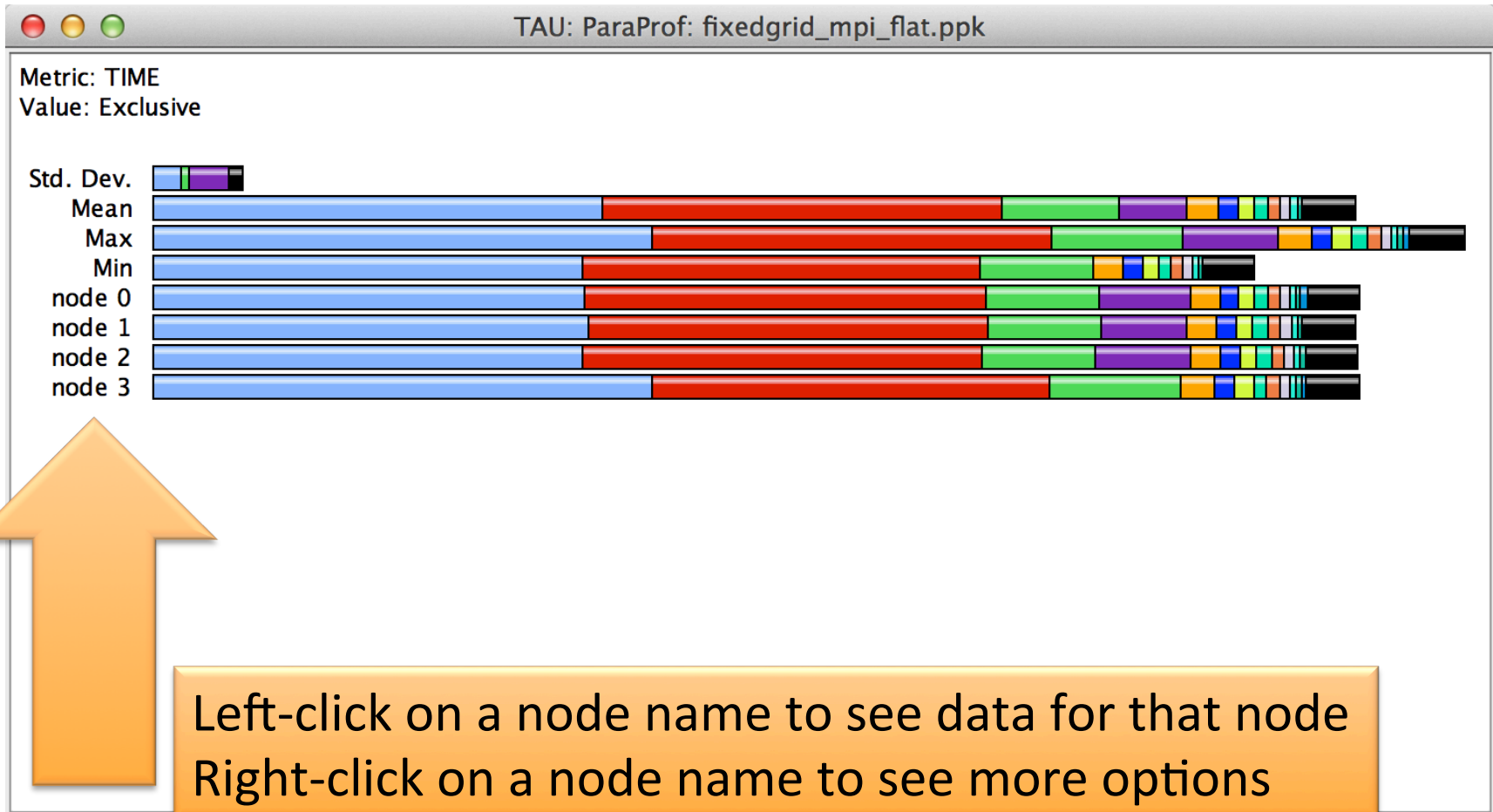
```
$ “Run my code” \  
    “Use TAU to measure MPI” \  
    “Within that TAU instance, instrument python”
```

wrapper.py for Python Instrumentation

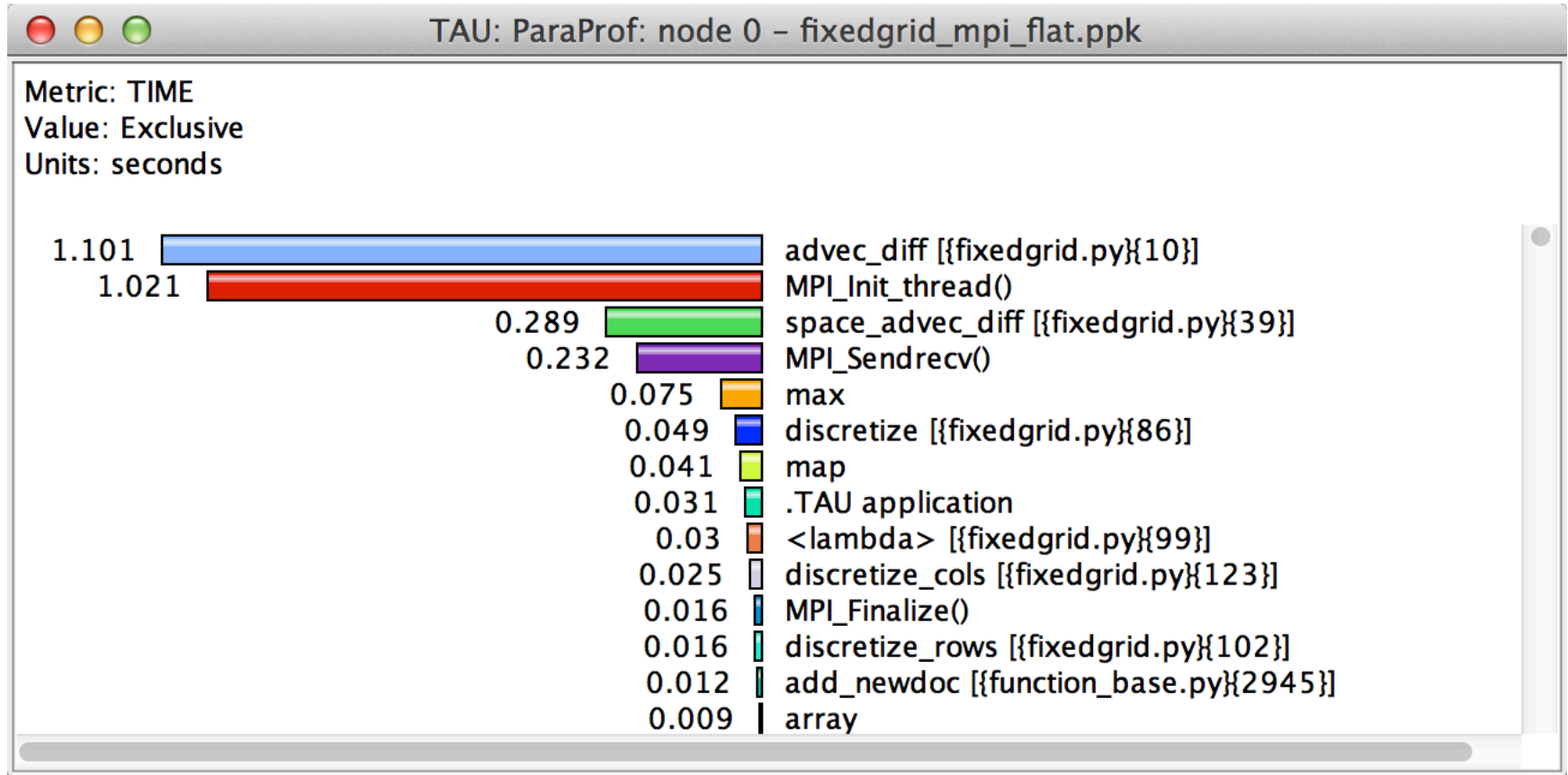
```
$ cat wrapper.py
import tau
tau.run('import fixedgrid')
```

This approach works for many Python packages,
not just mpi4py

FIXEDGRID Profile



FIXEDGRID Profile

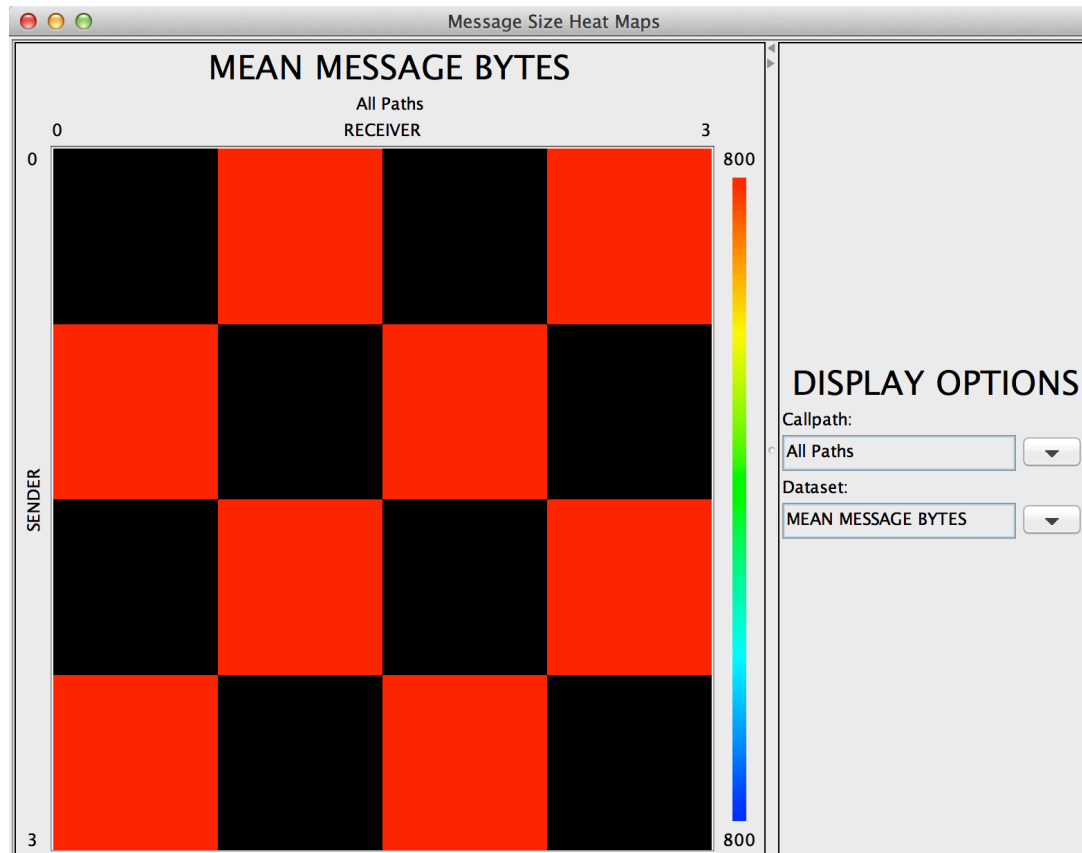


FIXEDGRID Communication Matrix

```
$ export TAU_COMM_MATRIX=1
```

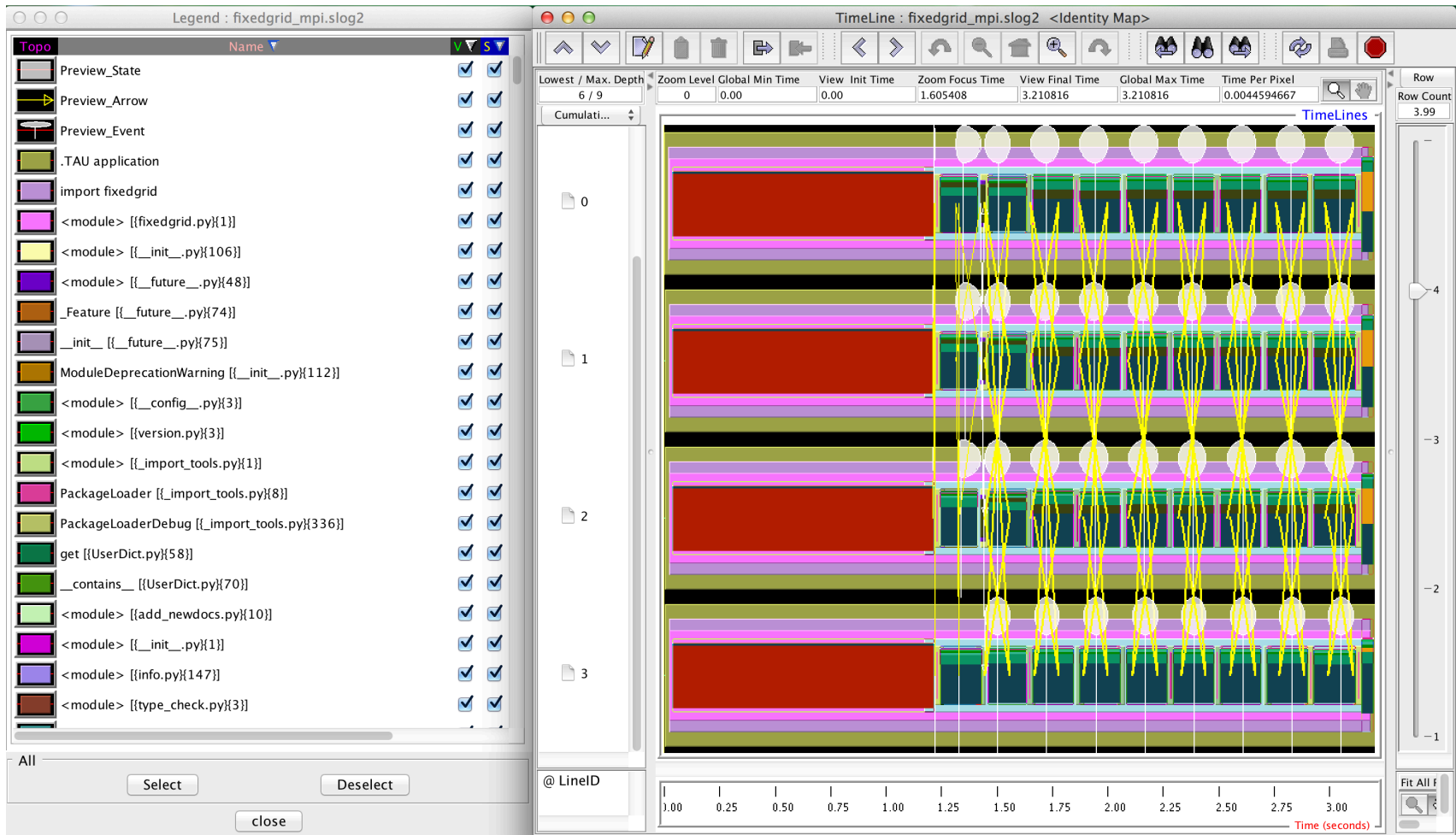
```
$ mpirun -np 4 tau_exec -T python,mpi python wrapper.py
```

In Paraprof: **Windows | Communication Matrix**



FIXEDGRID Trace Shows Communication

```
$ jumpshot fixedgrid_mpi.slog2
```

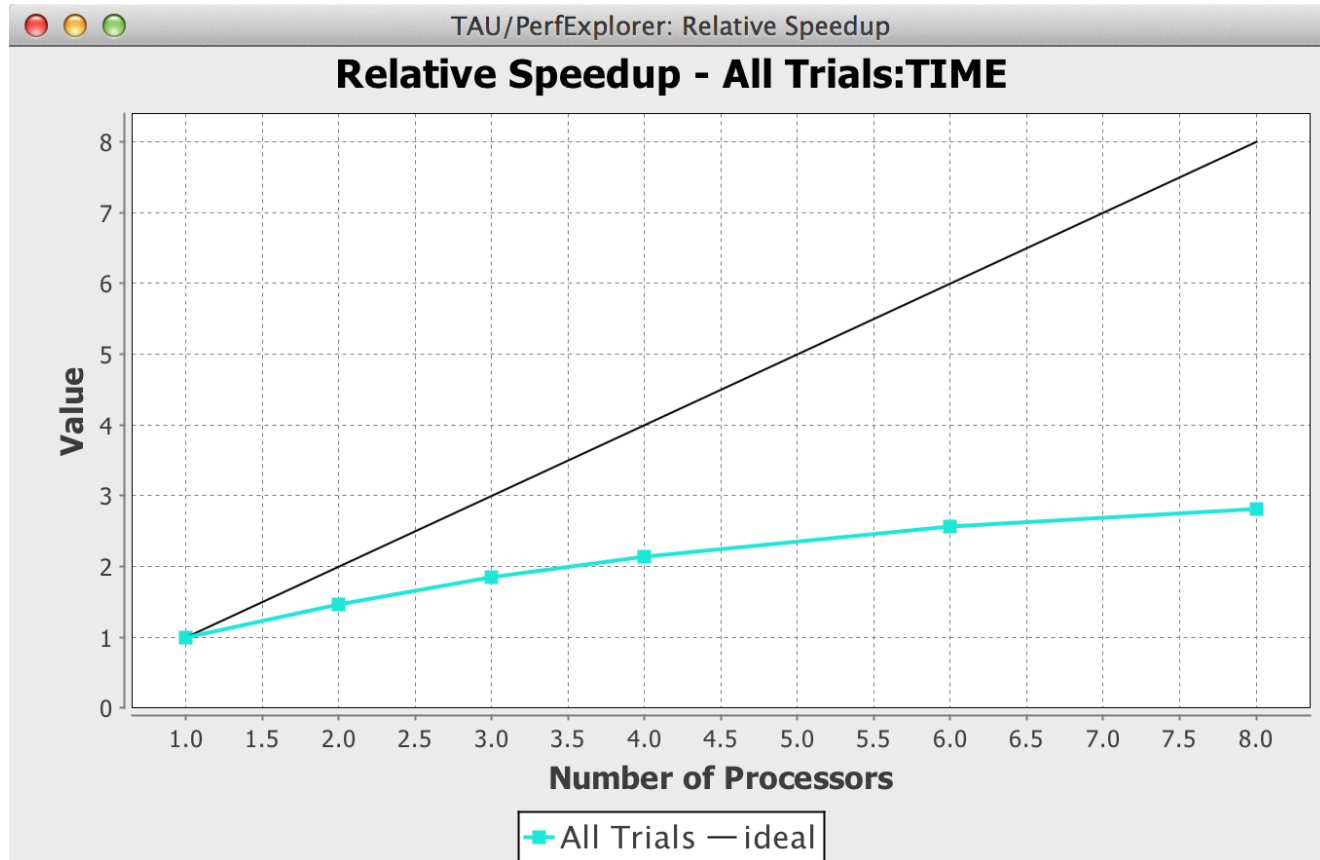


PerfExplorer

```
$ cd 04_fixedgrid-mpi.py/analysis
$ taudb_configure --create-default
$ taudb_loadtrial fixedgrid_np1.ppk
$ taudb_loadtrial fixedgrid_np2.ppk
$ taudb_loadtrial fixedgrid_np3.ppk
...
$ perfexplorer
```

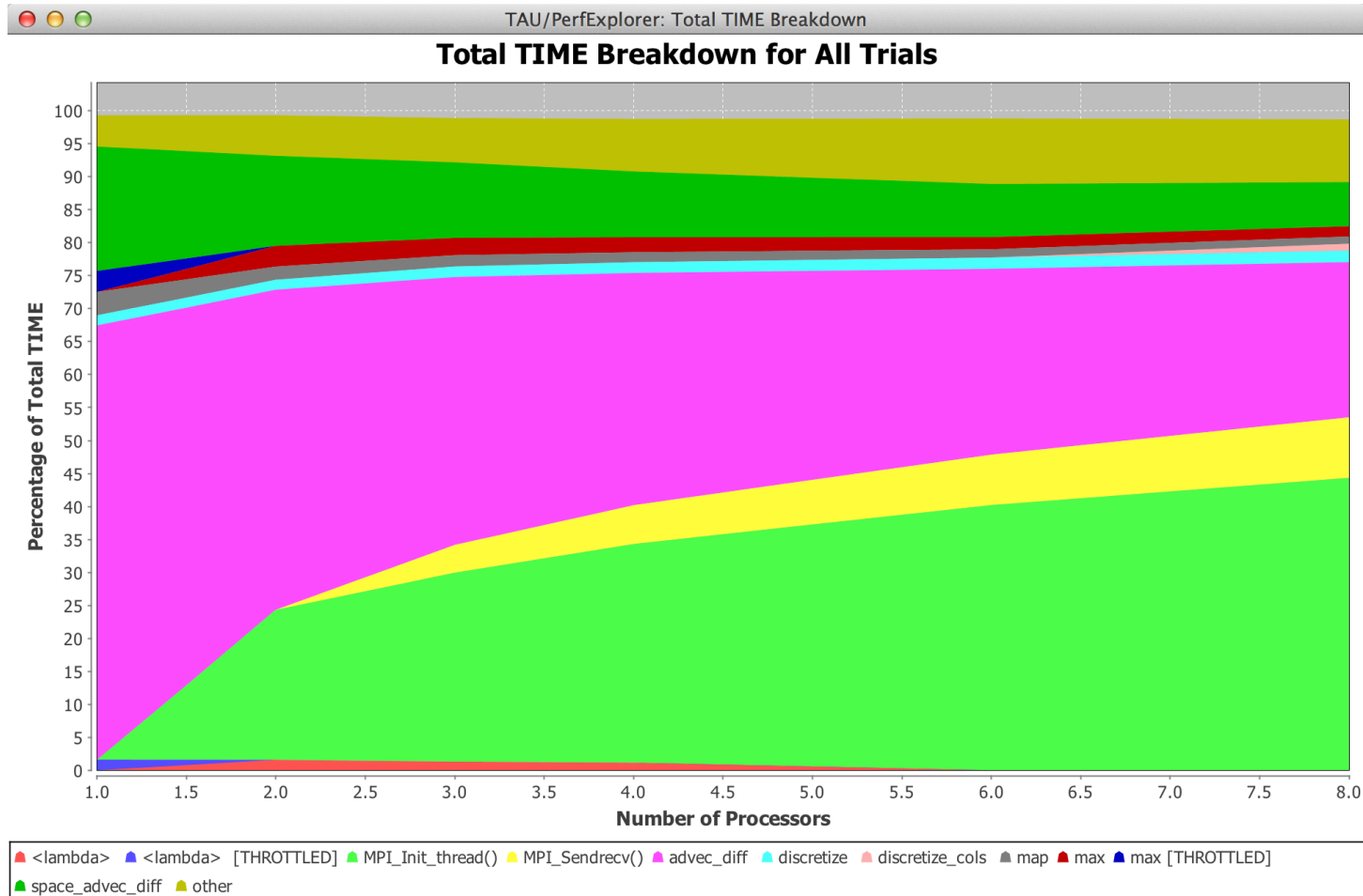
Relative Speedup Chart

- In PerfExplorer: **Charts | Relative Speedup**



Runtime Breakdown Chart

- In PerfExplorer: Charts | Runtime Breakdown

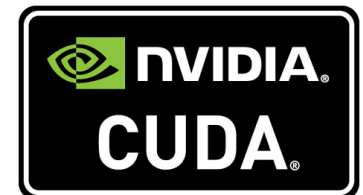
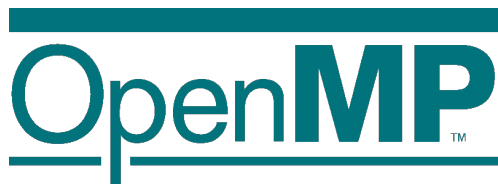
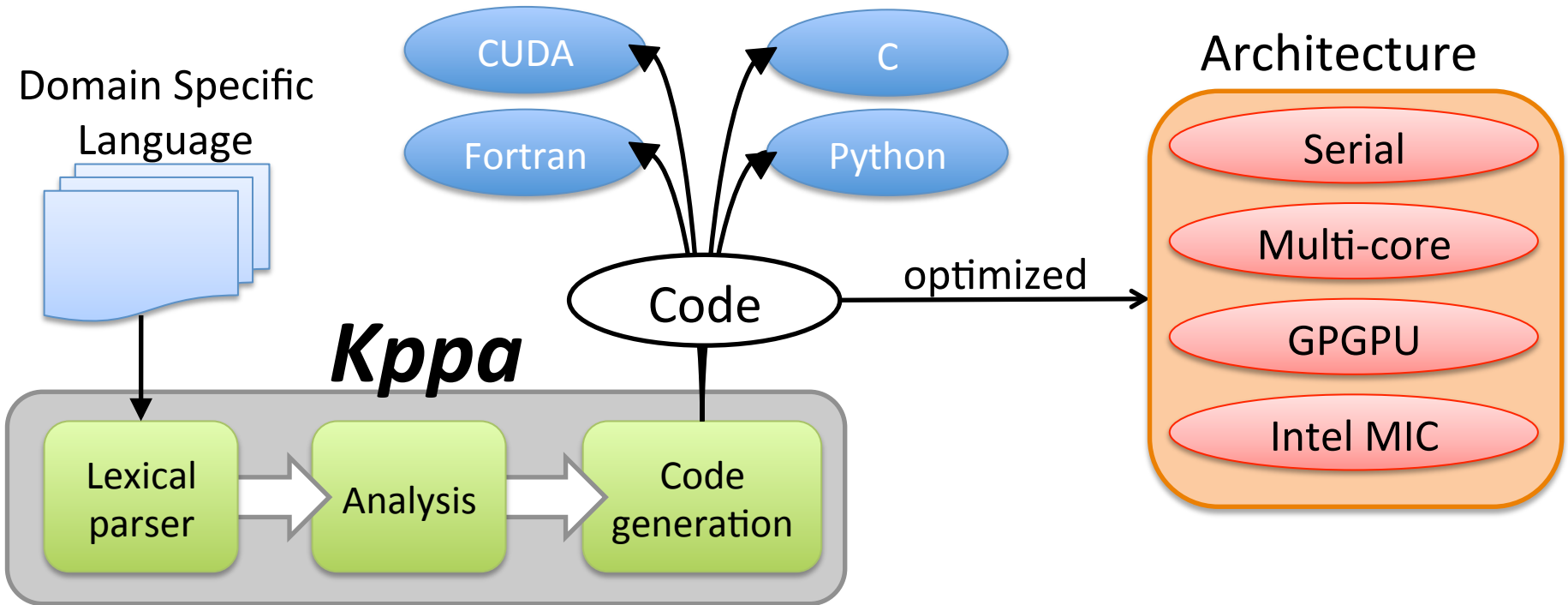


Python Performance Evaluation

HANDS-ON: PYTHON+X

(BECAUSE WE CAN)

Kppa: The Kinetic PreProcessor Accelerated



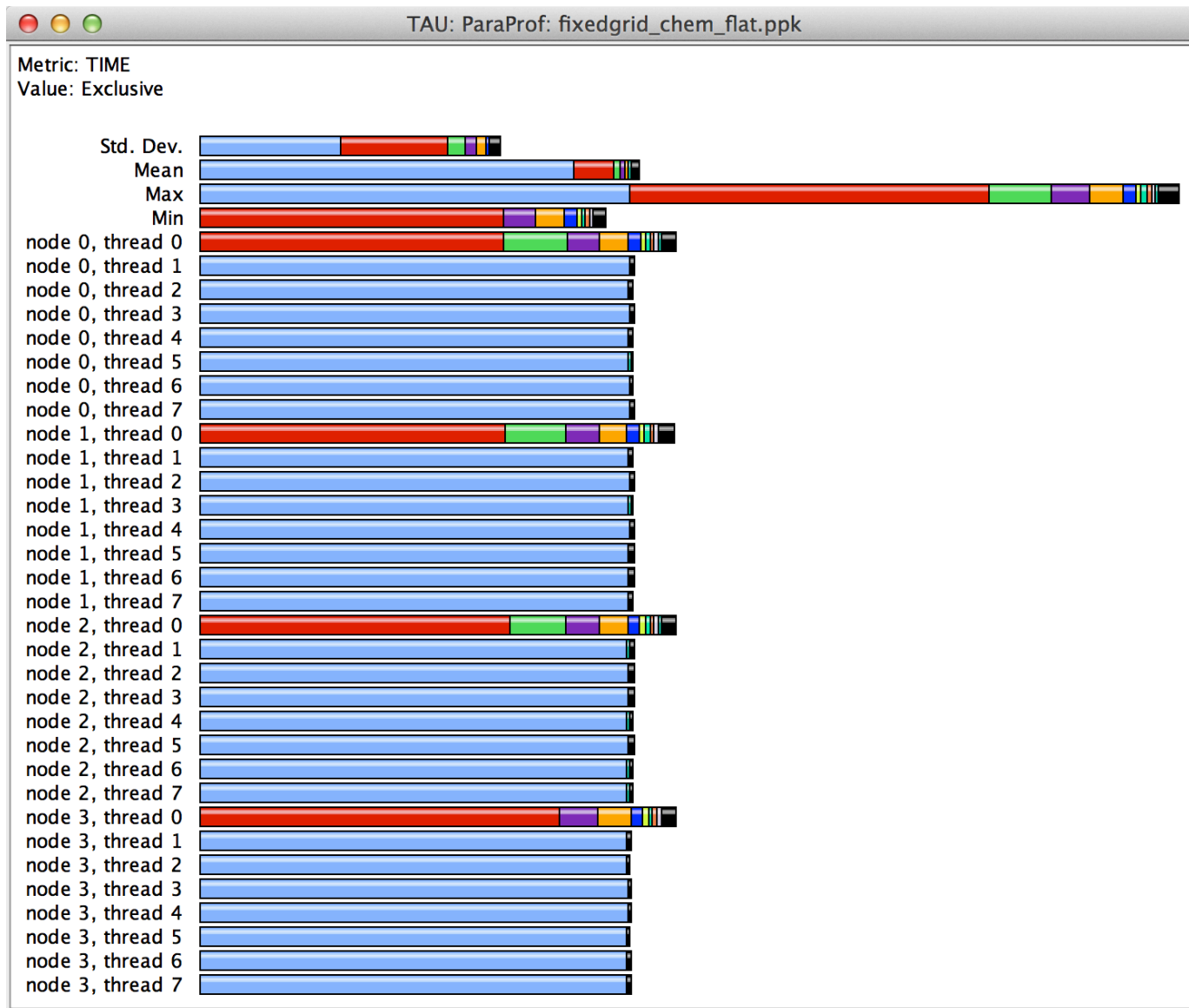
TAU + Python + mpi4py + C + OpenMP

```
$ cd 05_fixedgrid-chem.c_py
$ make
$ mpirun -np 4 python fixedgrid.py
```

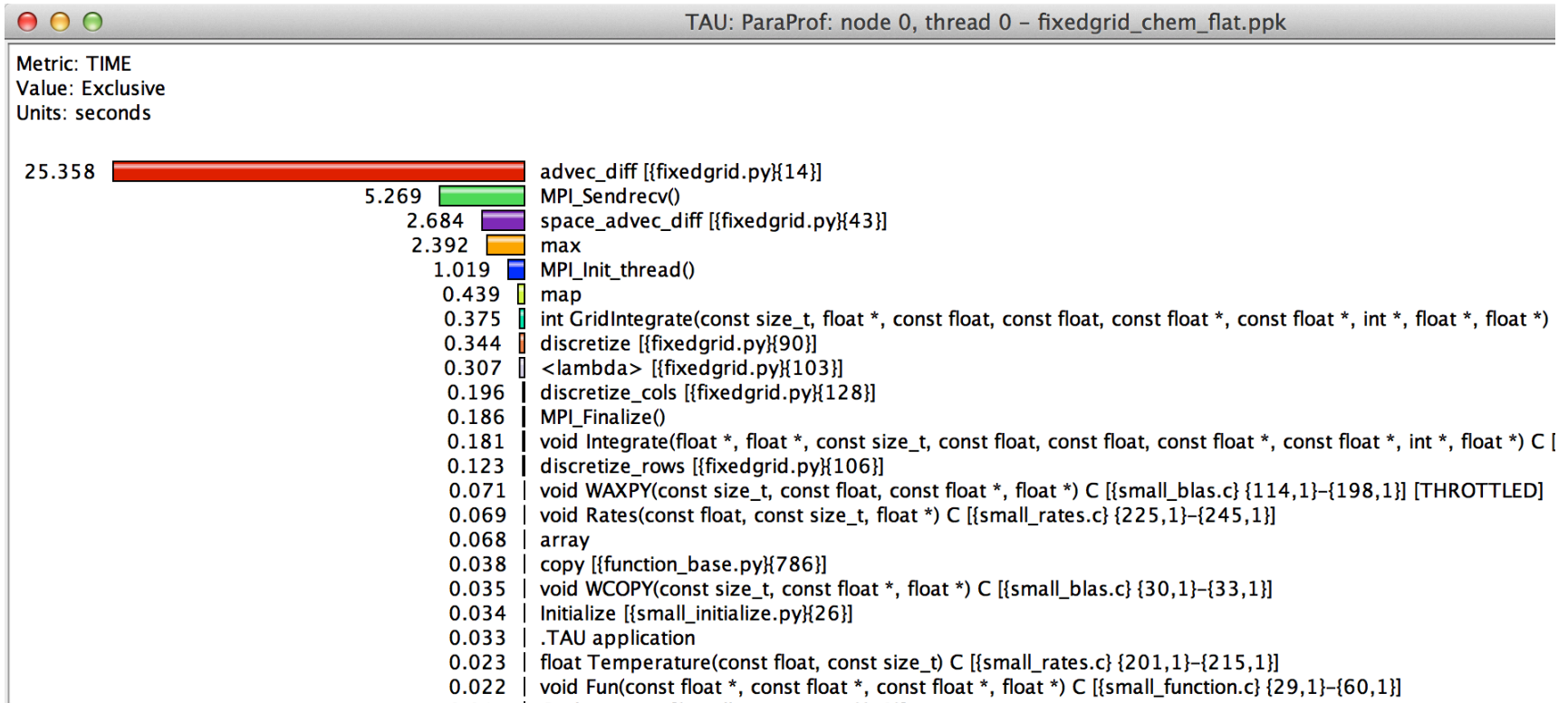
Run with `tau_exec` and `wrapper.py` to generate profiles:

```
$ make clean
$ make CC=tau_cc.sh
$ mpirun -np 4 tau_exec -T python,mpi,openmp \
    python wrapper.py
```

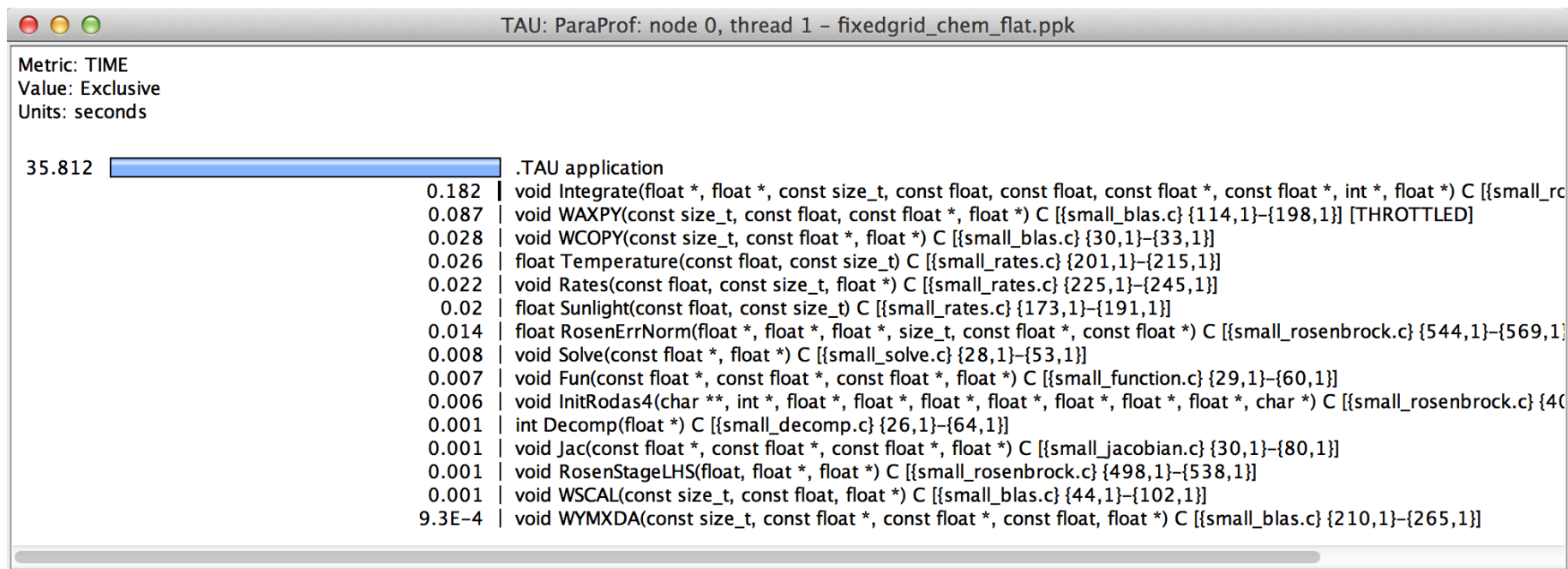
MPI + OpenMP Profiles



Rank 0, Thread 0



Rank 0, Thread 1



Python Performance Evaluation

HANDS-ON: DEBUGGING

TAU + Python + mpi4py + C + OpenMP

```
$ cd 06_debugging
```

```
$ make
```

```
$ tau_python samarcrun.py
```

TAU: Caught signal 8 (Floating point exception), ...

To see stack trace on command line:

```
$ paraprof -d | grep BACKTRACE
```

Backtrace Shown in ParaProf

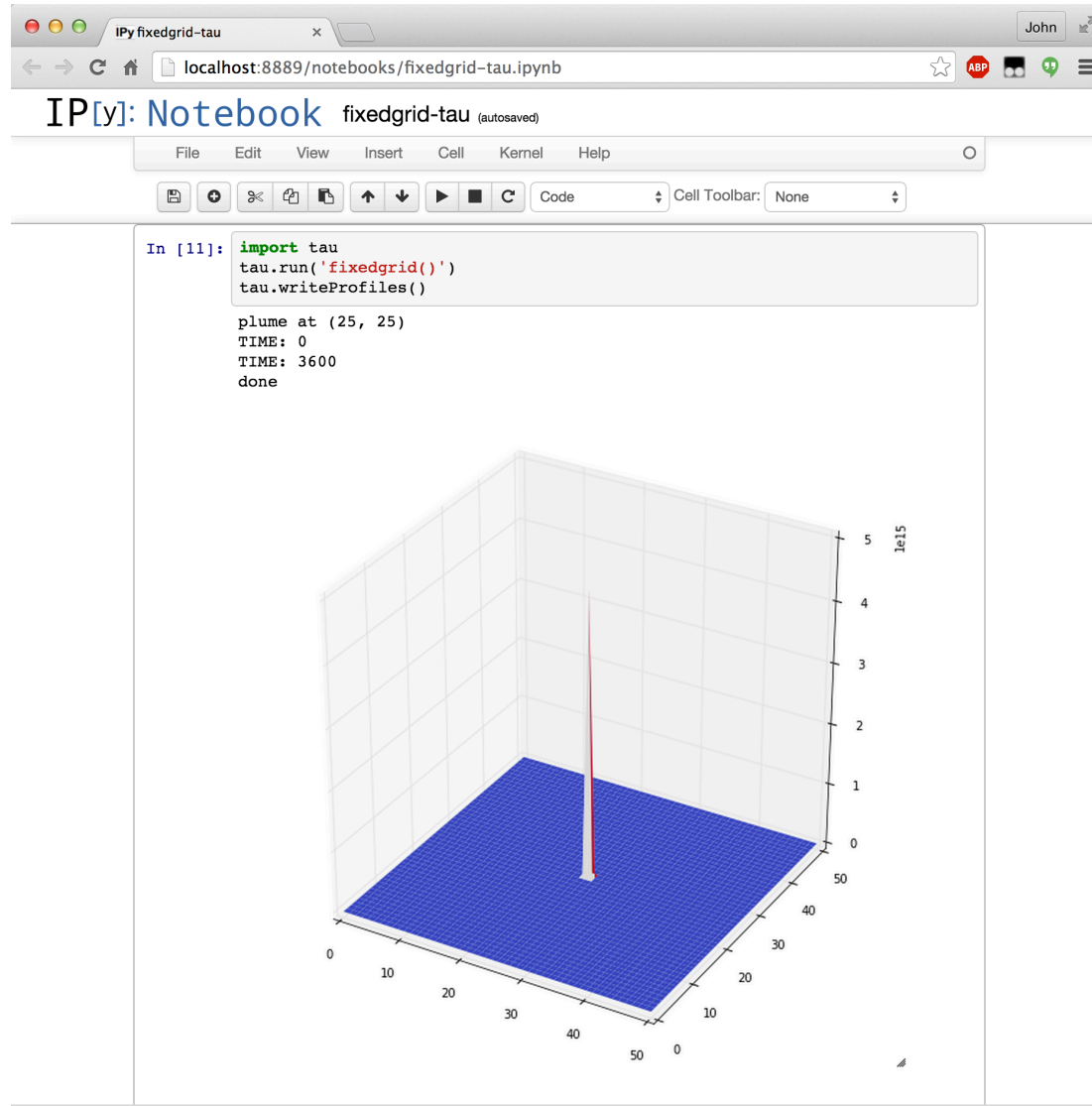
The screenshot shows the ParaProf Manager interface. On the left is a file tree under 'Applications' with '06_debugging/workshop-python/Downl' selected. The main area displays a table with 'TrialField' and 'Value' columns. The backtrace consists of 20 frames, each starting with 'BACKTRACE(1)'. The final frame is the command line: 'python /usr/local/packages/tau/x86_64/bin/tau_python samarcrun.py'. Below the backtrace, system information is listed, including CPU Cores (4), CPU MHz (1200.234), CPU Type (Intel(R) Xeon(R) CPU E5-2603 v2 @ 1.80GHz), CPU Vendor (GenuineIntel), CWD (/wopr/users/livetau/jlinford/workshop-python/06_debugging), Cache Size (10240 KB), and Command Line.

TrialField	Value
Name	06_debugging/workshop-python/Downloads/jlinford/Users/
Application ID	0
Experiment ID	0
Trial ID	0
BACKTRACE(1) 1	[SAMINT::timestep(double, double)] [/home/users/livetau/jlinford/workshop-python/06_...
BACKTRACE(1) 2	[samarcStep(double, double)] [/home/users/livetau/jlinford/workshop-python/06_debu...
BACKTRACE(1) 3	[_wrap_samarcStep] [/home/users/livetau/jlinford/workshop-python/06_debugging/sam...
BACKTRACE(1) 4	[addr=<0x2abcca0aab6c>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 5	[addr=<0x2abcca0aa980>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 6	[addr=<0x2abcca0ac1dd>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 7	[addr=<0x2abcca0ac2e2>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 8	[addr=<0x2abcca0ab530>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 9	[addr=<0x2abcca0ac1dd>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 10	[addr=<0x2abcca0aa88f>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 11	[addr=<0x2abcca0ac1dd>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 12	[addr=<0x2abcca0aa88f>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 13	[addr=<0x2abcca0ac1dd>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 14	[addr=<0x2abcca0ac2e2>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 15	[addr=<0x2abcca0c571f>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 16	[addr=<0x2abcca0c68de>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 17	[addr=<0x2abcca0c7b69>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 18	[addr=<0x2abcca0d8b7f>] [(unknown):0] [/usr/lib64/libpython2.7.so.1.0]
BACKTRACE(1) 19	[addr=<2abccacdcd65>] [/usr/lib64/libc-2.18.so:0] [/usr/lib64/libc-2.18.so]
BACKTRACE(1) 20	[addr=<0x400721>] [(unknown):0] [/usr/bin/python2.7]
CPU Cores	4
CPU MHz	1200.234
CPU Type	Intel(R) Xeon(R) CPU E5-2603 v2 @ 1.80GHz
CPU Vendor	GenuineIntel
CWD	/wopr/users/livetau/jlinford/workshop-python/06_debugging
Cache Size	10240 KB
Command Line	python /usr/local/packages/tau/x86_64/bin/tau_python samarcrun.py

Python Performance Evaluation

HANDS-ON: TAU AND IPYTHON

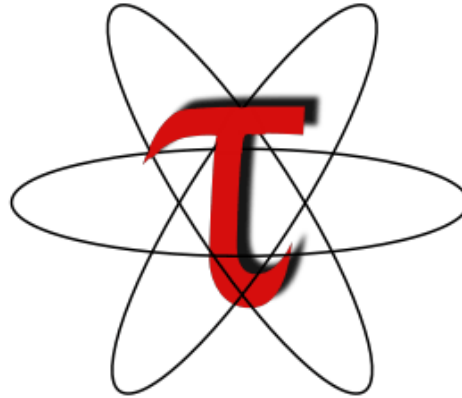
TAU in IPython Notebook



Python Performance Evaluation

CONCLUSION

Download TAU from U. Oregon



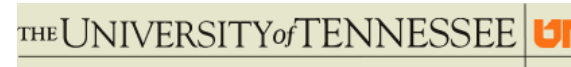
<http://tau.uoregon.edu>

<http://www.hpclinux.com> [LiveDVD]

Free download, open source, BSD license

Acknowledgements

- Department of Energy
 - Office of Science
 - Argonne National Laboratory
 - Oak Ridge National Laboratory
 - NNSA/ASC Trilabs (SNL, LLNL, LANL)
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- National Science Foundation
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- University of New Hampshire
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- University of Oregon
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- TU Dresden
 - Holger Brunst, Andreas Knupfer
 - Wolfgang Nagel
- Research Centre Jülich
 - Bernd Mohr
 - Felix Wolf



UNIVERSITY
OF OREGON



TAU Performance System

REFERENCE

Online References

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

Compiling Fortran Codes with TAU

- **If your Fortran code uses free format in .f files (fixed is default for .f):**
% export TAU_OPTIONS='-optPdtF95Opts="-R free" -optVerbose'
- **To use the compiler based instrumentation instead of PDT (source-based):**
% export TAU_OPTIONS='-optComplnst -optVerbose'
- **If your Fortran code uses C preprocessor directives (#include, #ifdef, #endif):**
% export TAU_OPTIONS='-optPreProcess -optVerbose'
- **To use an instrumentation specification file:**
% export TAU_OPTIONS=
 '-optTauSelectFile=select.tau -optVerbose -optPreProcess'

Example select.tau file

```
BEGIN_INSTRUMENT_SECTION  
loops file="*" routine="#"  
memory file="foo.f90" routine="#"  
io file="abc.f90" routine="FOO"  
END_INSTRUMENT_SECTION
```

Generate a PAPI profile with 2 or more counters

```
% export TAU_MAKEFILE=$TAU/Makefile.tau-papi-mpi-pdt
% export TAU_OPTIONS='-optTauSelectFile=select.tau -optVerbose'
% cat select.tau
BEGIN_INSTRUMENT_SECTION
loops routine="#"
END_INSTRUMENT_SECTION

% export PATH=$TAU_ROOT/bin:$PATH
% make F90=tau_f90.sh
(Or edit Makefile and change F90=tau_f90.sh)
%
% export TAU_METRICS=TIME:PAPI_FP_INS:PAPI_L1_DCM
% mpirun -np 4 ./a.out
% paraprof --pack app.ppk
Move the app.ppk file to your desktop.
% paraprof app.ppk
Choose Options -> Show Derived Metrics Panel -> "PAPI_FP_INS", click
"/", "TIME", click "Apply" and choose the derived metric.
```

Tracking I/O

```
% export TAU_MAKEFILE=$TAU/Makefile.tau-papi-mpi-pdt
% export PATH=$TAU_ROOT/bin:$PATH
% export TAU_OPTIONS='-optTrackIO -optVerbose'
% make CC=tau_cc.sh CXX=tau_cxx.sh F90=tau_f90.sh
% mpirun -n 4 ./a.out
% paraprof -pack ioprofile.ppk
% export TAU_TRACK_IO_PARAMS=1
% mpirun -n 4 ./a.out
```

Installing and Configuring TAU

•Installing PDT:

- `wget http://tau.uoregon.edu/pdt.tgz`
- `./configure --prefix=<dir>; make ; make install`

•Installing TAU:

- `wget http://tau.uoregon.edu/tau.tgz`
- `./configure -bfd=download -pdt=<dir> -papi=<dir> ...`
- `make install`

•Using TAU:

- `export TAU_MAKEFILE=<taudir>/<arch>/lib/Makefile.tau-<TAGS>`
- `make CC=tau_cc.sh CXX=tau_cxx.sh F90=tau_f90.sh`

Compile-Time Options (TAU_OPTIONS)

% tau_compiler.sh

-optVerbose	Turn on verbose debugging messages
-optComplnst	Use compiler based instrumentation
-optNoComplnst	Do not revert to compiler instrumentation if source instrumentation fails.
-optTrackIO	Wrap POSIX I/O call and calculates vol/bw of I/O operations
-optMemDbg	Runtime bounds checking (see TAU_MEMDBG_* env vars)
-optKeepFiles	Does not remove intermediate .pdb and .inst.* files
-optPreProcess	Preprocess sources (OpenMP, Fortran) before instrumentation
-optTauSelectFile=" <i><file></i> "	Specify selective instrumentation file for <i>tau_instrumentor</i>
-optTauWrapFile=" <i><file></i> "	Specify path to <i>link_options.tau</i> generated by <i>tau_gen_wrapper</i>
-optHeaderInst	Enable Instrumentation of headers
-optTrackUPCR	Track UPC runtime layer routines (used with tau_upc.sh)
-optPdtF95Opts=""	Add options for Fortran parser in PDT (f95parse/gfparse) ...

Runtime Environment Variables

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 <code>-optMemDbg</code> or <code>tau_exec</code>)
TAU_MEMDBG_PROTECT_ABOVE	0	Setting to 1 turns on bounds checking for dynamically allocated arrays. (Use with <code>-optMemDbg</code> or <code>tau_exec -memory_debug</code>).
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 <code>-optTrackIO</code> or <code>tau_exec -io</code> captures arguments of I/O calls
TAU_TRACK_SIGNALS	0	Setting to 1 generate debugging callstack info when a program crashes
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>)