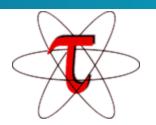
TAU Performance System®

13th Annual MVAPICH Users Group Meeting

2:30 pm – 3:00 pm ET, Monday, August 19th, 2025 The Ohio State University, Columbus, OH

Sameer Shende
Research Professor and Director,
Performance Research Laboratory, OACISS, University of Oregon
President and Director, ParaTools, Inc.
sameer@cs.uoregon.edu
https://tau.uoregon.edu/TAU_MUG25.pdf







UNIVERSITY OF OREGON

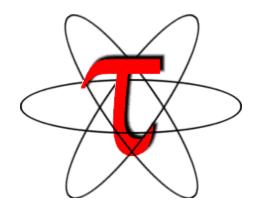




Acknowledgments

- The MVAPICH team The Ohio State University
 - http://mvapich.cse.ohio-state.edu
- TAU team at the University of Oregon
 - http://tau.uoregon.edu





Motivation and Challenges

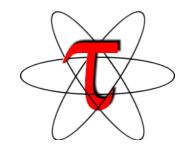
- With growing hardware complexity, it is getting harder to accurately measure and optimize the performance of our HPC and AI/ML workloads.
- TAU Performance System[®]:
 - Deliver a scalable, portable, performance evaluation toolkit for HPC and Al/ML workloads.
 - http://tau.uoregon.edu
- It is getting harder to install our HPC and Al/ML tools.

Motivation: Improving Productivity

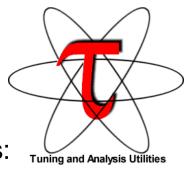
- TAU Performance System®:
 - Deliver a scalable, portable, performance evaluation toolkit for HPC and Al/ML workloads
 - http://tau.uoregon.edu

TAU Performance System®

- Tuning and Analysis Utilities (25+ 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)
 - Uses performance and control variables to interface with MVAPICH2
- Integrates with application frameworks
- http://tau.uoregon.edu



TAU Performance System®





OF OREGON

- Versatile profiling and tracing toolkit that supports: Tuning and Analysis Utilities
 - MPI, CUDA, ROCm, DPC++/SYCL (Level Zero), OpenCL, and OpenMP (OpenMP Tools Interface for Target Offload)
- Scalable, portable, performance evaluation toolkit for HPC and AI/ML workloads that supports:
 - C++/C/DPC++, Fortran, Python
- Supports PAPI, Likwid for hardware performance counter information
- Instrumentation includes support for PETSc (Perfstubs), GPTL, PhiProf, XGC (CAMTIMERS), Kokkos, MPI, pthread, event-based sampling, GPU runtimes
- A single tool (tau_exec) is used to launch un-instrumented, un-modified binaries
- Supports Grace-Grace and Grace-Hopper (SVE aarch64) systems
- TAU's paraprof, pprof, perfexplorer for profile analysis; Vampir, Jumpshot, Perfetto.dev for traces
- http://tau.uoregon.edu

Application Performance Engineering using TAU

- How much time is spent in each application routine and outer loops? Within loops, what is the
 contribution of each statement? What is the time spent in OpenMP loops? In kernels on
 GPUs.
- How many instructions are executed in these code regions?
 Floating point, Level 1 and 2 data cache misses, hits, branches taken? What is the extent of vectorization for loops?
- How much time did my application spend waiting at a barrier in MPI collective operations?
- What is the memory usage of the code? When and where is memory allocated/de-allocated?
 Are there any memory leaks? What is the memory footprint of the application? What is the memory high water mark?
- How much energy does the application use in Joules? What is the peak power usage?
- What are the I/O characteristics of the code? What is the peak read and write bandwidth of individual calls, total volume?
- How does the application scale? What is the efficiency, runtime breakdown of performance across different core counts?

TAU: Quickstart Guide

Profiling:

```
MPI: % mpirun -np 16 tau exec -ebs ./a.out
• Pthread: % mpirun -np 16 tau exec -T mpi,pthread -ebs ./a.out
• CUDA: % mpirun -np 16 tau exec -T cupti, mpi -cupti -ebs ./a.out
• ROCm: % mpirun -np 16 tau exec -T rocm, mpi -rocm -ebs ./a.out

    Python: % tau python ./foo.py

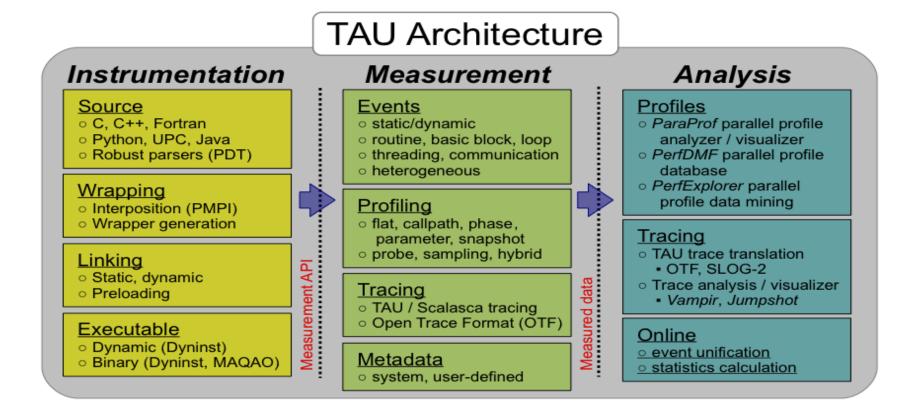
Analysis: % pprof -a -m | more; % paraprof (GUI)
Tracing:
• Vampir: MPI: % export TAU TRACE=1; export TAU TRACE FORMAT=otf2
            % mpirun -np 16 tau exec ./a.out; vampir traces.otf2 &
• Chrome/Jumpshot: % export TAU TRACE=1; mpirun -np 64 tau exec ./a.out
   % tau treemerge.pl;
Perfetto.dev:% tau trace2json tau.trc tau.edf -chrome -ignoreatomic -o app.json
   Chrome browser: chrome://tracing (Load -> app.json) or Perfetto.dev
• Jumpshot: tau2slog2 tau.trc tau.edf -o app.slog2; jumpshot app.slog2
```

TAU Performance System®

Parallel performance framework and toolkit

Supports all HPC platforms, compilers, runtime system Provides portable instrumentation, measurement, analysis





TAU Performance System®

Instrumentation

- Fortran, C++, C, UPC, Java, Python, Chapel, Spark
- Automatic instrumentation

Measurement and analysis support

- MPI (MVAPICH), OpenSHMEM, ARMCI, PGAS, DMAPP
- Supports Intel oneAPI compilers
- pthreads, OpenMP, OMPT interface, hybrid, other thread models
- GPU: OpenCL, oneAPI DPC++/SYCL (Level Zero), OpenACC, Kokkos, RAJA
- Parallel profiling and tracing

Analysis

- Parallel profile analysis (ParaProf), data mining (PerfExplorer)
- Performance database technology (TAUdb)
- 3D profile browser

Instrumentation

Add hooks in the code to perform measurements

Source instrumentation using a preprocessor

- Add timer start/stop calls in a copy of the source code.
- Use Program Database Toolkit (PDT) for parsing source code.
- Requires recompiling the code using TAU shell scripts (tau_cc.sh, tau_f90.sh)
- Selective instrumentation (filter file) can reduce runtime overhead and narrow instrumentation focus.

Compiler-based instrumentation

- Use system compiler to add a special flag to insert hooks at routine entry/exit.
- Requires recompiling using TAU compiler scripts (tau_cc.sh, tau_f90.sh...)

Runtime preloading of TAU's Dynamic Shared Object (DSO)

No need to recompile code! Use mpirun tau_exec ./app with options.

TAU's Support for Runtime Systems

MPI

- PMPI profiling interface
- MPI_T tools interface using performance and control variables
- MPI Collective Sync time: time in an implicit barrier in MPI collective operations

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
- Intel Level Zero
 - Captures time spent in kernels on GPUs using oneAPI Level Zero
 - Captures time spent in Intel Level Zero runtime calls
- 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
```

Using TAU's Runtime Preloading Tool: tau_exec

Preload a wrapper that intercepts the runtime system call and substitutes with another

MPI

OpenMP

POSIX I/O

Memory allocation/deallocation routines

Wrapper library for an external package

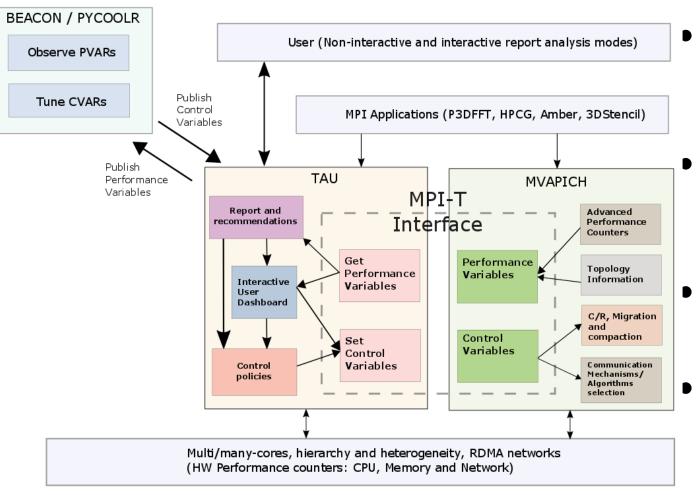
No modification to the binary executable!

Enable other TAU options (communication matrix, OTF2, event-based sampling)

TAU Execution Command (tau exec)

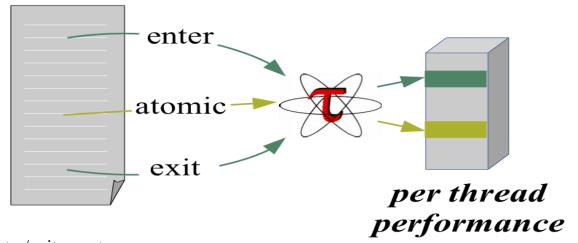
```
Uninstrumented execution
       % mpirun -np 256 ./a.out
Track GPU operations
       % mpirun -np 256 tau exec -rocm ./a.out (-rocm pc for PC sampling on GPU)
       % mpirun -np 256 tau exec -cupti ./a.out
       % mpirun -np 256 tau exec -cupti -um ./a.out (for Unified Memory) (-cupti pc for PC sampling on GPU)
       % mpirun –np 256 tau exec –l0
                                      ./a.out
       % 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+ or Clang 8+)
       % export TAU OMPT SUPPORT LEVEL=full;
       % mpirun –np 256 tau exec –T ompt,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 export TAU METRICS=TIME, PAPI L1 DCM... -ebs resolution=<file | function | line>
```

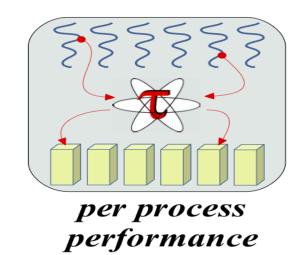
Integrating TAU with MVAPICH through MPI_T Interface



- Enhance existing support for MPI_T in MVAPICH2 to expose a richer set of performance and control variables
- Get and display MPI Performance Variables (PVARs) made available by the runtime in TAU
- Control the runtime's behavior via MPI Control Variables (CVARs)
- Add support to MVAPICH2 and TAU for interactive performance engineering sessions

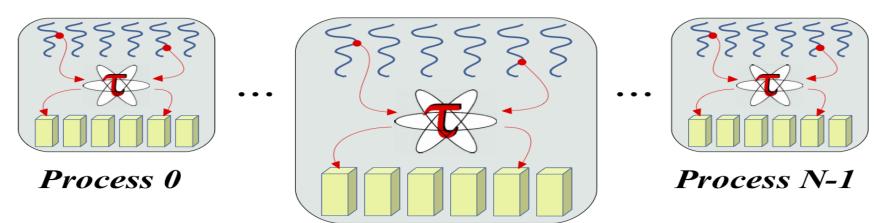
TAU Performance Measurement Model





enter/exit events are "interval" events

(in shared memory)



application-wide performance data

Process i

TAU Plugin Architecture

Extend TAU event interface for plugins

Events: interval, atomic

Specialized on event ID

Synchronous operation

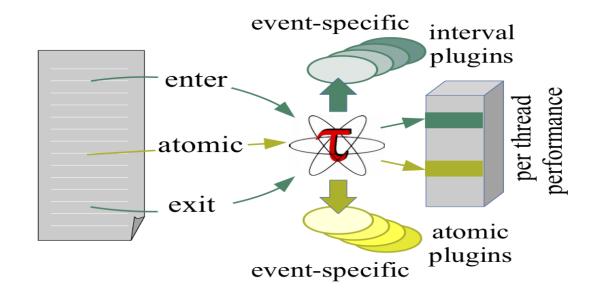
Create TAU interface for *trigger* plugins

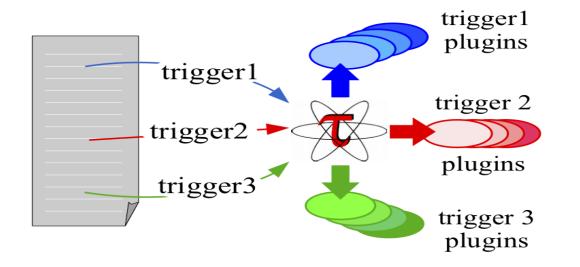
Named trigger

Pass application data

Synchronous

Asynchronous using agent plugin





Plugin-based Infrastructure for Non-Interactive Tuning

 TAU supports a fully-customizable plugin infrastructure based on callback event handler registration for salient states inside TAU:

Function Registration / Entry / Exit

Phase Entry / Exit

Atomic Event Registration / Trigger

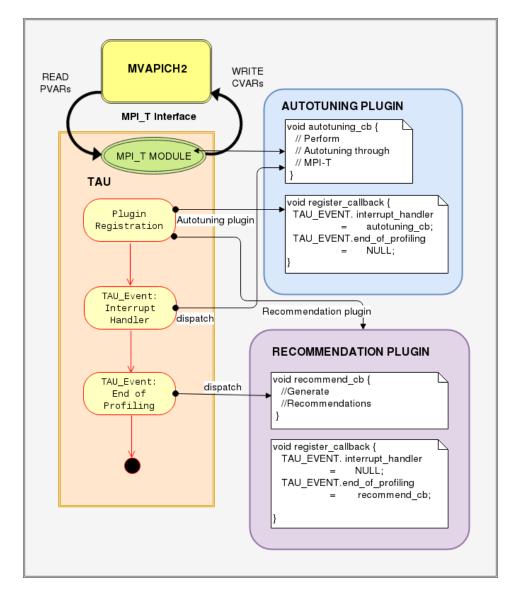
Init / Finalize Profiling

Interrupt Handler

MPI_T

 Application can define its own "trigger" states and associated plugins

Pass arbitrary data to trigger state plugins

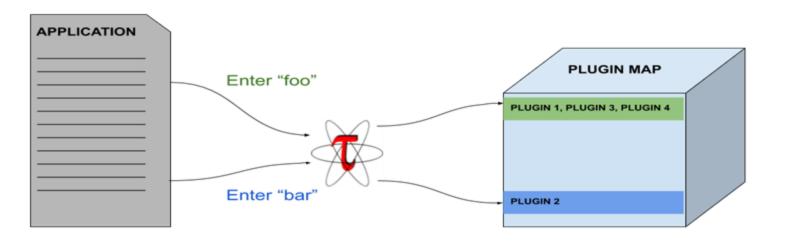


TAU Runtime Control of Plugin

- TAU defines a plugin API to deliver access control to the internal plugin map
- User can specify a regular expression to control plugins executed for a class of named states at runtime
 Access to map on a process is serialized: application is expected to access map through main thread

TAU Customization

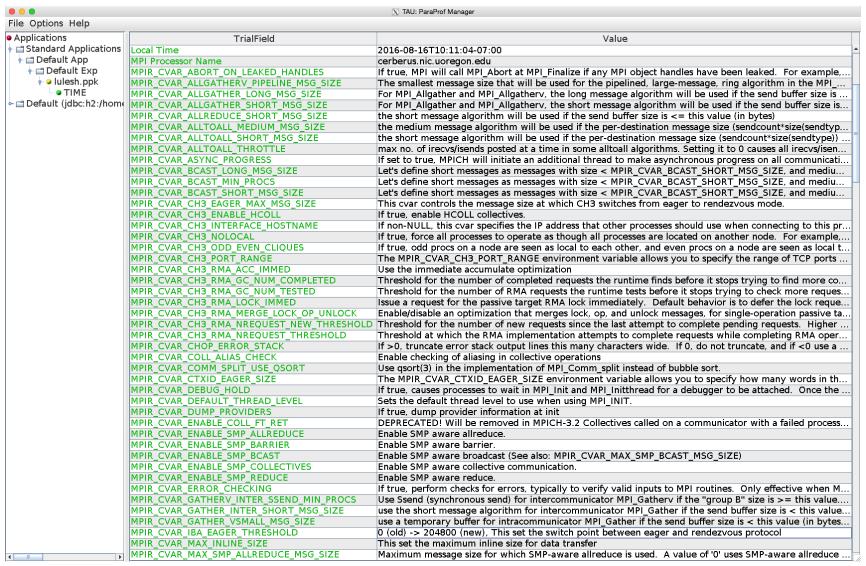
- TAU states can be named or generic
- TAU distinguishes named states in a way that allows for separation of occurrence of a state from the action associated with it Function entry for "foo" and "bar" represent distinguishable states in TAU
- TAU maintains an internal map of a list of plugins associated with each state



PVARs Exposed by MVAPICH2

●		∑ TAU: ParaProf Manager	
e Options Help			
pplications	TrialField	Value	
Standard Applications	MPI T PVAR[0]: mem allocated	Current level of allocated memory within the MPI library	
- ⊢ 🗂 Default App	MPI_T PVAR[10]: mv2_num_2level_comm_success	Number of successful 2-level comm creations	
• □ Default Exp	MPI_T PVAR[11]: mv2_num_shmem_coll_calls	Number of times MV2 shared-memory collective calls were invoked	
• ● lulesh.ppk	MPI T PVAR[12]: mpit progress poll	CH3 RDMA progress engine polling count	
∟• TIME	MPI T PVAR[13]: mv2 smp read progress poll	CH3 SMP read progress engine polling count	
	MPI_T PVAR[14]: mv2_smp_write_progress_poll	CH3 SMP write progress engine polling count	
, ,		s Unsucessful CH3 SMP read progress engine polling count	
		Unsucessful CH3 SMP write progress engine polling count	
	MPI T PVAR[17]: rdma_ud_retransmissions	CH3 RDMA UD retransmission count	
	MPI_T PVAR[18]: mv2_coll_bcast_binomial	Number of times MV2 binomial boast algorithm was invoked	
		Number of times MV2 scatter+double allgather boast algorithm was invoked	
	MPI T PVAR[1]: mem allocated	Maximum level of memory ever allocated within the MPI library	
		Number of times MV2 scatter+ring allgather bcast algorithm was invoked	
	MPI_T PVAR[20]: mv2_coll_bcast_scatter_ring_aligath	Number of times MV2 scatter+ring aligather shm boast algorithm was invoked	
	MPI_T PVAR[22]: mv2_coll_bcast_shmem	Number of times MV2 scatter 11mg anguitier 3mm ocast argoritimm was invoked	
	MPI T PVAR[23]: mv2 coll bcast knomial internode	Number of times MV2 similari beast algorithm was invoked Number of times MV2 knomial internode beast algorithm was invoked	
	MPI T PVAR[24]: mv2 coll bcast knomial intranode	Number of times MV2 knomial intranode boast algorithm was invoked	
	MPI T PVAR[24]: mv2_coll_bcast_knormal_intranode	Number of times MV2 mast internode bast algorithm was invoked Number of times MV2 mast internode bast algorithm was invoked	
	MPI_T PVAR[26]: mv2_coll_bcast_pipelined	Number of times MV2 pipelined boast algorithm was invoked	
	MPI_T PVAR[27]: mv2_coll_alltoall_inplace	Number of times MV2 in-place alltoall algorithm was invoked Number of times MV2 brucks alltoall algorithm was invoked	
	MPI_T PVAR[28]: mv2_coll_alltoall_bruck		
	MPI_T PVAR[29]: mv2_coll_alltoall_rd	Number of times MV2 recursive-doubling alltoall algorithm was invoked	
	MPI_T PVAR[2]: num_malloc_calls	Number of MPIT_malloc calls	
	MPI_T PVAR[30]: mv2_coll_alltoall_sd	Number of times MV2 scatter-destination alltoall algorithm was invoked	
	MPI_T PVAR[31]: mv2_coll_alltoall_pw	Number of times MV2 pairwise alltoall algorithm was invoked	
	MPI_T PVAR[32]: mpit_alltoallv_mv2_pw	Number of times MV2 pairwise alltoally algorithm was invoked	
	MPI_T PVAR[33]: mv2_coll_allreduce_shm_rd	Number of times MV2 shm rd allreduce algorithm was invoked	
	MPI_T PVAR[34]: mv2_coll_allreduce_shm_rs	Number of times MV2 shm rs allreduce algorithm was invoked	
	MPI_T PVAR[35]: mv2_coll_allreduce_shm_intra	Number of times MV2 shm intra allreduce algorithm was invoked	
	MPI_T PVAR[36]: mv2_coll_allreduce_intra_p2p	Number of times MV2 intra p2p allreduce algorithm was invoked	
	MPI_T PVAR[37]: mv2_coll_allreduce_2lvl	Number of times MV2 two-level allreduce algorithm was invoked	
	MPI_T PVAR[38]: mv2_coll_allreduce_shmem	Number of times MV2 shmem allreduce algorithm was invoked	
	MPI_T PVAR[39]: mv2_coll_allreduce_mcast	Number of times MV2 multicast-based allreduce algorithm was invoked	
	MPI_T PVAR[3]: num_calloc_calls	Number of MPIT_calloc calls	
	MPI_T PVAR[40]: mv2_reg_cache_hits	Number of registration cache hits	
	MPI_T PVAR[41]: mv2_reg_cache_misses	Number of registration cache misses	
	MPI_T PVAR[42]: mv2_vbuf_allocated	Number of VBUFs allocated	
	MPI_T PVAR[43]: mv2_vbuf_allocated_array	Number of VBUFs allocated	
	MPI_T PVAR[44]: mv2_vbuf_freed	Number of VBUFs freed	
	MPI_T PVAR[45]: mv2_ud_vbuf_allocated	Number of UD VBUFs allocated	
	MPI_T PVAR[46]: mv2_ud_vbuf_freed	Number of UD VBUFs freed	
	MPI_T PVAR[47]: mv2_vbuf_free_attempts	Number of time we attempted to free VBUFs	
	MPI_T PVAR[48]: mv2_vbuf_free_attempt_success_time	Average time for number of times we sucessfully freed VBUFs	
		Average time for number of times we sucessfully freed VBUFs	
	MPI_T PVAR[4]: num_memalign_calls	Number of MPIT_memalign calls	
	MPI_T PVAR[50]: mv2_vbuf_allocate_time	Average time for number of times we allocated VBUFs	
	MPI T PVAR[51]: mv2 vbuf allocate time	Average time for number of times we allocated VBUFs	

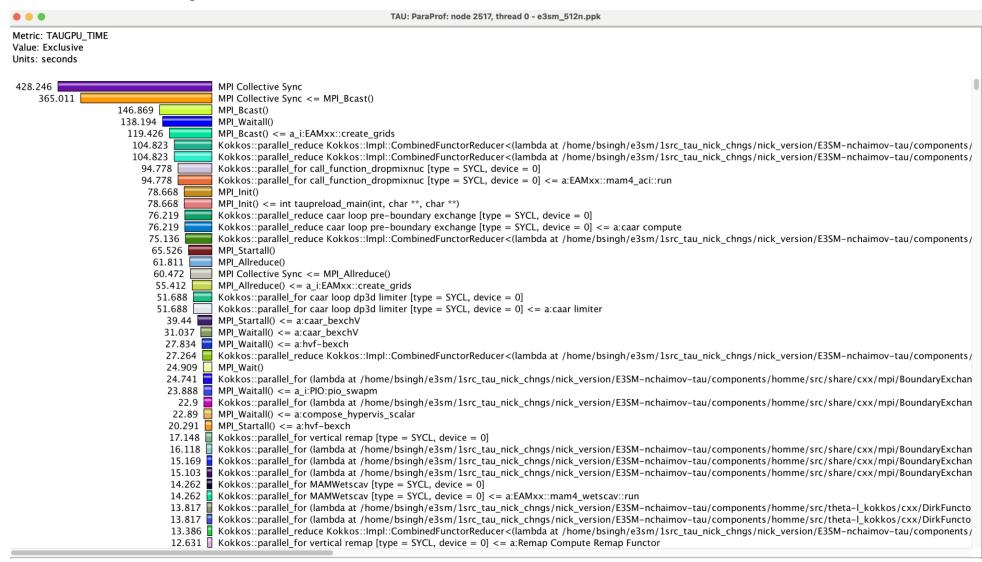
CVARs Exposed by MVAPICH2



Using MVAPICH2 and TAU with Multiple CVARs

To set CVARs or read PVARs using TAU for an uninstrumented binary:
 % export TAU_TRACK_MPI_T_PVARS=1
 % export TAU_MPI_T_CVAR_METRICS=
 MPIR_CVAR_VBUF_POOL_REDUCED_VALUE[1],
 MPIR_CVAR_IBA_EAGER_THRESHOLD
 % export TAU_MPI_T_CVAR_VALUES=32,64000
 % export PATH=/path/to/tau/x86_64/bin:\$PATH
 % mpirun -np 1024 tau_exec -T mvapich,mpit ./a.out
 % paraprof

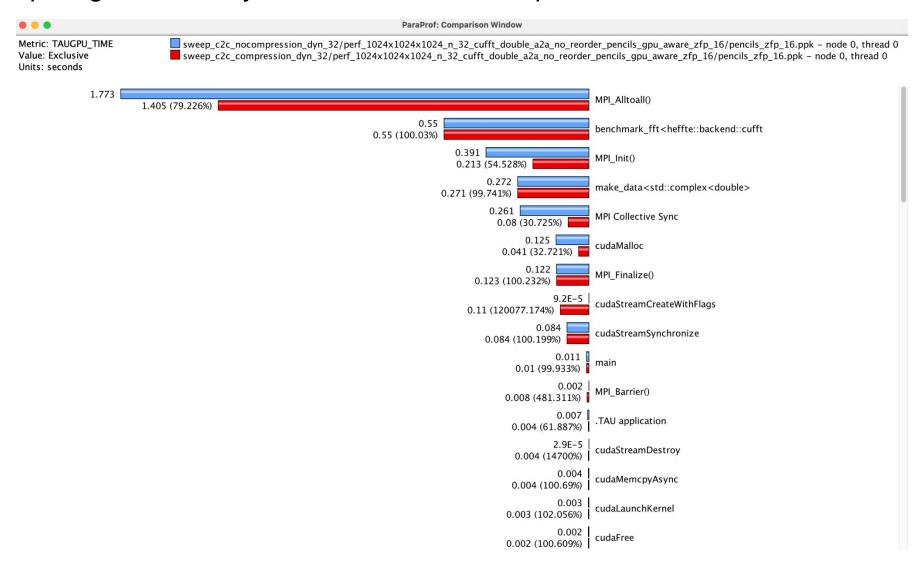
MPI Collective Sync in TAU: Time wasted in barrier



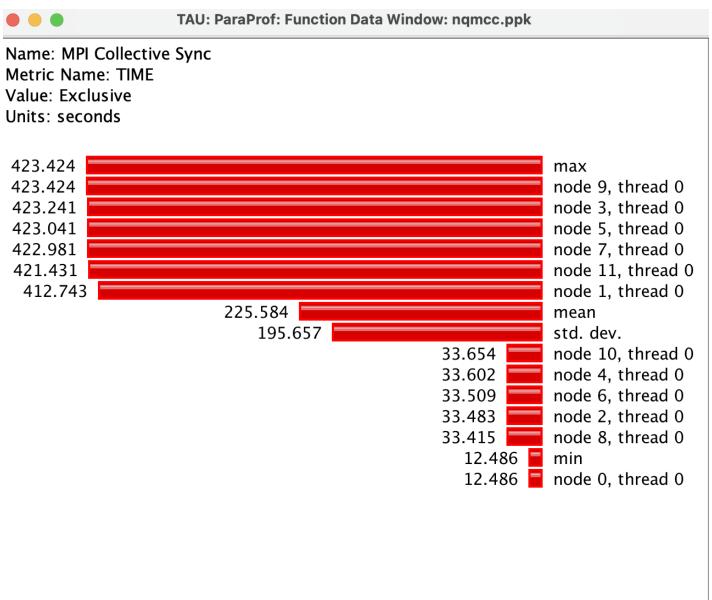
MPI Collective Sync in TAU: Time wasted in an implicit barrier

• • •	TAU: ParaProf: Call Path Data n,c,t, 2517,0,0 - e3sm_512n.ppk					
Metric Name: TAUGPU_TIME Sorted By: Exclusive Units: seconds						
Exclusive 	Inclusive	Calls/Tot.Calls	Name[id]			
365.011 3.0E-4 60.472 1.073 0.565 0.333 0.573 0.173 0.046	365.011 3.0E-4 60.472 1.073 0.565 0.333 0.573 0.173 0.046 428.246	1292216/1610353 1/1610353 317955/1610353 71/1610353 5/1610353 25/1610353 51/1610353 20/1610353 9/1610353	MPI_Bcast() MPI_Scan() MPI_Allreduce() MPI_Reduce() MPI_Allgather() MPI_Comm_dup() MPI_Gather() MPI_Scatterv() MPI_Allgatherv() MPI_Allgatherv()			
0.046 0.01 0.839 0.203 4.4E-4 0.053 0.006 2.865 1.1E-4 0.013 0.007 7.6E-4 0.003 3.4E-4 1.82 0.156	0.974 0.028 1.705 0.22 0.035 0.148 0.036 6.205 0.036 0.08 0.031 0.001 0.007 7.3E-4 4.426 6.196	519/1292216 122/1292216 9864/1292216 6/1292216 5/1292216 630/1292216 67/1292216 25889/1292216 1/1292216 154/1292216 86/1292216 9/1292216 38/1292216 3/1292216 108/1292216	<pre>l_i:PIO:pio_inq_varid_file_vid l_i:PIO:get_var_0d_double PIO:PIOc_write_darray l_i:comp_init PIO:put_var1_double l_i:PIO:pio_inq_vardimid_file_vid CPL:seq_timemgr_clockInit a_i:EAMxx::initialize_fields CPL:seq_hist_write l_i:PIO:get_var_1d_int CPL:comp_init_cc_atm2 i:PIO:pio_inq_varndims_file_vid CPL:comp_init_cc_esp i:cice_pice_readLBUB_UB_readpio i_i:cice_mct_init CPL:o2c_infoexch</pre>			

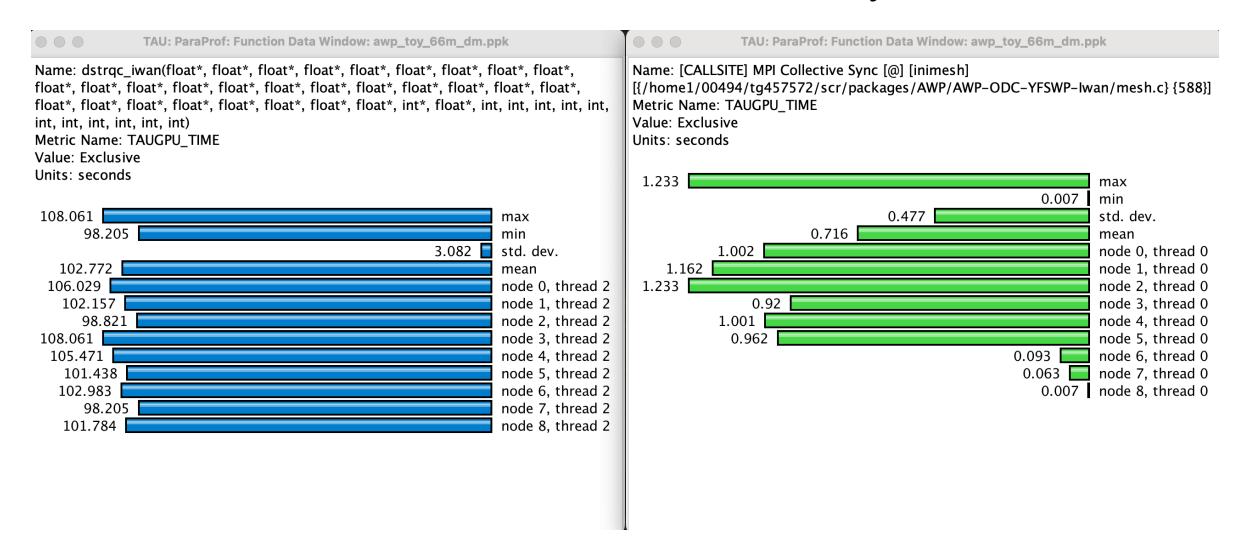
HeFFTe: Comparing collective sync time with TAU's comparison window



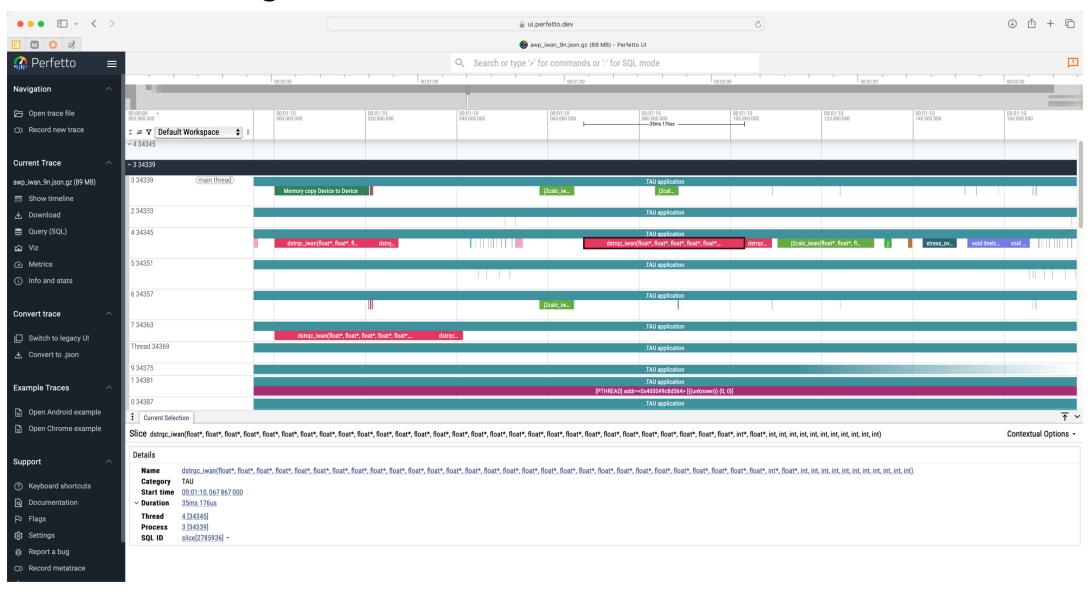
MPI Collective Sync in TAU: Time wasted in an implicit barrier



AWP-ODC: Callsite location of MPI Collective Sync



AWP-ODC: Tracing with TAU and Perfetto.dev



Binary instrumentation of libraries: Work in progress

- % tau_run a.out -o a.inst
 instruments a binary. Other flags -T <tags>, -f <selective instrumentation file>
 % tau_run -l /path/to/libhdf5.so.310 -o libhdf5.so.310
 instruments a DSO
- % tau_exec ./a.out executes the uninstrumented application with the instrumented shared object.

To use with DyninstAPI 13 on x86_64:

- 1. Load spack: source spack/share/spack/setup-env.sh
- 2. Install dyninst: spack install dyninst@13 %gcc@11
- 3. Configure tau with dyninst:
 - 3.1 spack find -p dyninst boost tbb elfutils
 - 3.2 Copy the paths for each package into the configure line
- 3.3 ./configure -bfd=download -dyninst=<dir> -tbb=<dir> -boost=<dir> -elf=<dir>; <set paths>; make install With AMD GPUs:
 - ./configure -bfd=download -mpi -rocm=/opt/rocm-6.0.0 -rocprofiler=/opt/rocm-6.0.0 -dyninst=download; make install

Binary instrumentation of libraries: HDF5



\$ pprof
Reading Profile files in profile.*

NODE 0; CONTEXT 0; THREAD 0:

%Time	Exclusive msec	Inclusive total msec	#Call	#Subrs	<pre>Inclusive usec/call</pre>	Name
100.0	 0.272	 68	1	 1	68245	 .TAU application
99.6	0.272	67	1	26		taupreload_main
65.8	0.008	44	6	1		H5open
65.8	6	44	2	14		H5_init_library
36.0	4	24	1	12		H5VL_init_phase2
27.8	1	18	1	319		H5T_init
19.8	0.193	13	179	179		H5Tregister_int
19.5	0.302	13	179	310		H5Tregister
19.0	4	12	155	2555		H5Tpath_find_real
13.0	2	8	1	79		H5P_init_phase1
12.7	0.663	8	2	51		H5F_open
11.2	0.348	7	1	6	7610	H5Fcreate
10.5	0.386	7	1	6	7138	H5Fcreate_api_commor
9.8	0.406	6	1	2		H5VL_file_create
9.2	0.005	6	1	1	6299	H5VLnative_file_crea
7.1	1	4	488	976	10	H5T_copy
6.5	1	4	1	363	4452	H5E_init
5.6	0.013	3	4	12	956	H5I_dec_app_ref
5.6	0.013	3	2	10	1896	H5Fclose
5.5	0.009	3	2	4	1878	H5Fclose_cb
5.5	0.01	3	2	6		H5VL_file_close
5.4	0.013	3	2	4		H5VLnative_file_clos
5.4	0.019	3	4	8	924	H5F_try_close.localal:

AWP-ODC [UCSD]: TAU+CUPTI+DyninstAPI

Reading Profile files in profile.*						
NODE 0;	CONTEXT 0;TH	READ 0:				
%Time	Exclusive msec	Inclusive total msec	#Call	#Subrs	Inclusive usec/call	Name
100.0	25	6:27.801	1	1	387801618	.TAU application
100.0	3	6:27.776		1	387776447	taupreload_main
100.0	205	6:27.772	1	125785	387772922	int main()
60.2	3:53.279	3:53.279	10501	0		cudaDeviceSynchronize
37.4	2:25.156	2:25.156	18300	0	7932	cudaStreamSynchronize
1.8		7,086	12006			MPI_Waitall()
0.2	662	940	1	1033		MPI_Init()
0.1	45	284	62151	62151		cudaLaunchKernel <char></char>
0.1	274	274	1024	0		cudaStreamCreateWithFlags
0.1	239	239	62151	0		cudaLaunchKernel
0.0	173	173	108	0		Grid3D Alloc3D()
0.0	108	108	20750	0		cudaMemcpyAsync
0.0	67	72	1	1026		MPI_Finalize()
0.0	9	64	7500	30000		dstrqc_iwan_H
0.0	7	58	4000	24000		update_swapzone_data_y_H
0.0	7	57	4000	24000		update_swapzone_data_x_H
0.0	7	55	4000	24000		update_swapzone_buffer_y_H
0.0	28	53	40000	40000		cudaFuncSetCacheConfig <void (float*<="" td=""></void>
0.0	7	52	4000	24000		update_swapzone_buffer_x_H
0.0	5	45	1500	10500		<pre>void Cpy2Device_VY()</pre>
0.0	2	42	7500	7500		dstrqc_iwan
0.0	2	41	8000	8000		update_swapzone_data_y
0.0	2	41	8000	8000		update_swapzone_data_x
0.0	40	40	1	0	40672	void inisigma2()

Profiling and Tracing

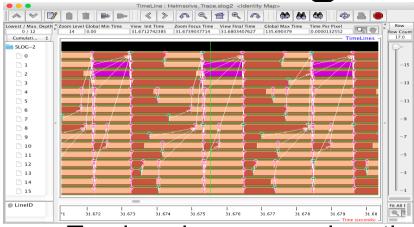
Profiling

```
Marrie: TIME
Value: Exclusive
Units: seconds

43.649

Loop: FOINT_SOLVER.POINT_SOLVE.S (Ippnin_solver.F00) (2757,51-(2917,19))
Loop: FOINT_SOLVER.POINT_SOLVER.POINT_SOLVE.S (Ippnin_solver.F00) (2757,51-(2917,19))
Loop: FOLVER.FCGNS: ROCE_FLUX (Iffux_perfgas.F00) (397.5)-(597.20)
Loop: FLUX_PERFCAS::ROCE_FLUX (Iffux_perfgas.F00) (397.5)-(597.20)
MPL Vedicard
CRADIENT_DEVIRE::CRAD_VARIABLE (Igradient_driver.F00) (110.3)-(598.30)]
MPL Vedicard
MPL V
```

 Profiling shows you how much (total) time was spent in each routine **Tracing**



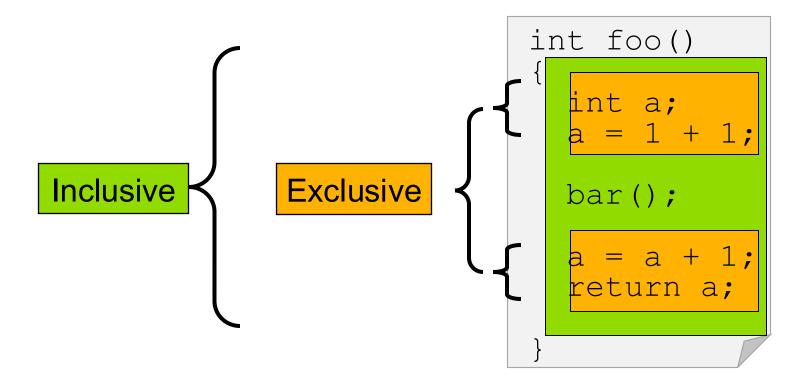
 Tracing shows you when the events take place on a timeline

Profiling and tracing

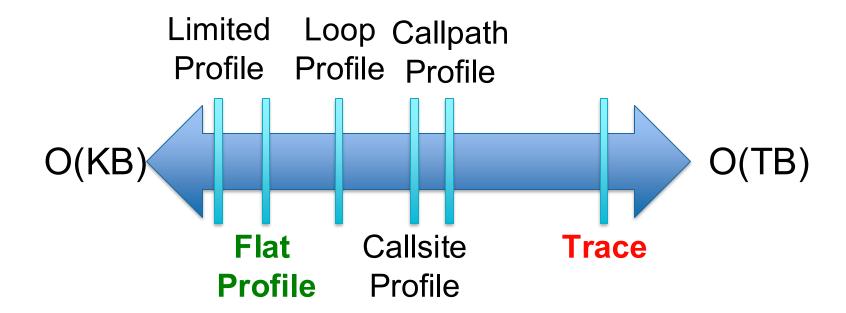
Profiling shows you **how much** (total) time was spent in each routine **Tracing** shows you **when** the events take place on a timeline

Inclusive vs. Exclusive values

- Inclusive
 - Information of all sub-elements aggregated into single value
- Exclusive
 - Information cannot be subdivided further



How much data do you want?



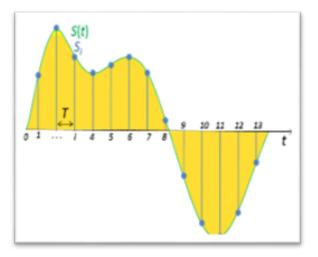
Types of Performance Profiles

- 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

Performance Data Measurement

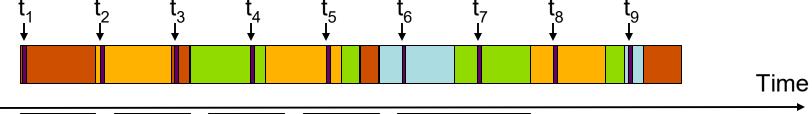
```
Call START('potential')
// code
Call STOP('potential')
```

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



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

Sampling



Measurement

foo (2)

Running program is periodically interrupted to take measurement

foo (1)

Timer interrupt, OS signal, or HWC overflow Service routine examines return-address stack Addresses are mapped to routines using symbol table information

Statistical inference of program behavior

Not very detailed information on highly volatile

metrics

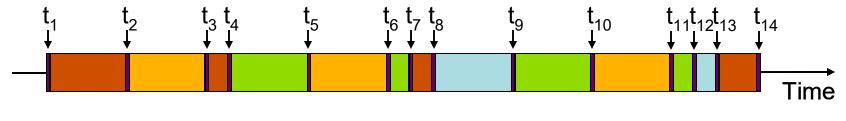
foo (0)

main

Requires long-running applications
Works with unmodified executables

```
int main()
  int i;
  for (i=0; i < 3; i++)
    foo(i);
  return 0;
void foo(int i)
  if (i > 0)
    foo (i - 1);
```

Instrumentation



Measurement

foo (2)

Measurement code is inserted such that every event of interest is captured directly

foo (1)

Can be done in various ways

foo (0)

Advantage:

main

Much more detailed information

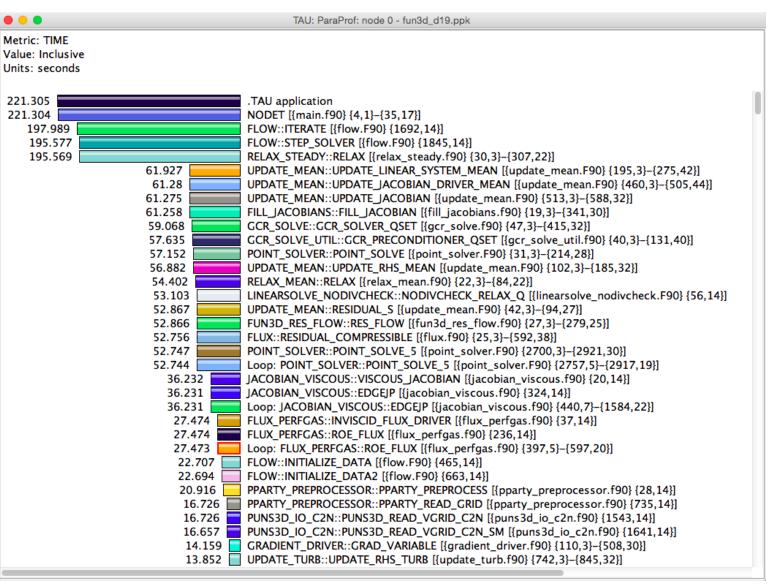
Disadvantage:

Processing of source-code / executable necessary

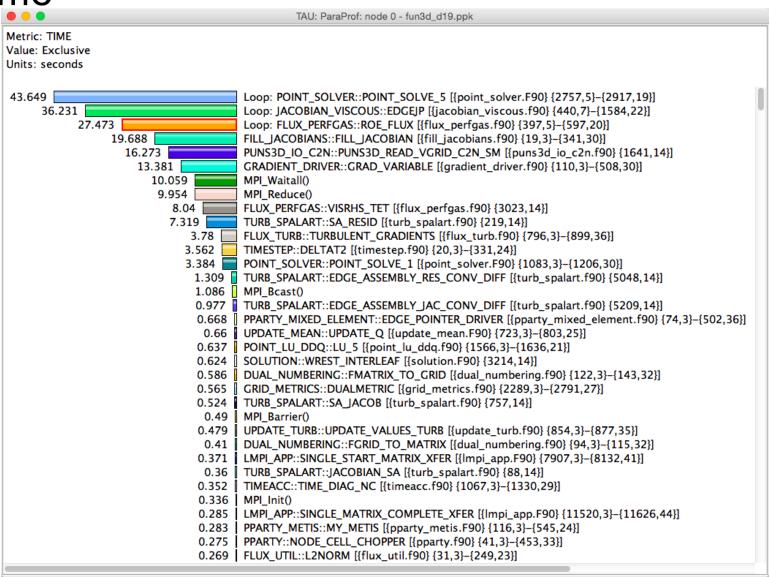
Large relative overheads for small functions

```
int main()
  int i;
  TAU START ("main");
  for (i=0; i < 3; i++)
  foo(i);
TAU_STOP("main");
  return 0;
void foo(int i)
  TAU START ("foo");
  if (i > 0)
    foo(i - 1);
  TAU STOP("foo");
```

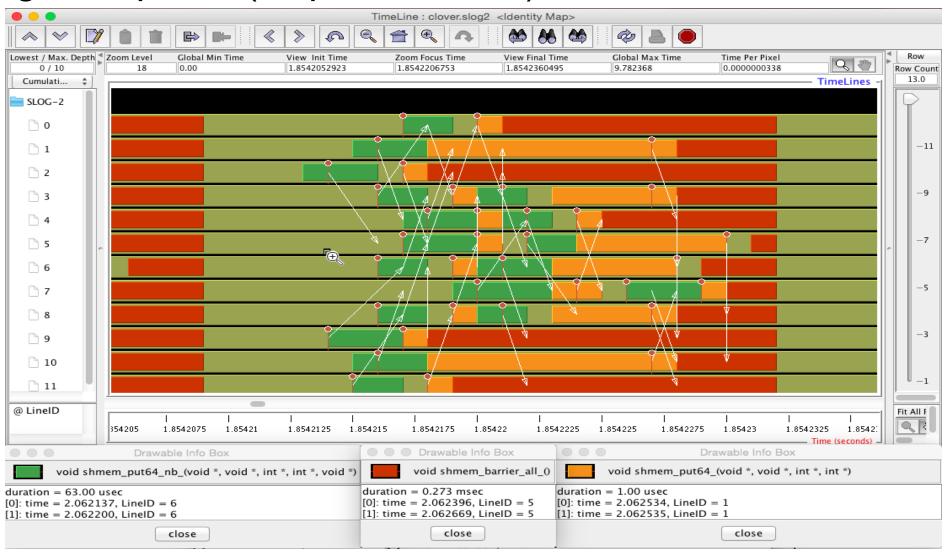
Inclusive Measurements



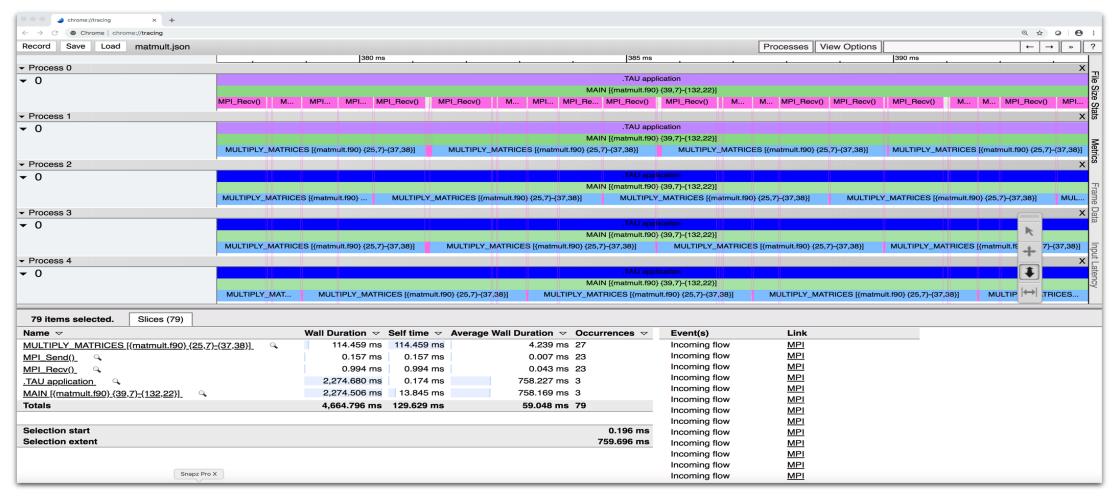
Exclusive Time



Tracing: Jumpshot (ships with TAU)



Tracing: Chrome Browser



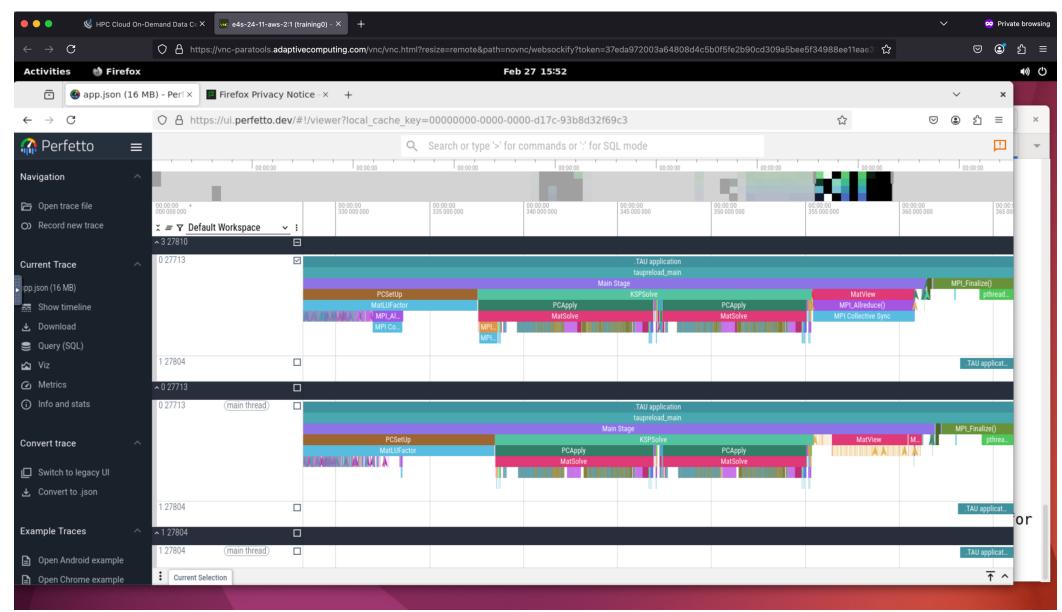
% export TAU_TRACE=1

% mpirun –np 256 tau_exec ./a.out

% tau_treemerge.pl; tau_trace2json tau.trc tau.edf -chrome -ignoreatomic -o app.json

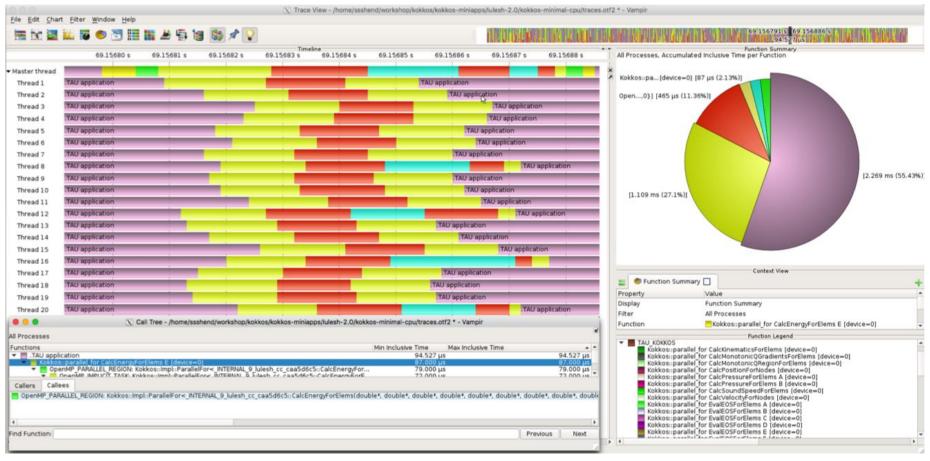
Chrome browser: chrome://tracing (Load -> app.json)

Visualizing Traces with https://Perfetto.dev



wasd W = widen S = Shrink A = Left D = Right

Vampir [TU Dresden] Timeline: Kokkos

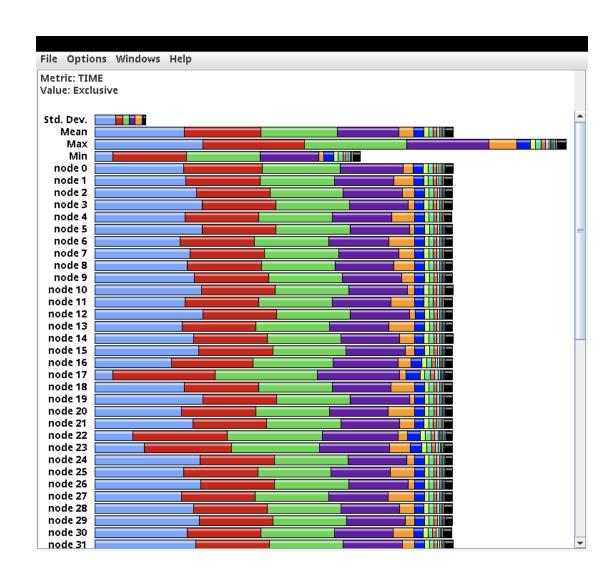


% export TAU TRACE=1; export TAU TRACE FORMAT=otf2

% tau exec -T ompt -ompt ./a.out

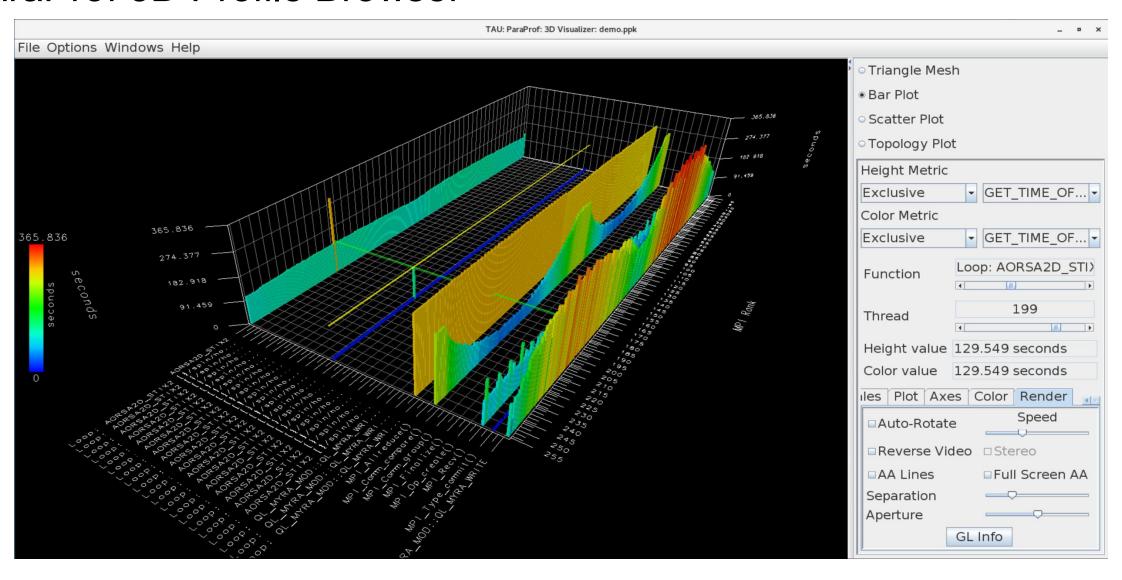
% vampir traces.otf2 &

ParaProf Profile Browser

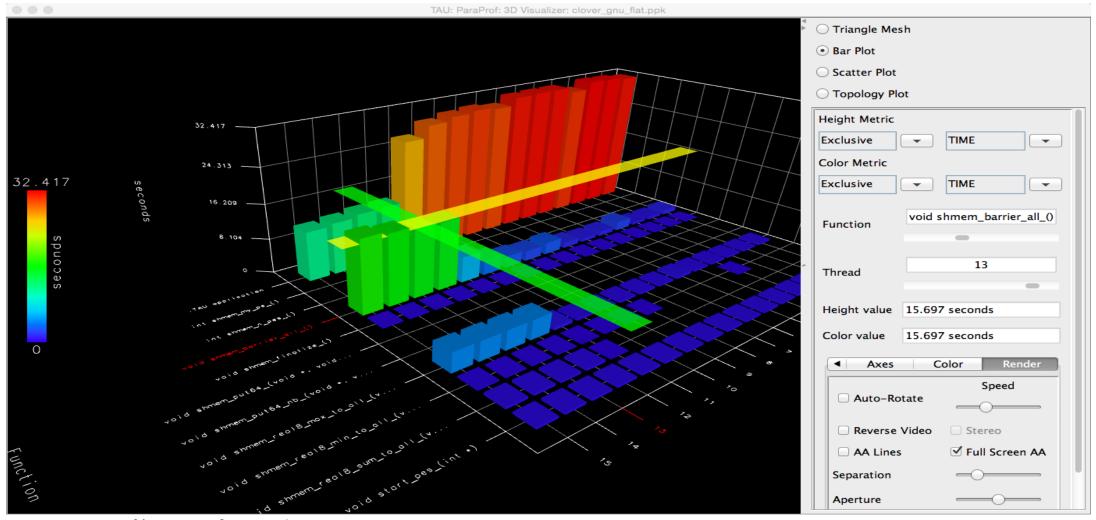


% paraprof

ParaProf 3D Profile Browser

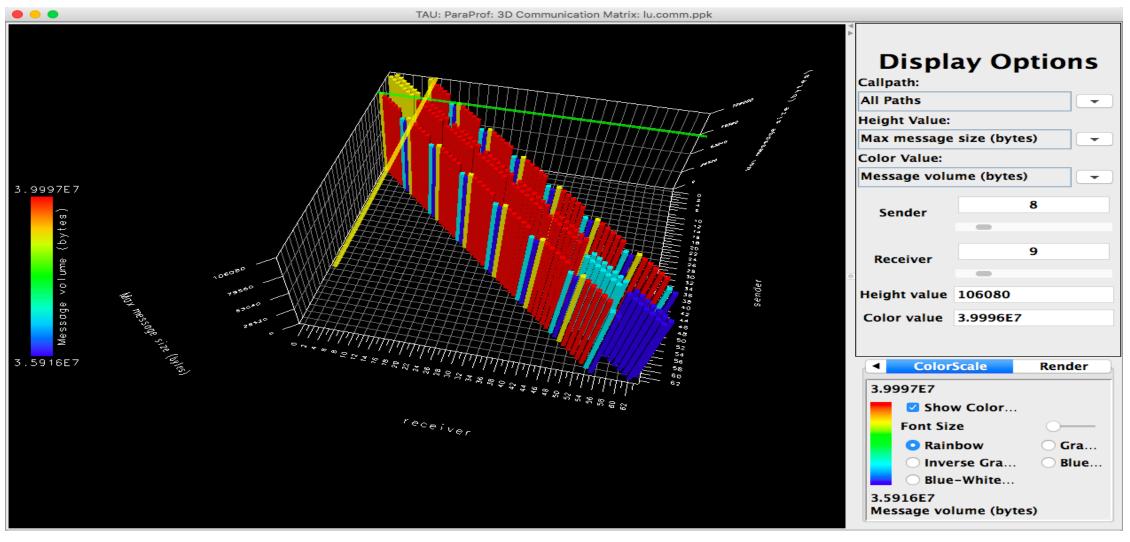


TAU – ParaProf 3D Visualization



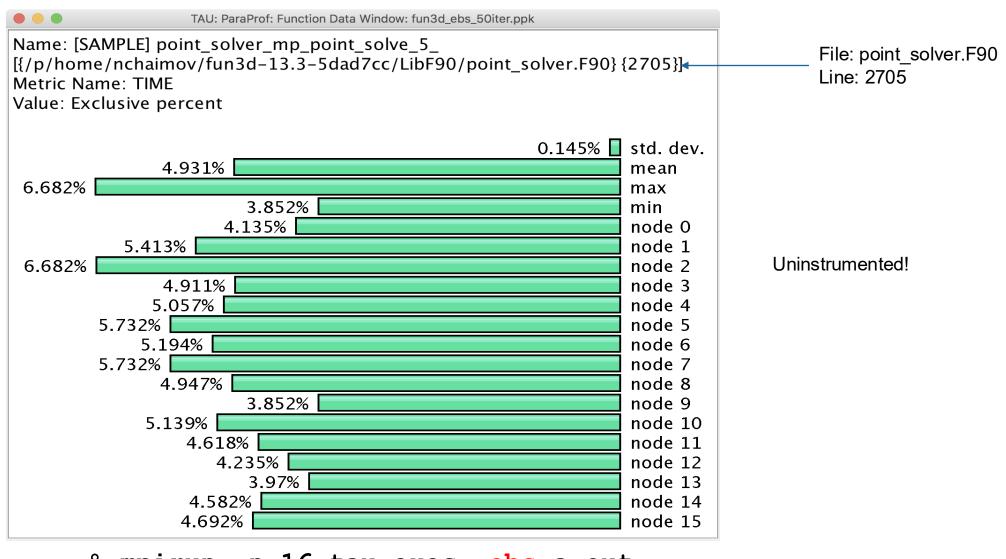
% paraprof app.ppk
Windows -> 3D Visualization -> Bar Plot (right pane)

TAU – 3D Communication Window



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

Event Based Sampling (EBS)

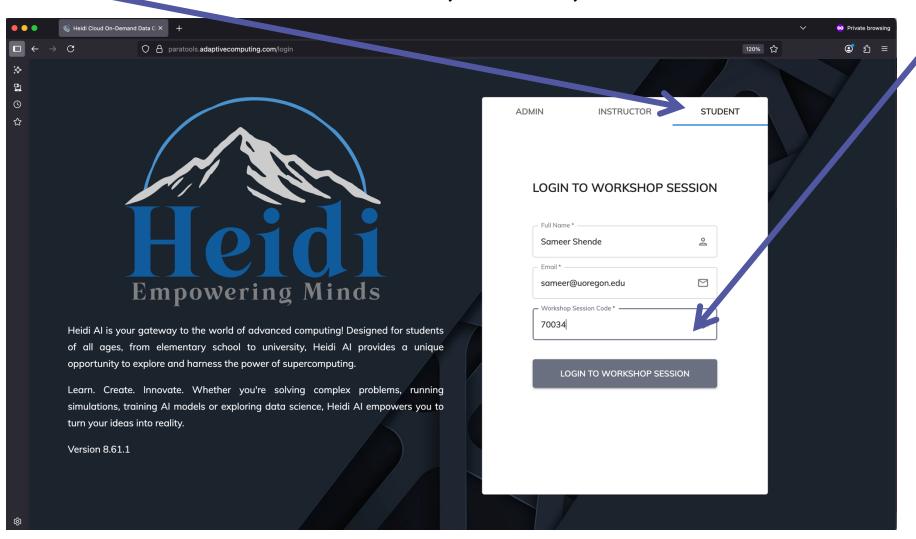


% mpirun -n 16 tau_exec -ebs a.out

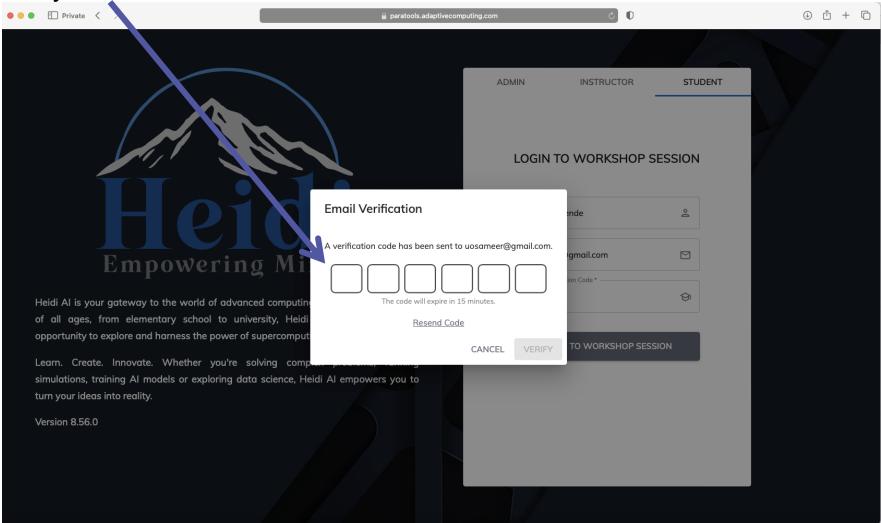
Using ParaTools Pro for E4STM image on AWS with Heidi AI/ODDC

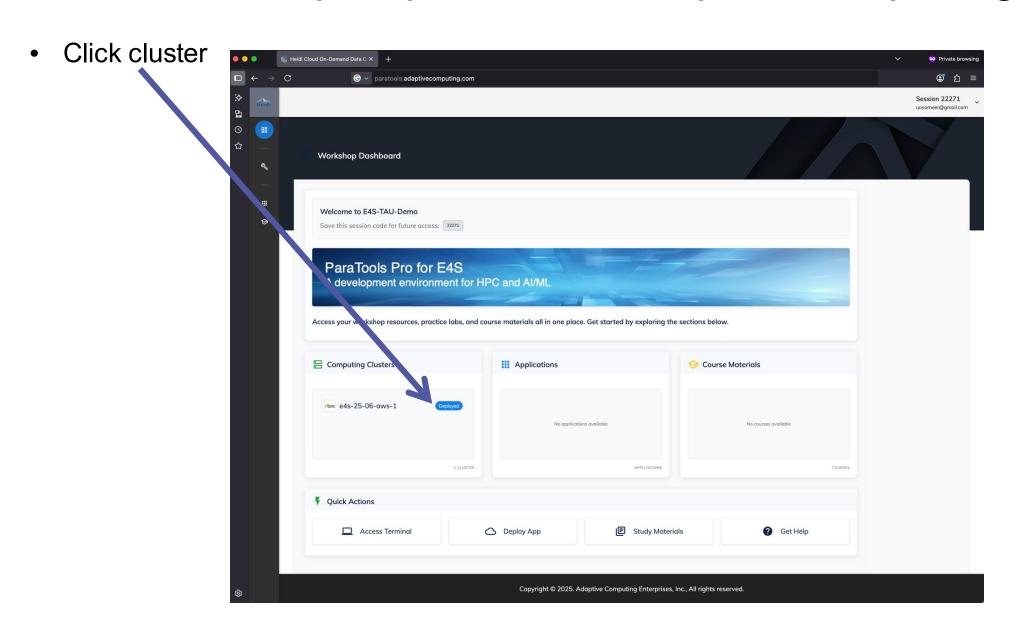
Login to:
https://paratools.adaptivecomputing.com
with the credentials. Firefox private window recommended.
Click on Student tab and use code:70034

Use Student tab and enter name, email, session code 70034

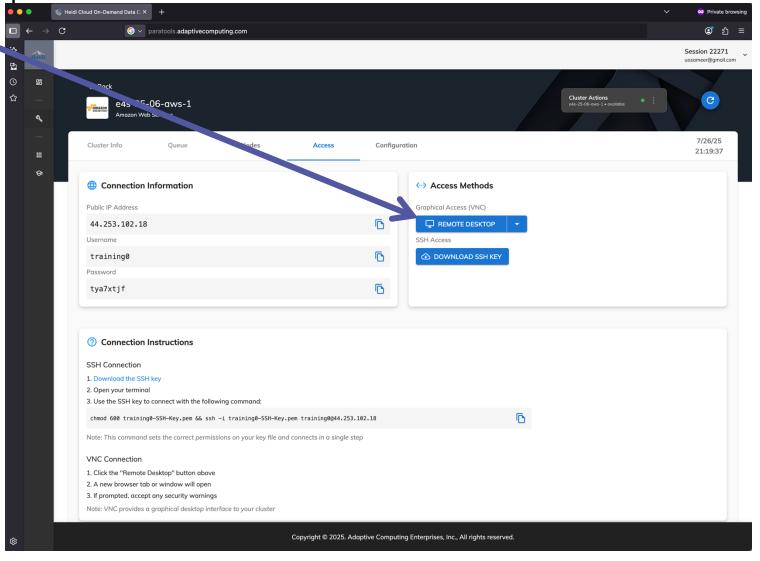


Check your email, enter verification code.

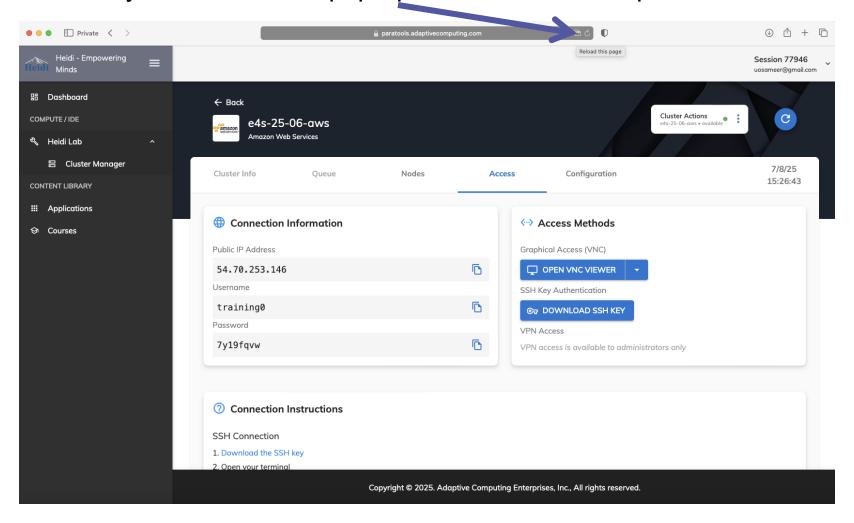




Click Remote Desktop



You may have to enable pop-up windows and accept

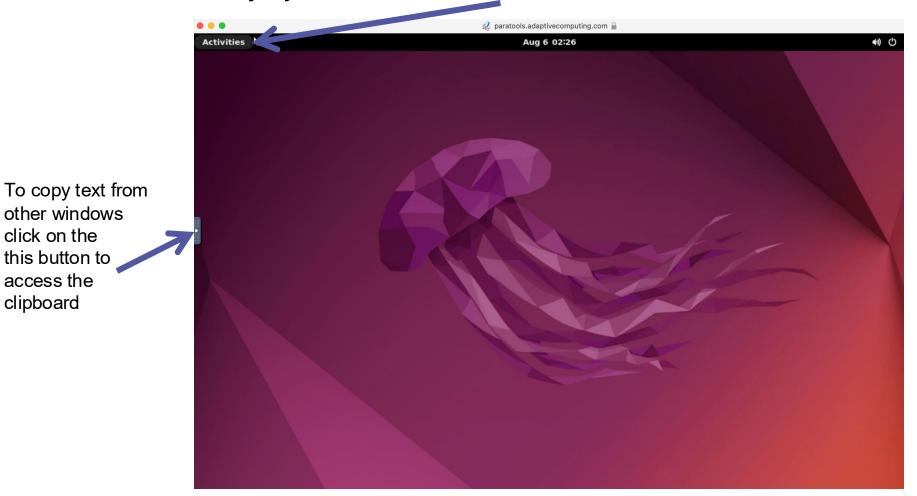


Connect to Students tab with code 70034 at https://paratools.adaptivecomputing.com

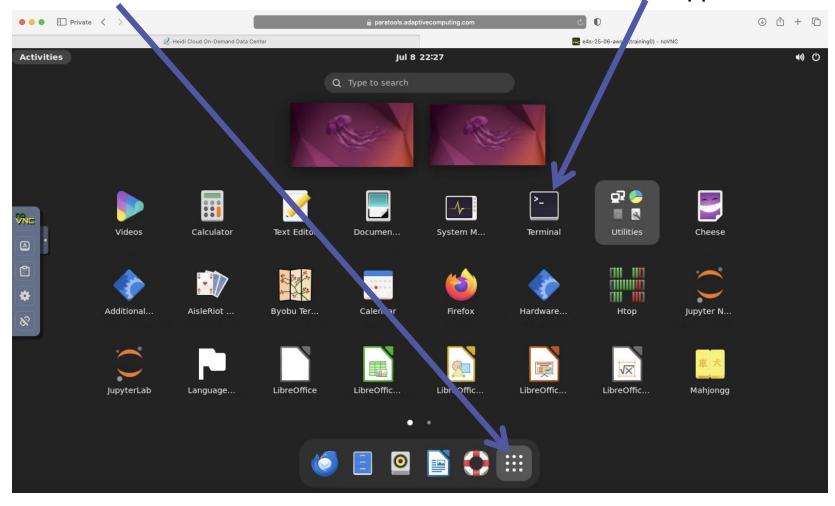
You should see this jellyfish. Click on Activities.

click on the

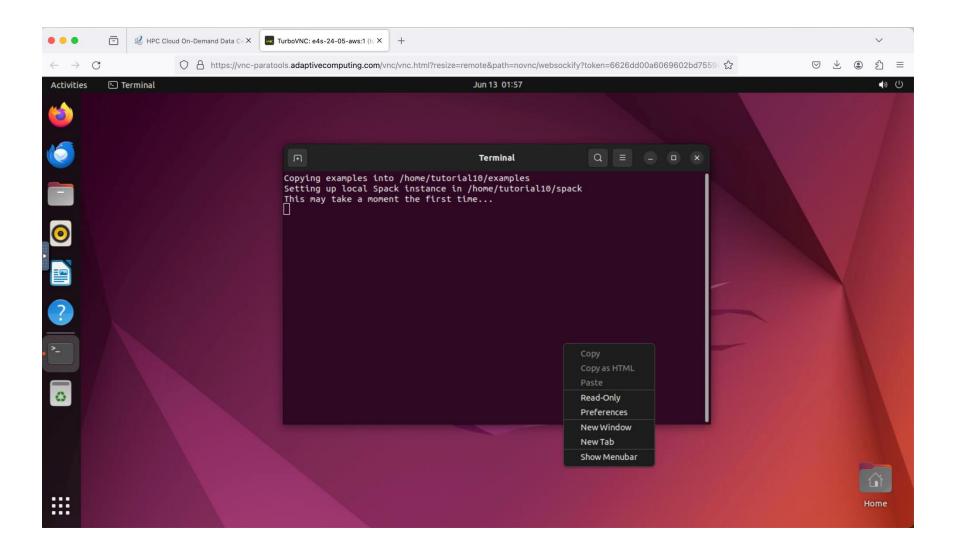
access the clipboard



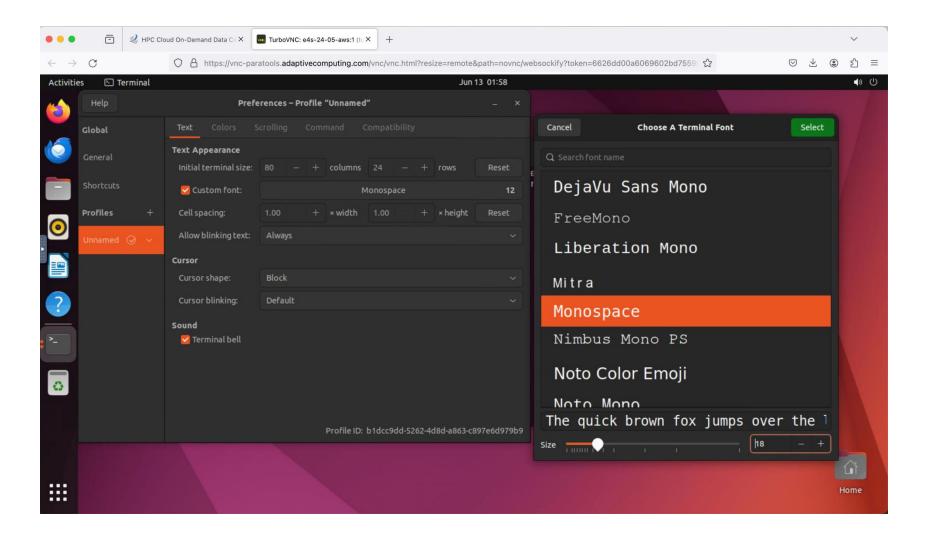
Click on Activities, nine dots, and then select the Terminal application



To increase font size right click and choose preferences



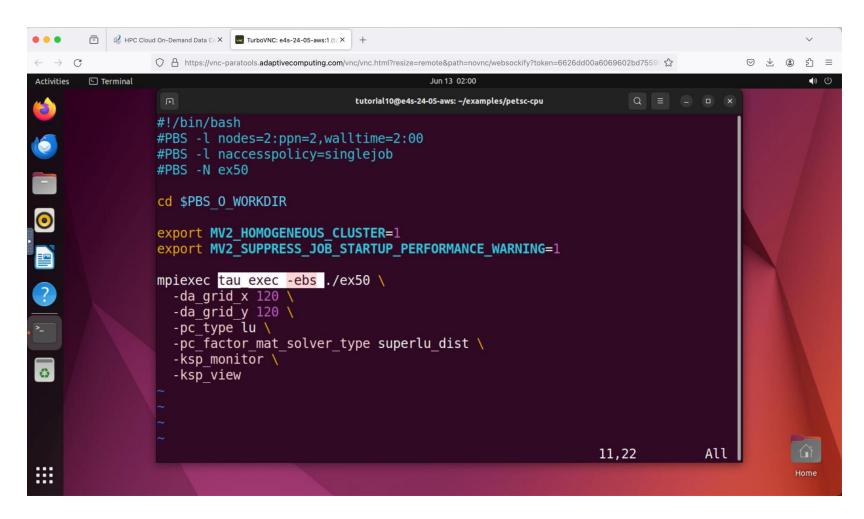
Choose font size after clicking Custom Font for Terminal



Running your first MPI application on the allocated cluster

```
% cd ~/examples/mpi-procname
% ./compile.sh
% ./run-single-node.sh
                      # on the login node
% cat mpiprocname.qsub
% qsub mpiprocname.qsub
% qstat –u $USER
% cat mpiprocname.o*
% cd ~/examples/osu-benchmarks
% cat bw.qsub
% qsub bw.qsub
% cat bw.o*
                    # How close did you get to 50Gbps? At what message size? Multiply MB/s x 8 ...
```

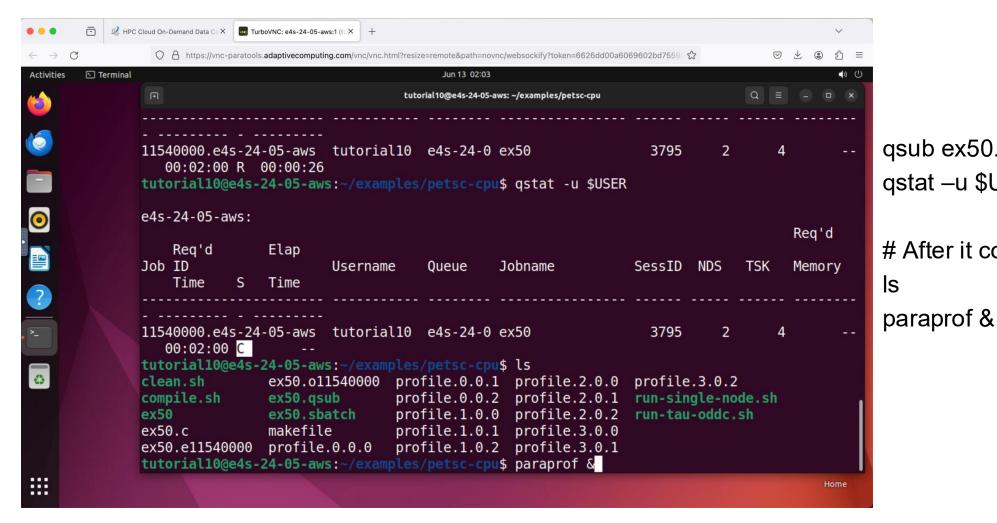
Launching the binary using tau_exec -ebs



cd ~/examples/petsc-cpu vi ex50.qsub

Add tau_exec –ebs before ./ex50 in the launch command. Save the file.

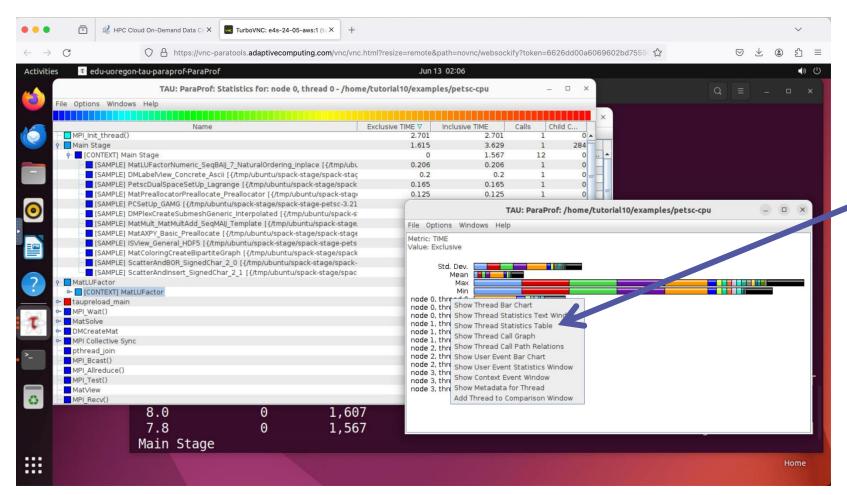
TAU's ParaProf Profile Browser: Source Code Browser



qsub ex50.qsub qstat -u \$USER

After it completes Is

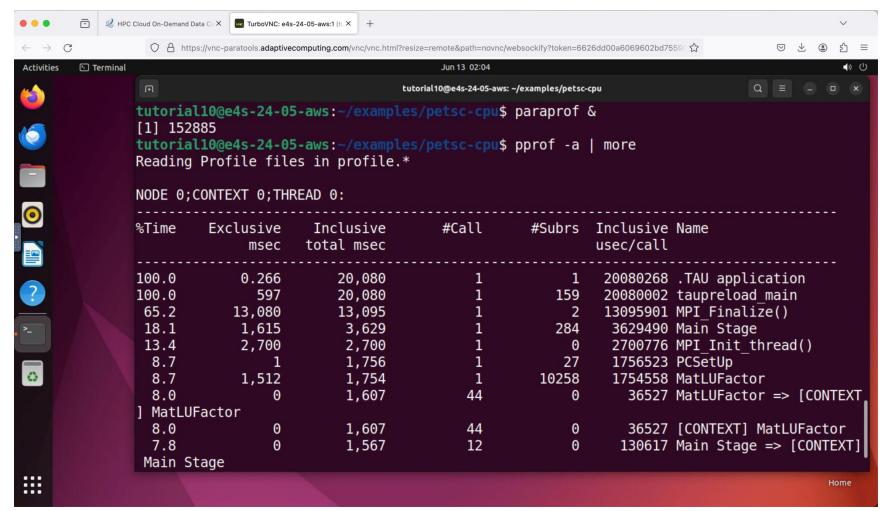
TAU's paraprof browser with PETSc performance profile



paraprof

Choose
Show thread statistics table by right clicking on node 0, thread 0.

Using pprof: TAU's text based profile browser

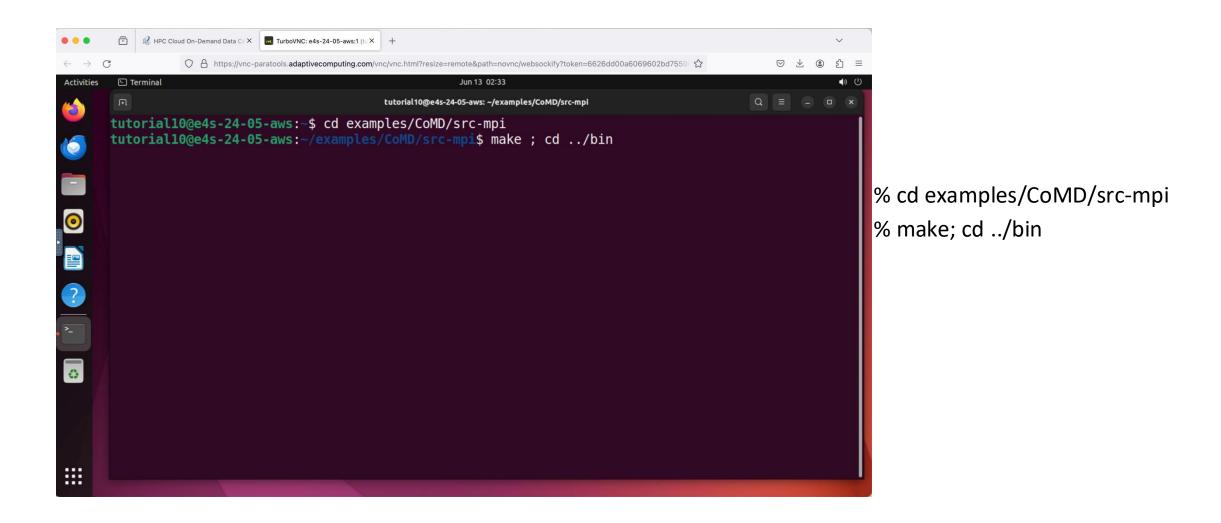


pprof -a | more

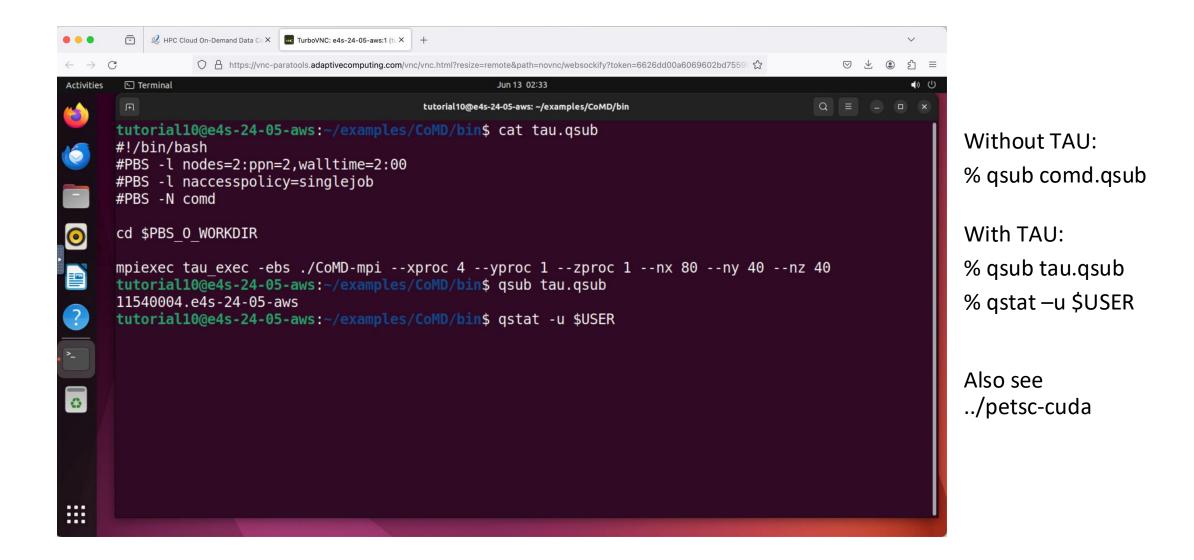
Here we see PETSc timers translated into TAU timers using the Perfstubs library.

No modification to the source, build system, or the binary!

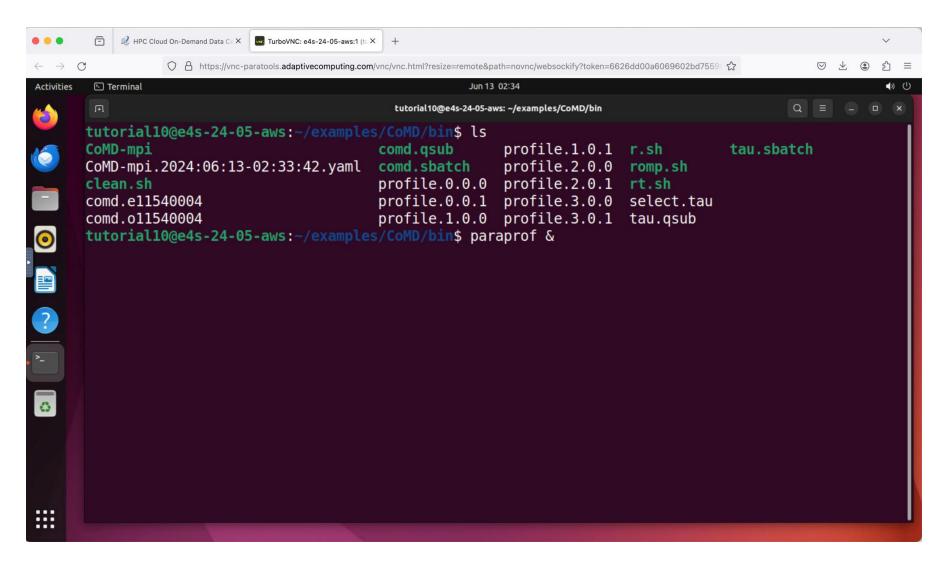
CoMD: TAU with event-based sampling (EBS)



CoMD: TAU with event-based sampling (EBS)



CoMD: TAU's paraprof visualizer



% paraprof &

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_FOO TPRINT	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>)</subevent></event>	

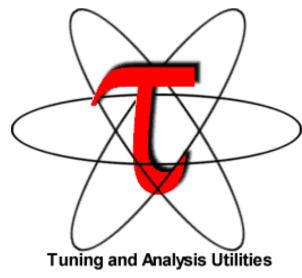
Runtime Environment Variables

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/AB OVE	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_ALINGMENT	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

Download TAU from U. Oregon



http://tau.uoregon.edu

https://e4s.io [TAU in Docker/Singularity containers] for more information

Free download, open source, BSD license

Performance Research Laboratory,

University of Oregon Fugene









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 - PETTT, HPCMP
- National Science Foundation (NSF)
 - SI2-SSI, Glassbox, E4S Workshop
- NASA
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- CEA, France
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Office of



- https://science.osti.gov/ascr
- https://pesoproject.org
- https://ascr-step.org
- https://hpsf.io



https://www.energy.gov/technologytransitions/sbirsttr

Thank you

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Thank you to all collaborators in the ECP and proader computational science communities. The work discussed in this presentation represents the time computational science of many people who are passionately working toward next-generation computational science.

