

# Enabling HPC software productivity with the TAU performance system

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# Runtime Support

**What can be instrumented using TAU ?**

# TAU's Support for Runtime Systems

## *MPI*

- PMPI profiling interface
- MPI\_T tools interface using performance and control variables

## *Pthread*

- Captures time spent in routines per thread of execution

## *OpenMP*

- OMPT tools interface to track salient OpenMP runtime events
- Opari source rewriter
- Preloading wrapper OpenMP runtime library when OMPT is not supported

## *OpenACC*

- OpenACC instrumentation API
- Track data transfers between host and device (per-variable)
- Track time spent in kernels

# TAU's Support for Runtime Systems (contd.)

## *OpenCL*

- OpenCL profiling interface
- Track timings of kernels

## *CUDA*

- Cuda Profiling Tools Interface (CUPTI)
- Track data transfers between host and GPU
- Track access to uniform shared memory between host and GPU

## *ROCM*

- Rocprofiler and Roctracer instrumentation interfaces
- Track data transfers and kernel execution between host and GPU

## *Kokkos*

- Kokkos profiling API
- Push/pop interface for region, kernel execution interface

## *Python*

- Python interpreter instrumentation API
- Tracks Python routine transitions as well as Python to C transitions

# Examples of Multi-Level Instrumentation

## *MPI + OpenMP*

- MPI\_T + PMPI + OMPT may be used to track MPI and OpenMP

## *MPI + CUDA*

- PMPI + CUPTI interfaces

## *OpenCL + ROCm*

- Rocprofiler + OpenCL instrumentation interfaces

## *Kokkos + OpenMP*

- Kokkos profiling API + OMPT to transparently track events

## *Kokkos + pthread + MPI*

- Kokkos + pthread wrapper interposition library + PMPI layer

## *Python + CUDA*

- Python + CUPTI + pthread profiling interfaces (e.g., Tensorflow, PyTorch)

## *MPI + OpenCL*

- PMPI + OpenCL profiling interfaces

# What does TAU support?

C/C++

Fortran

pthreads

Intel GNU

MPC

Insert yours here

CUDA

OpenACC

Intel MIC

LLVM

Linux

BlueGene

NVIDIA

UPC

PGI

Windows

Fujitsu

Power 8

GPI

Java

Cray

OpenCL

Python

MPI

OpenMP

Sun

AIX

ARM64

OS X

# **Basic usage of TAU**

**How to run ? How to visualize ?**

# Simplifying the use of TAU!

Uninstrumented code:

- \$ make
- \$ mpirun –np 64 ./a.out

With TAU using event based sampling (EBS):

- \$ mpirun –np 64 tau\_exec –ebs ./lu.B.64
- \$ paraprof (GUI)
- \$ pprof –a | more

NOTE: Source code should be compiled with –g for access to symbol table.

# TAU Execution Command (tau\_exec)

## Uninstrumented execution

- % mpirun -np 256 ./a.out

## Track GPU operations

- % mpirun -np 256 tau\_exec -rocm ./a.out
- % mpirun -np 256 tau\_exec -cupti ./a.out
- % mpirun -np 256 tau\_exec -cupti -um ./a.out (for Unified Memory)
- % mpirun -np 256 tau\_exec -opencl ./a.out
- % mpirun -np 256 tau\_exec -openacc ./a.out

## Track MPI performance

- % mpirun -np 256 tau\_exec ./a.out

## Track I/O, and MPI performance (MPI enabled by default)

- % mpirun -np 256 tau\_exec -io ./a.out

## Track OpenMP and MPI execution (using OMPT for Intel v19)

- % export TAU\_OMPT\_SUPPORT\_LEVEL=full;
- % export TAU\_OMPT\_RESOLVE\_ADDRESS\_EAGERLY=1
- % mpirun -np 256 tau\_exec -T ompt,v5,mpi -ompt ./a.out

## Track memory operations

- % export TAU\_TRACK\_MEMORY\_LEAKS=1
- % mpirun -np 256 tau\_exec -memory\_debug ./a.out (bounds check)

## Use event based sampling (compile with -g)

- % mpirun -np 256 tau\_exec -ebs ./a.out
- Also -ebs\_source=<PAPI\_COUNTER> -ebs\_period=<overflow\_count>  
-ebs\_resolution=<file | function | line>

# 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` and `TAU_CALLPATH_DEPTH` environment variables

## *Callsite* profiles

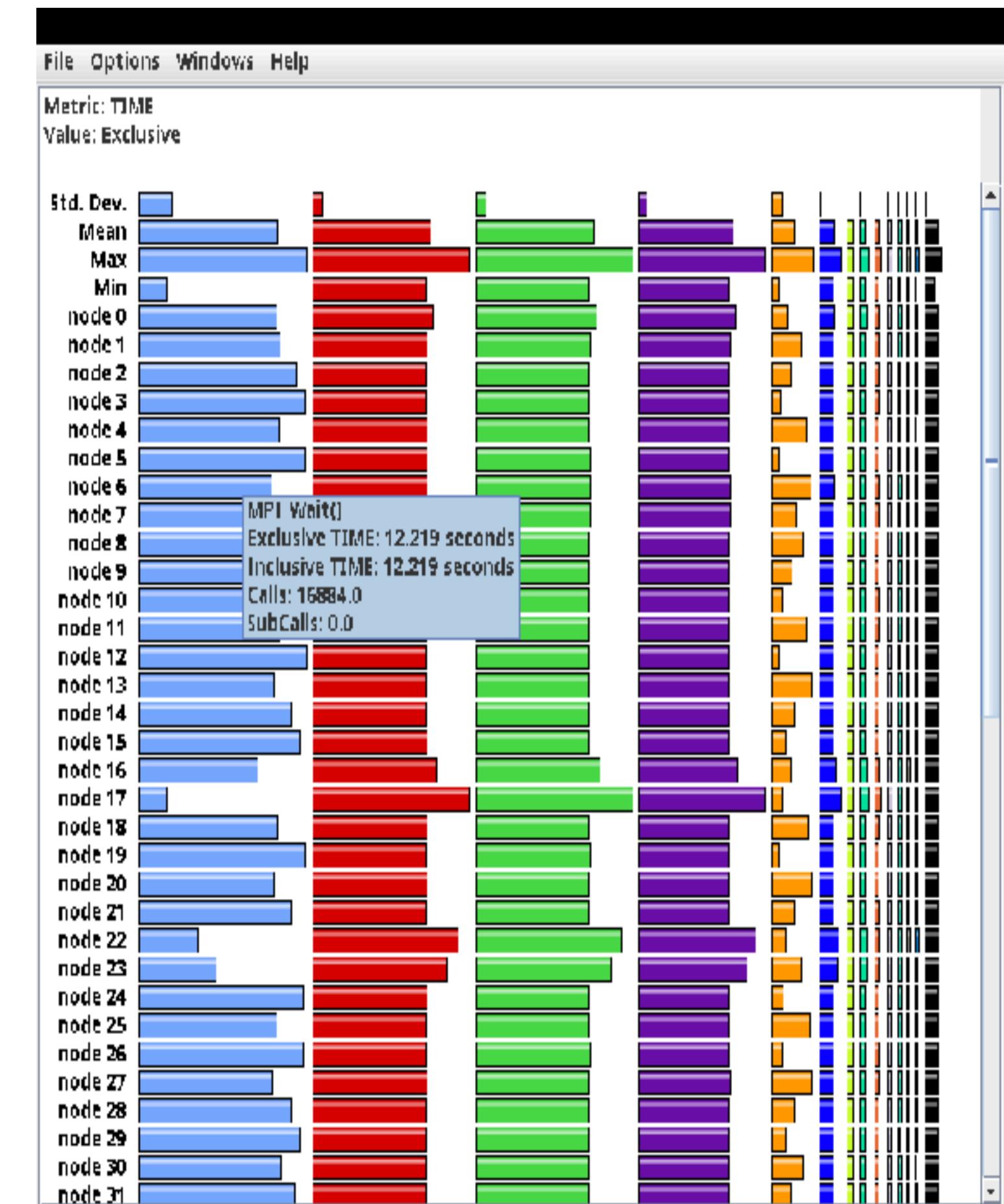
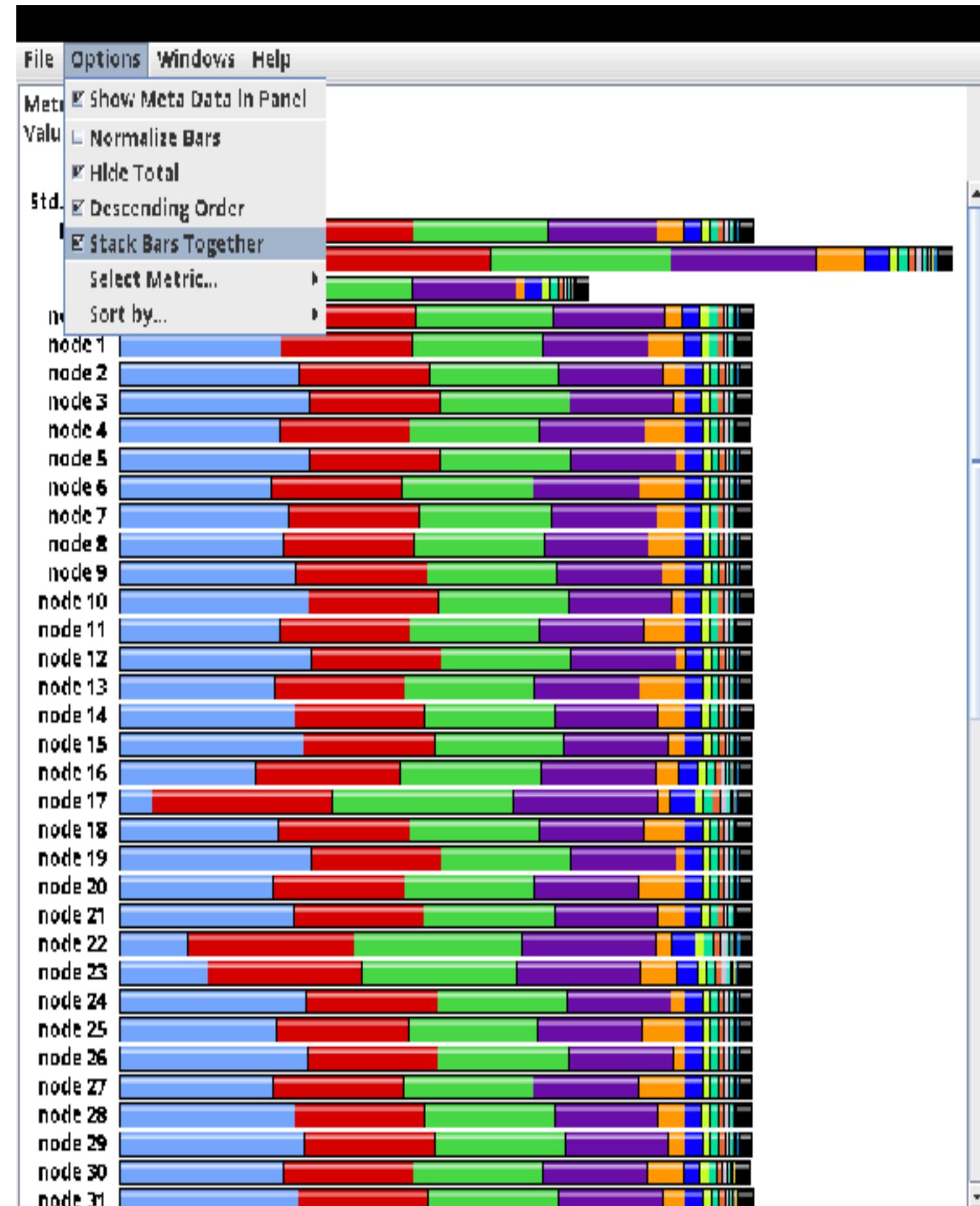
- Time spent along in an event at a given source location
- Set the `TAU_CALLSITE` environment variable

## *Phase* profiles

- Flat profiles under a phase (nested phases allowed)
- Default “main” phase
- Supports static or dynamic (e.g. per-iteration) phases

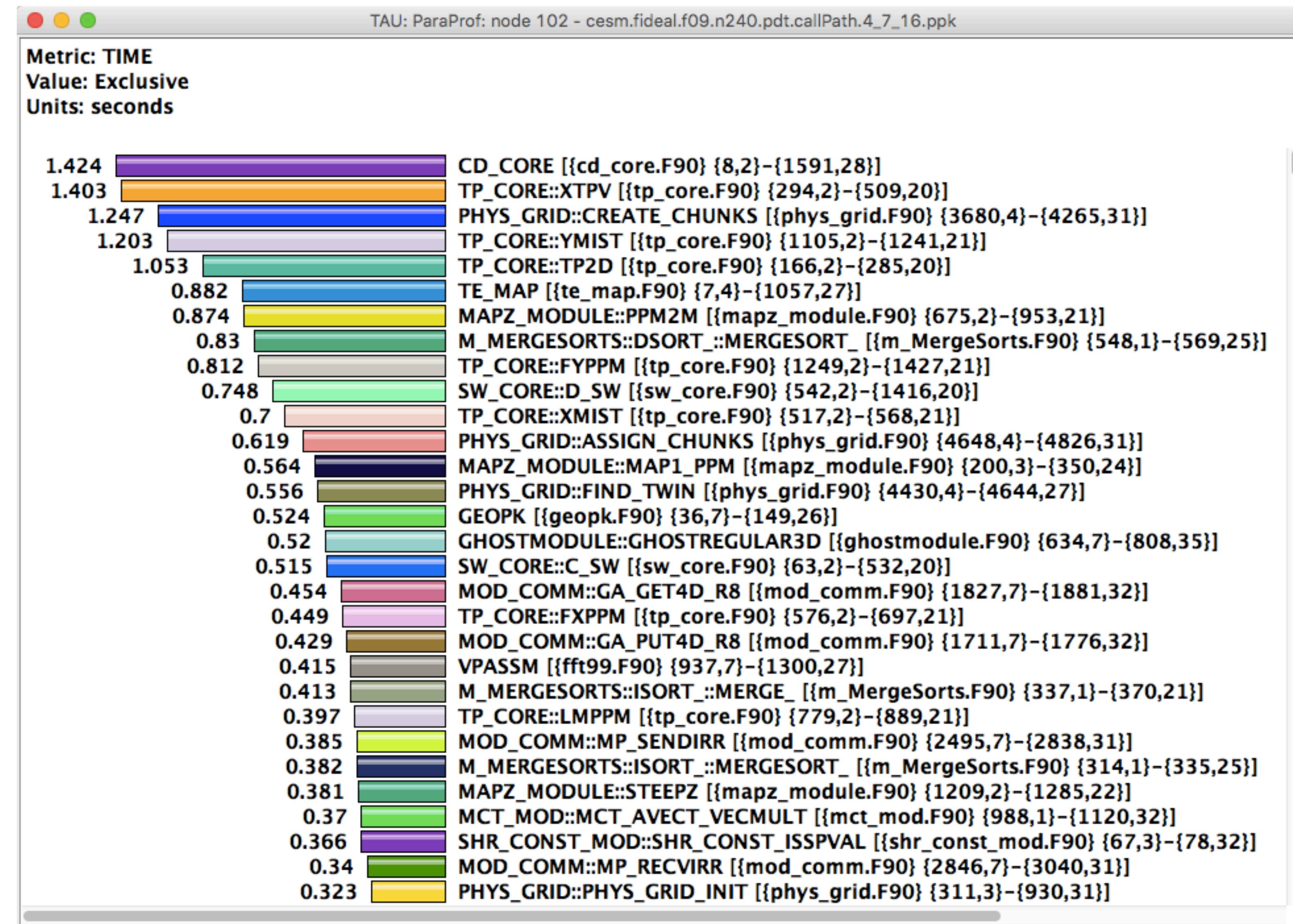
# Paraprof

# ParaProf Profile Browser

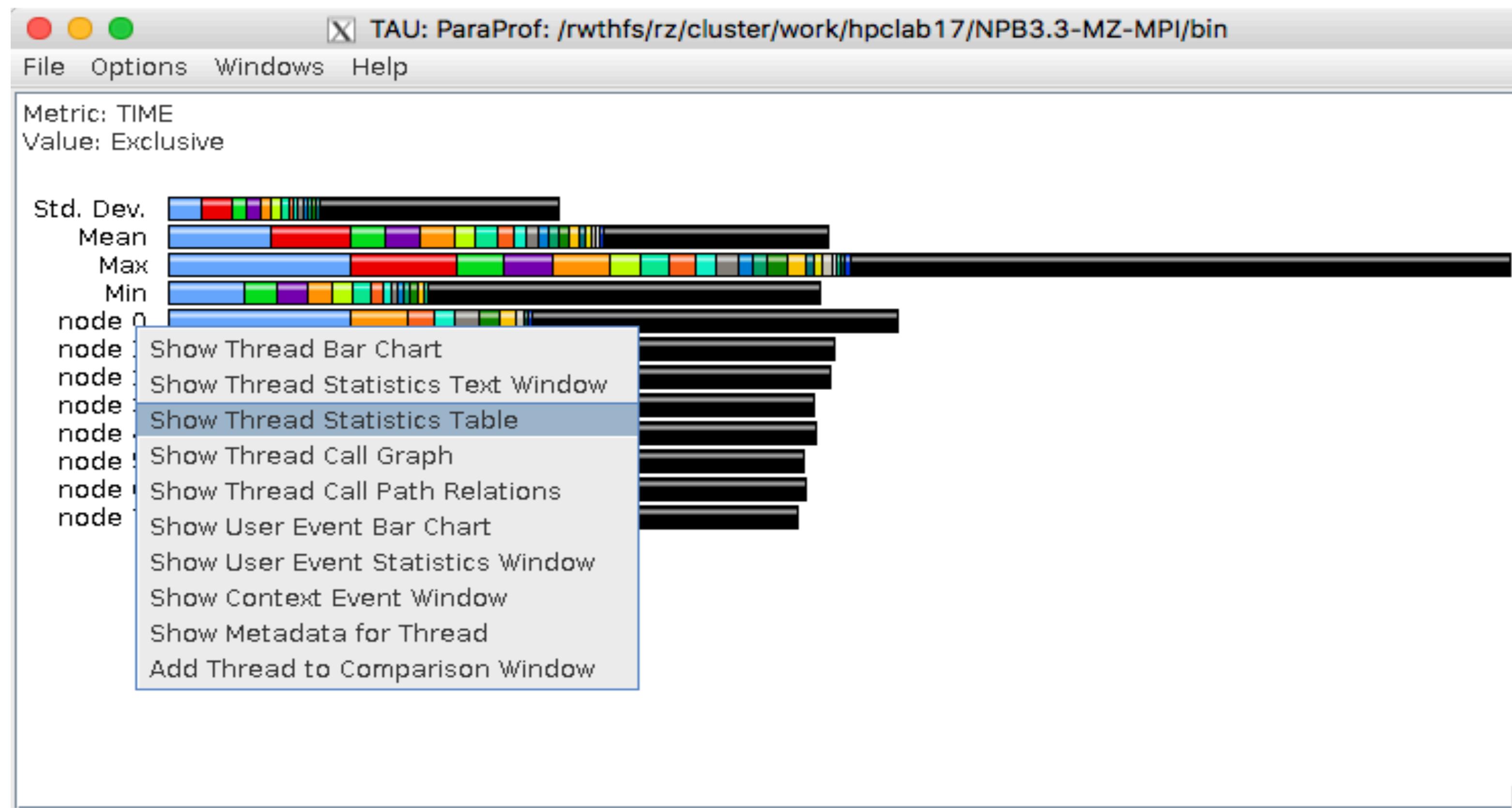


**Click “node X” next to see details**

# TAU – Flat Profile



# ParaProf Thread Statistics Table



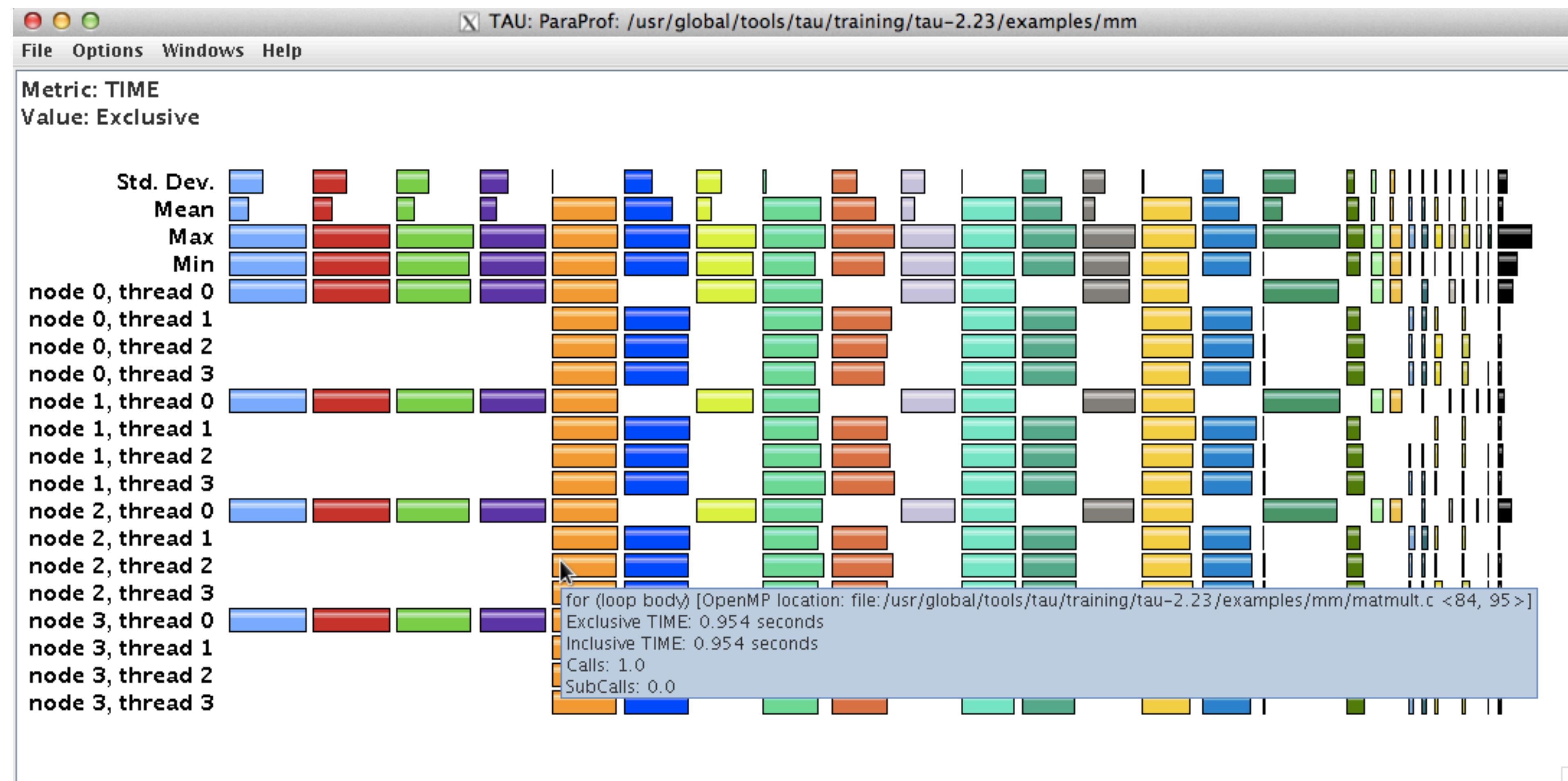
Right click over “node X” and choose  
Show Thread Statistics Table

# ParaProf Thread Statistics Table

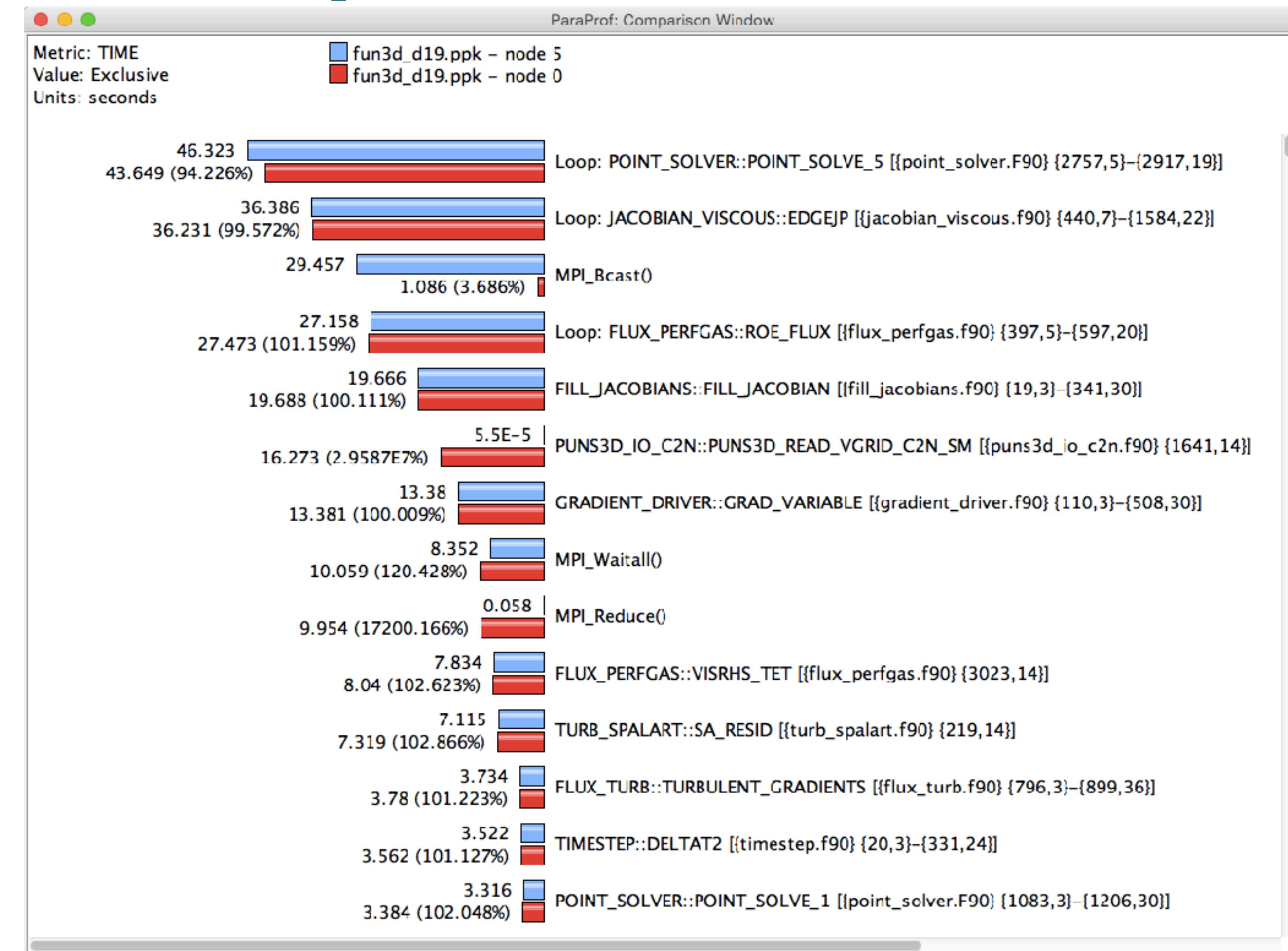
Name	Exclusive TIME	Inclusive TIME	Calls	Child Calls
.TAU application	12.111	13.341	1	26,524
[CONTEXT] .TAU application	0	11.971	396	0
MPI_Allreduce()	0.038	0.038	2,816	0
MPI_Alltoall()	0.262	0.271	1,011	105
[CONTEXT] MPI_Alltoall()	0	0.27	8	0
[SAMPLE] .annobin_pthread_spin_lock.c {[pthread_spin_lock.c} {0}]	0.03	0.03	1	0
[SAMPLE] PAMI_Context_trylock_advancev [{/m100/prod/opt/com]}	0.09	0.09	2	0
[SAMPLE] _ZN4PAMI8Protocol3Get13CompositeRGetINS1_4RGetES3	0.03	0.03	1	0
[SAMPLE] __memcpy_power7 [{} {0}]	0.09	0.09	3	0
[SAMPLE] opal_datatype_copy_content_same_ddt [{/m100/prod/op}	0.03	0.03	1	0
MPI_Barrier()	0.043	0.043	3,992	0
MPI_Bcast()	0.004	0.004	875	5
MPI_Comm_free()	0	0	11	0
MPI_Comm_rank()	0.002	0.002	4,221	0
MPI_Comm_size()	0.004	0.004	4,954	0
MPI_Comm_split()	0.008	0.009	13	26
MPI_Finalize()	0.399	0.416	1	37
MPI_Gather()	0	0	3	0
MPI_Get_count()	0	0	12	0
MPI_Get_processor_name()	0	0	1	0
MPI_Init_thread()	0.128	0.16	1	909
MPI_Irecv()	0.002	0.002	1,212	0
MPI_Isend()	0.024	0.024	1,212	4
MPI_Recv()	0.001	0.001	24	0

Using sampling, TAU can explain 11.971 seconds out of 12.111 seconds using 396 samples.

# Mixed MPI and OpenMP Instrumentation



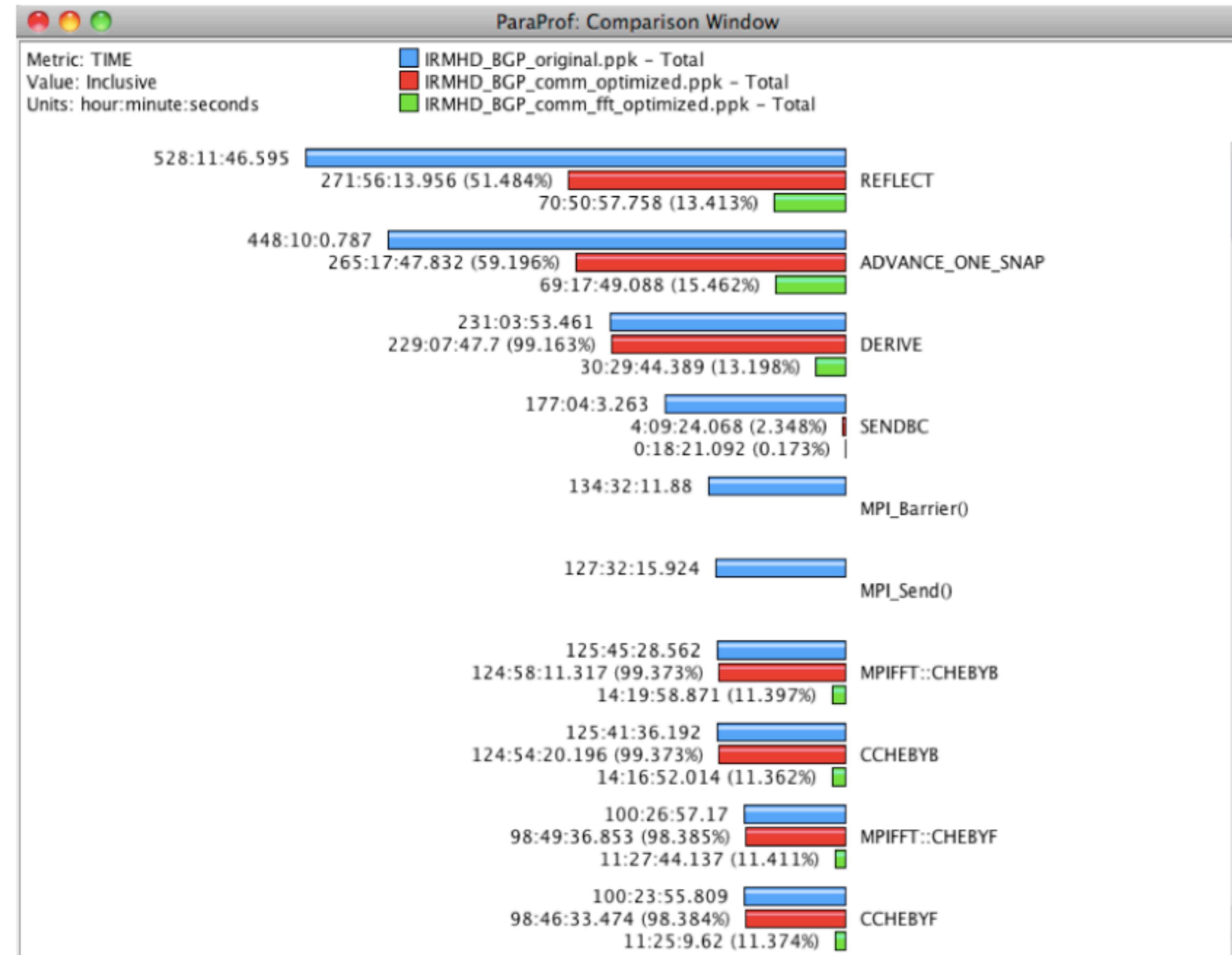
# ParaProf Comparison Window



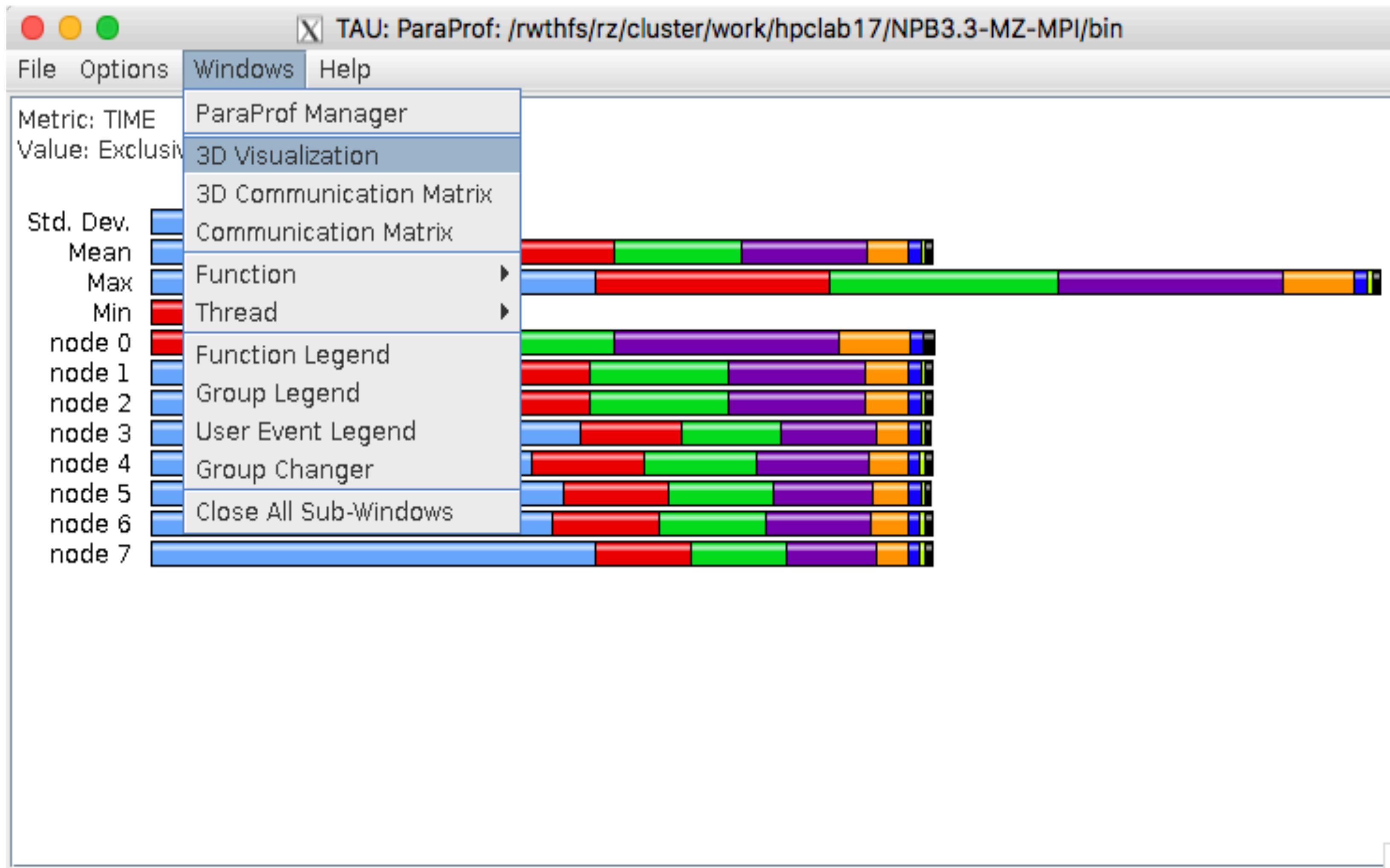
Comparing Rank 0 with 5.

Right click on “node 5” -> Add node to comparison window

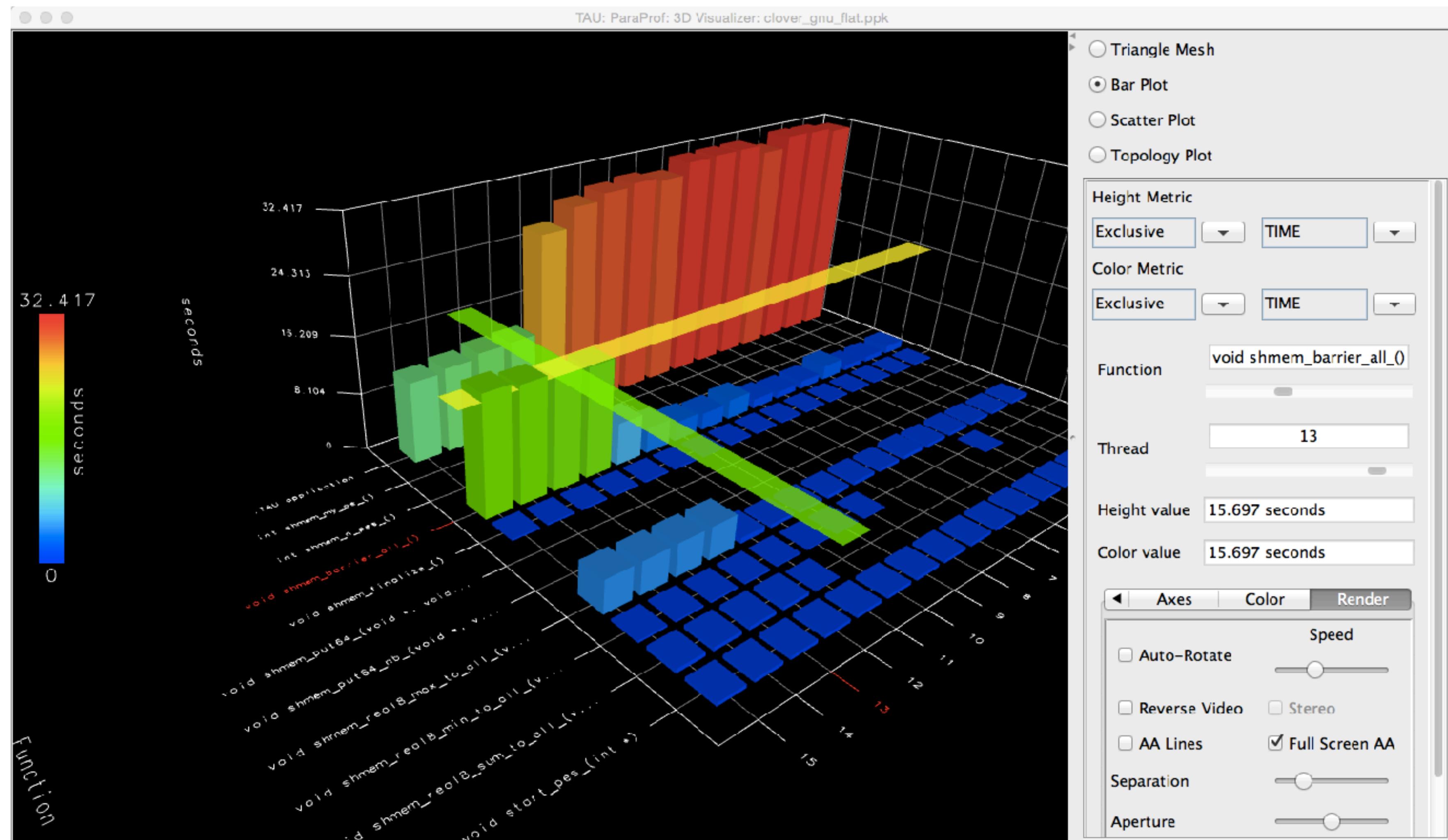
# ParaProf Comparison Window



# 3D Visualization in ParaProf



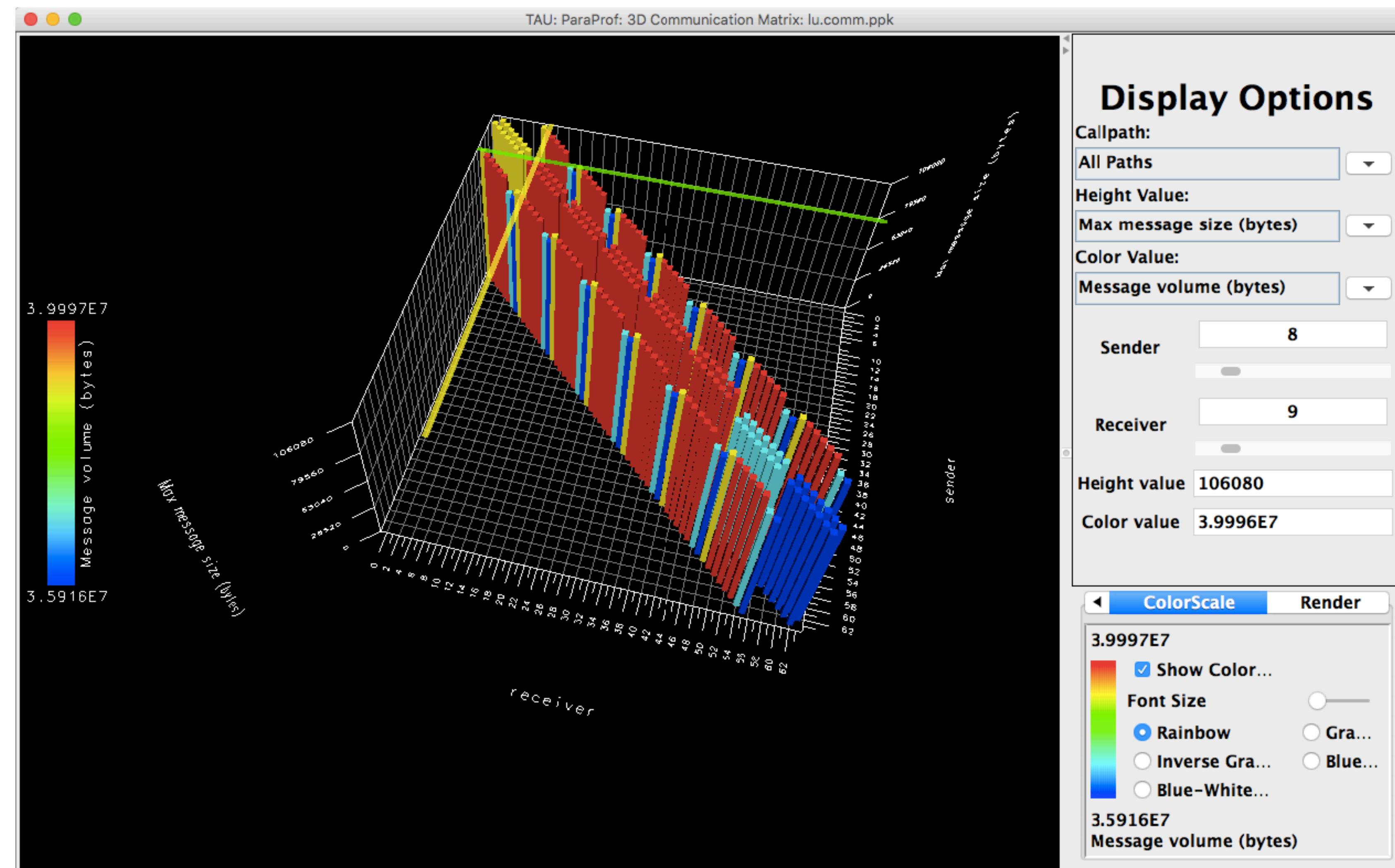
# TAU – ParaProf 3D Visualization



\$ paraprof app.ppk

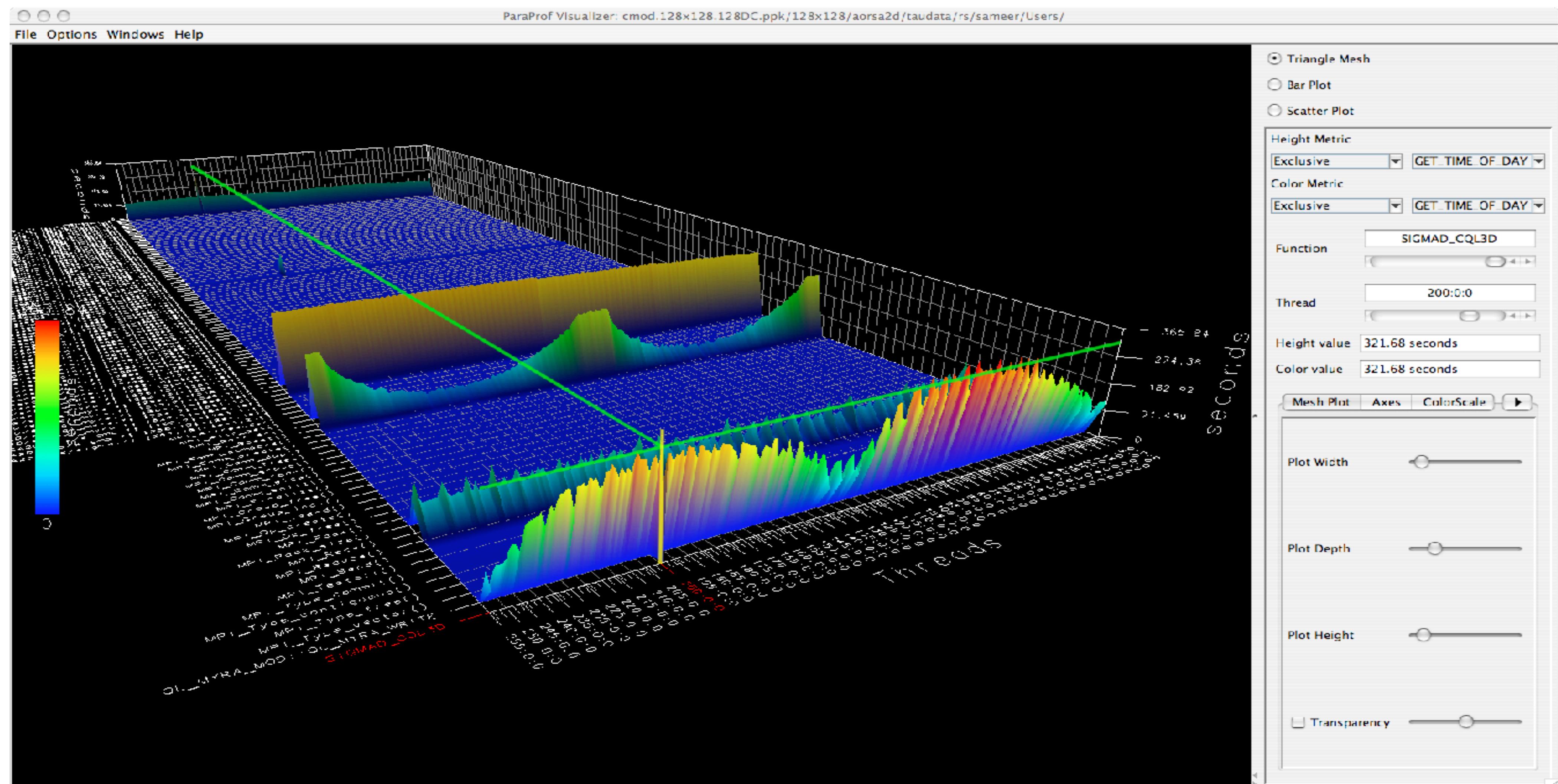
Windows -> 3D Visualization -> Bar Plot (right pane)

# TAU – 3D Communication Window

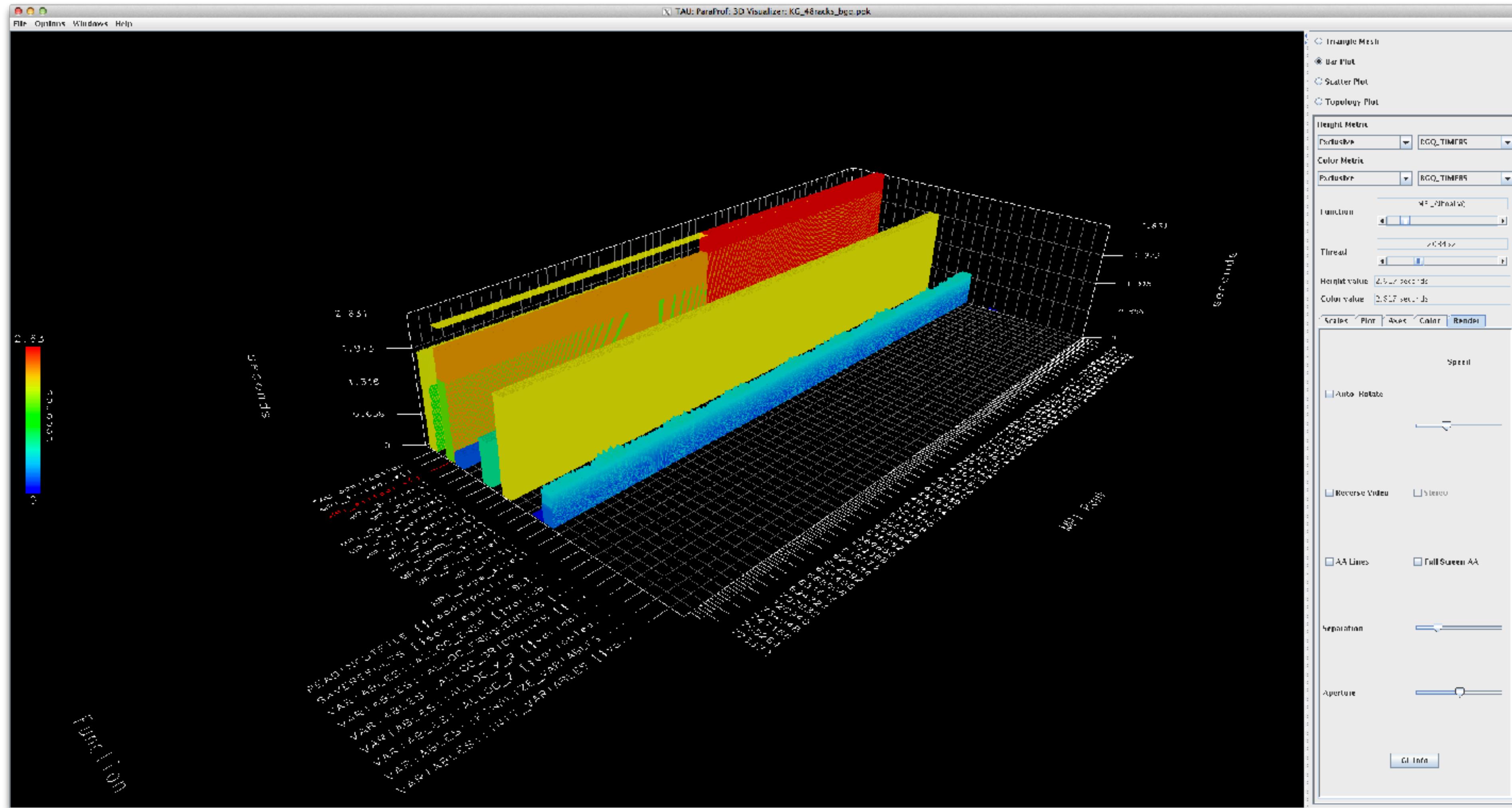


```
% export TAU_COMM_MATRIX=1; mpirun ... tau_exec ./a.out  
% paraprof app.ppk; Windows -> 3D Communication Matrix
```

# ParaProf 3D Profile Browser



# ParaProf's Scalable 3D Visualization (BGQ)



786,432 ranks

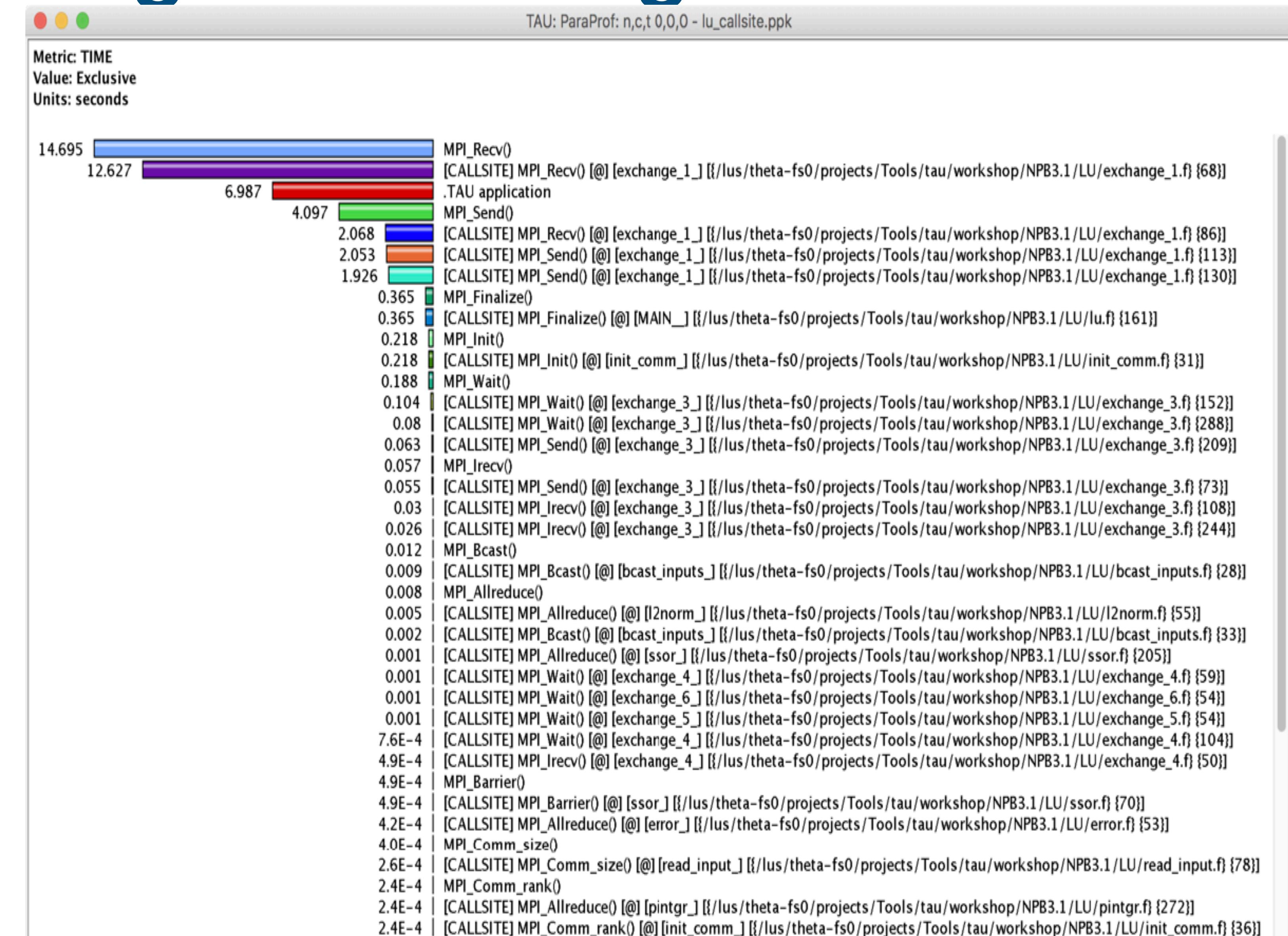
# Callsite Profiles

# TAU – Callsite Profiling

Name	Excl...	Incl...	Calls	Chil...
.TAU application	6.152	8.249	1	28,383
[CALLSITE] void start_pes_(int *) [@] [/nfsprojects/volta-projects/tau/tau-2.24.1/craycnl/lib/libTAUsh-gnu-papi-shmem-pdt.so] UNRESOLVED ADDR	0.747	0.747	1	0
void start_pes_(int *)	0.747	0.747	1	0
void shmem_barrier_all_()	0.624	0.624	9,229	0
[CALLSITE] void shmem_barrier_all_0 [@] __clover_module_MOD_clover_exchange_message [{/home/ssshend/CloverLeaf_OpenSHMEM/clover.f90} {572}]	0.401	0.401	4,610	0
[CALLSITE] void shmem_finalize_0 [@] [/nfsprojects/volta-projects/tau/tau-2.24.1/craycnl/lib/libTAUsh-gnu-papi-shmem-pdt.so] UNRESOLVED ADDR	0.314	0.314	1	0
void shmem_finalize_0	0.314	0.314	1	0
[CALLSITE] void shmem_barrier_all_0 [@] __clover_module_MOD_clover_exchange_message [{/home/ssshend/CloverLeaf_OpenSHMEM/clover.f90} {643}]	0.223	0.223	4,610	0
void shmem_put64_nb_(void *, void *, int *, int *, void *)	0.159	0.159	9,220	0
void shmem_put64_(void *, void *, int *, int *)	0.126	0.126	9,220	0
void shmem_real8_max_to_all_(void *, void *, int *, int *, int *, int *, void *, long *)	0.081	0.081	400	0
[CALLSITE] void shmem_put64_nb_(void *, void *, int *, int *, void *) [@] __clover_module_MOD_clover_exchange_message [{/home/ssshend/CloverLeaf_OpenSHMEM/clover.f90} {572}]	0.07	0.07	4,610	0
[CALLSITE] void shmem_put64_(void *, void *, int *, int *) [@] __clover_module_MOD_clover_exchange_message [{/home/ssshend/CloverLeaf_OpenSHMEM/clover.f90} {643}]	0.063	0.063	4,610	0
[CALLSITE] void shmem_real8_max_to_all_(void *, void *, int *, int *, int *, int *, void *, long *) [@] [hydro_] [{/home/ssshend/CloverLeaf_OpenSHMEM/hydro.f90} {100}]	0.046	0.046	200	0
[CALLSITE] void shmem_real8_min_to_all_(void *, void *, int *, int *, int *, int *, void *, long *) [@] [/nfsprojects/volta-projects/tau/tau-2.24.1/craycnl/lib/libTAUsh-gnu-papi-shmem-pdt.so]	0.04	0.04	200	0
void shmem_real8_min_to_all_(void *, void *, int *, int *, int *, int *, void *, long *)	0.04	0.04	200	0
[CALLSITE] void shmem_real8_max_to_all_(void *, void *, int *, int *, int *, int *, void *, long *) [@] [hydro_] [{/home/ssshend/CloverLeaf_OpenSHMEM/hydro.f90} {100}]	0.036	0.036	200	0
[CALLSITE] void shmem_put64_nb_(void *, void *, int *, int *, void *) [@] __clover_module_MOD_clover_exchange [{/home/ssshend/CloverLeaf_OpenSHMEM/clover.f90} {572}]	0.028	0.028	601	0

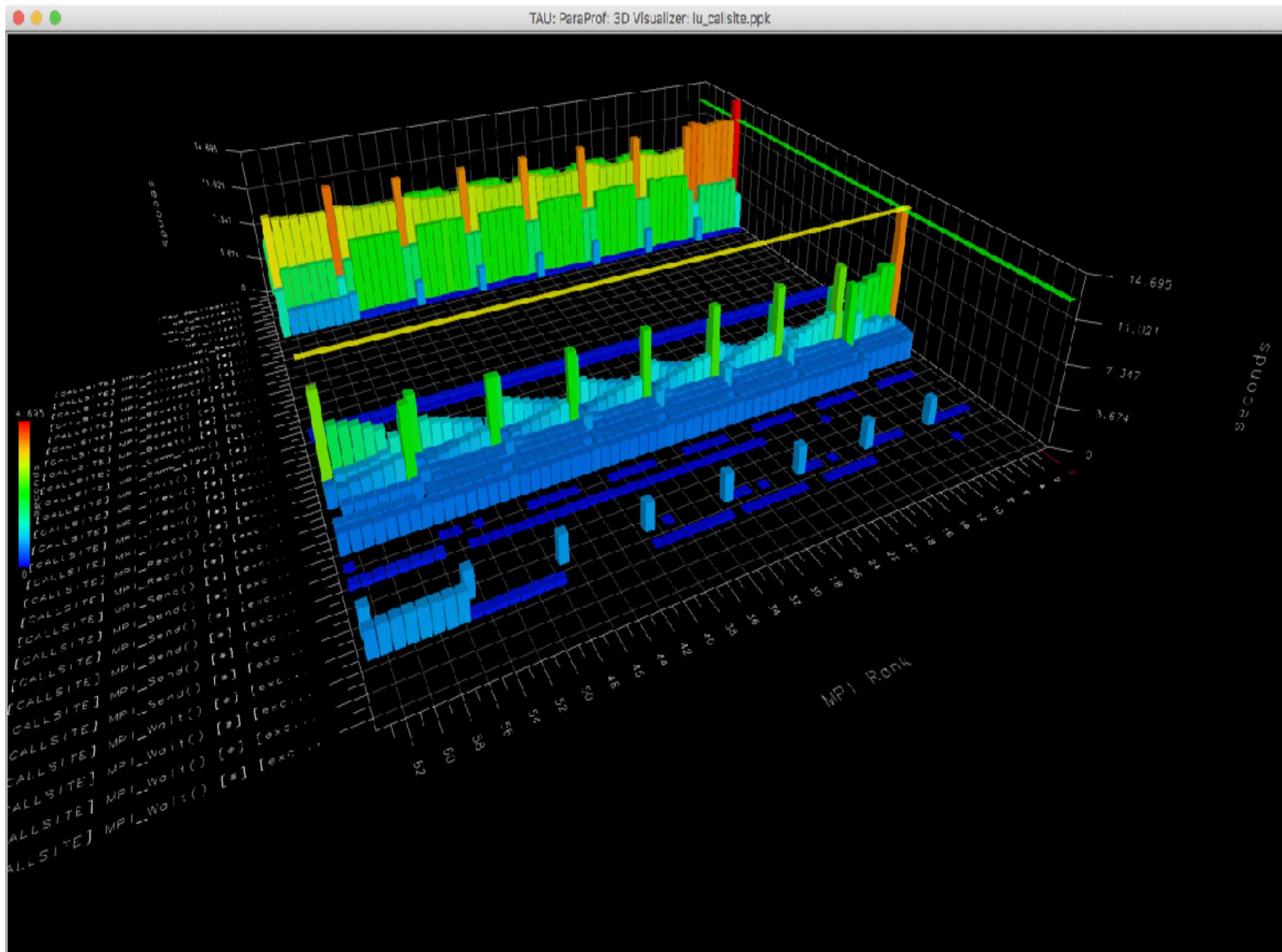
```
$ export TAU_CALLSITE=1
```

# Callsite Profiling and Tracing

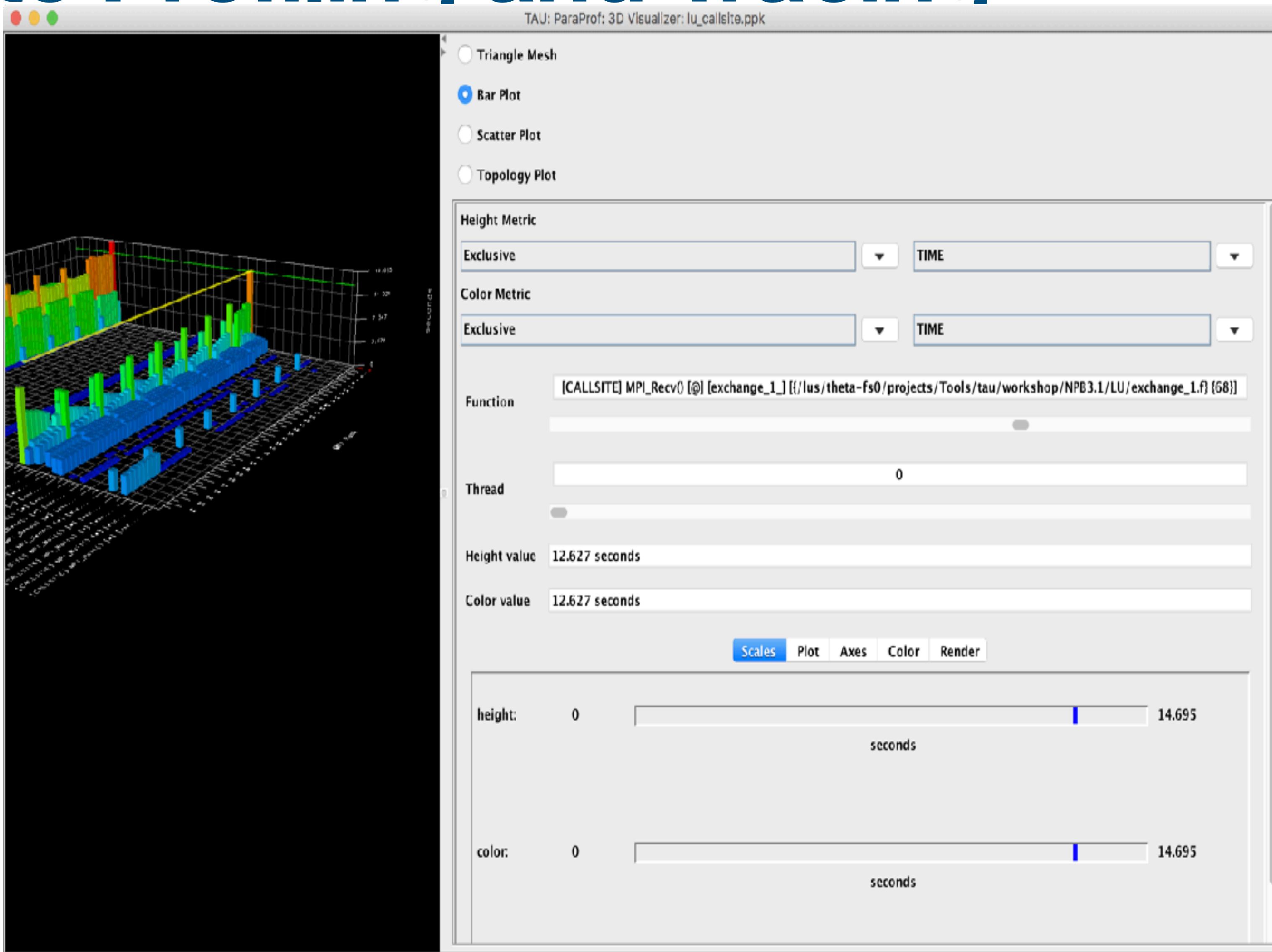


```
$ export TAU_CALLSITE=1
```

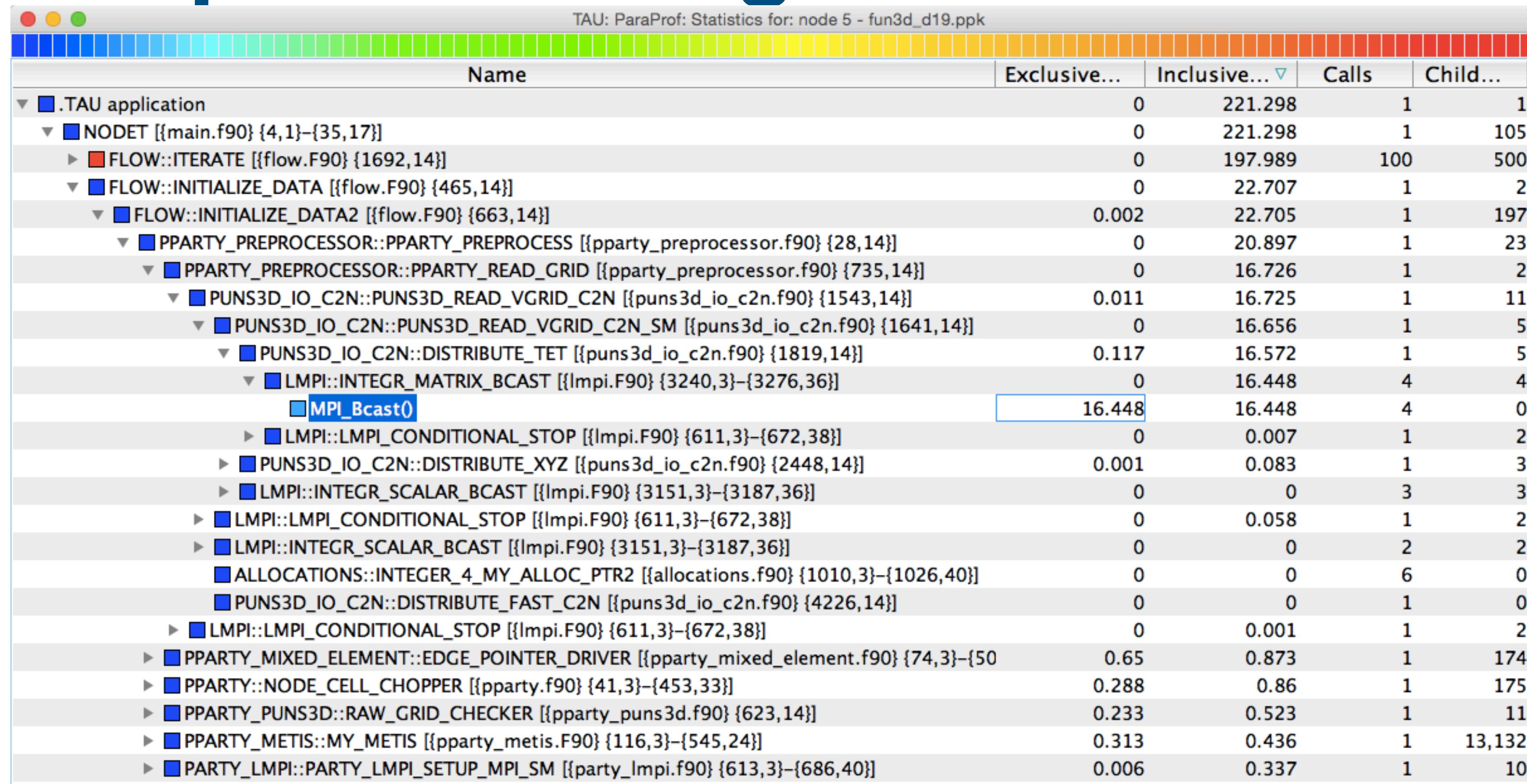
# Callsite Profiling and Tracing



# Callsite Profiling and Tracing



# TAU – Callpath Profiling



```
$ export TAU_CALLPATH=1; export TAU_CALLPATH_DEPTH=100
```

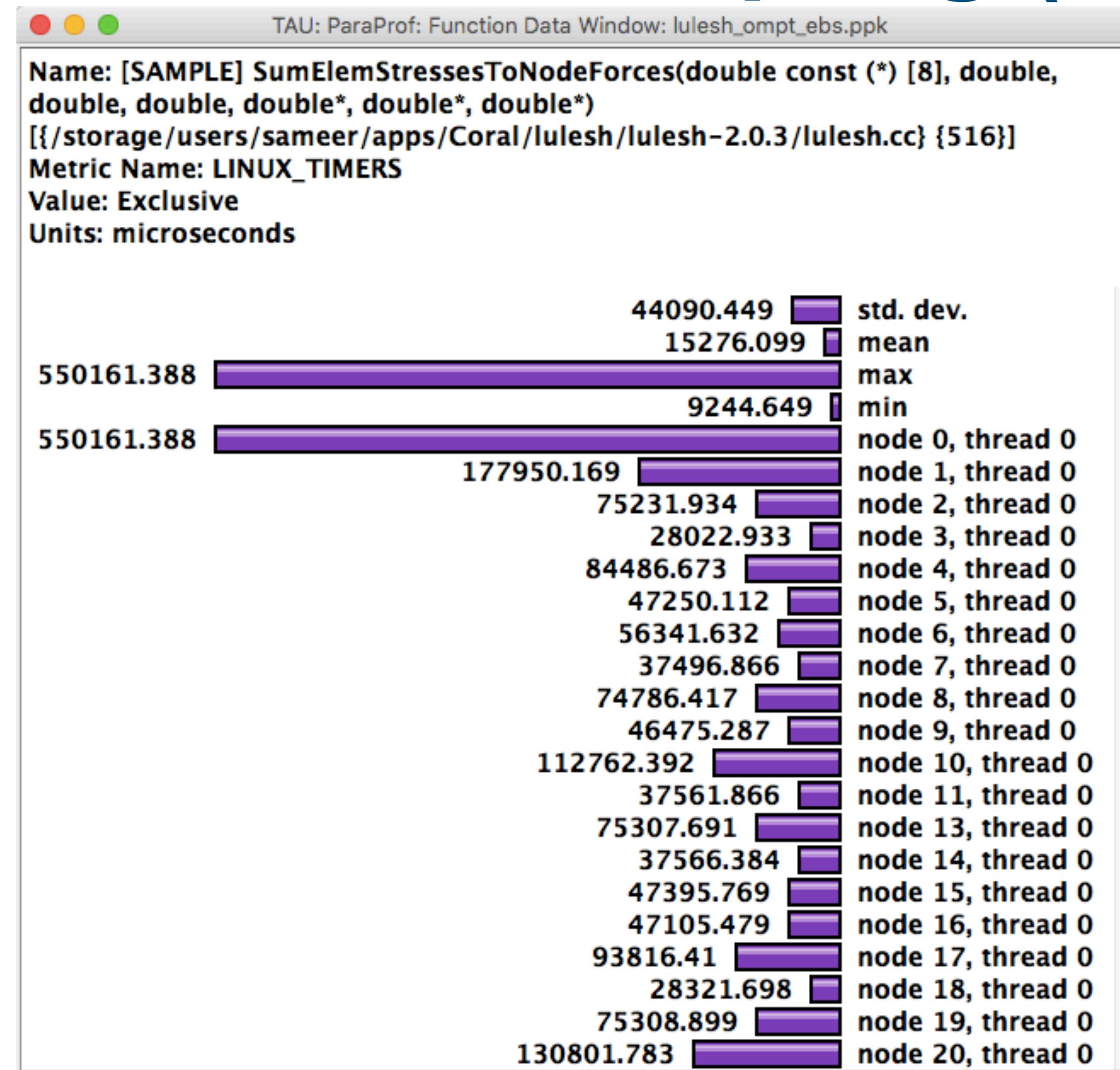
# Sample Callstacks

# TAU - Callstack Sampling



```
$ export TAU_SAMPLING=1; export TAU_EBS_UNWIND=1
```

# TAU – Event Based Sampling (EBS)



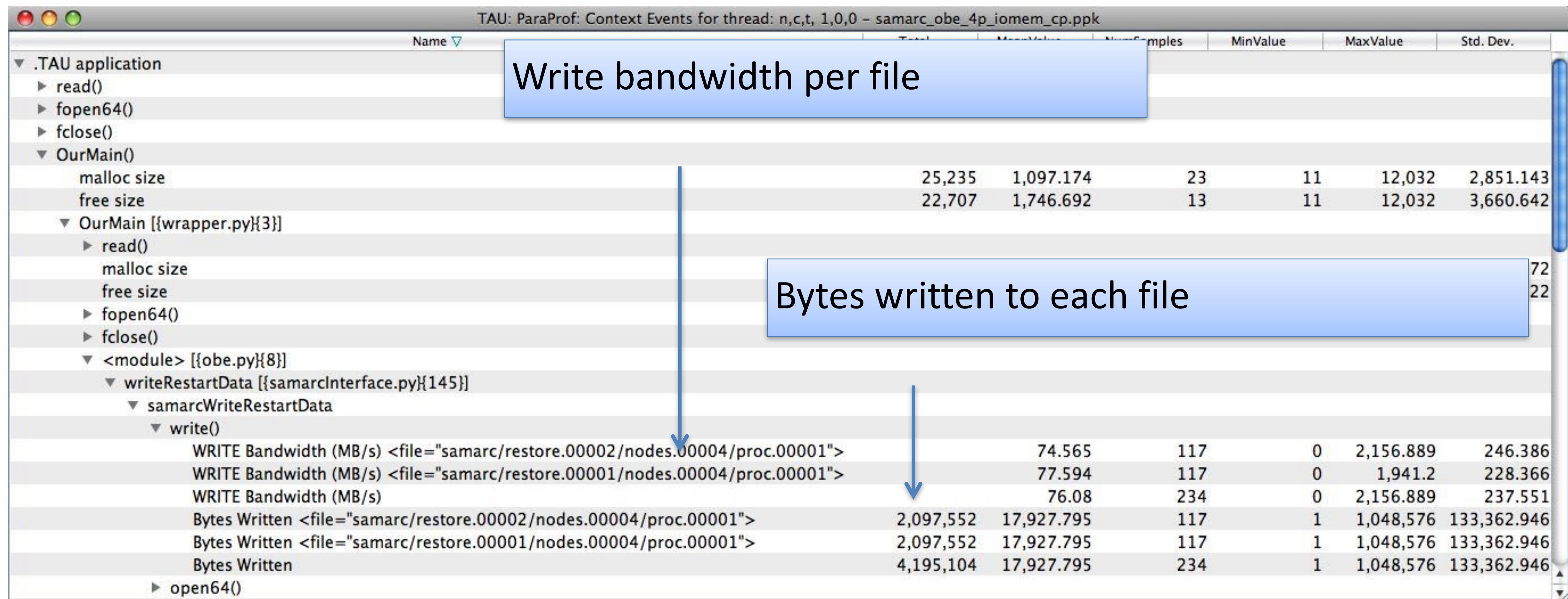
\$ export TAU\_SAMPLING=1 (same as -ebs)

# Atomic Events (incl. I/O)

# TAU Atomic Events

Name ▾	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
Bytes Written <file=stdout>	911	62	21	1	14.694	7.441
Bytes Written <file=pipe>	22	22	1	1	1	0
Bytes Written <file=Process_Output/VelRsd.dat>	7,826	100	302	76	78.26	22.487
Bytes Written <file=Process_Output/MomRsd.dat>	7,826	100	302	76	78.26	22.487
Bytes Written <file=Process_Output/MassRsd.dat>	11,325	100	435	110	113.25	32.337
Bytes Written <file=Grid_Output/bodyBndry.dat>	9,724	5	8,192	4	1,944.8	3,174.201
Bytes Written <file=/home/sameer/apps/sukra/RotCFD_Regression/case_catalog/UNS2D/N/	45	1	45	45	45	0
Bytes Written <file=./Restarts/Restart_History//NACA0012_LargeGrid_00010.Rst>	44,619,720	5,484	8,192	4	8,136.346	640.325
Bytes Written <file=./Restarts/Restart_History//NACA0012_LargeGrid_00005.Rst>	44,619,720	5,484	8,192	4	8,136.346	640.325
Bytes Written <file=./Restarts//NACA0012_LargeGrid.Rst>	44,619,720	5,484	8,192	4	8,136.346	640.325
Bytes Written <file=./Process_Output/TurbRsd.dat>	4,271	72	224	57	59.319	19.544
Bytes Written <file=./Process_Output/Solver.out>	2,039	13	797	43	156.846	191.359
Bytes Written <file=./Field_Solutions/Solution_History/NACA0012_LargeGrid_00010.Sln>	4,356,976	534	8,192	4	8,159.131	501.319
Bytes Written <file=./Field_Solutions/Solution_History/NACA0012_LargeGrid_00005.Sln>	4,356,976	534	8,192	4	8,159.131	501.319
Bytes Written <file=./Field_Solutions/NACA0012_LargeGrid.Sln>	4,356,976	534	8,192	4	8,159.131	501.319
Bytes Written <file=./Body_Pressure/NACA0012_LargeGrid_00010_body.Prs>	65,986	9	8,190	1,300	7,331.778	2,133.204
Bytes Written <file=./Body_Pressure/NACA0012_LargeGrid_00005_body.Prs>	65,986	9	8,190	1,300	7,331.778	2,133.204
Bytes Written <file=./Body_Pressure/FrcMnt.out>	1,497	3	1,185	108	499	486.656
Bytes Written	147,107,546	18,550	8,192	1	7,930.326	1,420.552

# TAU – Context Events



# Trace: Vampir

# Vampir

Alternative and supplement to automatic analysis

Show dynamic run-time behavior graphically at any level of detail

Provide statistics and performance metrics

## Timeline charts

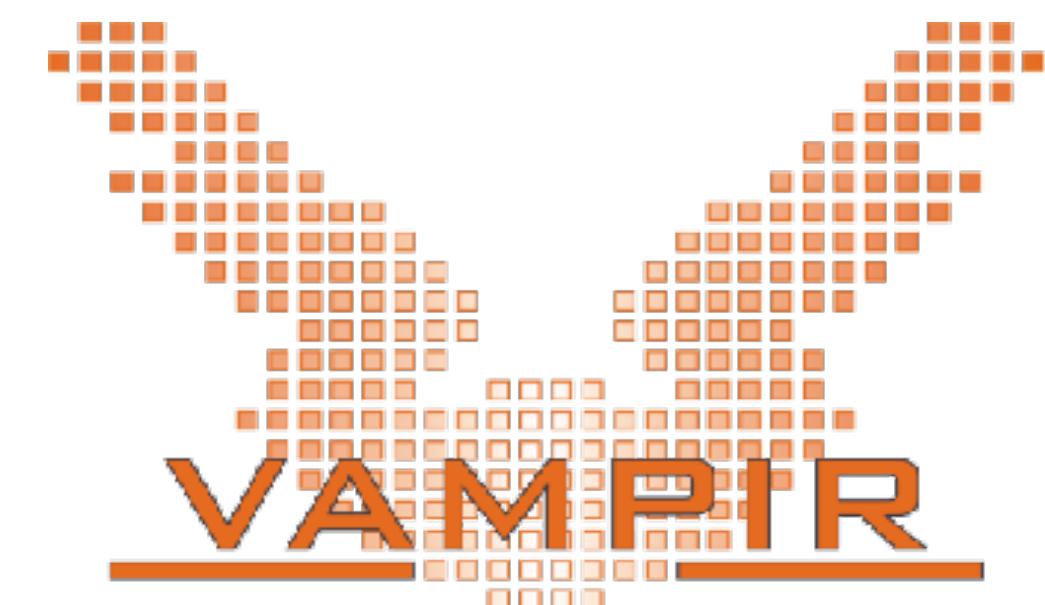
- Show application activities and communication along a time axis

## Summary charts

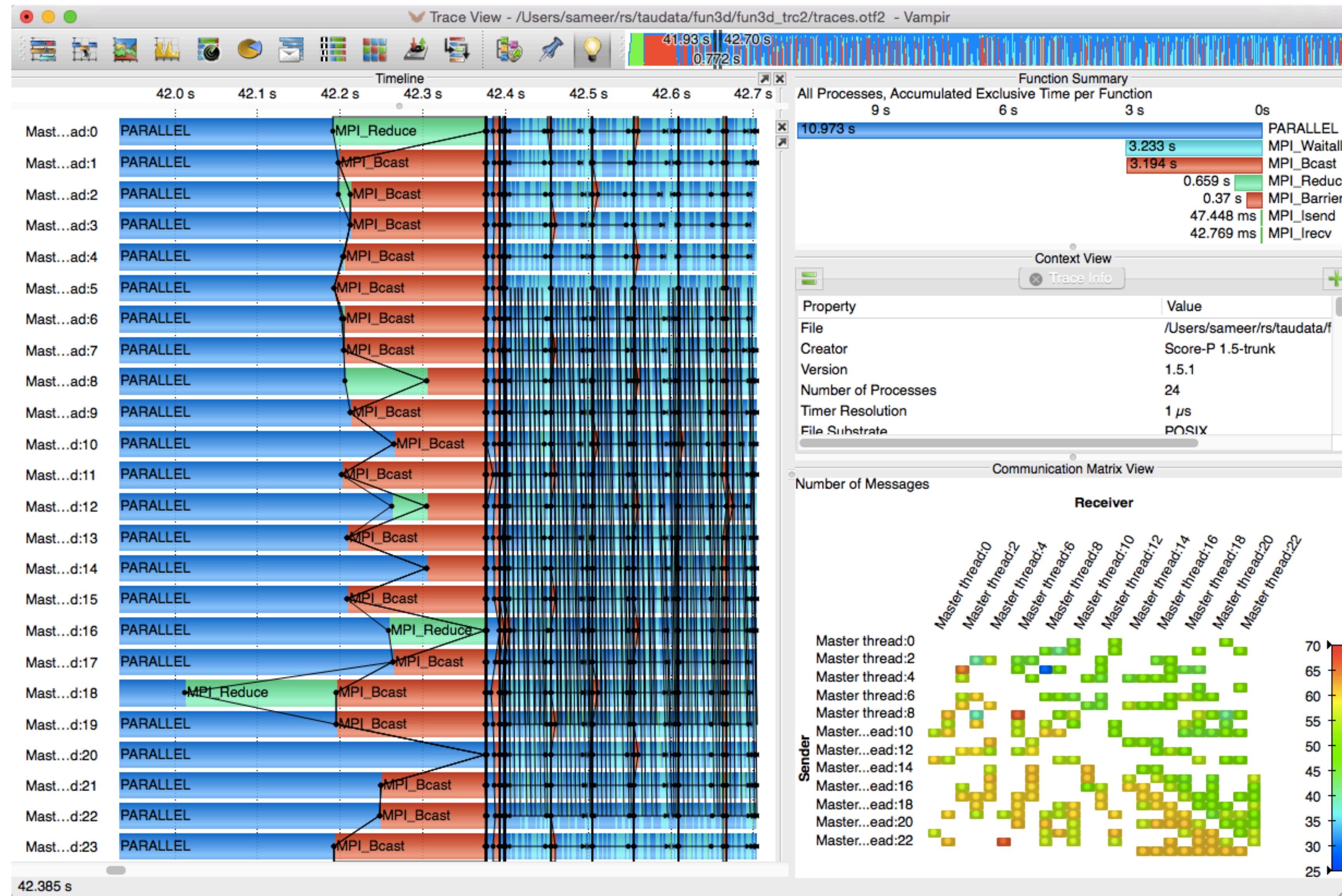
- Provide quantitative results for the currently selected time interval
- Commercial trace visualization tool

*From TU Dresden, Germany*

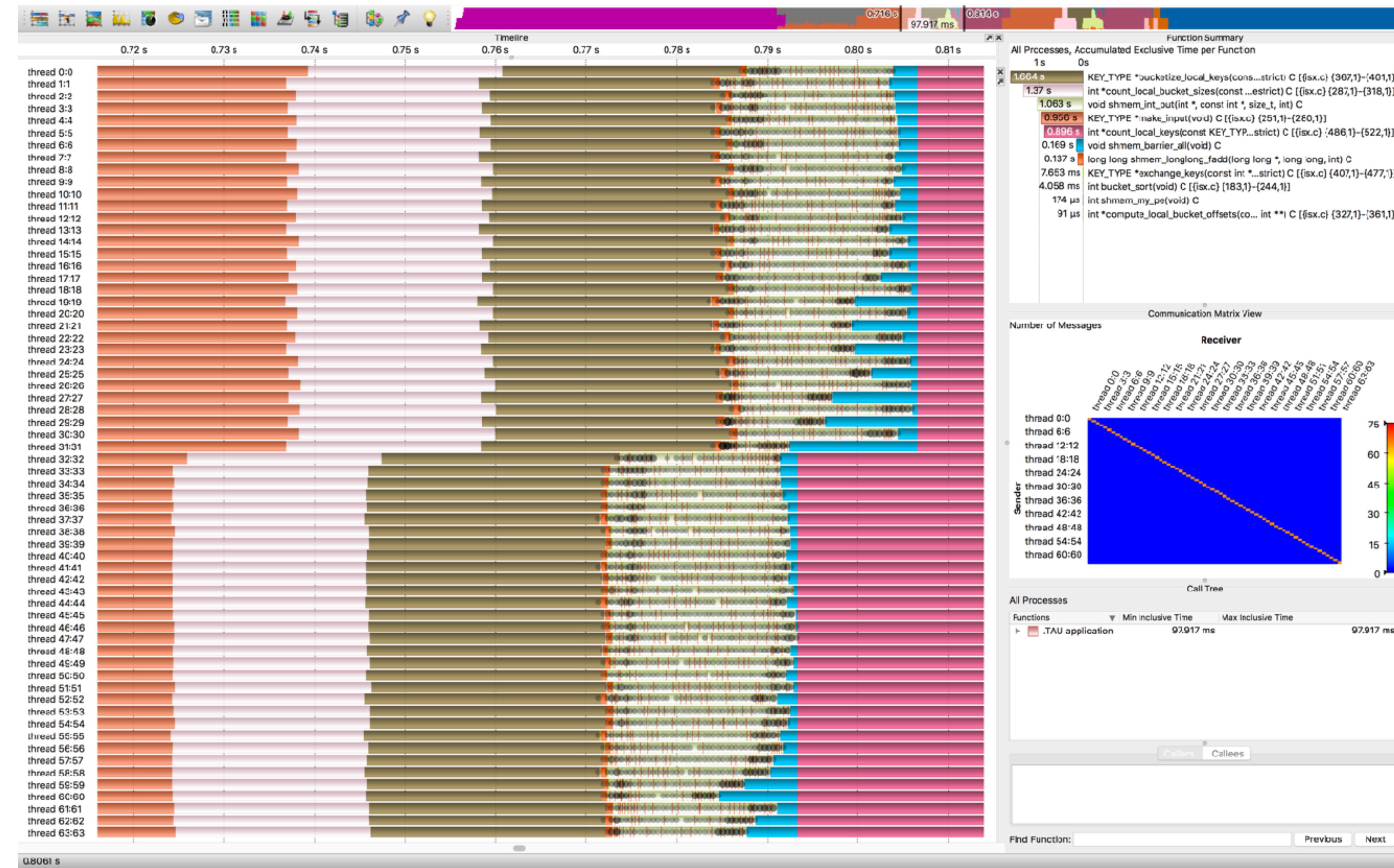
<http://www.vampir.eu>



# Vampir – Trace Visualization

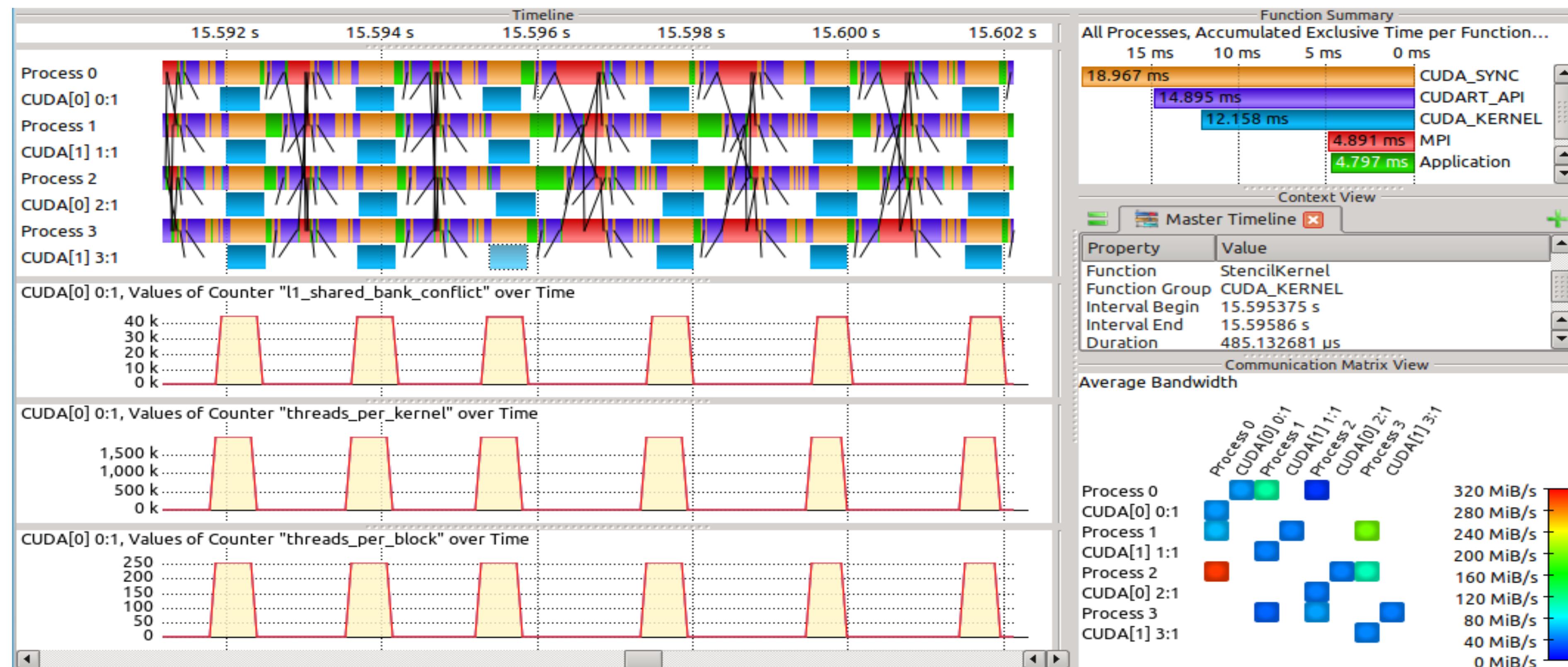
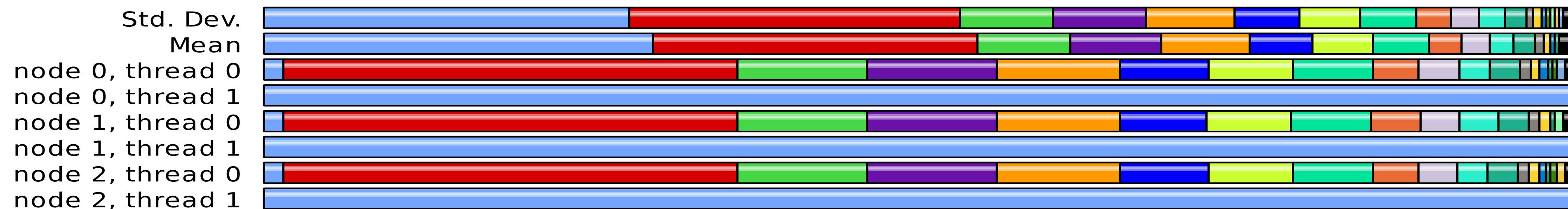


# Vampir – Trace Visualization

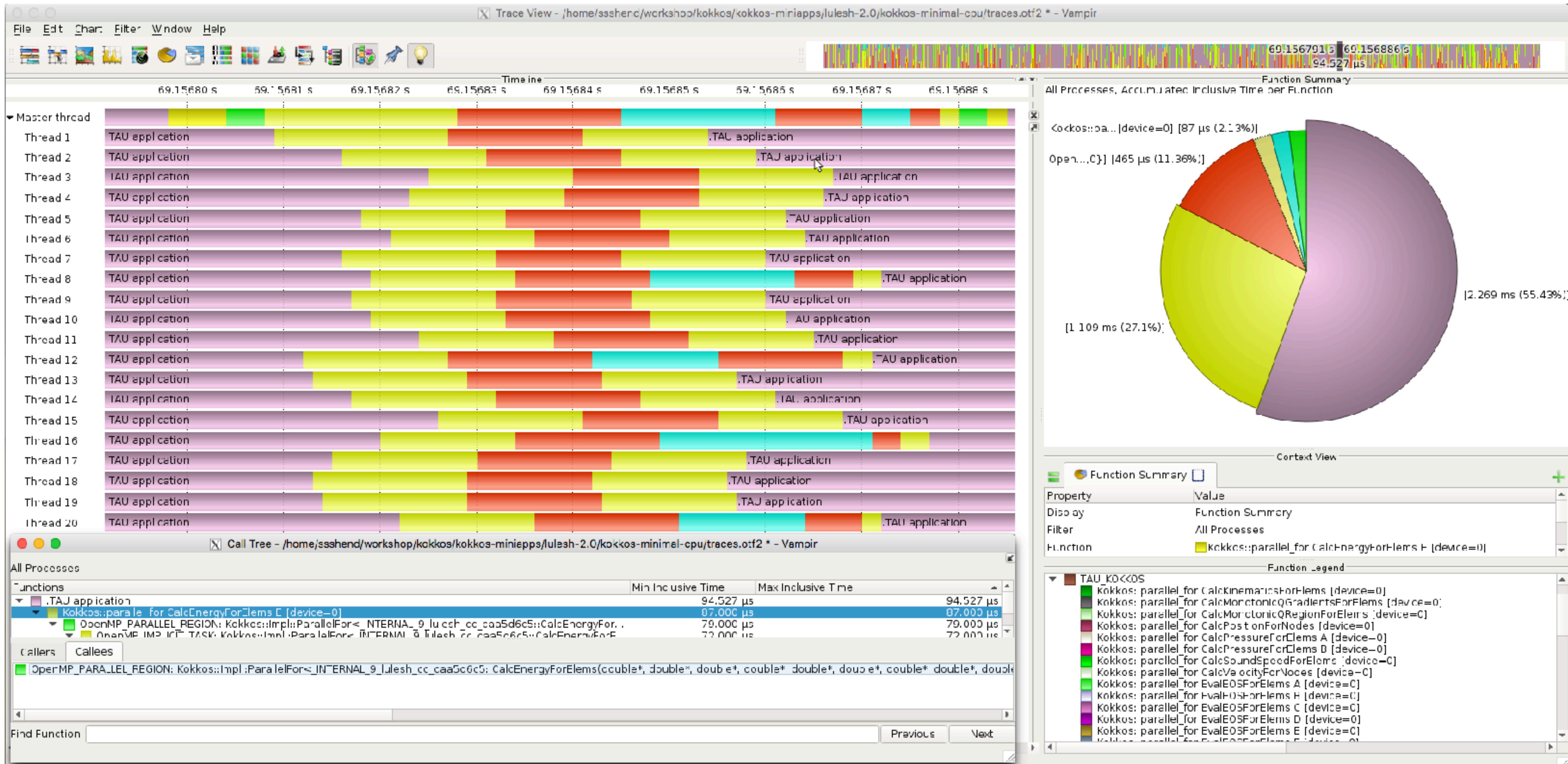


# Stencil2D Parallel Profile / Trace in Vampir

Metric: TAUGPU\_TIME  
Value: Exclusive



# Vampir – TAU’s Kokkos Profiling Interface



# Trace: Jumpshot

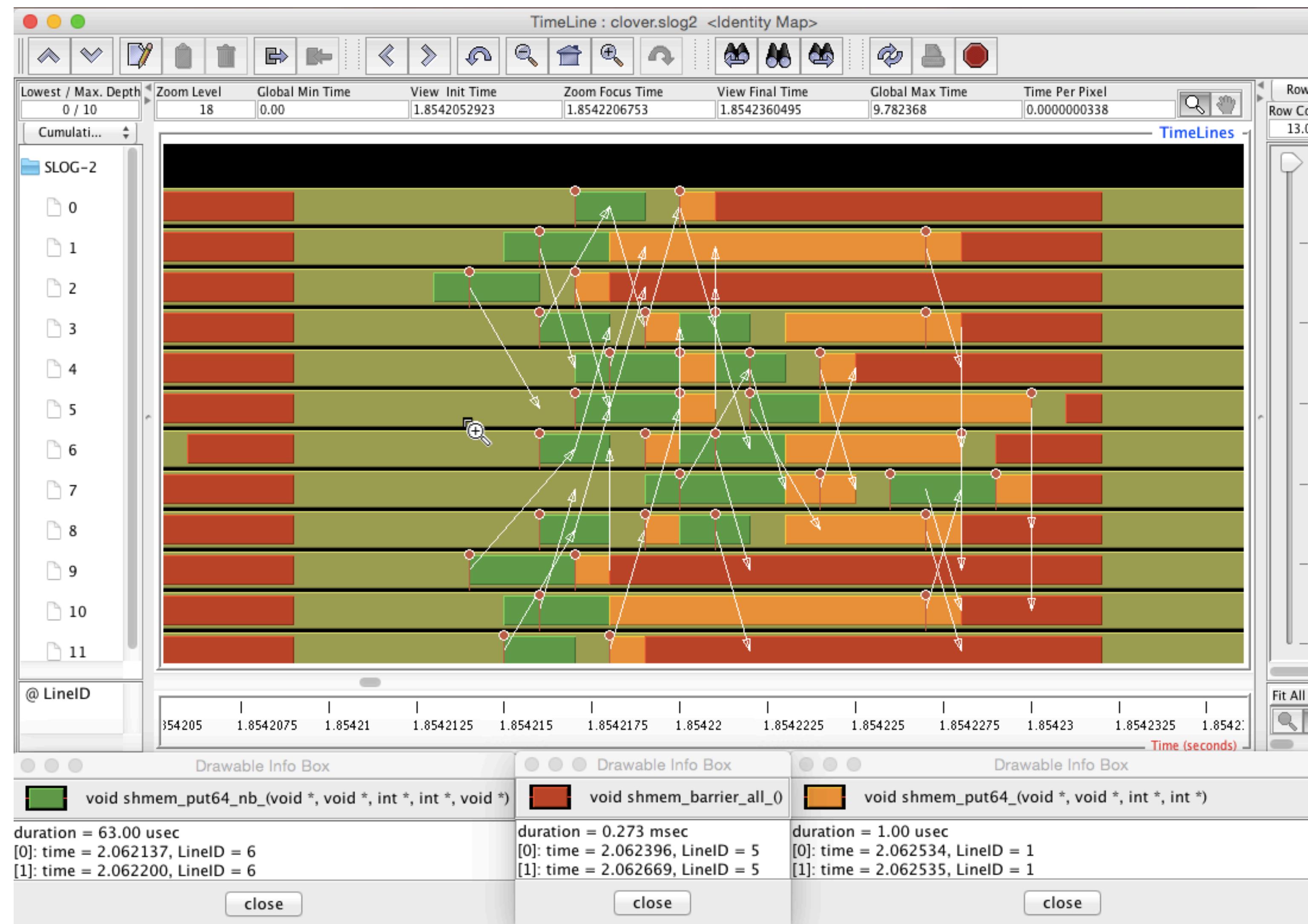
# Jumpshot

- Open source alternative to Vampir
- Developed by Argonne National Laboratory
- Packaged with TAU

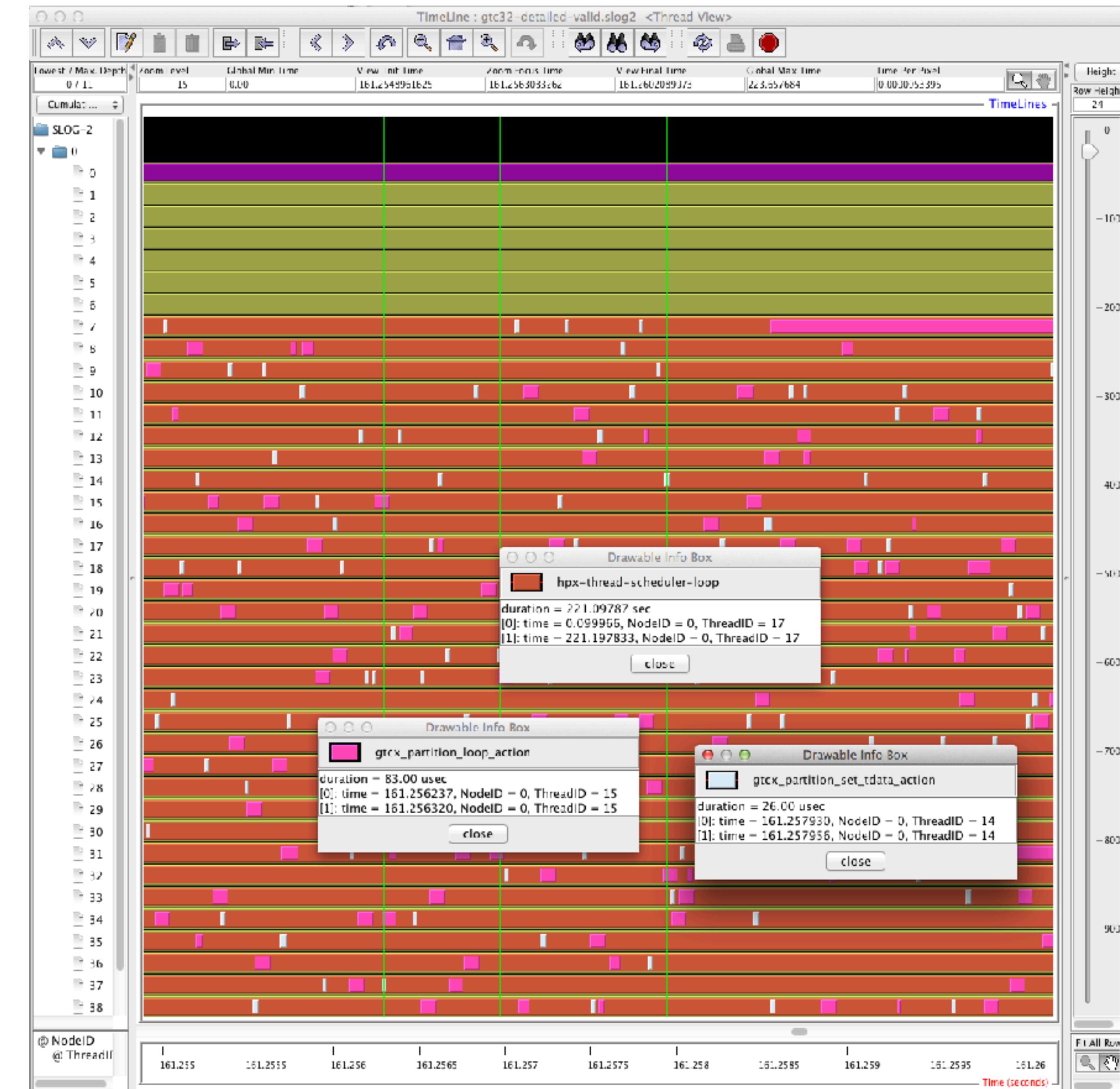
## Timeline charts

- Show application activities and communication along a time axis
- Shows boxes within boxes to show nesting of events

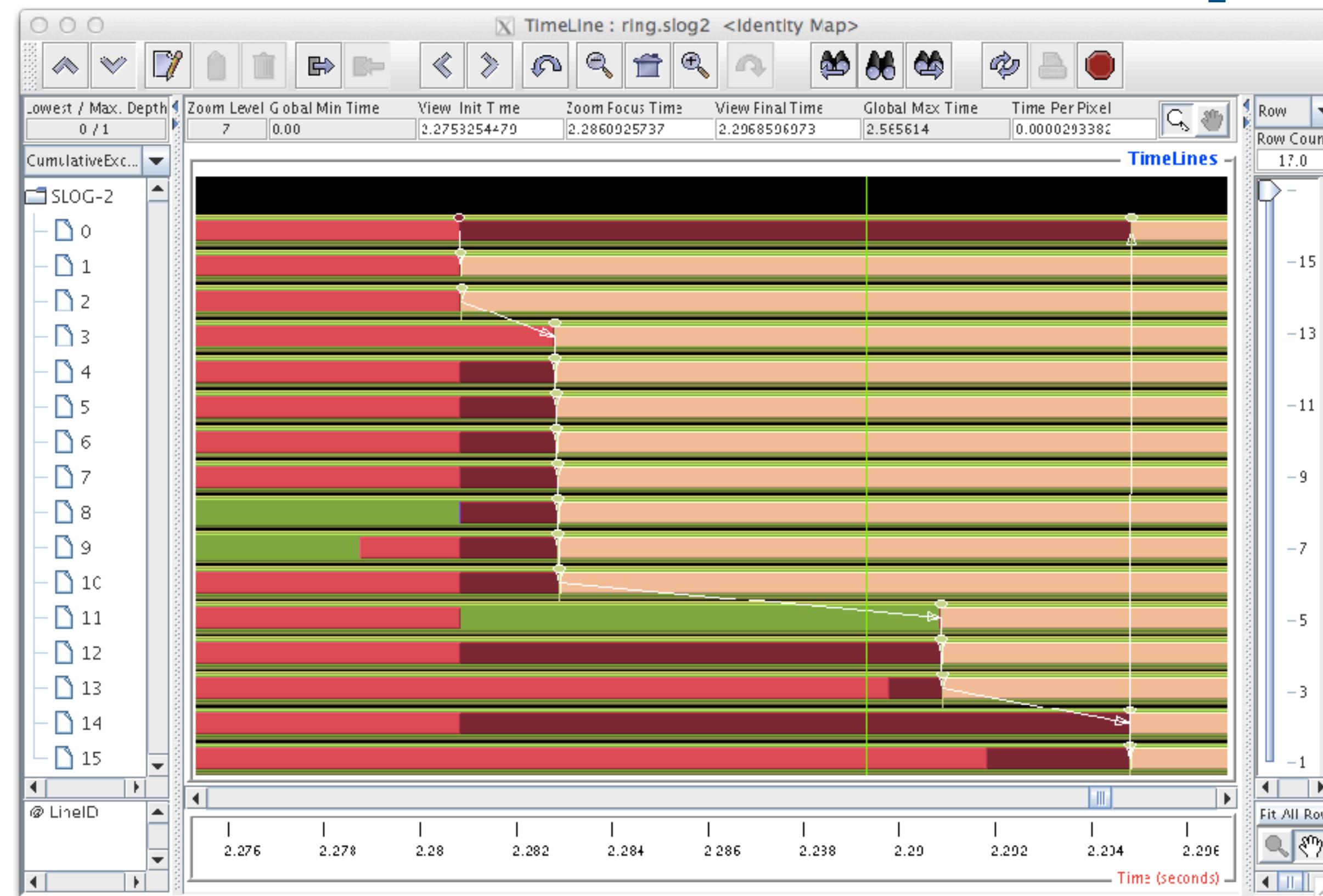
# Jumpshot



# Jumpshot Trace Visualizer in TAU



# Tracing Communication in Jumpshot



```
$ export TAU_MAKEFILE=$TAU_MAKEFILE_BASE-icpc-papi-mpi-pdt
$ cmake -DCMAKE_CXX_COMPILER=tau_cxx.sh; make -j 8
$ export TAU_TRACE=1
$ mpirun -np 16 ./a.out ; tau_treemerge.pl; tau2slog2 tau.trc tau.edf -o a.slog2
$ jumpshot a.slog2 &
```

# Generating Event Traces

```
% export TAU_MAKEFILE=$TAU/Makefile.tau-icpc-mpi-pdt  
% make F90=tau_f90.sh  
(Or edit Makefile and change F90=tau_f90.sh)
```

For Jumpshot:

```
% export TAU_TRACE=1  
% mpirun -np 64 ./a.out
```

```
% tau_treemerge.pl  
% tau_treemerge; tau2slog2 tau.trc tau.edf -o app.slog2;  
% jumpshot app.slog2 &
```

For Vampir:

```
% export TAU_TRACE_FORMAT=otf2  
# TAU's native OTF2 trace generation capability!  
% mpirun -np 64 ./a.out  
% vampir traces.otf2 &
```

For ParaVer:

```
% tau_convert -paraver tau.trc tau.edf app.prv; paraver app.prv
```

# Trace: Browser

# Chrome Browser

```
% export TAU_MAKEFILE=$TAU/Makefile.tau-icpc-mpi-pdt  
% make F90=tau_f90.sh  
(Or edit Makefile and change F90=tau_f90.sh)
```

For Chrome:

```
% export TAU_TRACE=1  
% srun -n 64 ./a.out  
  
% tau_treemerge.pl  
% tau_trace2json tau.trc tau.edf -chrome -ignoreatomic -o app.json
```

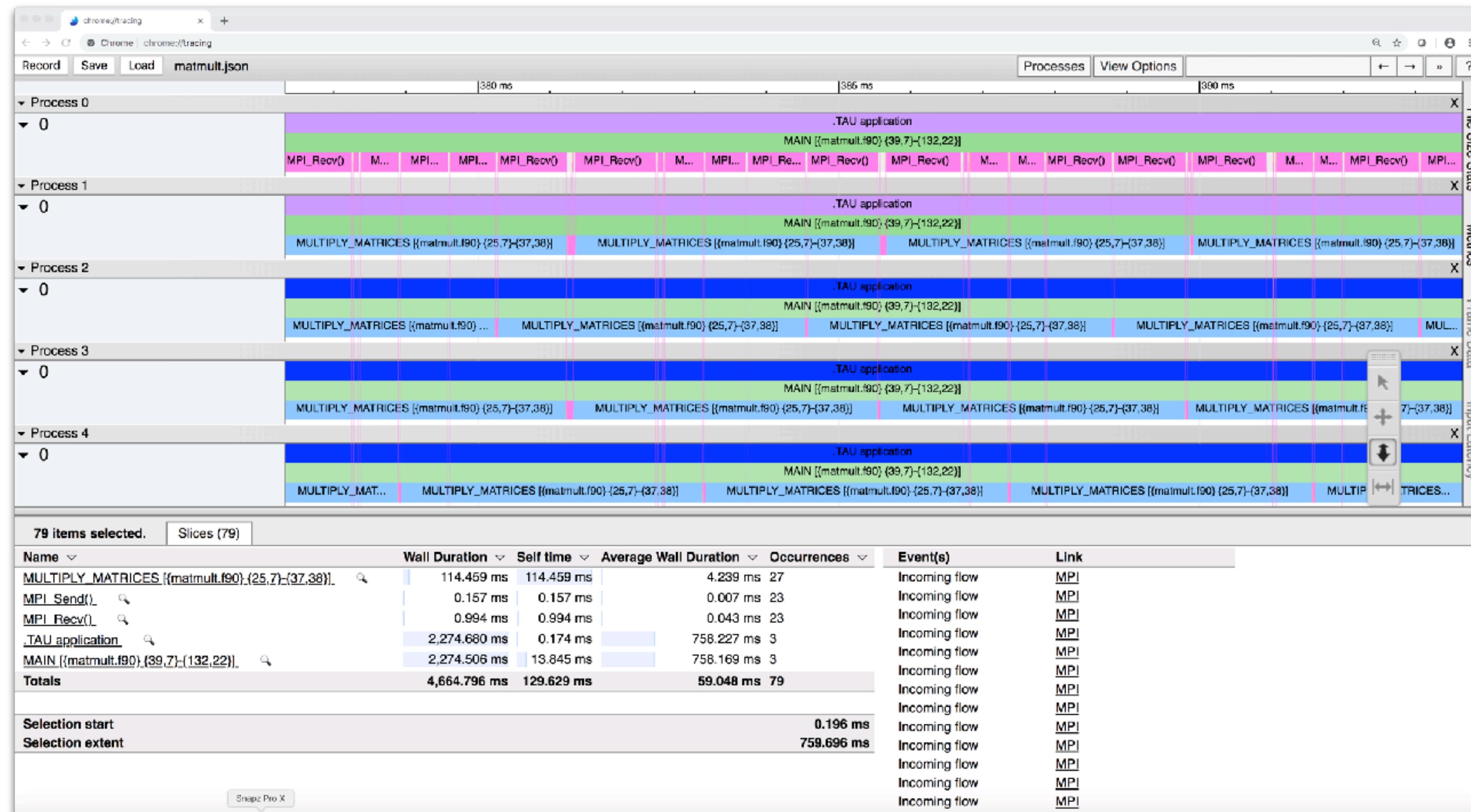
Copy app.json to your laptop and launch Chrome browser and in address:

chrome://tracing

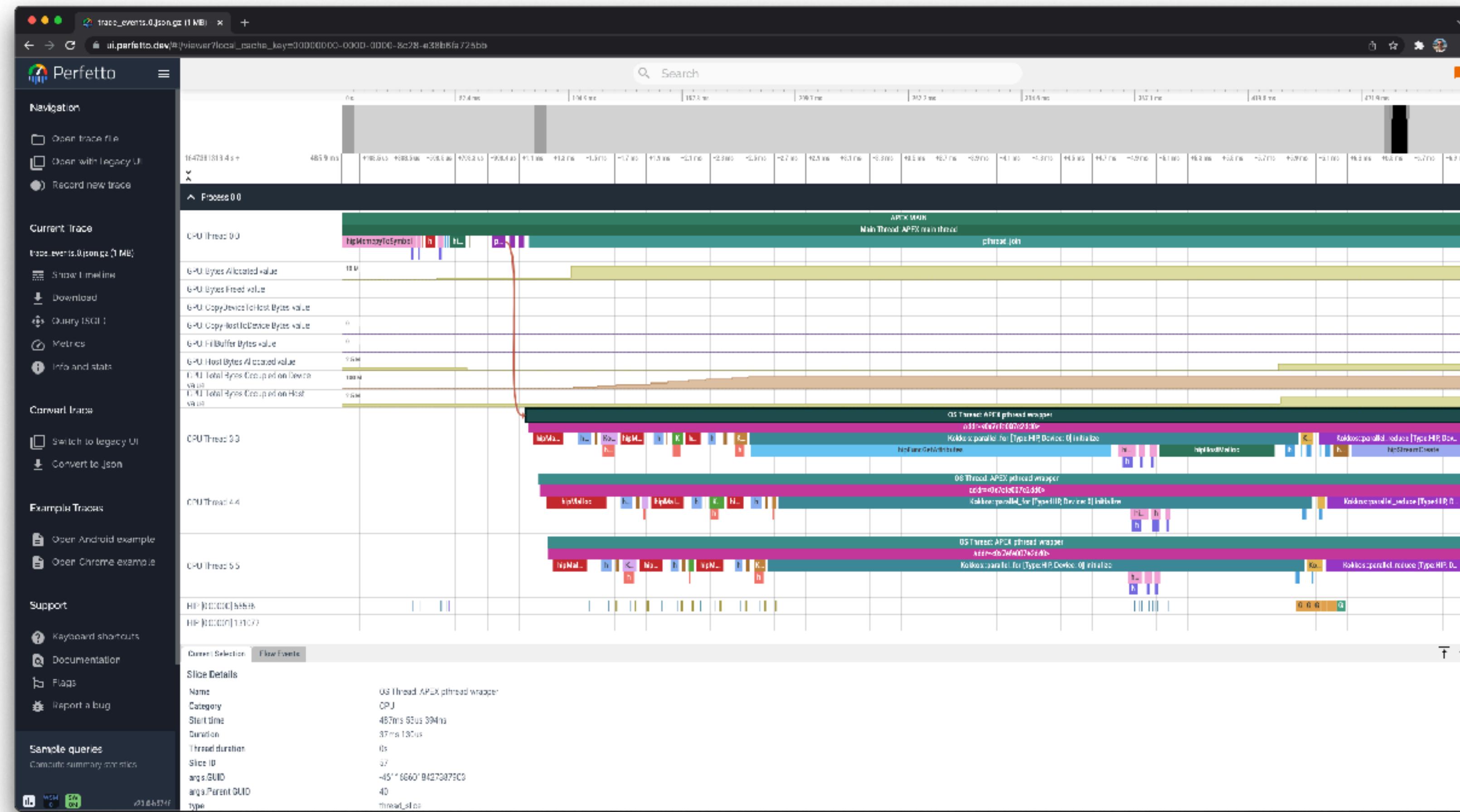
Load -> app.json

Newer tool: Perfetto.dev also reads the same json file (or .json.gz)

# Chrome Browser

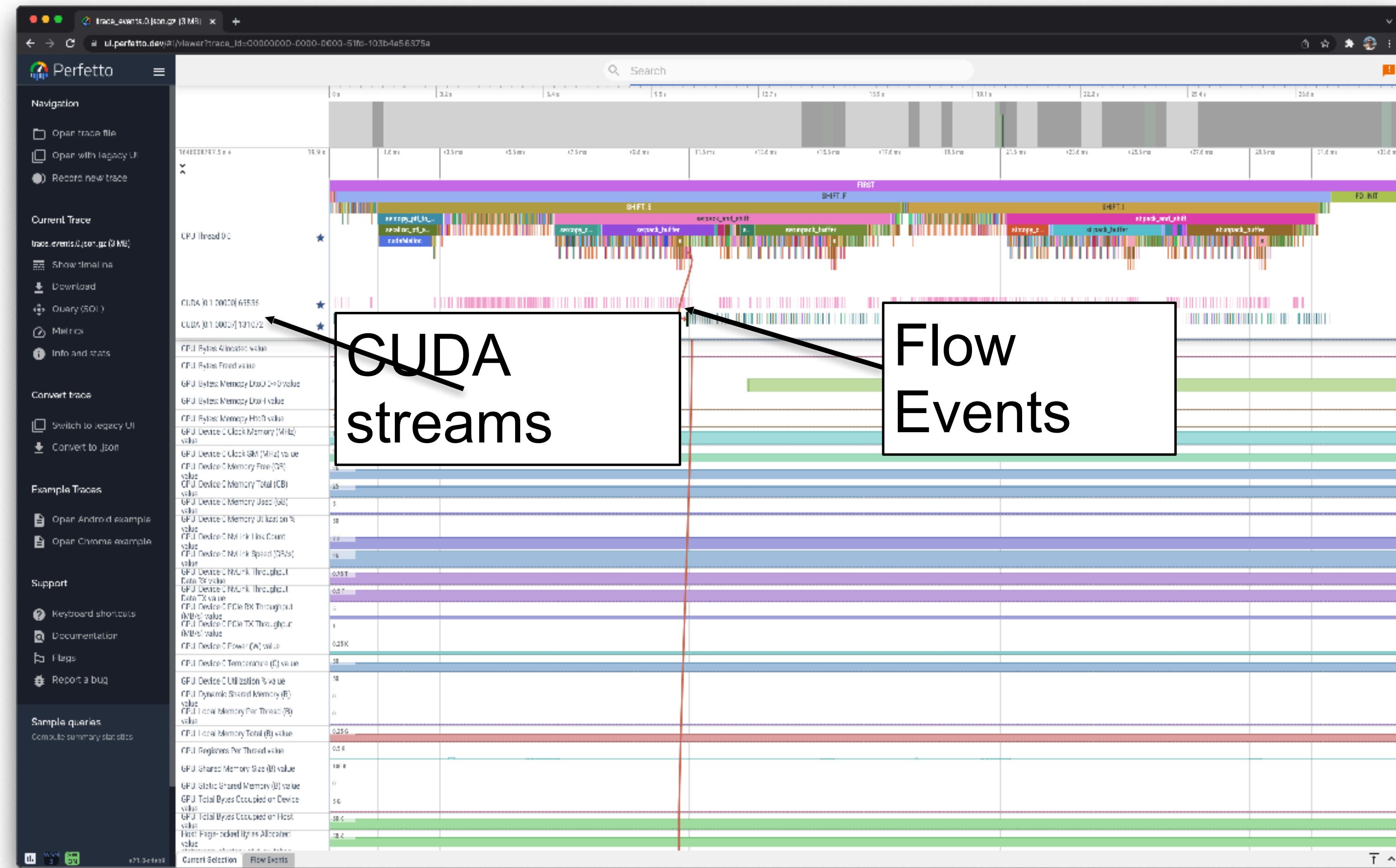


# Perfetto.dev Trace Browser: Kokkos



```
% export TAU_TRACE=1; mpirun -np 64 tau_exec ./a.out;
% tau_treemerge.pl;
% tau_trace2json tau.trc tau.edf -chrome -ignoreatomic -o app.json
```

# Perfetto.dev Trace Browser



```
% export TAU_TRACE=1; mpirun -np 64 tau_exec ./a.out;
% tau_treemerge.pl;
% tau_trace2json tau.trc tau.edf -chrome -ignoreatomic -o app.json
```

# TAU for Heterogeneous Measurement

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 <configuration tags> --cuhti ./a.out
% paraprof
```

# OpenACC with PGI compilers

Name	Exclusive...	Inclusive...	Calls	Child...
.TAU application	4.982	9.443	1	5,168
openacc_enqueue_upload bench_staggeredleapfrog2 [/storage]	0.694	3.35	3,700	29,867
cuMemcpyHtoDAsync_v2	2.47	2.47	3,700	0
cuEventRecord	0.06	0.06	7,400	0
cuDeviceGetCount	0.032	0.032	7,401	0
cuEventElapsedTime	0.031	0.031	3,700	0
cuCtxSynchronize	0.031	0.031	3,700	0
cuEventSynchronize	0.028	0.028	3,700	0
cuDeviceGetAttribute	0.002	0.002	249	0
cuDeviceGetName	0	0	3	0
cuDeviceTotalMem_v2	0	0	3	0
cuCtxGetDevice	0	0	1	0
cuEventCreate	0	0	2	0
cuDeviceGet	0	0	3	0
cuDriverGetVersion	0	0	1	0
cuCtxGetCurrent	0	0	2	0
cuCtxGetApiVersion	0	0	1	0
culnt	0	0	1	0
openacc_enqueue_download bench_staggeredleapfrog2 [/storage]	0.116	0.556	600	5,407
cuMemcpyDtoHAsync_v2	0.405	0.405	600	0
cuEventRecord	0.013	0.013	1,800	0
cuDeviceGetCount	0.005	0.005	1,200	0

```
$ configure --c++=pgCC --cc=pgcc --fortran=pgi ...
$ tau_exec -T pgi -openacc -cupti ./a.out
```

# Tracking OpenACC Data Transfers

Name	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
.TAU application						
openacc_enqueue_upload bench_staggeredleapfrog2 [{/s1]						
cuMemcpyHtoDAsync_v2						
[GROUP=MAX_MARKER] Bytes copied from Host to Device	512,000	1	512,000	512,000	512,000	0
Bytes copied from Host to Device	973,016,000	3,700	512,000	120	262,977.297	255,846.506
openacc_enqueue_download bench_staggeredleapfrog2 [{						
cuMemcpyDtoHAsync_v2						
Bytes copied from Device to Host	307,200,000	600	512,000	512,000	512,000	0
Bytes copied from Device to Host	307,200,000	600	512,000	512,000	512,000	0
Bytes copied from Host to Device	973,016,000	3,700	512,000	120	262,977.297	255,846.506
[GROUP=MAX_MARKER] Bytes copied from Host to Device	512,000	1	512,000	512,000	512,000	0

```
% configure --c++=pgCC --cc=pgcc --fortran=pgi ...
% tau_exec -T pgi -openacc -cupti ./a.out
Context events show extent of variation
```

# TAU Architecture and Workflow

**Instrumentation:** Add 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

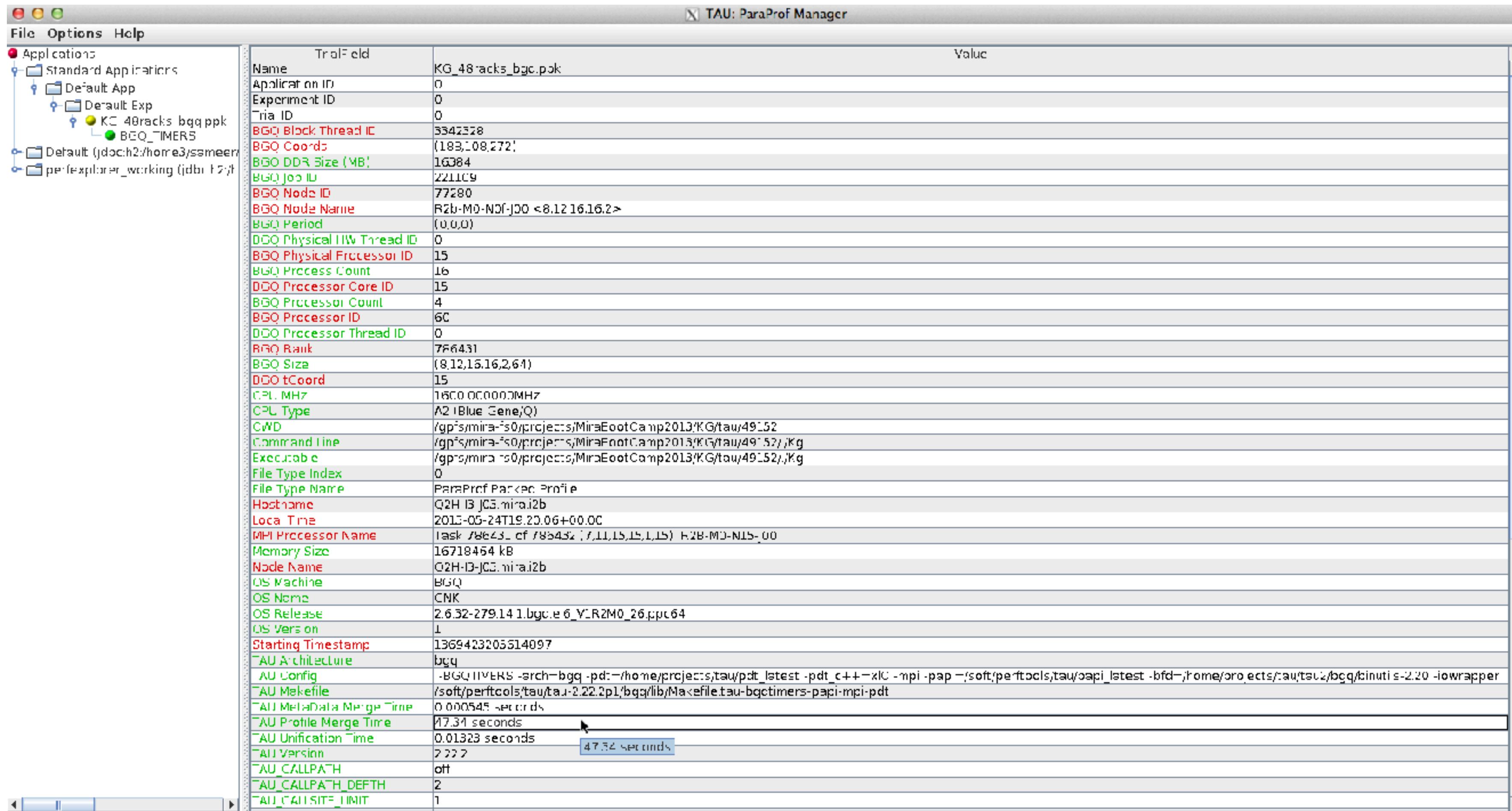
**Measurement:** Profiling or tracing using various metrics

- 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 (e.g. PAPI hw performance counter library)

**Analysis:** Visualization of profiles and traces

- 3D visualization of profile data in paraprof or perfexplorer tools
- Trace conversion & display in external visualizers (Vampir, Jumpshot, ParaVer)

# TAU's Runtime Merging of Profile Data



The screenshot shows the TAU ParaProf Manager application window. The left sidebar displays a tree view of applications, with the 'Default App' node expanded to show 'Default Exp' and 'KC\_40racks\_bgq\_ppk'. The main pane is a table titled 'ParaProf' with columns 'Trait/eld' and 'Value'. The table contains numerous entries related to the profile data, including system configuration (e.g., BGQ Block Thread ID, BGQ Coords, BGQ Job ID, BGQ Node ID, BGQ Node Name, BGQ Period, DDO Physical HW Thread ID, BGQ Physical Processor ID, BGQ Process Count, BGQ Processor Core ID, BGQ Processor Count, BGQ Processor ID, DDO Processor Thread ID, BGQ Rank, BGQ Size, DDO tCoord, CPL MHZ, CPL Type, CWD, Command Line, Executable, File Type Index, File Type Name, Hostname, Local Time, MPI Processor Name, Memory Size, Node Name, OS Machine, OS Name, OS Release, OS Version, Starting Timestamp, TAU Architecture, TAU Config, TAU Makefile, All MetaData Merge Time, All Profile Merge Time, All Unification Time, All Version, TAU\_CALLPATH, TAU\_CALLPATH\_DEPTH, TAU\_CALLSITE\_LIMIT). The 'All Profile Merge Time' row shows a value of 47.34 seconds, which is highlighted with a blue selection bar.

Trait/eld	Value
Name	KC_40racks_bgq_ppk
Application ID	0
Experiment ID	0
Job ID	0
BGQ Block Thread ID	3342328
BGQ Coords	(183,108,272)
BGQ DDR Size (MB)	16384
BGQ Job ID	221109
BGQ Node ID	77280
BGQ Node Name	R2b-M0-N0f-J0 <8.12.16.16.2>
BGQ Period	(0.0,0)
DDO Physical HW Thread ID	0
BGQ Physical Processor ID	15
BGQ Process Count	16
BGQ Processor Core ID	15
BGQ Processor Count	4
BGQ Processor ID	6C
DDO Processor Thread ID	0
BGQ Rank	786431
BGQ Size	(8.12,15.16,2.64)
DDO tCoord	15
CPL MHZ	1600.000000MHZ
CPL Type	A2 (Blue Gene/Q)
CWD	/gpfs/mira-fs0/projects/MiraEoTCamp2013/KG/tau/49152
Command Line	/gpfs/mira-fs0/projects/MiraEoTCamp2013/KG/tau/49152/
Executable	/gpfs/mira-fs0/projects/MiraEoTCamp2013/KG/tau/49152/
File Type Index	0
File Type Name	ParaProf Packaged Profile
Hostname	G2H13-JC3.mira12b
Local Time	2013-05-24T19:20:06+00:00
MPI Processor Name	Task /8643_cf /786432 ; 7,11,15,15,1,15) R2B-M0-N15-00
Memory Size	16718454 kB
Node Name	G2H13-JC3.mira12b
OS Machine	BGQ
OS Name	CNK
OS Release	2.6.32-279.14.1.bgqe.6_V_R2M0_26.ppc64
OS Version	1
Starting Timestamp	1369423205514097
TAU Architecture	bgq
TAU Config	-BGQTIMERS -arch=bgq -pd:-/home/projects/tau/pdt_latest -pdt_c++ -xlc -mpi -papi -/soft/perf-tools/tau/capi_latest -bfd -/home/projects/tau/tarz/bcq/binutils-2.20 -lowrapper
TAU Makefile	/soft/perf-tools/tau/tau-2.22.2p1/bcq/lib/Makefile.tau-bqctimers-papi-mpi-pdt
All MetaData Merge Time	0.000045 seconds
All Profile Merge Time	47.34 seconds
All Unification Time	0.0123 seconds
All Version	2.22.2
TAU_CALLPATH	off
TAU_CALLPATH_DEPTH	2
TAU_CALLSITE_LIMIT	1

```
$ export TAU_PROFILE_FORMAT=merged
```

It took ~48 seconds to merge and write profiles from 786,432 ranks

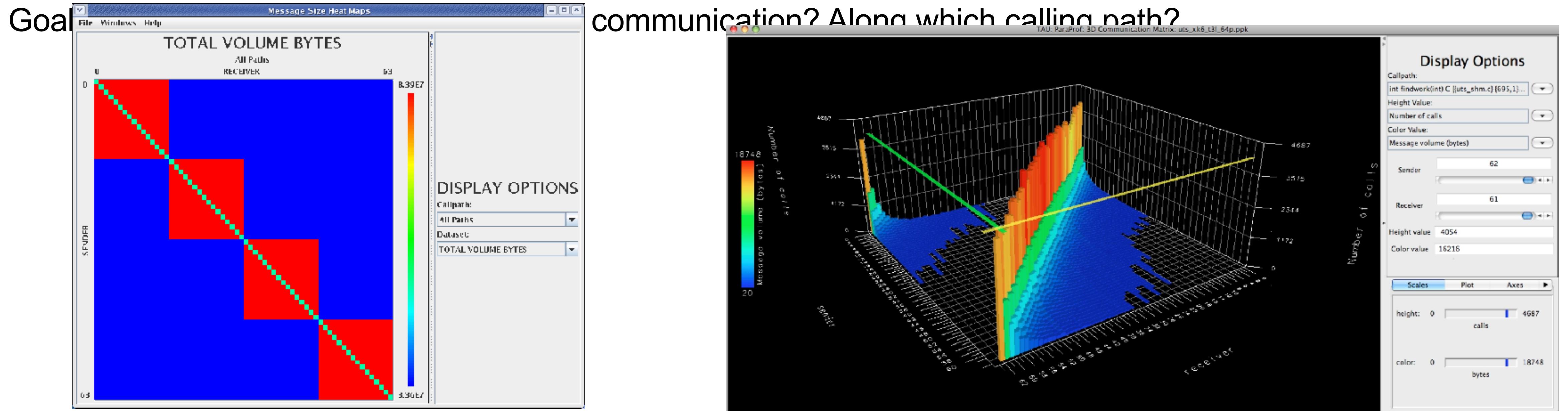
# Communication Matrix

# Generating Communication Matrix

```
% export TAU_MAKEFILE=$TAU_MAKEFILE_BASE-icpc-papi-mpi-pdt  
% make F90=tau_f90.sh  
(Or edit Makefile and change F90=tau_f90.sh)
```

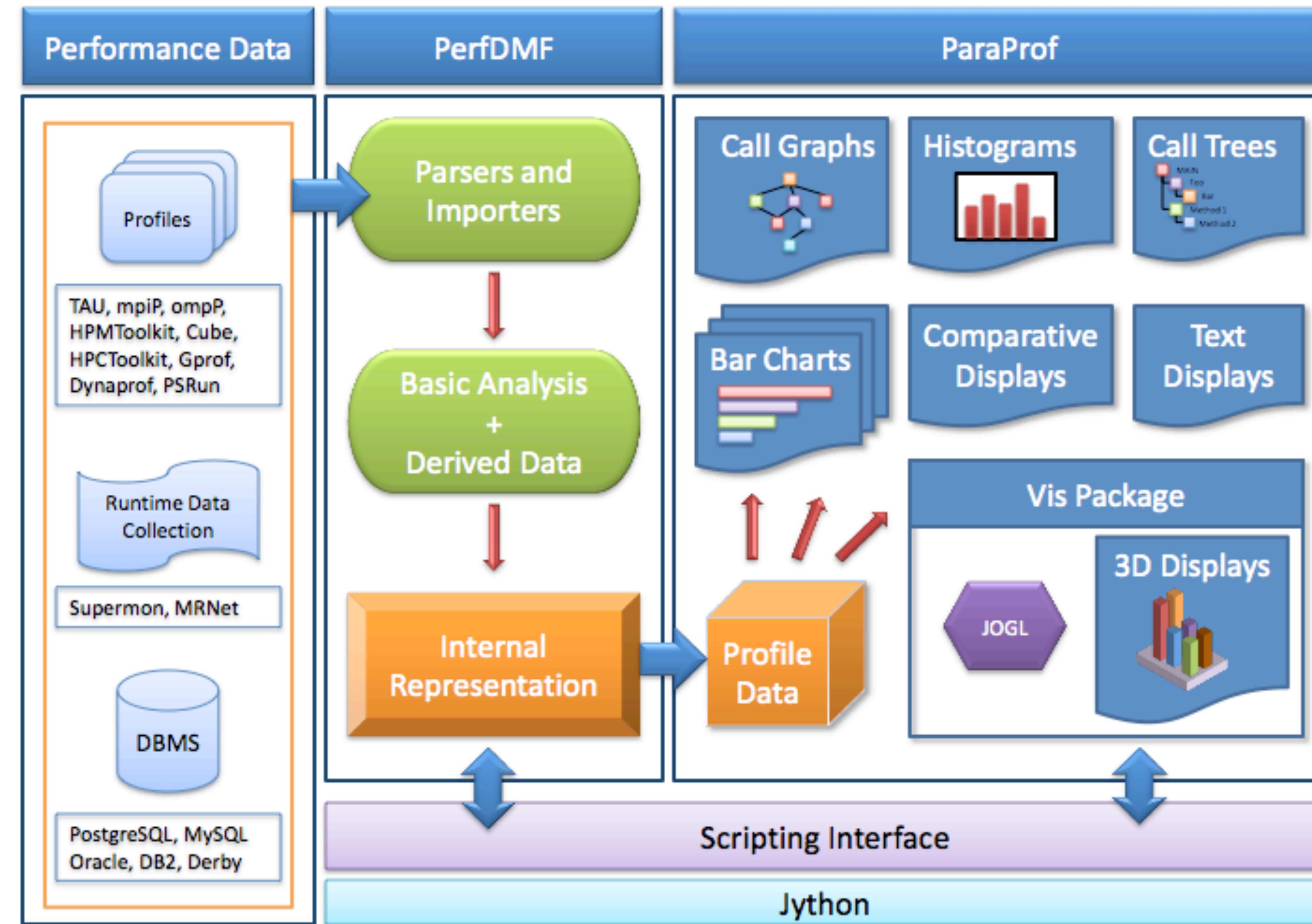
```
% export TAU_COMM_MATRIX=1  
% mpirun -np 4 ./a.out  
  
% paraprof  
(Windows -> Communication Matrix)  
(Windows -> 3D Communication Matrix)
```

# Communication Matrix Display

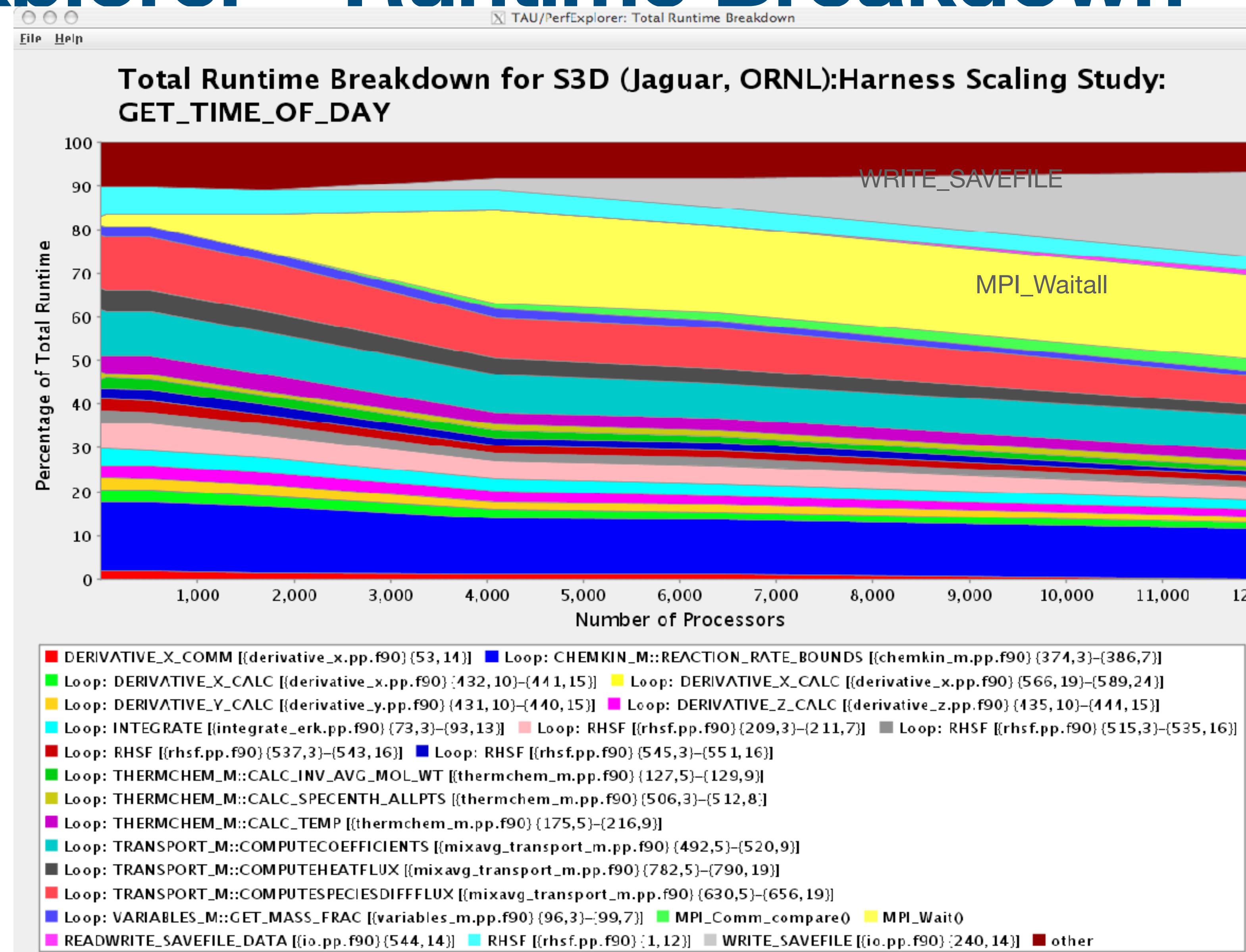


# Perf Explorer

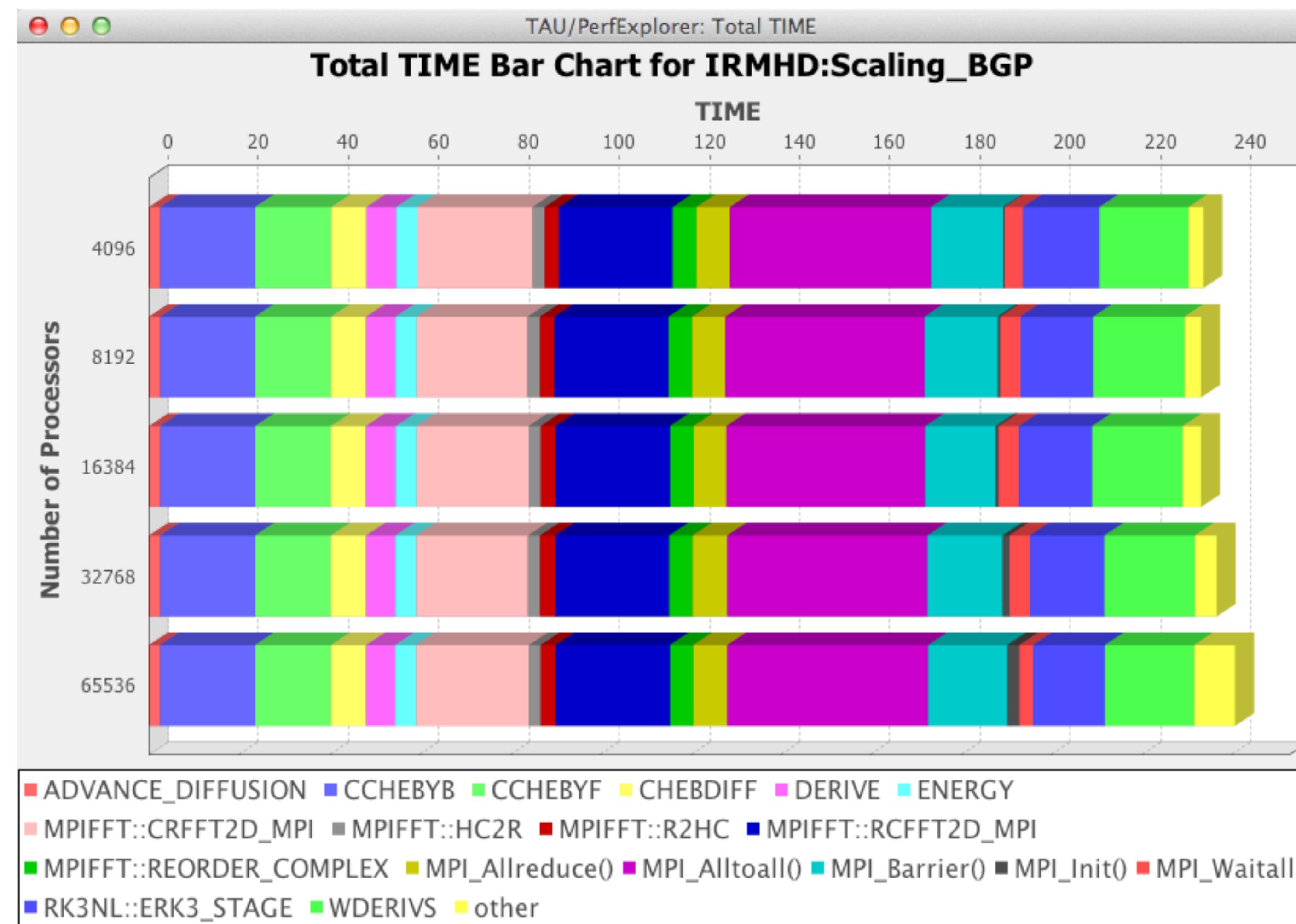
# ParaProf Profile Analysis Framework



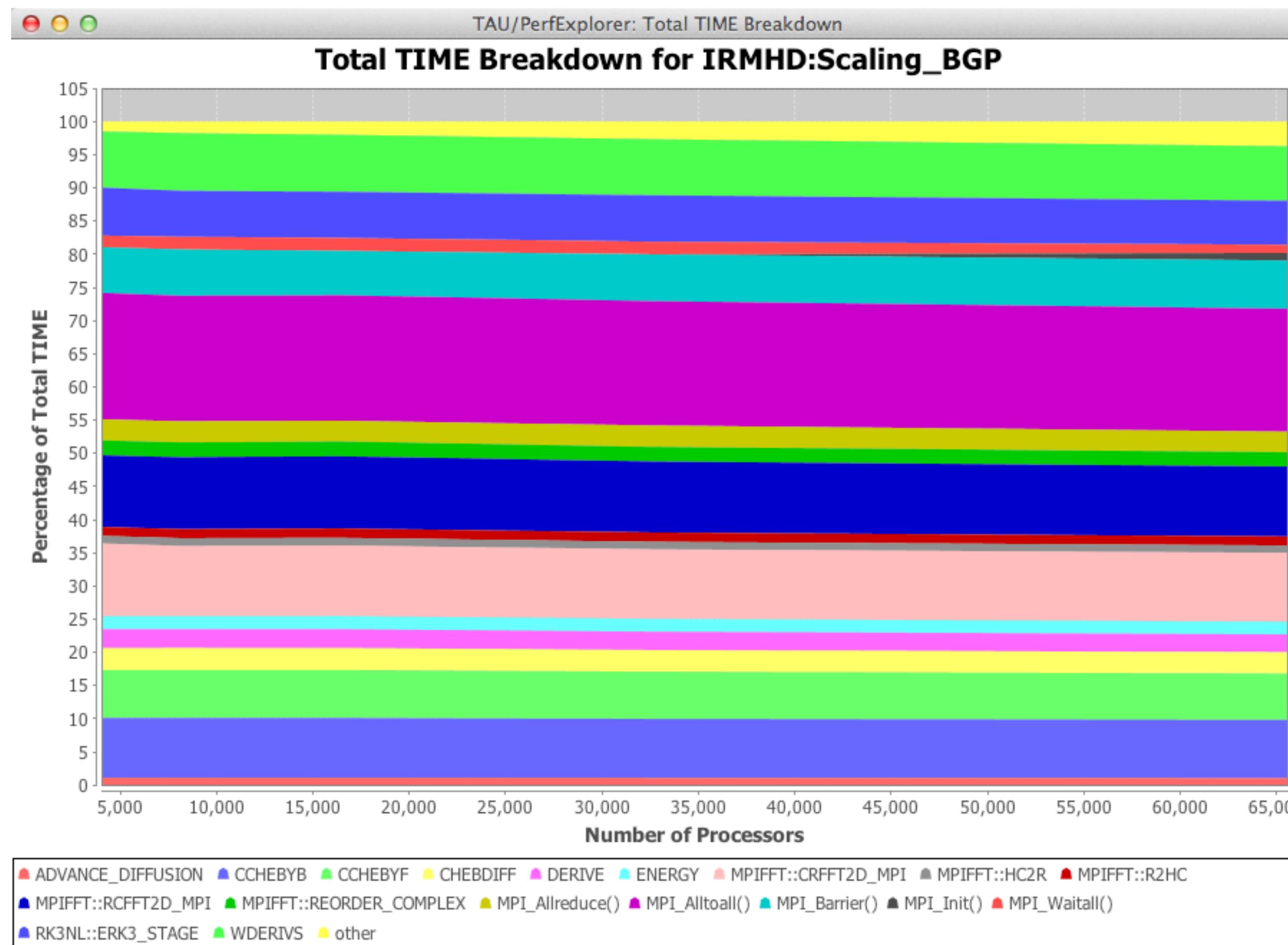
# PerfExplorer – Runtime Breakdown



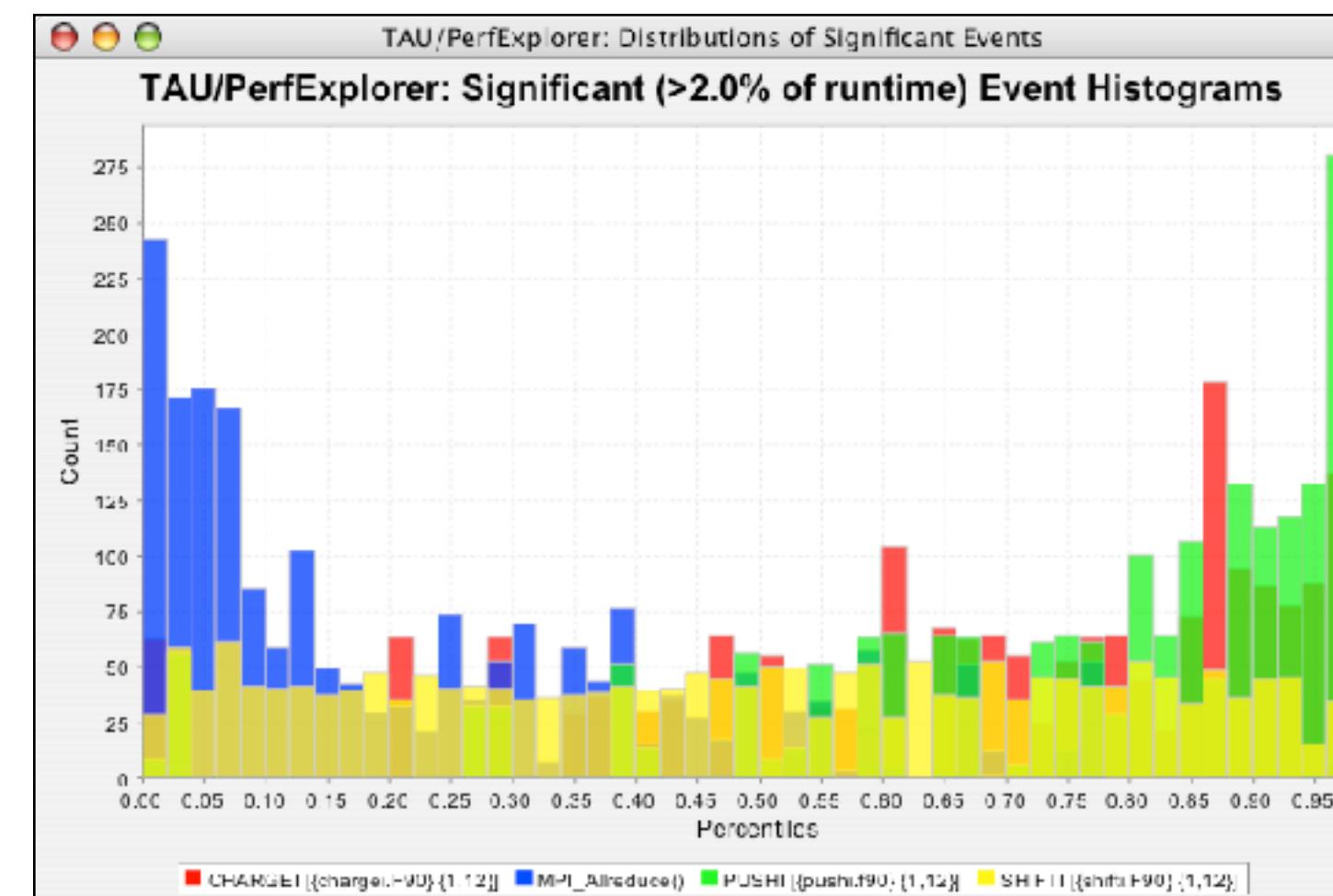
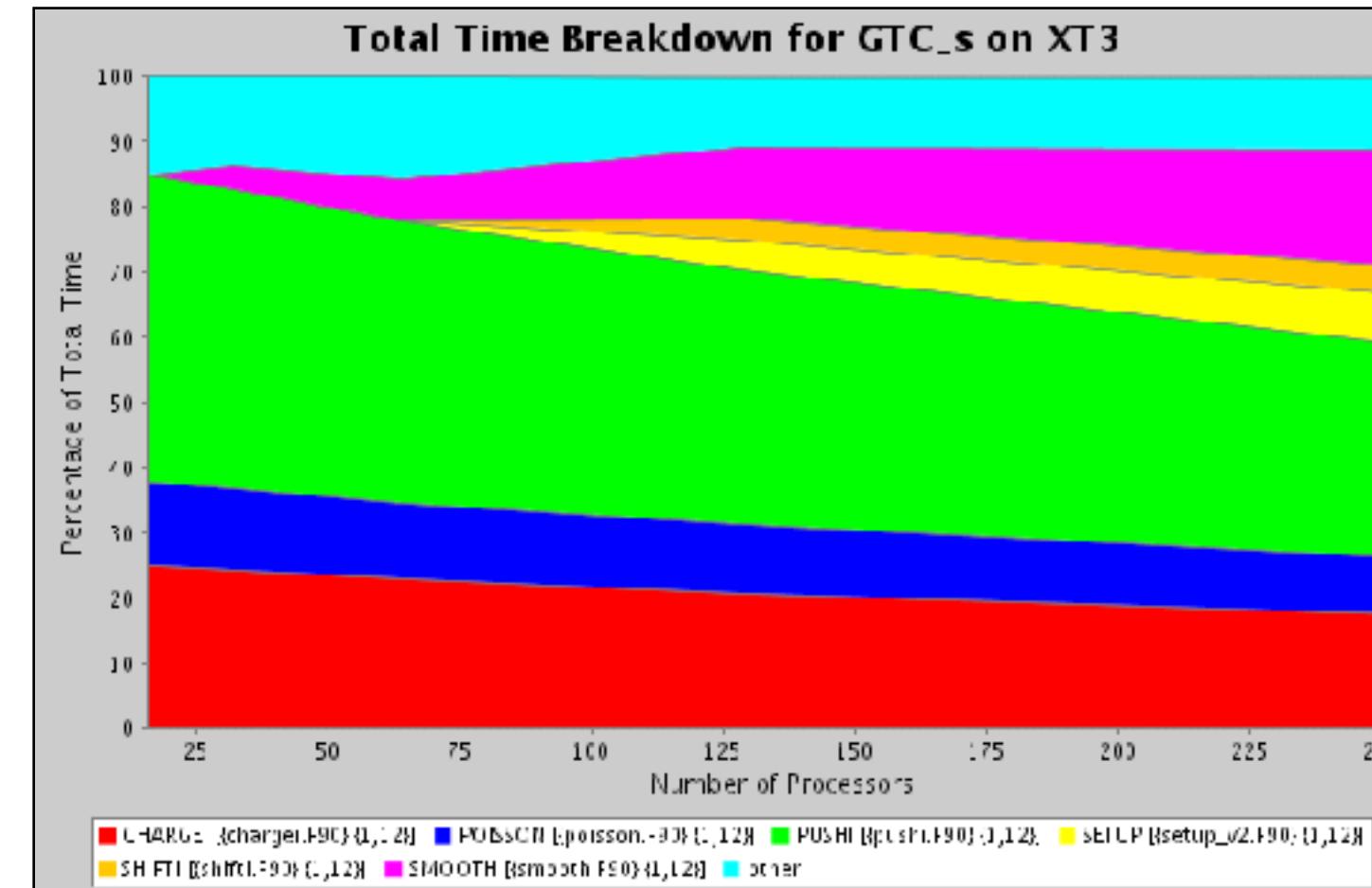
# Evaluate Scalability



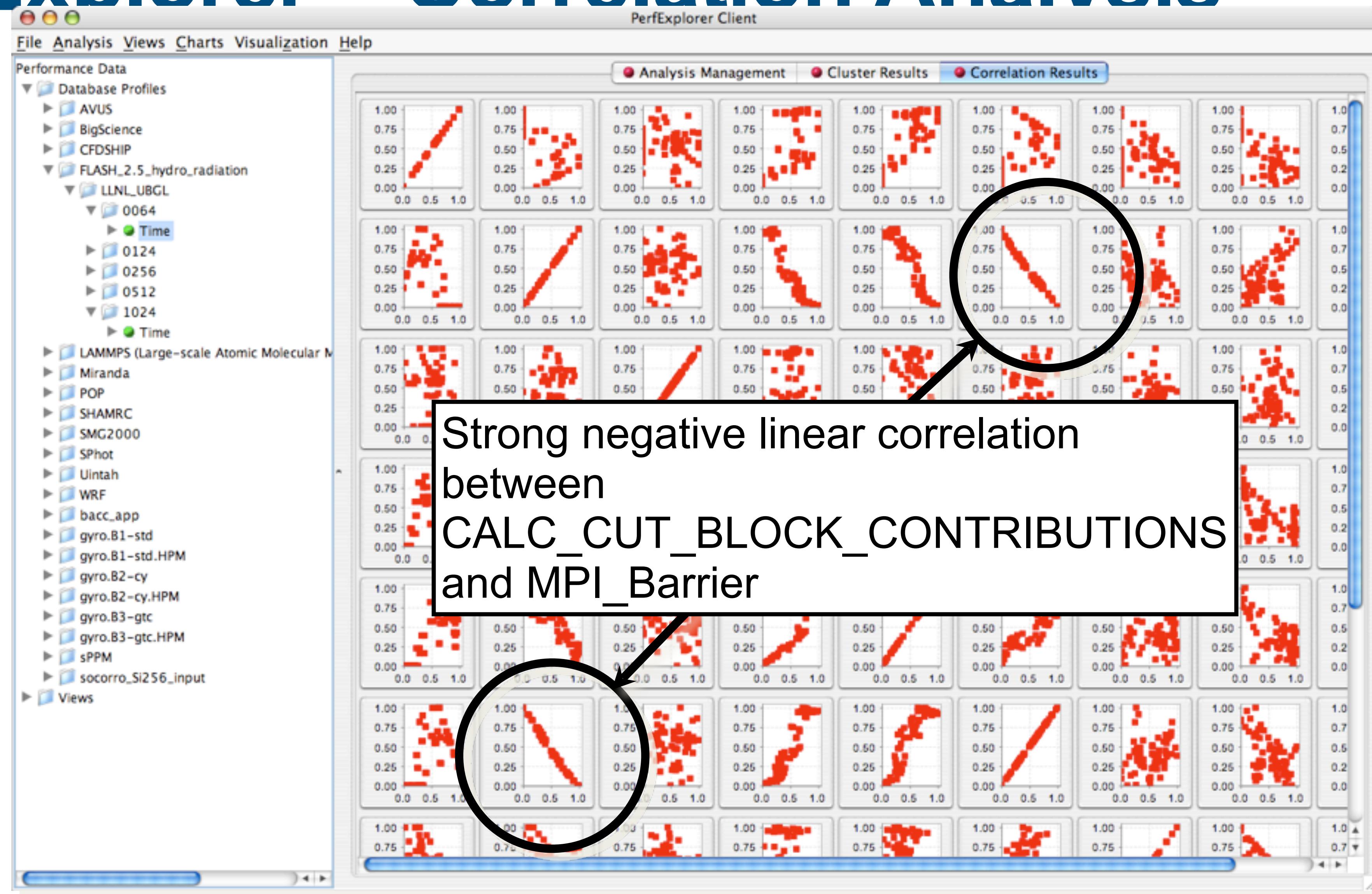
# Runtime Breakdown



# PerfExplorer – Relative Comparisons

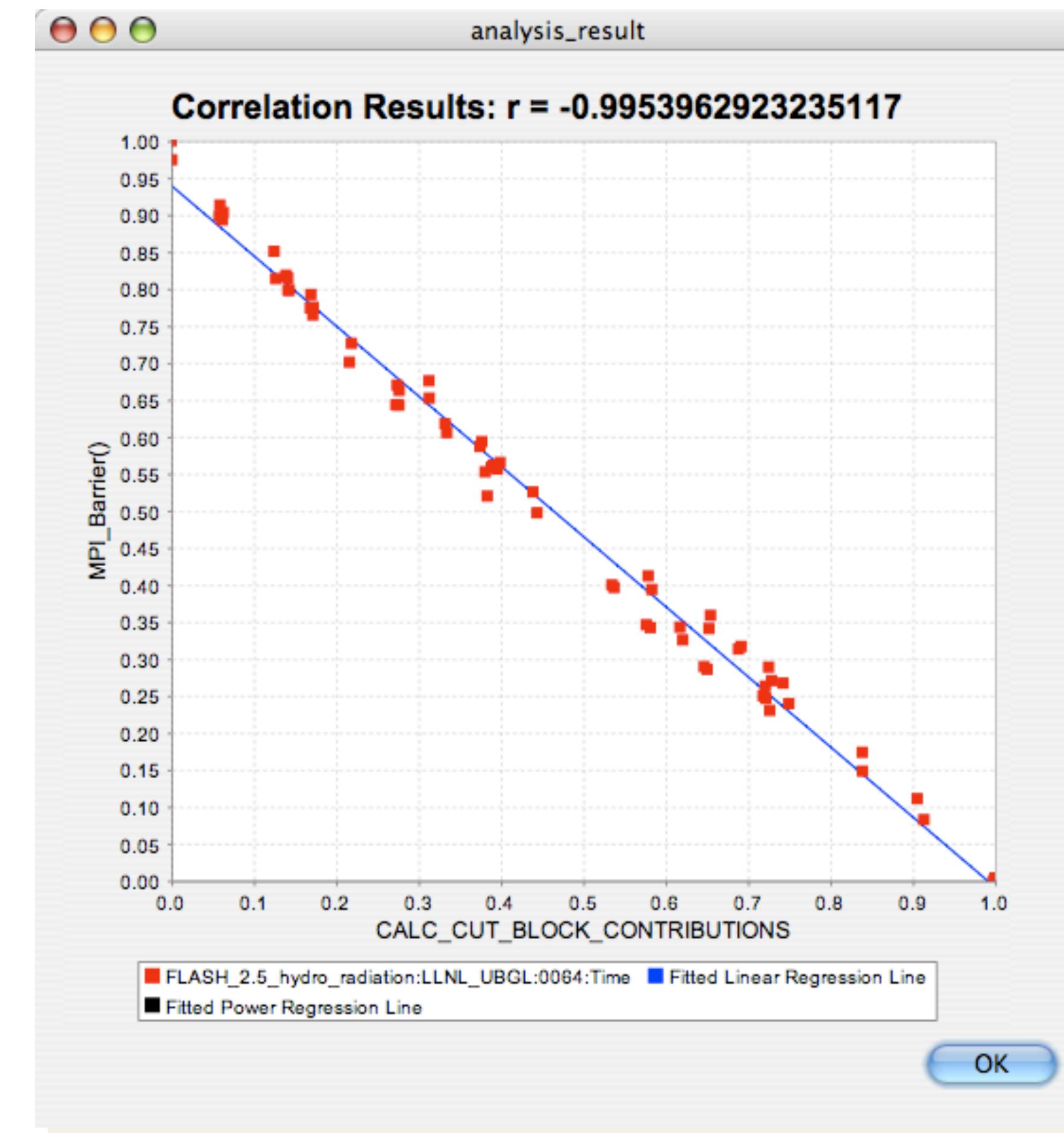


# PerfExplorer – Correlation Analysis

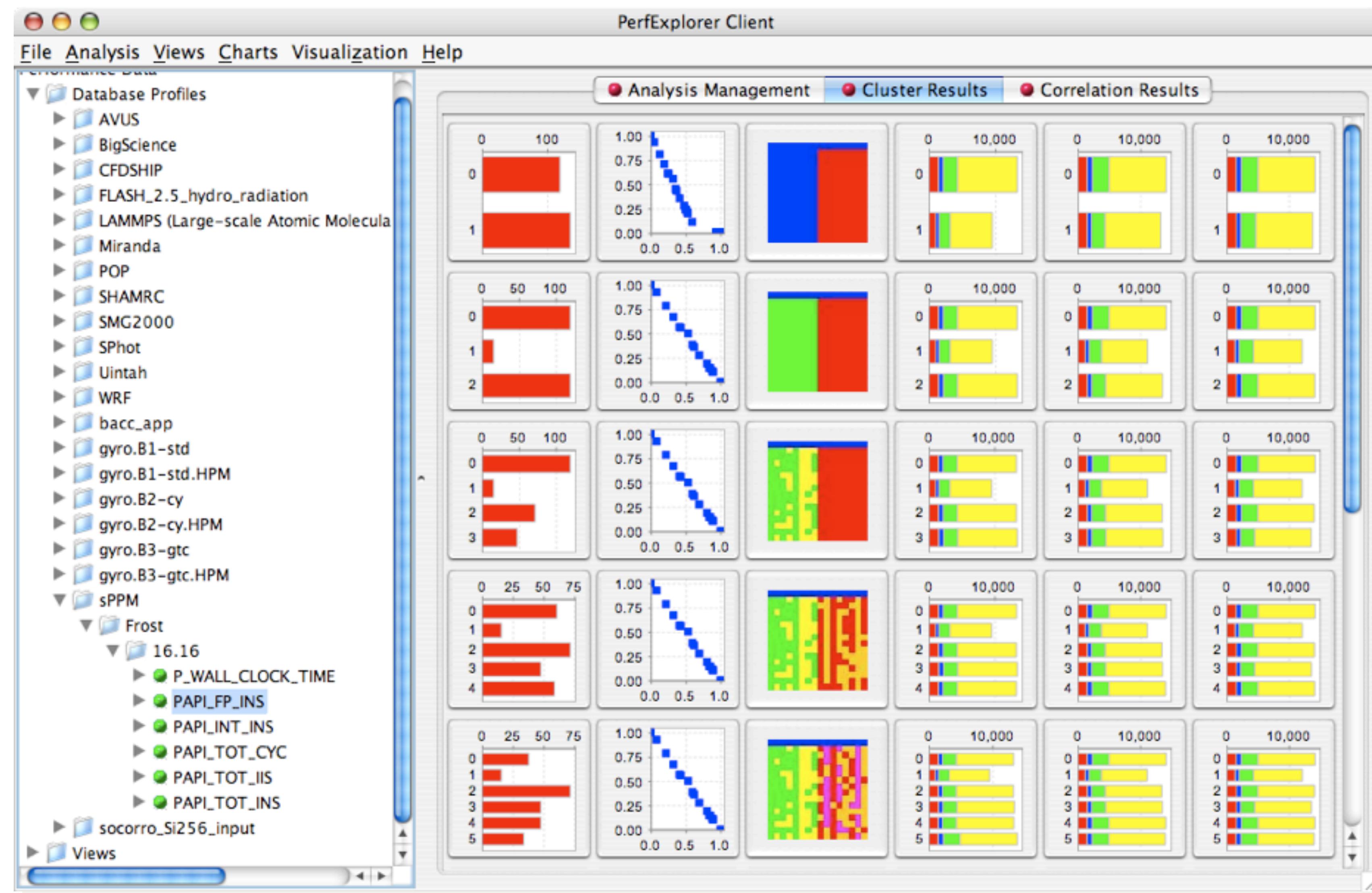


Data: FLASH on BGL(LLNL), 64 nodes

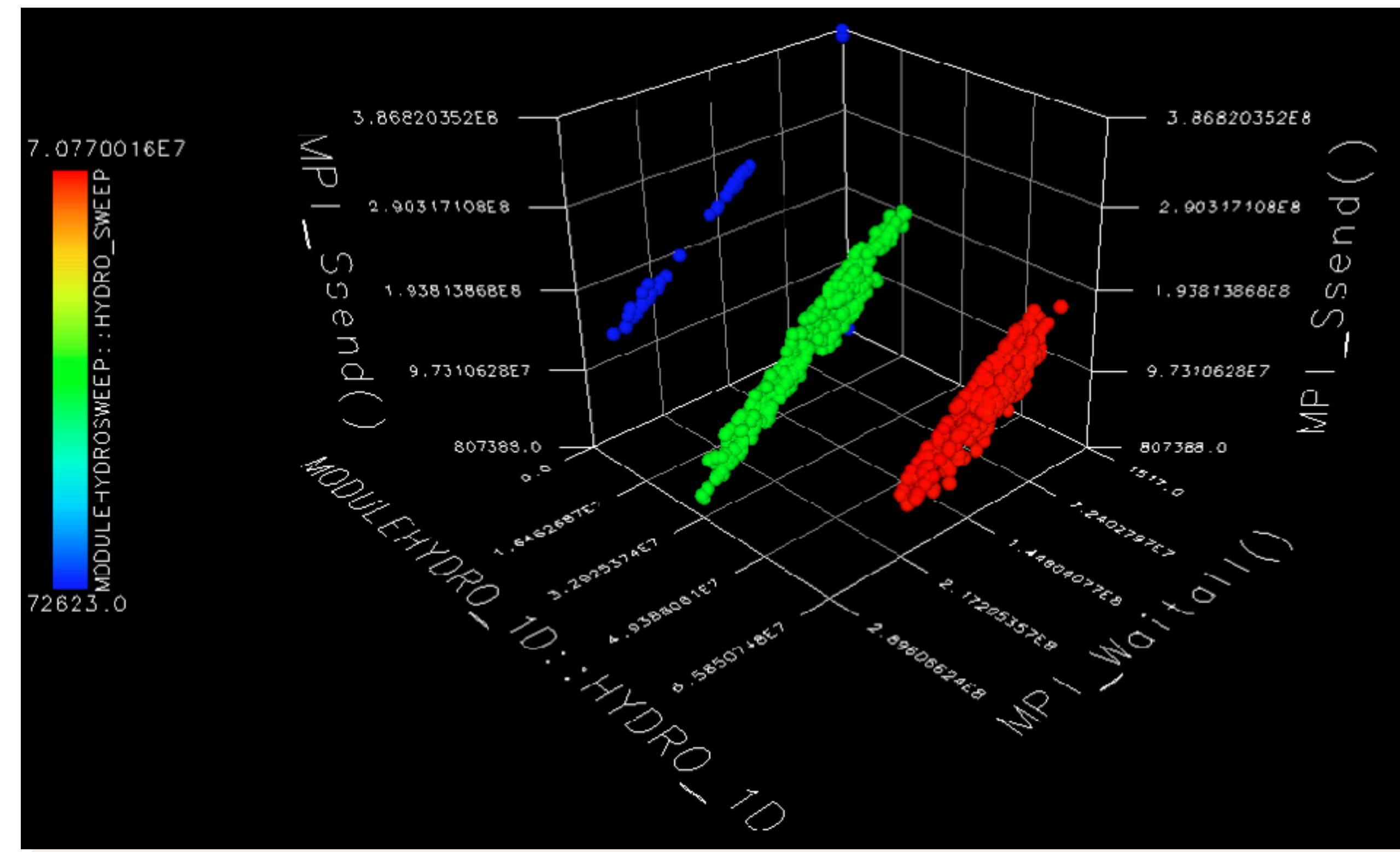
# PerfExplorer – Correlation Analysis



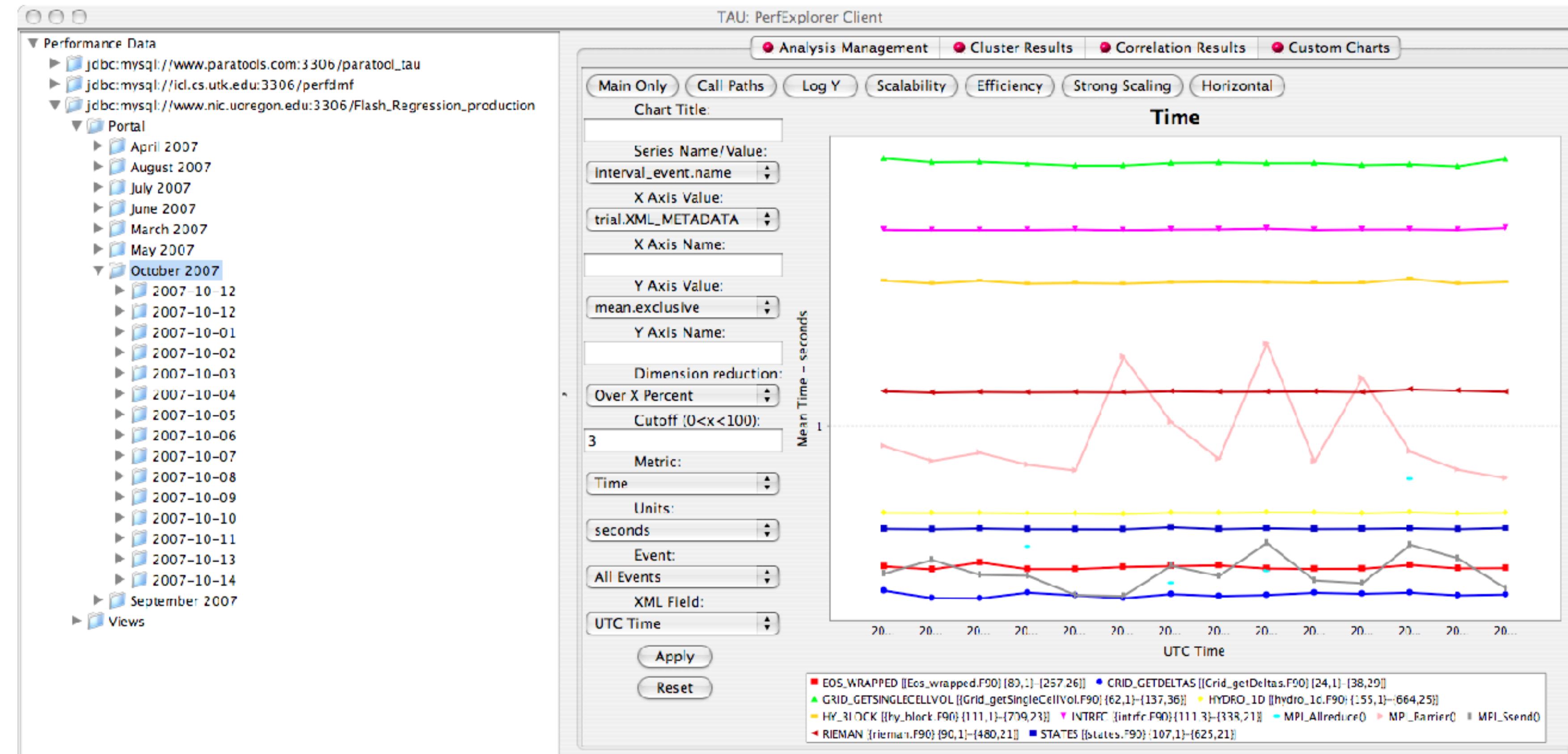
# PerfExplorer – Cluster Analysis



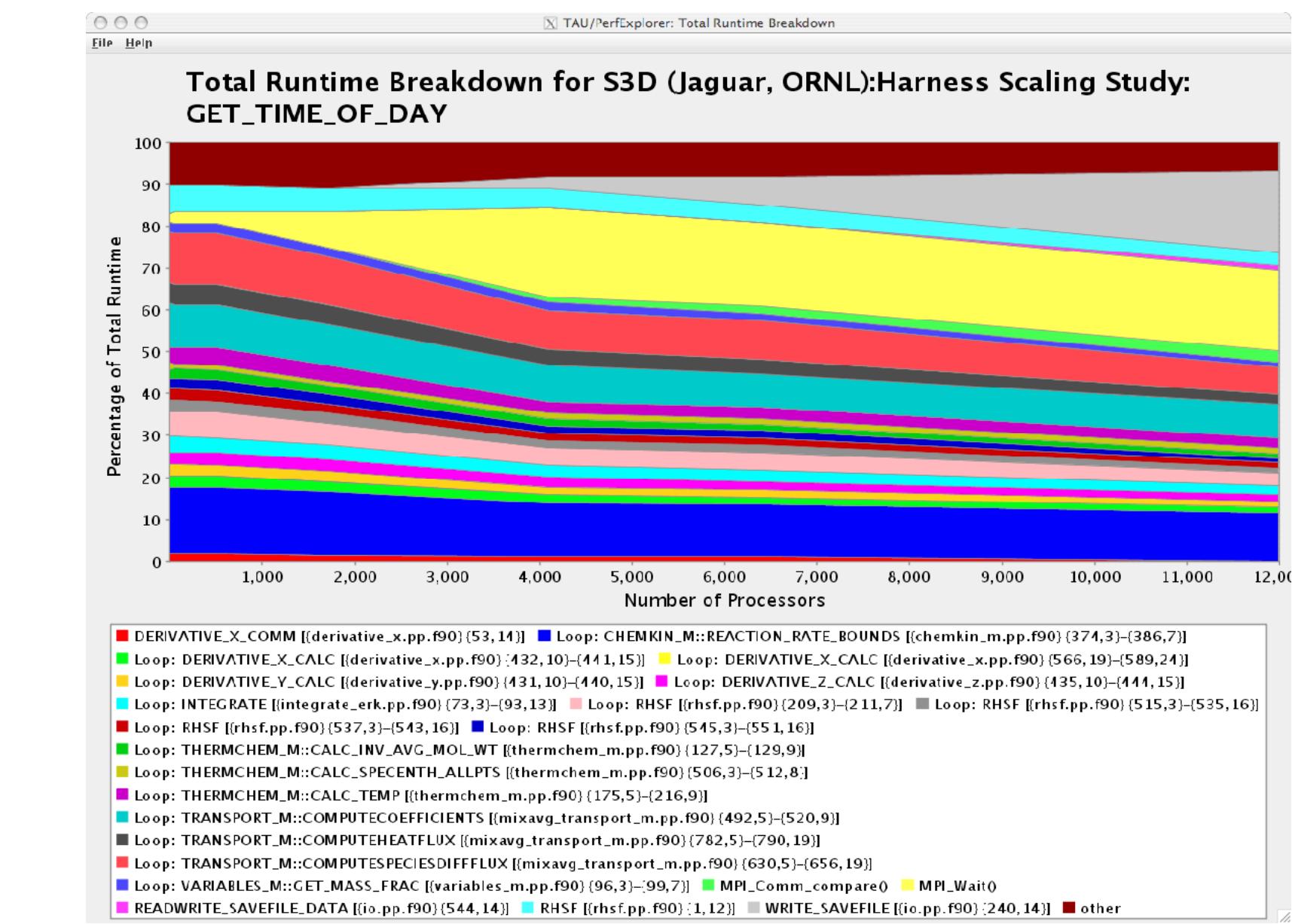
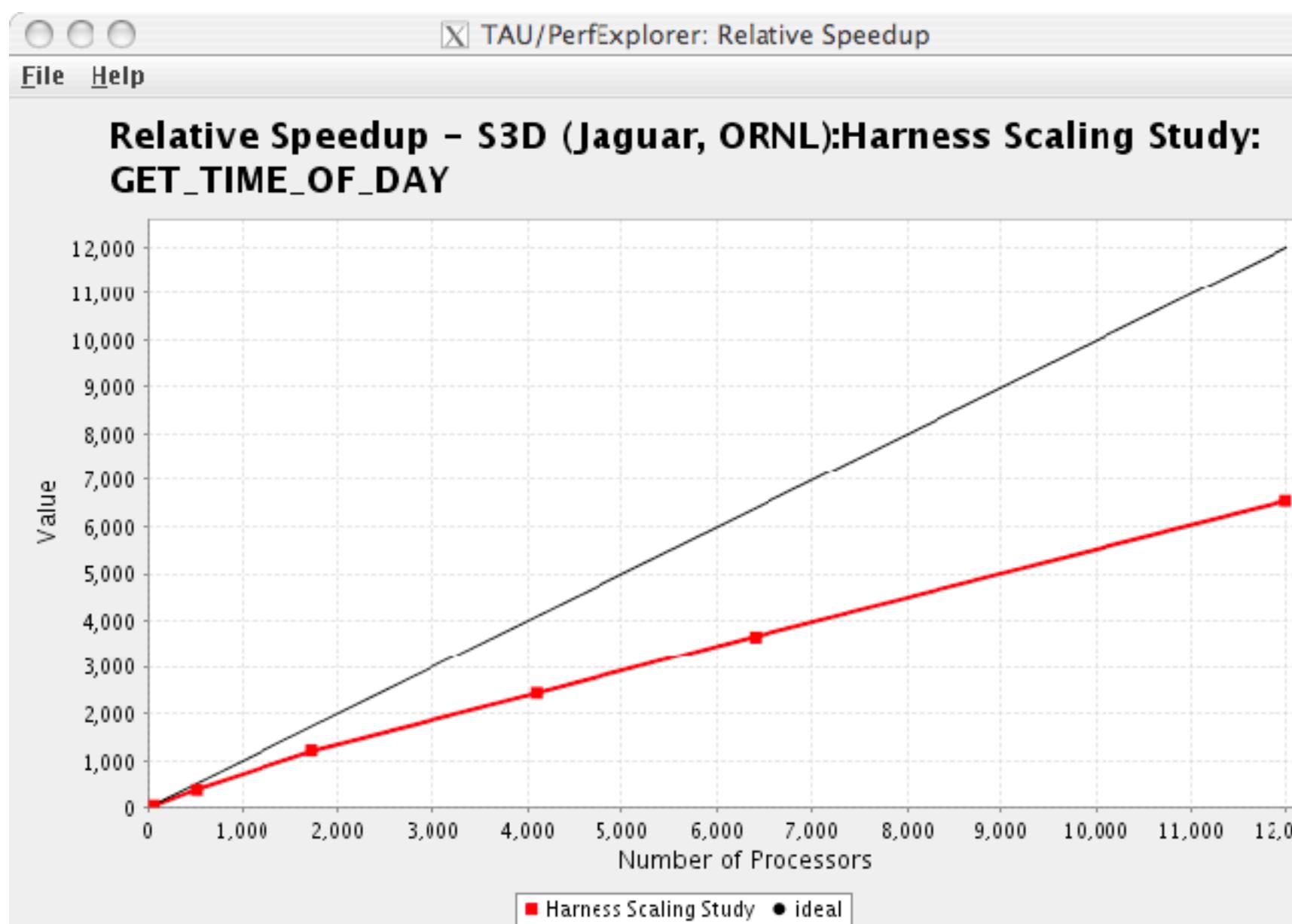
# PerfExplorer – Cluster Analysis



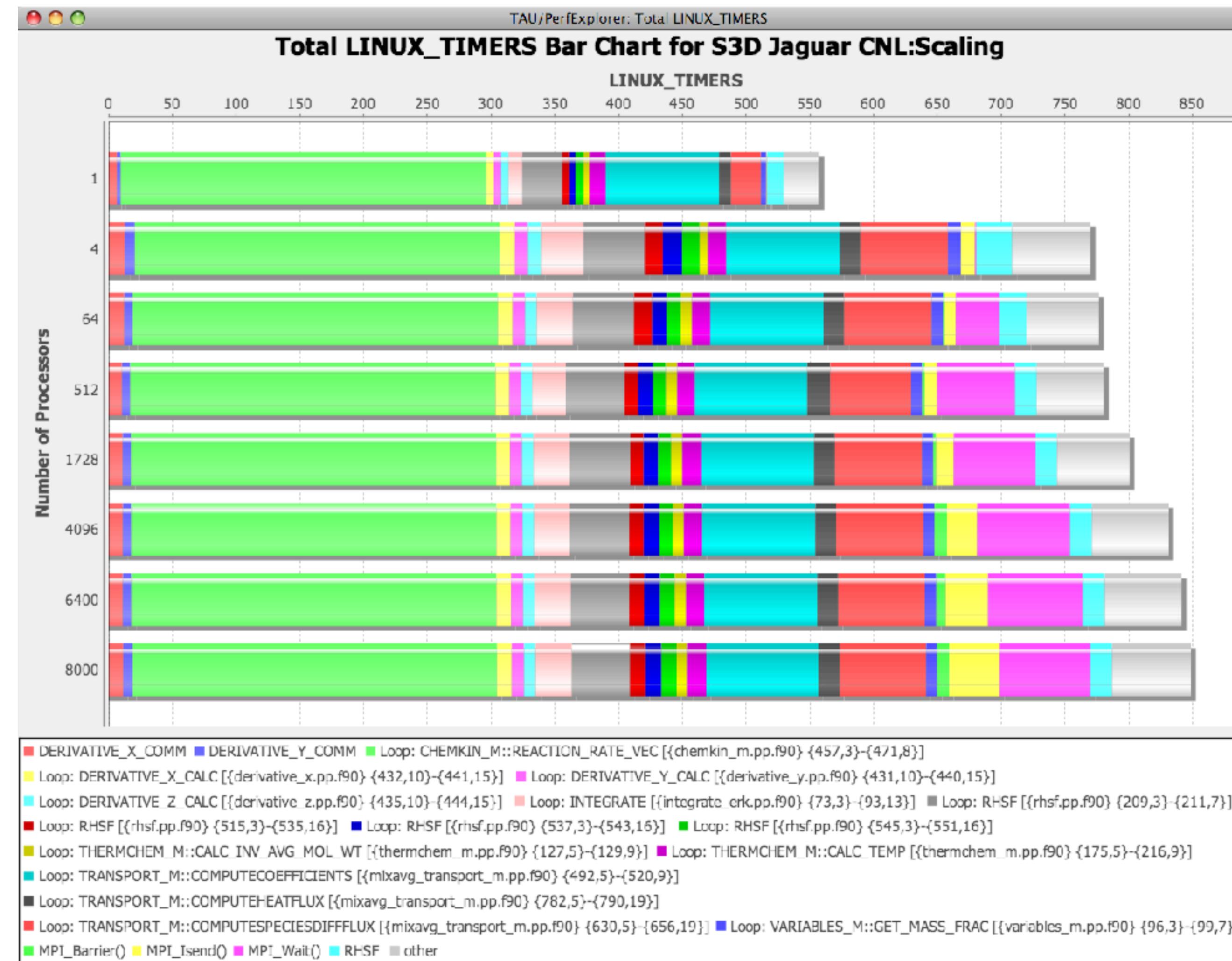
# PerfExplorer – Performance Regression



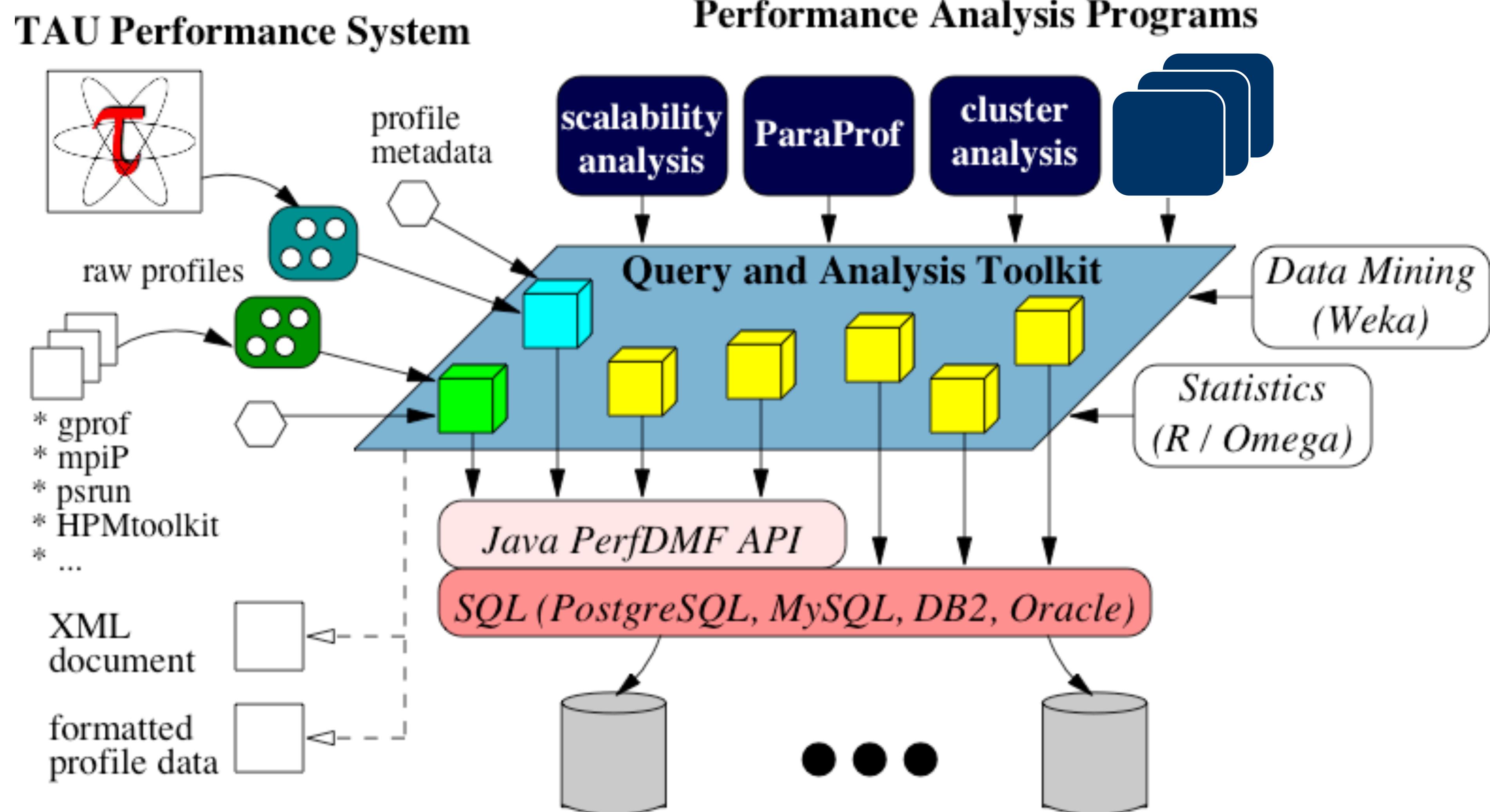
# Evaluate Scalability



# Usage Scenarios: Evaluate Scalability



# TAUdb: Framework for Managing Performance Data



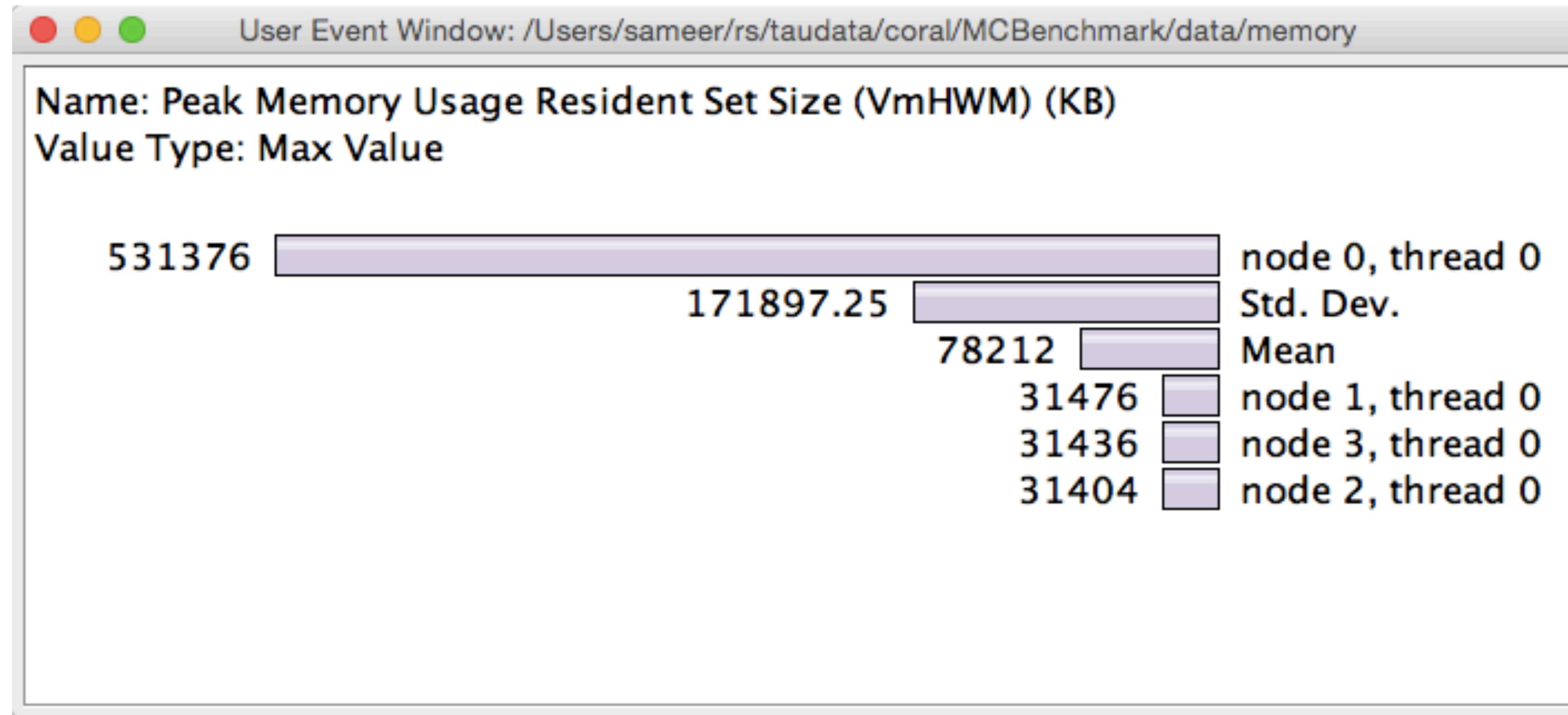
# Evaluate Scalability using PerfExplorer Charts

```
% export TAU_MAKEFILE=$TAU_MAKEFILE_BASE-icpc-papi-mpi-pdt
% 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:
% taudb_configure --create-default
% perfexplorer_configure
(Enter, y to load schema, defaults)
% paraprof
(load each trial: DB -> Add Trial -> Type (Paraprof Packed Profile) -> OK, OR use taudb_loadtrial on the commandline)
% taudb_loadtrial -a App -x MyExp -n 4p 4p.ppk
% perfexplorer
(Charts -> Speedup)
OR:
wget http://tau.uoregon.edu/data.tgz; cat README in data
```

# Debugging and Memory

# Measuring Memory Footprint



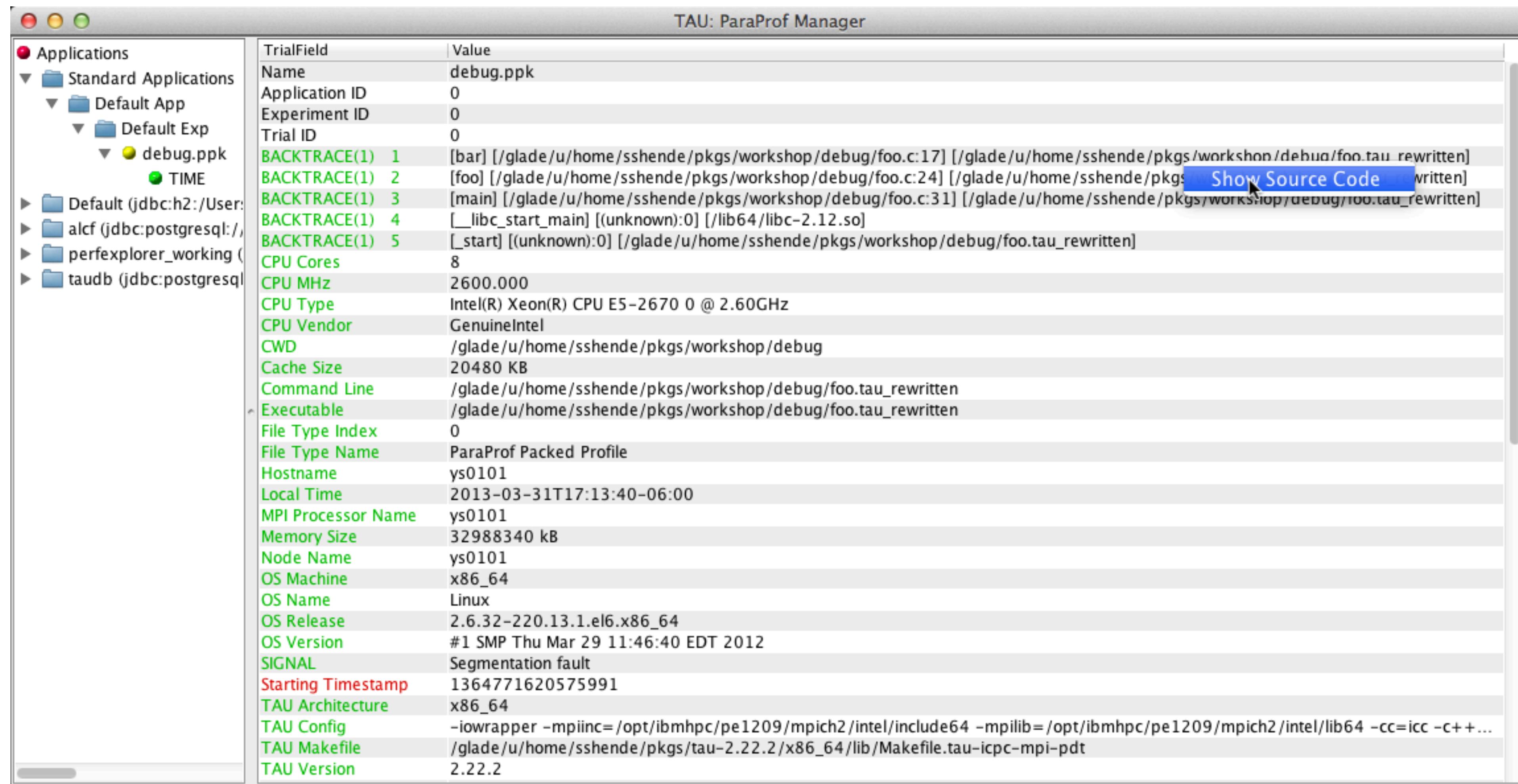
```
% export TAU_TRACK_MEMORY_FOOTPRINT=1
Paraprof:
Right click on a node -> Show Context Event Window -> see memory events
```

# Application Debugging

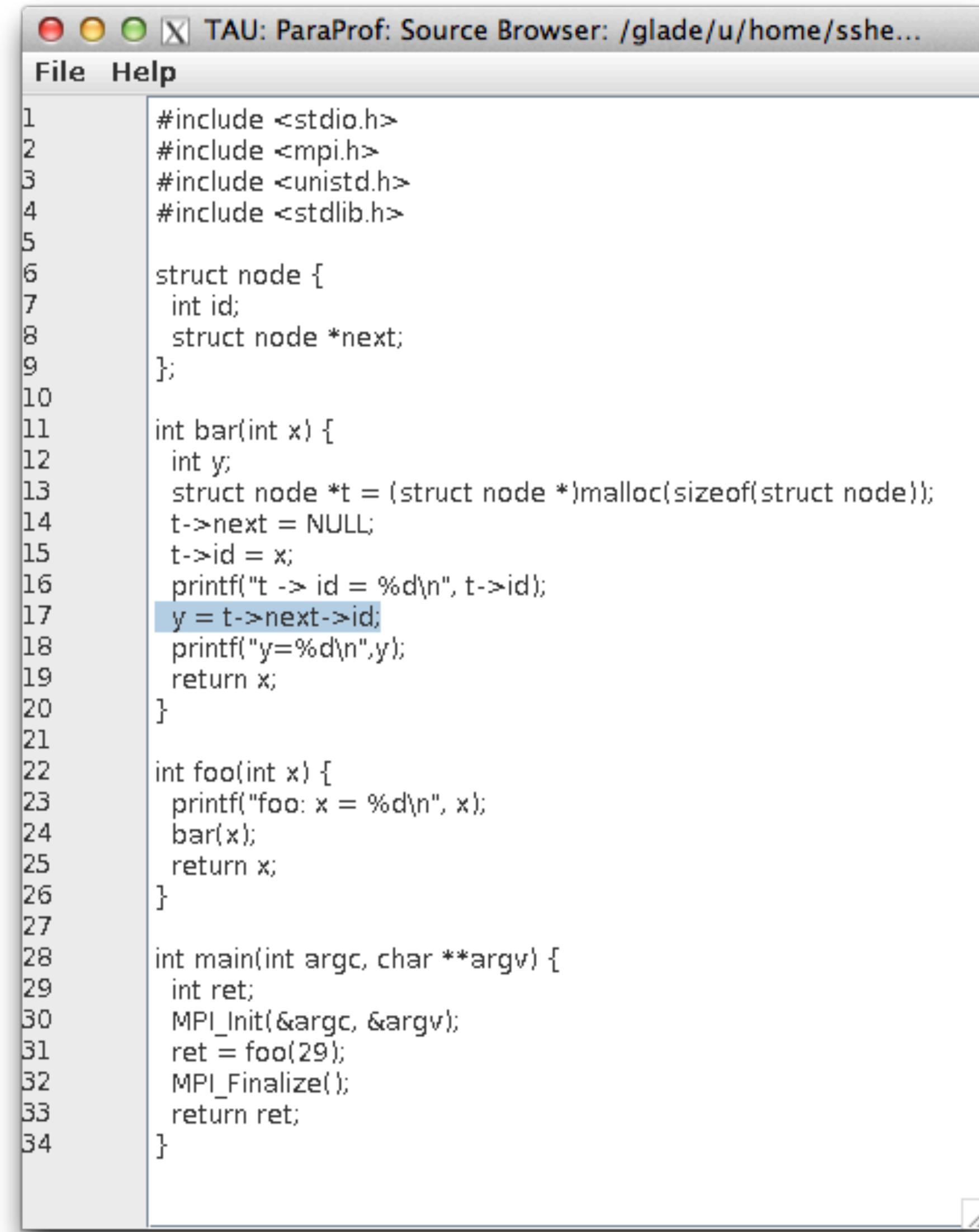
```
% export TAU_MAKEFILE=$TAU_MAKEFILE_BASE-icpc-papi-mpi-pdt
% export TAU_OPTIONS='-optMemDbg -optVerbose'
% make F90=tau_f90.sh CC=tau_cc.sh CXX=tau_cxx.sh

% export TAU_MEMDBG_PROTECT_ABOVE=1
% export TAU_MEMDBG_PROTECT_BELOW=1
% export TAU_MEMDBG_PROTECT_FREE=1
% mpirun -np 4 ./matmult
% paraprof
```

# Application < Debugging >



# Location of segmentation violation



The screenshot shows a window titled "TAU: ParaProf: Source Browser: /glade/u/home/sshe...". The window has a menu bar with "File" and "Help". The main area displays a C program with line numbers on the left:

```
1 #include <stdio.h>
2 #include <mpi.h>
3 #include <unistd.h>
4 #include <stdlib.h>
5
6 struct node {
7     int id;
8     struct node *next;
9 };
10
11 int bar(int x) {
12     int y;
13     struct node *t = (struct node *)malloc(sizeof(struct node));
14     t->next = NULL;
15     t->id = x;
16     printf("t -> id = %d\n", t->id);
17     y = t->next->id;
18     printf("y=%d\n",y);
19     return x;
20 }
21
22 int foo(int x) {
23     printf("foo: x = %d\n", x);
24     bar(x);
25     return x;
26 }
27
28 int main(int argc, char **argv) {
29     int ret;
30     MPI_Init(&argc, &argv);
31     ret = foo(29);
32     MPI_Finalize();
33     return ret;
34 }
```

The line `y = t->next->id;` is highlighted with a blue rectangular selection.

# Memory Leak Detection

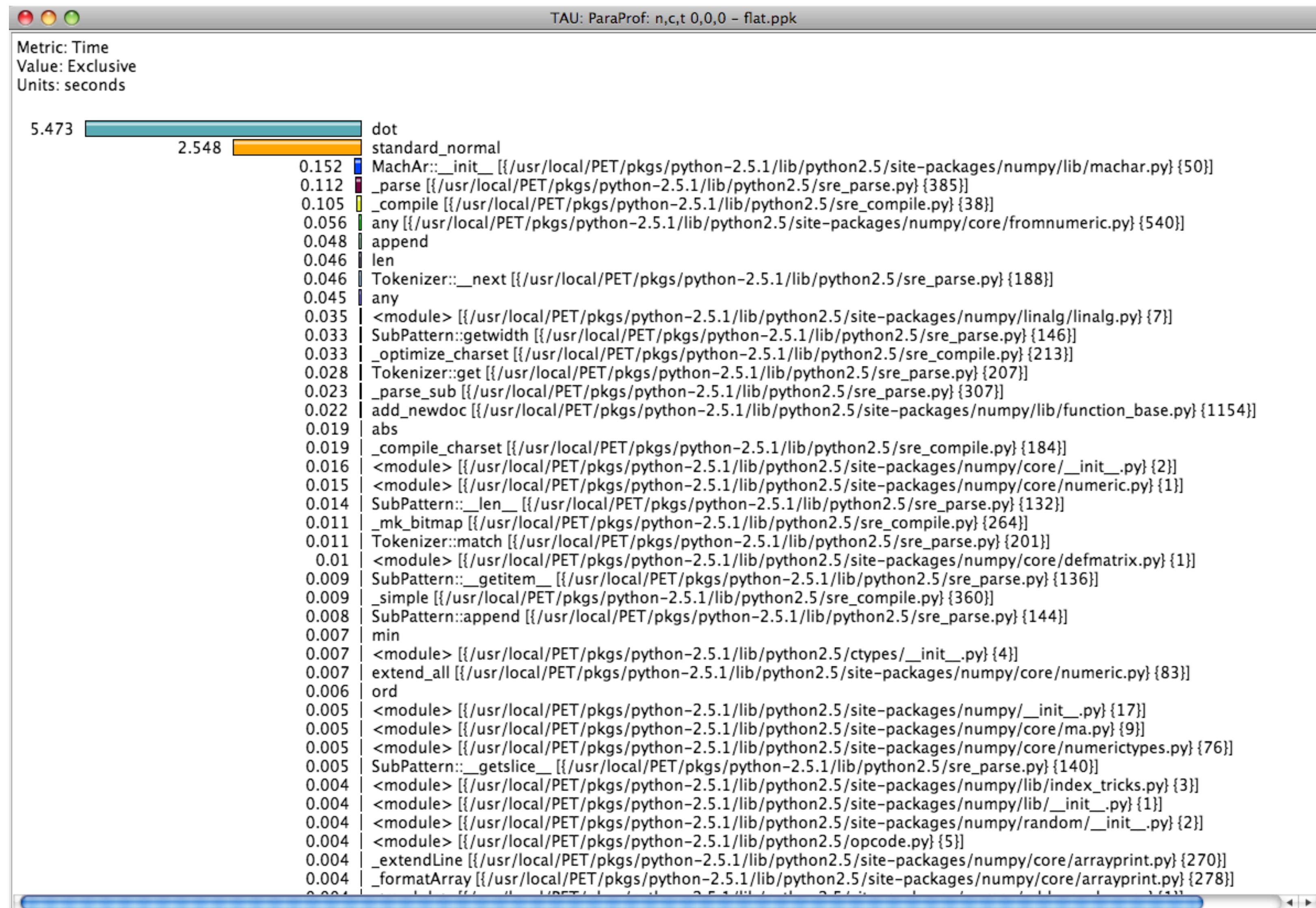
```
% export TAU_MAKEFILE=$TAU_MAKEFILE_BASE-icpc-papi-mpi-pdt  
% export TAU_OPTIONS=' -optMemDbg -optVerbose'  
% make F90=tau_f90.sh CC=tau_cc.sh CXX=tau_cxx.sh  
  
% export TAU_TRACK_MEMORY_LEAKS=1  
% mpirun -np 4 ./matmult  
% paraprof
```

# Memory Leak Detection

Name ▲	Total	NumSamples	MaxValue	MinValue	MeanValue	Std. Dev.
Heap Allocate	5,000,033	2	5,000,001	32	2,500,016.5	2,499,984.5
Heap Allocate <file=simple.c, line=15>	180	3	80	48	60	14.236
Heap Allocate <file=simple.c, line=23>	180	1	180	180	180	0
Heap Free <file=simple.c, line=18>	80	1	80	80	80	0
Heap Free <file=simple.c, line=25>	180	1	180	180	180	0
Heap Memory Used (KB)	4,884.829	8	4,883.196	0.047	610.604	1,614.888
▼ int foo(int) C [{simple.c} {36,1}-{44,1}]						
▼ int bar(int) C [{simple.c} {7,1}-{28,1}]						
Heap Allocate <file=simple.c, line=23>	180	1	180	180	180	0
Heap Free <file=simple.c, line=25>	180	1	180	180	180	0
▼ int g(int) C [{simple.c} {30,1}-{34,1}]						
▼ int bar(int) C [{simple.c} {7,1}-{28,1}]						
Heap Allocate <file=simple.c, line=15>	180	3	80	48	60	14.236
Heap Free <file=simple.c, line=18>	80	1	80	80	80	0
MEMORY LEAK! Heap Allocate <file=simple.c, line=15>	100	2	52	48	50	2
▼ int main(int, char **) C [{simple.c} {45,1}-{55,1}]						
▼ MPI_Finalize()						
Heap Allocate	5,000,033	2	5,000,001	32	2,500,016.5	2,499,984.5
MEMORY LEAK! Heap Allocate	5,000,033	2	5,000,001	32	2,500,016.5	2,499,984.5

# Instrument Python

# Profiling Python using tau\_python



# Python Instrumentation

Name	Exclusive TAUGPU_TIME	Inclusive TAUGPU_TIME	Calls	Child Calls
TAU application	0.575	182.783	1	6
<module> [{micro_benchmarking_pytorch.py}{1}]	0.002	182.151	1	13
main [{micro_benchmarking_pytorch.py}{81}]	0.002	168.702	1	1
run_benchmarking [{micro_benchmarking_pytorch.py}{40}]	0.006	168.7	1	40
forwardbackward [{micro_benchmarking_pytorch.py}{33}]	0.002	155.924	22	110
backward [{tensor.py}{79}]	0.001	106.141	22	22
backward [{__init__.py}{38}]	0.001	106.14	22	88
run_backward	106.135	106.135	22	3
pthread_create	0	0	3	0
_make_grads [{__init__.py}{20}]	0.001	0.004	22	110
isinstance	0	0	22	0
len	0	0	22	0
__call__ [{module.py}{485}]	0	49.77	22	110
forward [{container.py}{95}]	0	49.768	22	66
__call__ [{module.py}{485}]	0.001	49.767	44	220
forward [{resnet.py}{151}]	0.003	49.765	22	484
__call__ [{module.py}{485}]	0.006	49.759	220	1,100
forward [{container.py}{95}]	0.002	45.622	88	440
__call__ [{module.py}{485}]	0.007	45.616	352	1,760
forward [{resnet.py}{78}]	0.071	45.598	352	6,600
__call__ [{module.py}{485}]	0.07	45.495	3,256	16,280
forward [{conv.py}{319}]	0.017	29.675	1,056	3,168
conv2d	29.648	29.648	1,056	0
__getattr__ [{module.py}{523}]	0.01	0.01	2,112	0
forward [{container.py}{95}]	0.002	9.401	88	264
forward [{batchnorm.py}{59}]	0.262	6.097	1,056	9,504

```
$ tau_python ./foo.py
```

# Identifying Wait States Using EBS

Name	Inclusive ...	Calls
[_do_call {{session.py}{1348}}]	512.135	82
[_run_fn {{session.py}{1317}}]	512.134	82
TF_Run	512.093	82
[CONTEXT] TF_Run	512.173	51,211
[SAMPLE] __pthread_cond_wait {{}{0}}	511.273	51,123
[SAMPLE] tensorflow::TensorBuffer* tensorflow::(anonymous namespace)::FromProtoField	0.42	42
[SAMPLE] __memcpy_ssse3_back {{}{0}}	0.28	28
[SAMPLE] _int_free {{malloc.c}{0}}	0.03	3
[SAMPLE] __GI__libc_malloc {{}{0}}	0.02	2
[SAMPLE] std::basic_string<char, std::char_traits<char>, std::allocator<char> >::assign(s	0.02	1
[SAMPLE] google::protobuf::internal::MapField<tensorflow::NodeDef::NodeDef_AttrEntry,	0.02	1
[SAMPLE] __exchange_and_add {{/home/msarahan/miniconda2/conda-bld/compilers_lin	0.01	1
[SAMPLE] void google::protobuf::internal::RepeatedPtrFieldBase::MergeFromInnerLoop<g	0.01	1
[SAMPLE] google::protobuf::internal::ArenaStringPtr::Destroy(std::basic_string<char, std::	0.01	1
[SAMPLE] std::_Hashtable<std::basic_string<char, std::char_traits<char>, std::allocator<	0.01	1
[SAMPLE] std::_Hashtable<tensorflow::Node*, std::pair<tensorflow::Node* const, tensorflow::	0.01	1
[SAMPLE] std::basic_string<char, std::char_traits<char>, std::allocator<char> >::_Rep::_I	0.01	1
[SAMPLE] std::_Hash_bytes(void const*, unsigned long, unsigned long) {{/home/msaraha	0.01	1
[SAMPLE] std::basic_string<char, std::char_traits<char>, std::allocator<char> >::_M_cop	0.01	1
[SAMPLE] std::basic_string<char, std::char_traits<char>, std::allocator<char> >::size() cc	0.01	1
[SAMPLE] PyObject_Malloc {{/home/nwani/m2u/conda-bld/python_1500576437846/woi	0.01	1
[SAMPLE] jemalloc_free {{/home/nchaimov/candle/anaconda3/lib/python3.6/site-pacak	0.01	1

```
$ tau_python -ebs ./foo.py
```

# Acknowledgements

# PRL, University of Oregon, Eugene



[www.uoregon.edu](http://www.uoregon.edu)

# Support Acknowledgments



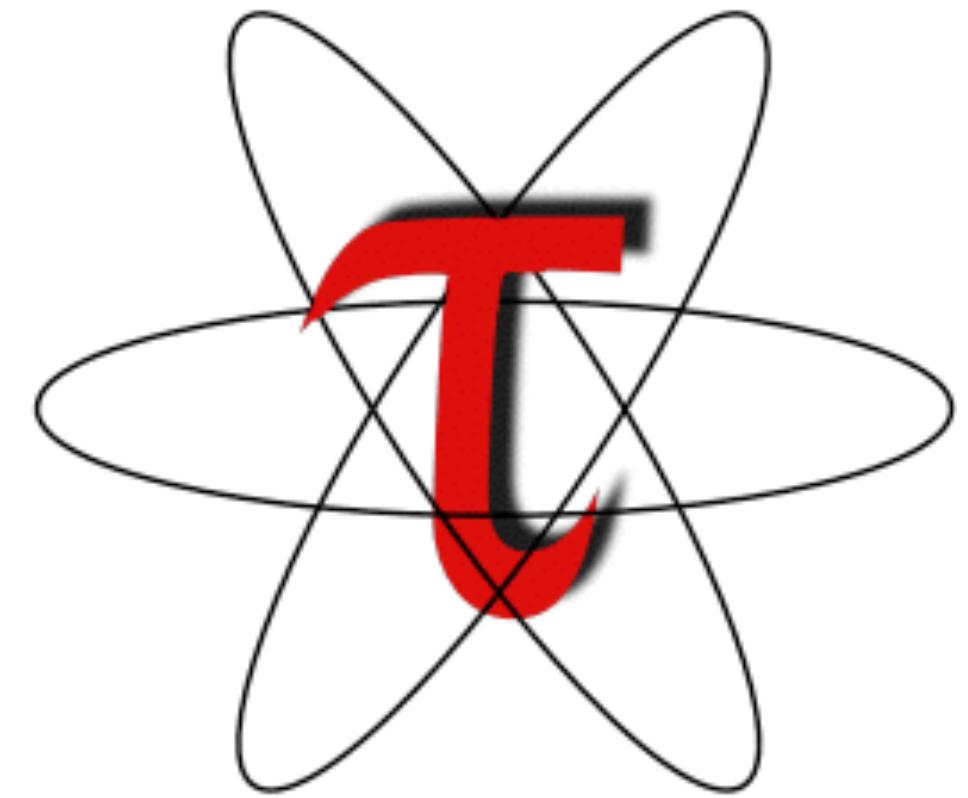
ParaTools

# Acknowledgment



# Cheat-Sheet

# Download TAU from U. Oregon



<http://tau.uoregon.edu>

<http://taucommander.com>

<http://www.hpclinux.com> [OVA for VirtualBox]

<https://e4s.io> [ Extreme-Scale Scientific Software Stack, Containers for HPC]

Free download, open source, BSD license

# Setup: Installing TAU on Laptops

Prerequisites: Java in your path

## Microsoft Windows

- Install Java from Oracle.com
  - <http://tau.uoregon.edu/tau.exe>
  - Install, click on a ppk file to launch paraprof

## macOS (x86\_64)

- Install Java 11.0.3:
  - Download and install <http://tau.uoregon.edu/java.dmg>
  - If you have multiple Java installations, add to your ~/.zshrc (or ~/.bashrc as appropriate):
    - `export PATH=/Library/Java/JavaVirtualMachines/jdk-11.0.3.jdk/Contents/Home/bin:$PATH`
  - `java -version`
- Download and install TAU (copy to /Applications from dmg):
  - <http://tau.uoregon.edu/tau.dmg>
  - `export PATH=/Applications/TAU/tau/apple/bin:$PATH`
  - `paraprof app.ppk &`

## macOS (arm64, M1,M2)

- [http://tau.uoregon.edu/java\\_arm64.dmg](http://tau.uoregon.edu/java_arm64.dmg)
- [http://tau.uoregon.edu/tau\\_arm64.dmg](http://tau.uoregon.edu/tau_arm64.dmg)

## Linux (<http://tau.uoregon.edu/tau.tgz>)

- `./configure -mpi -bfd=download -iowrapper -dwarf=download -unwind=download -otf=download ; make install`

# Installing and Configuring TAU

- Installing PDT:

- wget tau.uoregon.edu/pdt\_lite.tgz
- ./configure; make ; make install

- Installing TAU:

- wget tau.uoregon.edu/tau.tgz; tar zxf tau.tgz; cd tau-2.<ver>
- wget http://tau.uoregon.edu/ext.tgz ; tar xf ext.tgz
- ./configure -bfd=download -pdt=<dir> -papi=<dir> -mpi  
-pthread -c++=mpicxx -cc=mpicc -fortran=mpif90  
-dwarf=download -unwind=download -otf=download  
-iowrapper -papi=<dir>
- make install

- Using TAU:

- export TAU\_MAKEFILE=<taudir>/x86\_64/lib/Makefile.tau-<TAGS>
- make CC=tau\_cc.sh CXX=tau\_cxx.sh F90=tau\_f90.sh

# Compile-Time Options

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> )
-optTrackGOMP	Enable tracking GNU OpenMP runtime layer (used without <i>-opari</i> )
-optMemDbg	Enable 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=<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
-optTrackUPCR	Track UPC runtime layer routines (used with <i>tau_upc.sh</i> )
-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) ...

# Compile-Time Options (contd.)

Optional parameters for the TAU\_OPTIONS environment variable:

% tau\_compiler.sh

- optShared      Use TAU's shared library (libTAU.so) instead of static library (default)
- optPdtCxxOpts=""      Options for C++ parser in PDT (cxxparse).
- optPdtF90Parser=""      Specify a different Fortran parser
- optPdtCleanscapeParser      Specify the Cleanscape Fortran parser instead of GNU gfparser
- optTau=""      Specify options to the tau\_instrumentor
- optTrackDMAPP      Enable instrumentation of low-level DMAPP API calls on Cray
- optTrackPthread      Enable instrumentation of pthread calls

See tau\_compiler.sh for a full list of TAU\_OPTIONS.

...

# TAU's 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_FOOTPRINT	0	Setting to 1 turns on tracking memory usage by sampling periodically the resident set size and high water mark of memory usage
TAU_TRACK_POWER	0	Tracks power usage by sampling periodically.
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_SAMPLING	1	Setting to 1 enables event-based sampling.
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. Throttles 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_CALLSITE	0	Setting to 1 enables callsite profiling that shows where an instrumented function was called. Also compatible with tracing.
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., ENERGY,TIME,P_VIRTUAL_TIME,PAPI_FP_INS,PAPI_NATIVE_<event>:<subevent>)

# Runtime Environment Variables

Environment Variable	Default	Description
TAU_TRACE	0	Setting to 1 turns on tracing
TAU_TRACE_FORMAT	Default	Setting to “otf2” turns on TAU’s native OTF2 trace generation (configure with –otf=download)
TAU_EBS_UNWIND	0	Setting to 1 turns on unwinding the callstack during sampling (use with tau_exec –ebs or TAU_SAMPLING=1)
TAU_EBS_RESOLUTION	line	Setting to “function” or “file” changes the sampling resolution to function or file level respectively.
TAU_TRACK_LOAD	0	Setting to 1 tracks system load on the node
TAU_SELECT_FILE	Default	Setting to a file name, enables selective instrumentation based on exclude/include lists specified in the file.
TAU_OMPT_SUPPORT_LEVEL	basic	Setting to “full” improves resolution of OMPT TR6 regions on threads 1.. N-1. Also, “lowoverhead” option is available.
TAU_OMPT_RESOLVE_ADDRESS_EAGERLY	1	Setting to 1 is necessary for event based sampling to resolve addresses with OMPT. Setting to 0 allows the user to do offline address translation.

# Runtime Environment Variables

Environment Variable	Default	Description
TAU_TRACK_MEMORY_LEAKS	0	Tracks allocates that were not de-allocated (needs –optMemDbg or tau_exec –memory)
TAU_EBS_SOURCE	TIME	Allows using PAPI hardware counters for periodic interrupts for EBS (e.g., TAU_EBS_SOURCE=PAPI_TOT_INS when TAU_SAMPLING=1)
TAU_EBS_PERIOD	100000	Specifies the overflow count for interrupts
TAU_MEMDBG_ALLOC_MIN/MAX	0	Byte size minimum and maximum subject to bounds checking (used with TAU_MEMDBG_PROTECT_*)
TAU_MEMDBG_OVERHEAD	0	Specifies the number of bytes for TAU's memory overhead for memory debugging.
TAU_MEMDBG_PROTECT_BELOW/ ABOVE	0	Setting to 1 enables tracking runtime bounds checking below or above the array bounds (requires –optMemDbg while building or tau_exec –memory)
TAU_MEMDBG_ZERO_MALLOC	0	Setting to 1 enables tracking zero byte allocations as invalid memory allocations.
TAU_MEMDBG_PROTECT_FREE	0	Setting to 1 detects invalid accesses to deallocated memory that should not be referenced until it is reallocated (requires –optMemDbg or tau_exec –memory)
TAU_MEMDBG_ATTEMPT_CONTINUE	0	Setting to 1 allows TAU to record and continue execution when a memory error occurs at runtime.
TAU_MEMDBG_FILL_GAP	Undefined	Initial value for gap bytes
TAU_MEMDBG_ALIGNMENT	Sizeof(int)	Byte alignment for memory allocations
TAU_EVENT_THRESHOLD	0.5	Define a threshold value (e.g., .25 is 25%) to trigger marker events for min/max