

TAU Performance Analysis

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ParaTools, Inc.

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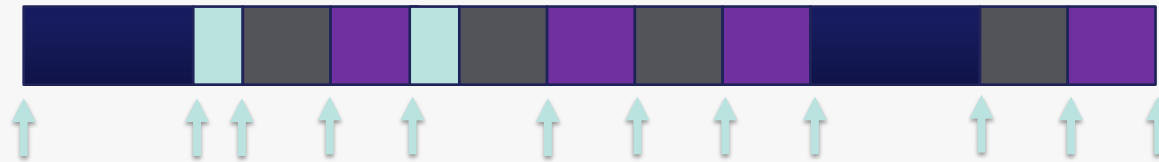
Overview

We will cover:

- Profiling and tracing via the TAU Performance System
- Hardware performance counters (PAPI)
- Performance analysis of C/C++, Fortran, Python
- Python+MPI analysis

PERFORMANCE CHARACTERIZATION CONCEPTS AND TOOLS

Instrumentation



Code or compiler output is modified to explicitly trigger a measurement at the beginning and end of each function/region of interest.

- More detailed information
- Unequally distributed overhead (short-running functions -> larger % overhead)
- Need to process source code

Source instrumentation

Compiler instrumentation

Binary rewriting

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

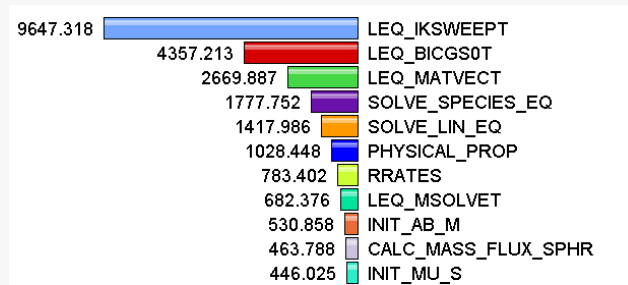

Sampling



- Periodically interrupt program and record program counter
- No modification to program needed
 - Just compile with debug symbols for address resolution
- Tradeoff between overhead and accuracy
 - Overhead evenly distributed

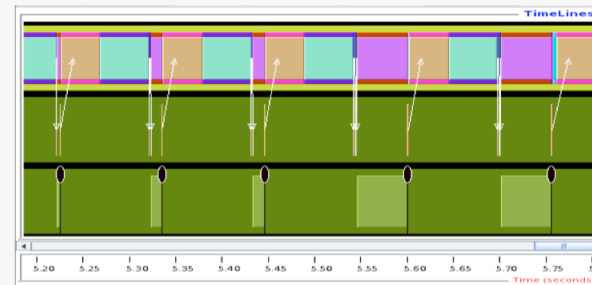
Measurement Approaches

Profiling



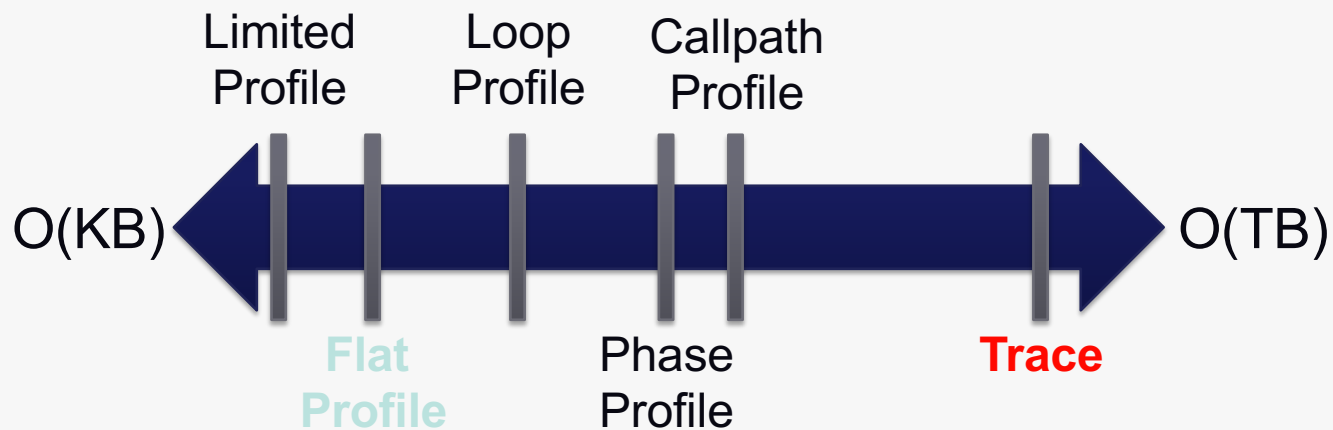
Shows
how much time
 was spent in each
 routine

Tracing



Shows
when events
 take place on a
 timeline

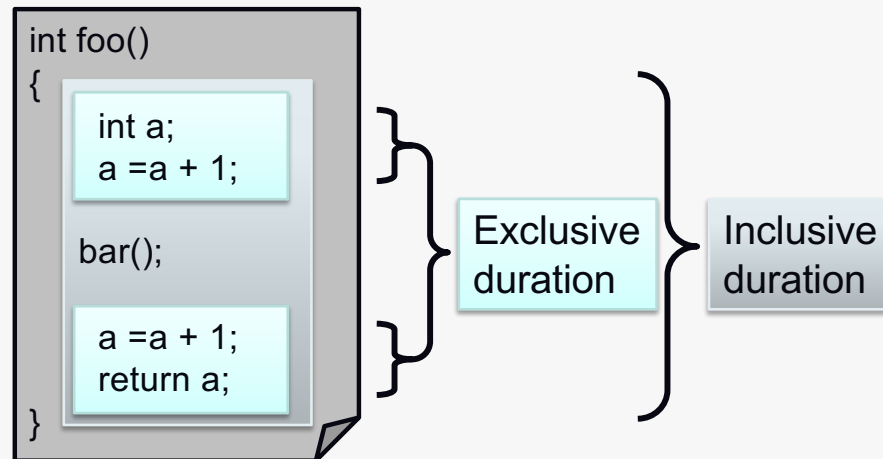
How much data do you want?



All levels support
multiple
metrics/counters

Inclusive vs. Exclusive Measurements

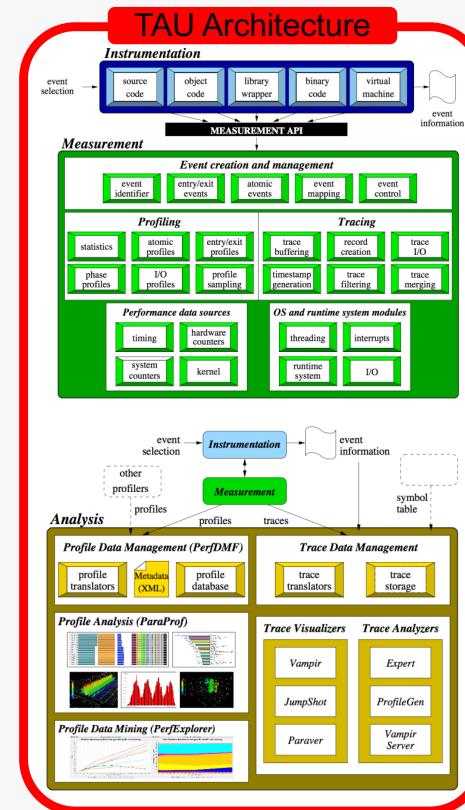
- Exclusive measurements for region only
- Inclusive measurements includes child regions



A HIGH LEVEL OVERVIEW OF TAU'S CAPABILITIES

The TAU Performance System®

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



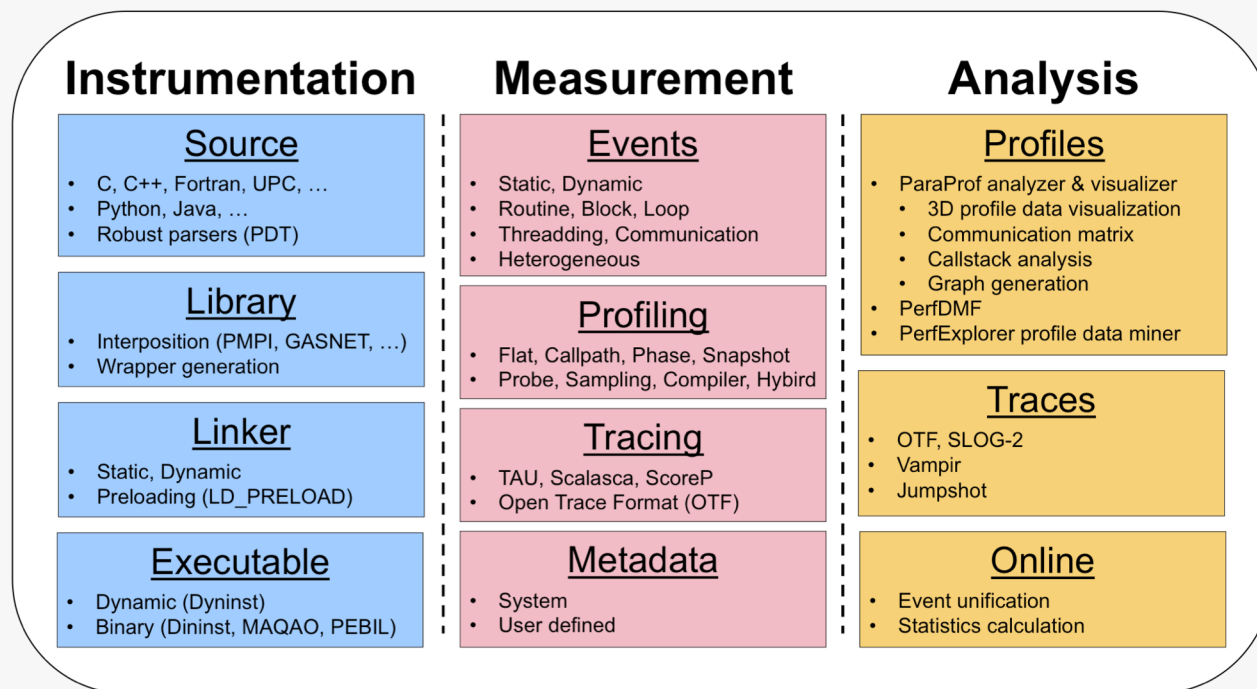
Performance Tool Checklist

- Universal tool or integrated toolkit
- Unbiased, accurate measurements
 - File I/O: serial and parallel
 - Communication: inter- and intra-node
 - Memory: allocation and access
 - CPU: vectorization, cache utilization, etc.
- Minimal overhead
 - Provide multiple measurement methods
 - Focus on one performance aspect at a time

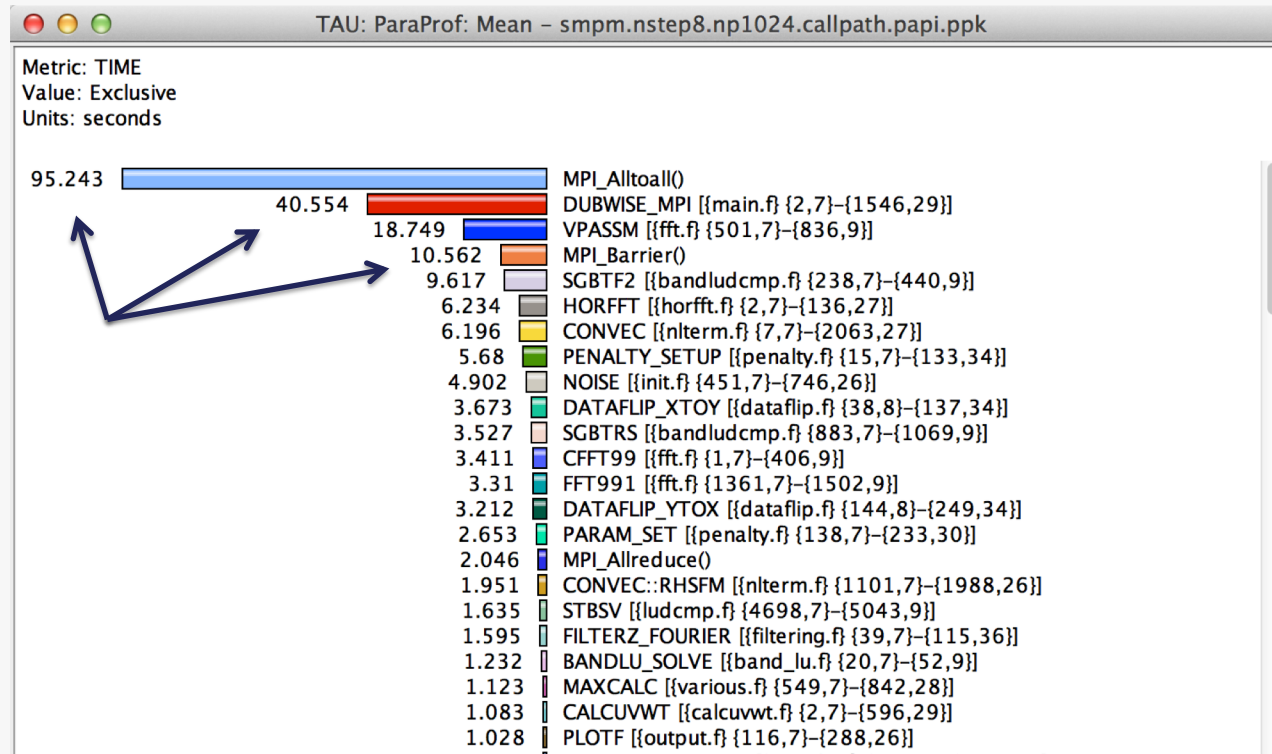


**TAU
Performance
System®**

TAU Workflow

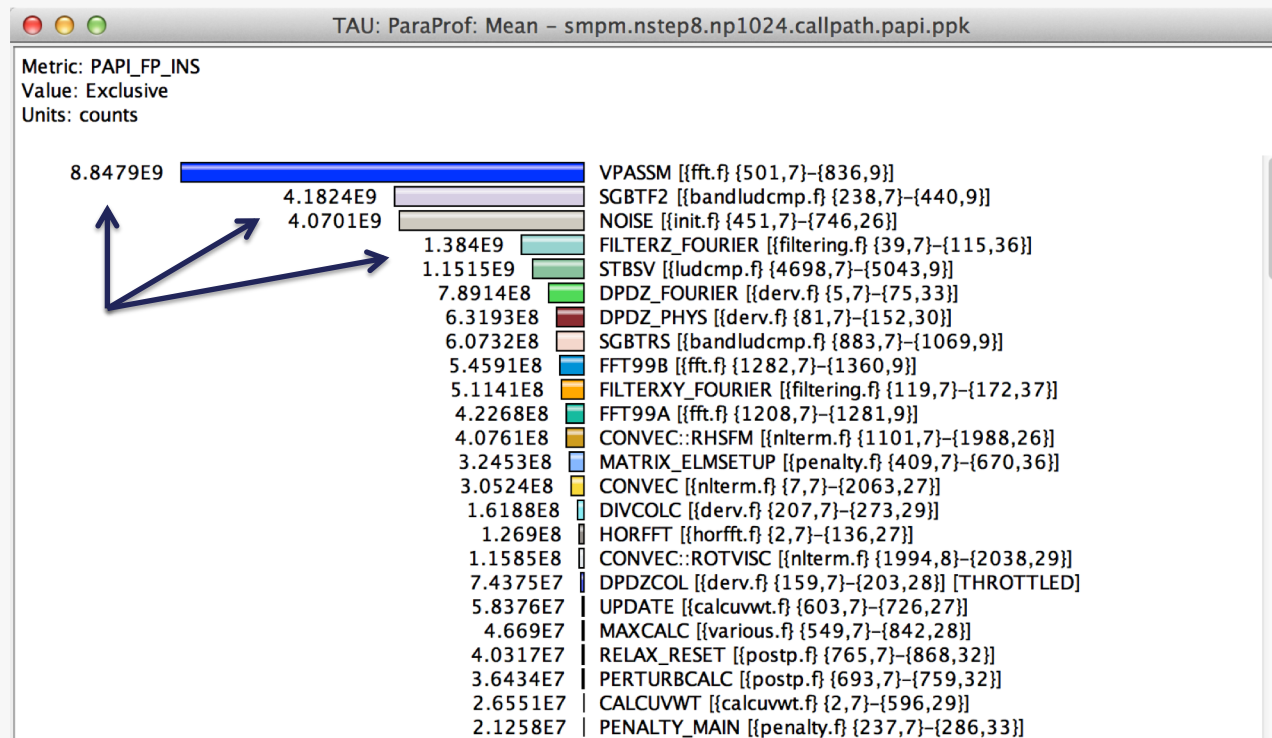


How Much Time per Code Region?



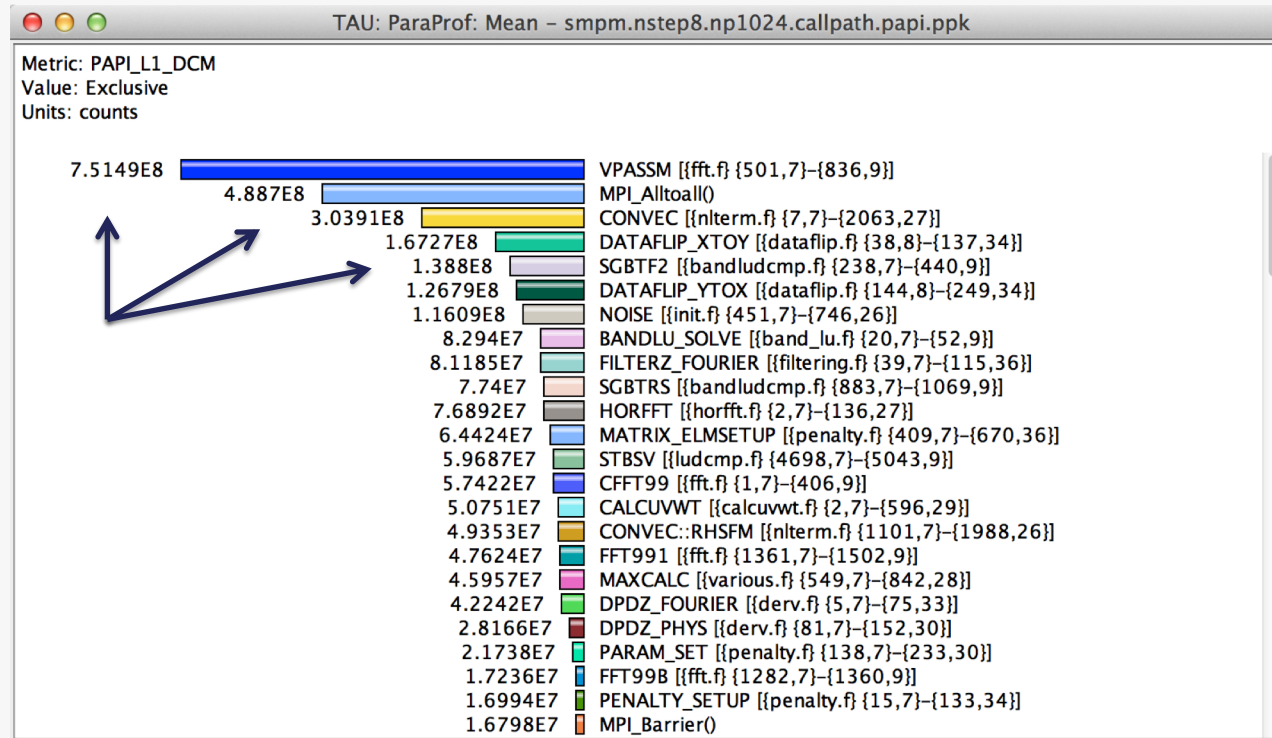
% paraprof (Click on label, e.g. “Mean” or “node 0”)

How Many Instructions per Code Region?



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

How Many L1 or L2 Cache Misses?



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

How Much Memory Does the Code Use?

TAU: ParaProf: Mean Context Events - sphere_np32_nsteps5_mem.ppk

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

High-water mark

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

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Total allocated/deallocated

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

Where is Memory Allocated / Deallocated?

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malloc size (bytes)	27,468,709,355.914	435,669.625	24,025,667	0	63,049.402	195,561.193

Allocation / Deallocation Events

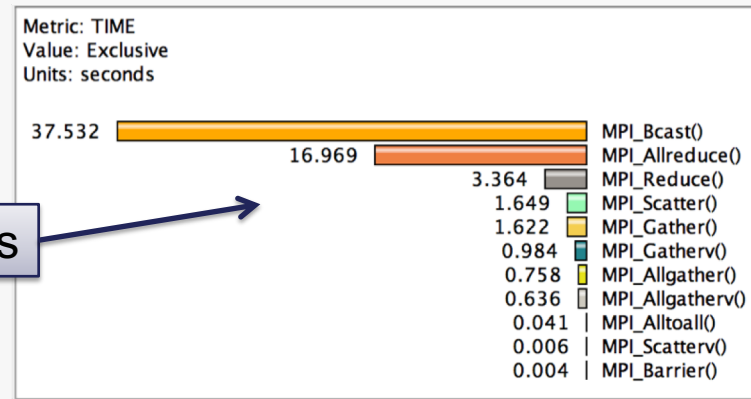
% **paraprof** (Right-click label [e.g “node 0”] → Show Context Event Window)

How Much Time is spent in Collectives?

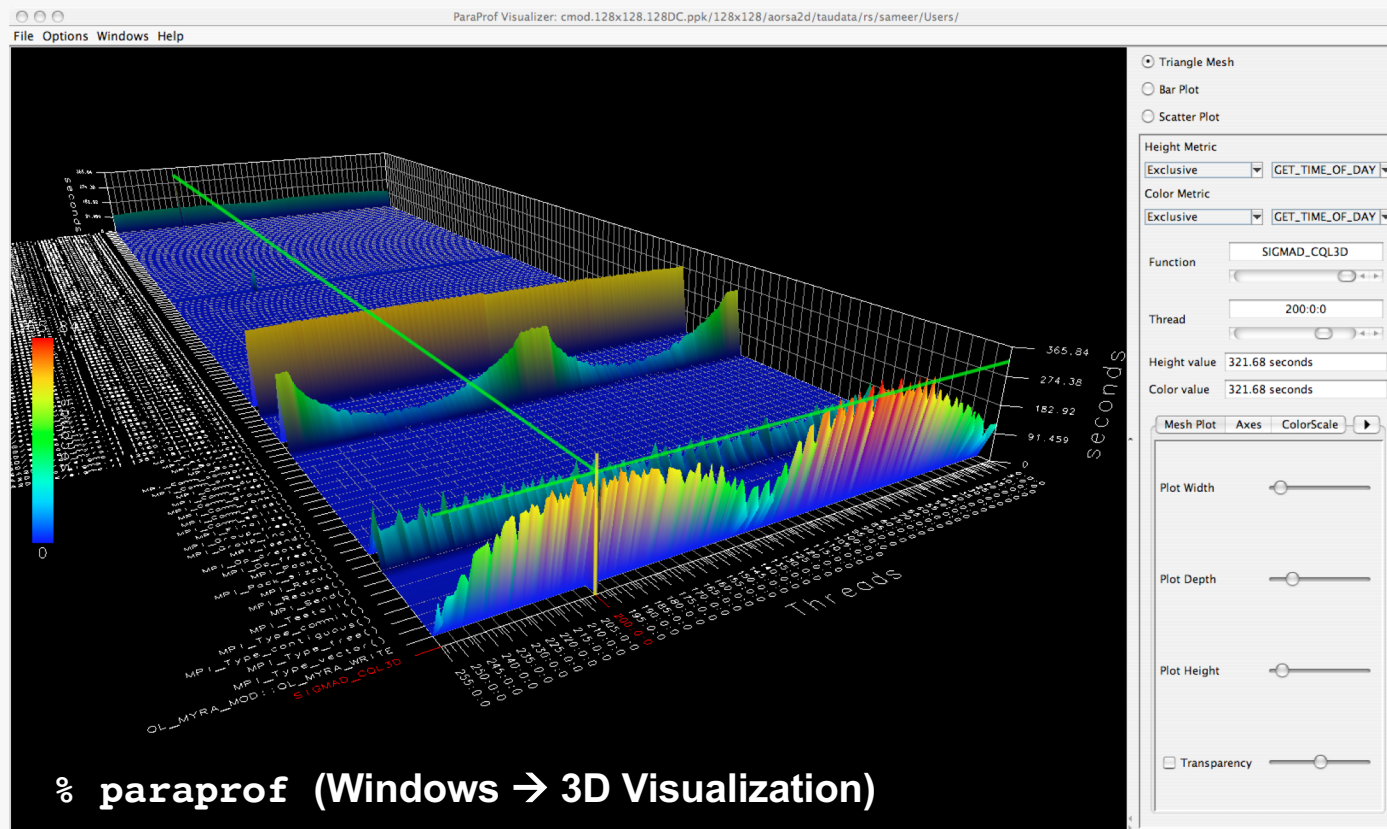
Name 	Total	Num...	MaxValue	MinValue	MeanValue	Std. Dev.
► MPI_Wait()						
► MPI_Waitall()						
Message size for all-gather	305,753,268	72	172,215,296	4	4,246,573.167	22,551,605.859
Message size for all-reduce	163,308	632	21,908	4	258.399	897.725
Message size for all-to-all	112	14	8	8	8	0
Message size for broadcast	692,208,045.5	3,346	18,117,620	0	206,876.284	1,284,673.036
Message size for gather	6,901,452.378	15,312	1,387,306.625	4	450,707.094	483,216.499
Message size for reduce	66,812	1,520	56	4	43.955	21.598
Message size for scatter	63,147.906	146	62,567.906	4	432.52	5,160.063

Message sizes

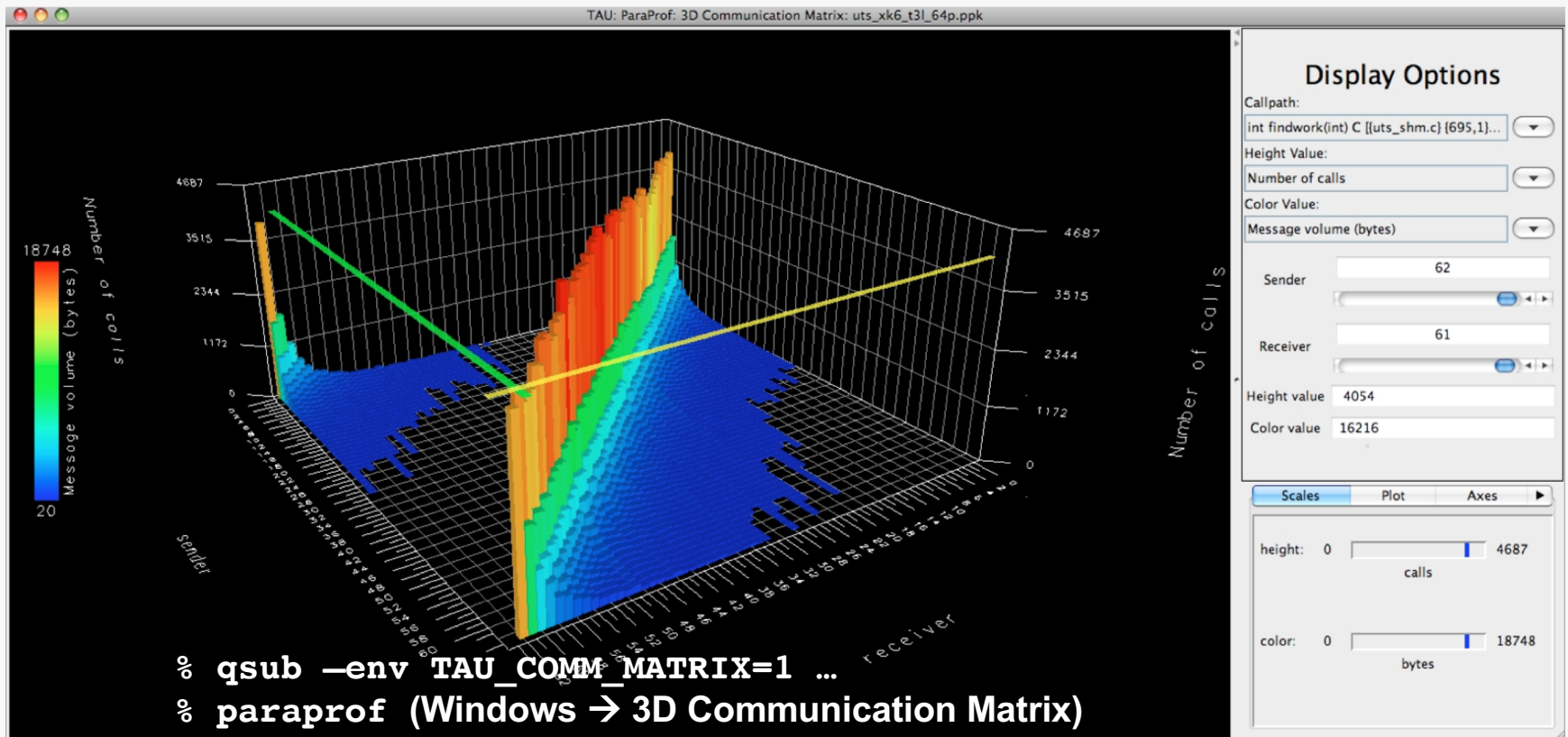
Time spent in collectives



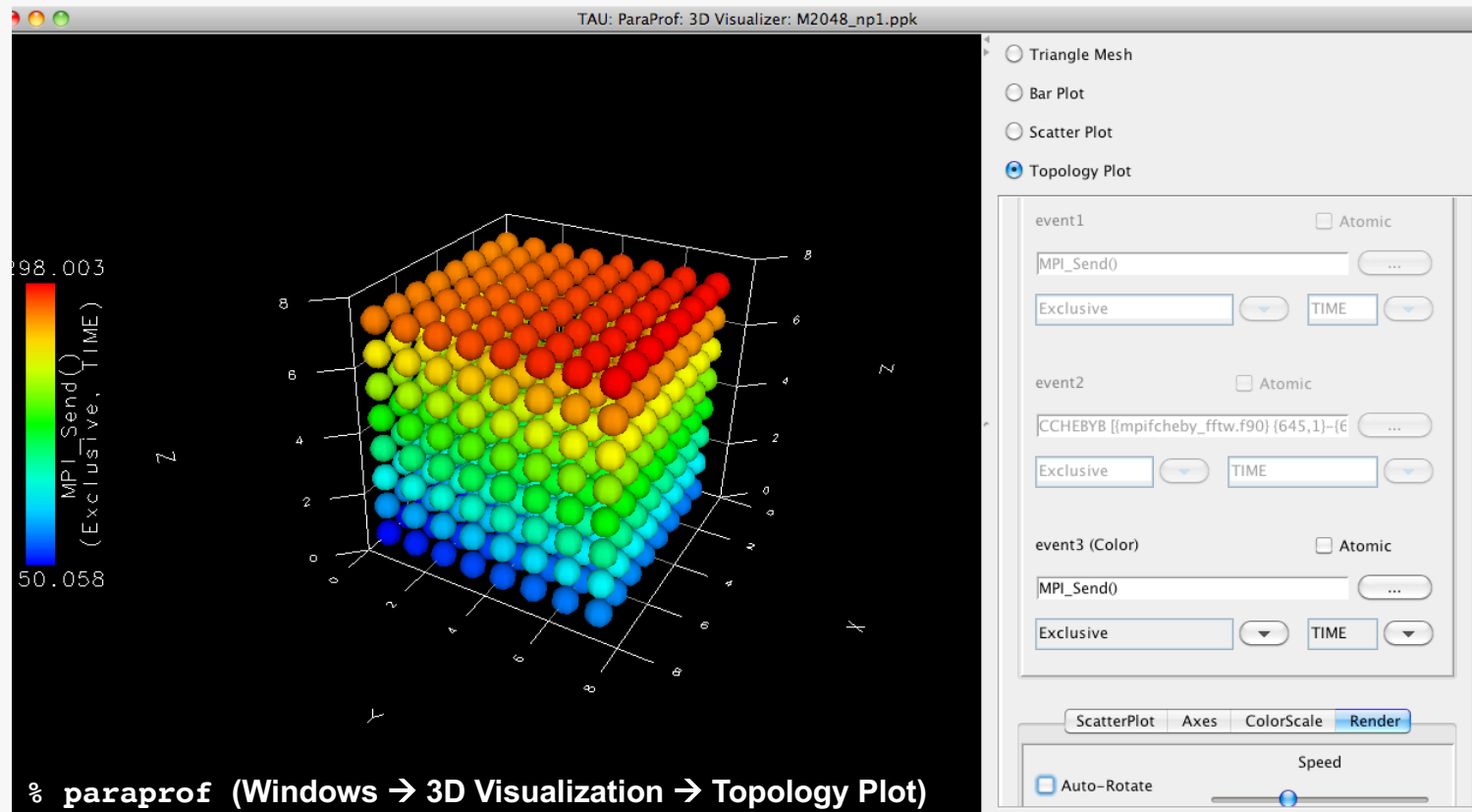
3D Profile Visualization



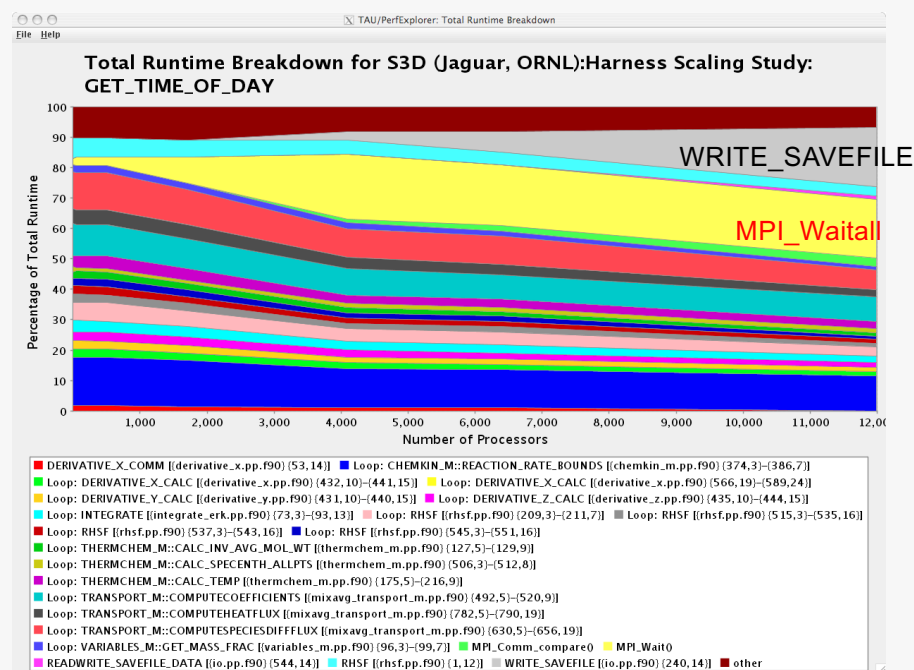
3D Communication Visualization



3D Topology Visualization

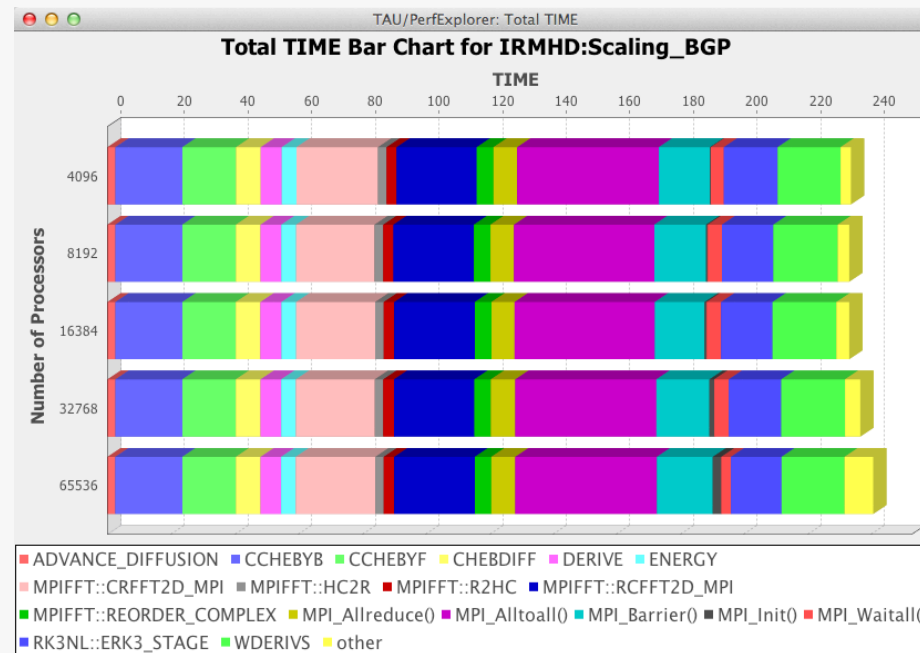


How Does Each Routine Scale?



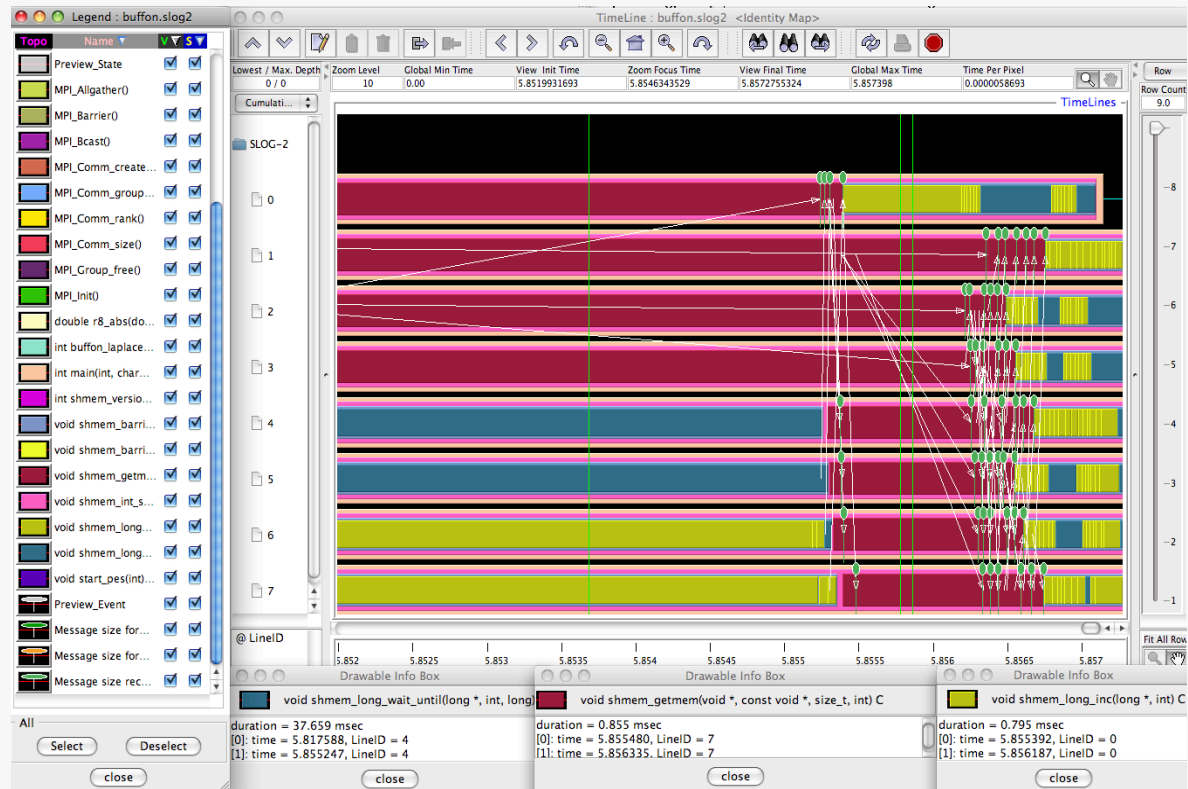
% perfexplorer (Charts → Runtime Breakdown)

How Does Each Routine Scale?



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

When do Events Occur?



Intuitive Performance Engineering

USING TAU

Preinstalled Tools on Theta

- On Theta, versions of TAU and related tools are installed at /soft/perftools/tau
- Modules are available:
 - % module avail tau
 - /soft/environment/modules/modulefiles -----
 - tau/2.25.2 tau/2.26 tau/2.26.1 tau/2.26.2 tau/2.26.3 tau/2.27
 - tau/2.27.1 tau/2.27.2 tau/2.28 tau/2.28.1
 - % module load tau/2.28.1

Using TAU Directly

- An unusual thing about TAU installations
 - For most UNIX software, when running
 - `./configure --foo; make install`
 - `./configure --bar; make install`
 - the second install will overwrite the first install.
 - In TAU, the two configurations are installed **side by side**.
- To reduce overhead, many features are enabled at compile time rather than runtime.
 - Always use `-bfd=download -unwind=download` for sampling address resolution
 - Common `./configure` options: `-cc`, `-c++`, `-fortran` select compiler, `-mpi`, `-pthread`, `-openmp`, `-cuda`
- For each configuration of TAU, a Makefile is present in `$TAU/<arch>/lib/Makefile.tau-*`
 - `<arch>` is `craycn1` on Theta
- `TAU_MAKEFILE` environment variable determines configuration used by compiler wrappers.
 - e.g., `export TAU_MAKEFILE=<path to TAU>/<arch>/lib/Makefile.tau-intel-papi-mpi-pdt`
- `-T` option determines configuration used by `tau_exec`
 - E.g., `tau_exec -T intel,papi,pdt`
 - `tau_exec` assumes `mpi`; specify `serial` if not

Typical Workflow

- Sample to identify hotspots (`tau_exec -ebs`)
- Selectively instrument hotspots (`tau_f90.sh` and friends, `-optSelectFile`)
- Gather hardware performance counter data (`papi_avail`, `TAU_METRICS`)
- Visualize performance data, derived metrics (`paraprof`)
- Visualize scaling data (`perfexplorer`)

Sampling with TAU

– Use `tau_exec -ebs`

- Build without TAU as *dynamic executable*, with `-g` if you want line-level resolution.
 - Does not work with static executables, which are default with Cray compiler wrappers!
- Run application through `tau_exec`, prepending launcher

Makefile without TAU

```
CXX = cc -dynamic
F90 = ftn -dynamic
CXXFLAGS = -g
LIBS =
OBJJS = f1.o f2.o f3.o ... fn.o

app: $(OBJJS)
    $(CXX) $(LDFLAGS) $(OBJJS) -o $@
    $(LIBS)
.cpp.o:
    $(CXX) $(CXXFLAGS) -c $<
```

`tau_exec` comes **after** launcher. Otherwise, we would sample `aprun` itself!

```
aprun -n 16 tau_exec -T mpi,thread -ebs ./foo
```

Insert TAU API Calls Automatically

- Use TAU's compiler wrappers
 - Replace CXX with tau_cxx.sh, etc.
 - Automatically instruments source code, links with TAU libraries.
- Use tau_cc.sh for C, tau_f90.sh for Fortran, etc.
- Run normally through launcher

Makefile without TAU

```
CXX = cc
F90 = ftn
CXXFLAGS =
OBSJ = f1.o f2.o f3.o ... fn.o

app: $(OBSJ)
    $(CXX) $(LDFFLAGS) $(OBSJ) -o $@
    $(LIBS)
.cpp.o:
    $(CXX) $(CXXFFLAGS) -c $<
```

Makefile with TAU

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

app: $(OBSJ)
    $(CXX) $(LDFFLAGS) $(OBSJ) -o $@
    $(LIBS)
.cpp.o:
    $(CXX) $(CXXFFLAGS) -c $<
```

What's PAPI?



Open Source software from U. Tennessee, Knoxville

<http://icl.cs.utk.edu/papi>

Middleware to provide a consistent programming interface for the performance counter hardware found in most major micro-processors.

Countable events are defined in two ways:

- Platform-neutral preset events
- Platform-dependent native events

Presets can be derived from multiple native events

All events are referenced by name and collected in EventSets

TAU Workflow

- Sampling to determine what to look at more closely
 - `tau_exec -ebs`
- Storage
 - `paraprof -pack file.ppk`
 - `taudb_loadtrial`
- Visualization
 - `paraprof`
- Selective Instrumentation
 - `tau_cc.sh`, `tau_cxx.sh`, `tau_f90.sh`
 - `export TAU_OPTIONS="-optSelectFile=path"`
 - (see <https://www.cs.uoregon.edu/research/tau/docs/newguide/bk01ch01s03.html> for syntax)
- Hardware performance counters
 - `papi_avail` to determine what's available
 - `papi_event_chooser` to determine what's compatible
 - `export TAU_METRICS=TIME:PAPI_L2_TCM:PAPI_L2_TCA`
- Derived metrics
 - `paraprof`

Python Performance Evaluation

HANDS-ON

Basic TAU Workflow

Choose your TAU_MAKEFILE:

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

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

- \$ ftn foo.f90

changes to

\$ tau_f90.sh foo.f90

Edit Makefile or set compilers on command line:

\$ make CC=tau_cc.sh

Execute application

Analyze performance data:

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

Example 1: C Matmult (MPI + Pthreads) Source Instrumentation

- First, we will install a compatible configuration of PDT and TAU:

```
wget http://tau.uoregon.edu/pdt.tar.gz
```

```
tar xzf pdt.tar.gz
```

```
cd pdtoolkit-3.25
```

```
./configure
```

```
make install # installs into current directory
```

```
cd ..
```

```
wget http://tau.uoregon.edu/tau.tgz
```

```
tar xzf tau.tgz
```

```
cd tau-2.27.2p1
```

```
./configure -bfd=download -unwind=download -arch=craycnl -pdt=<path to PDT>/pdtoolkit-3.25 -  
pdt_c++=/usr/bin/g++ -mpi -pthread
```

```
make install
```

```
export PATH=<path to TAU>/tau-2.27.2p1/craycnl/bin:$PATH
```

Example 1: C Matmult (MPI + Pthreads) Source Instrumentation

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

Run normally to generate profiles:

```
$ aprun -n 4 -N 4 ./matmult  
$ ls profile.*          # Shows four files  
$ paraprof --pack mm_c_flat.ppk
```

View the profiles:

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

Example 2: Fortran Matmult (MPI)

```
$ cd workshop-python/02_matmult.f90
$ make F90=tau_f90.sh
```

Run normally to generate profiles:

```
$ aprun -n 4 -N 4 ./matmult
$ ls profile.*          # Shows four files
$ paraprof --pack mm_f90_flat.ppk
```

View the profiles:

<code>pprof -a less</code>	#Command line
<code>paraprof</code>	#GUI (Java, X11)

Example 3: TAU with Pure Python

– Build a Python configuration of TAU:

```
module load miniconda-3.6/conda-4.5.4  
cd <TAU directory>  
./configure -bfd=download -unwind=download -arch=craycnl -python  
make install
```

TAU with Pure Python

```
$ cd workshop-python/03_fixedgrid.py
```

Run with tau_python to generate profiles:

```
$ export TAU_CALLPATH=1 # Generate callpath profiles
```

```
$ aprun -n 1 -N 1 tau_python -T serial,intel,python fixedgrid.py
```

```
$ ls profile.*          # shows profile.0.0.0
```

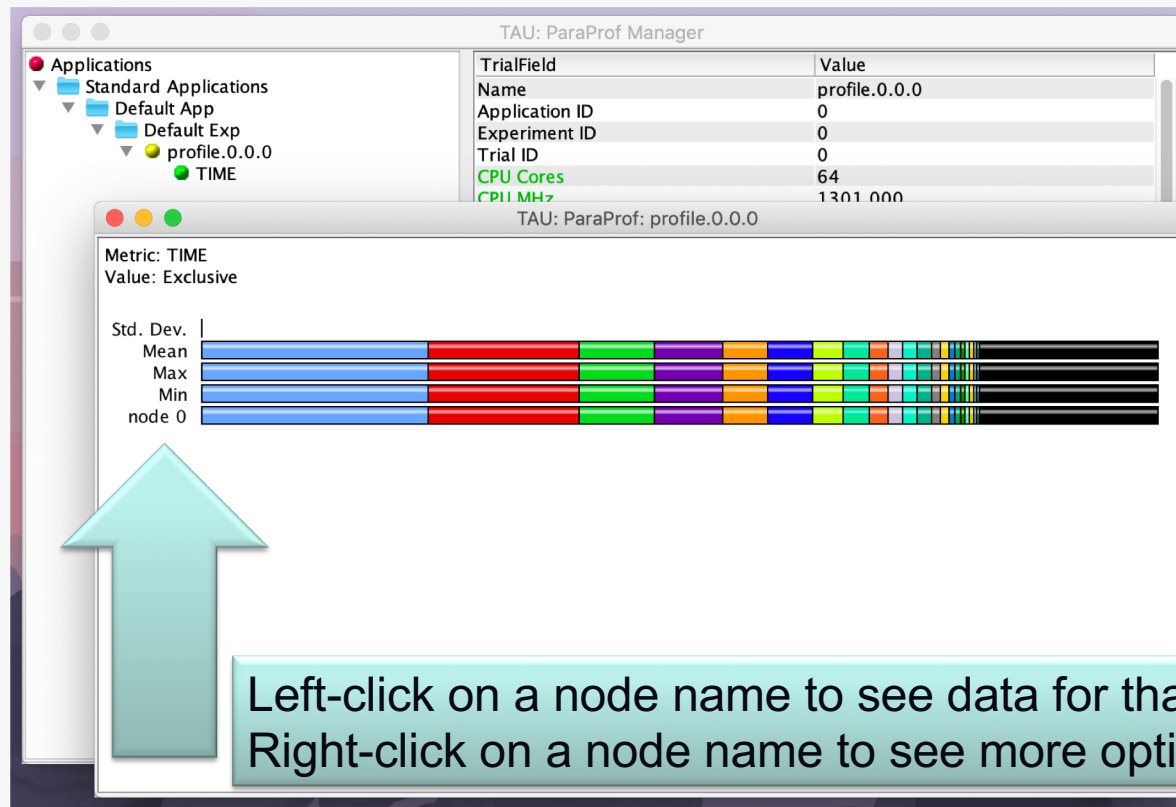
```
$ paraprof --pack fixedgrid_py_flat.ppk
```

View the profiles:

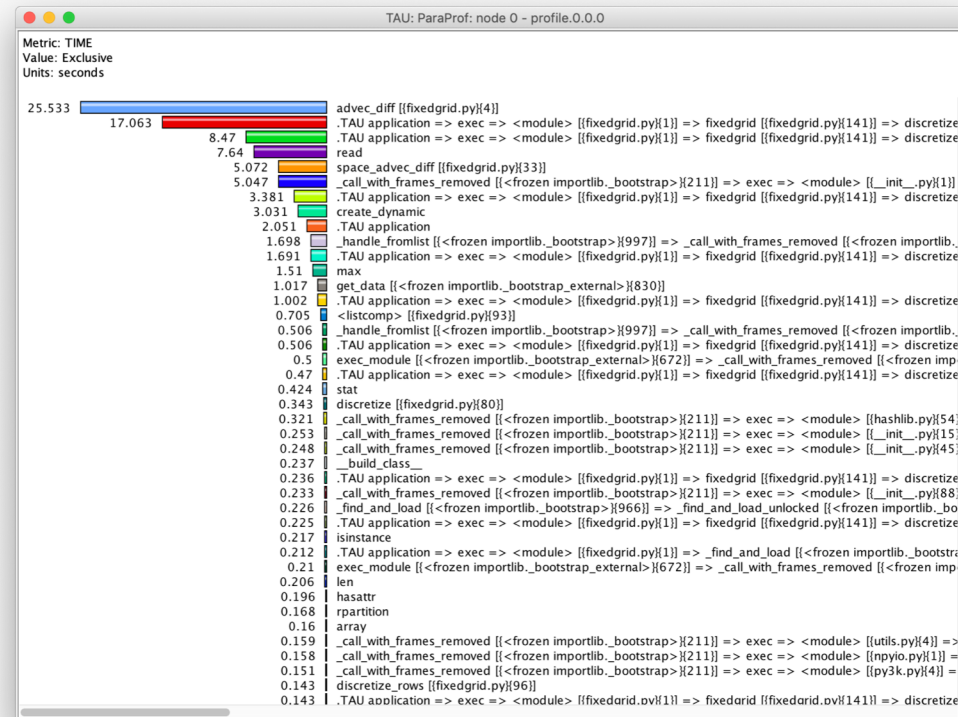
```
$ pprof -a | less      #Command line
```

```
$ paraprof             #GUI (Java, X11)
```

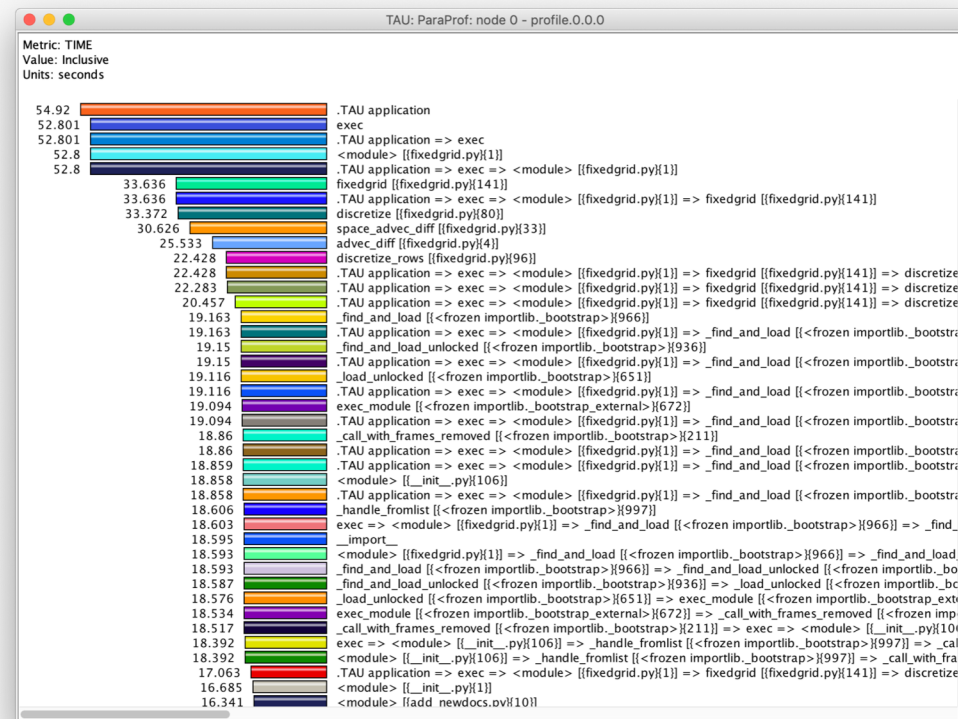
ParaProf Profile Visualizer



Exclusive Time in ParaProf



Inclusive Time in ParaProf

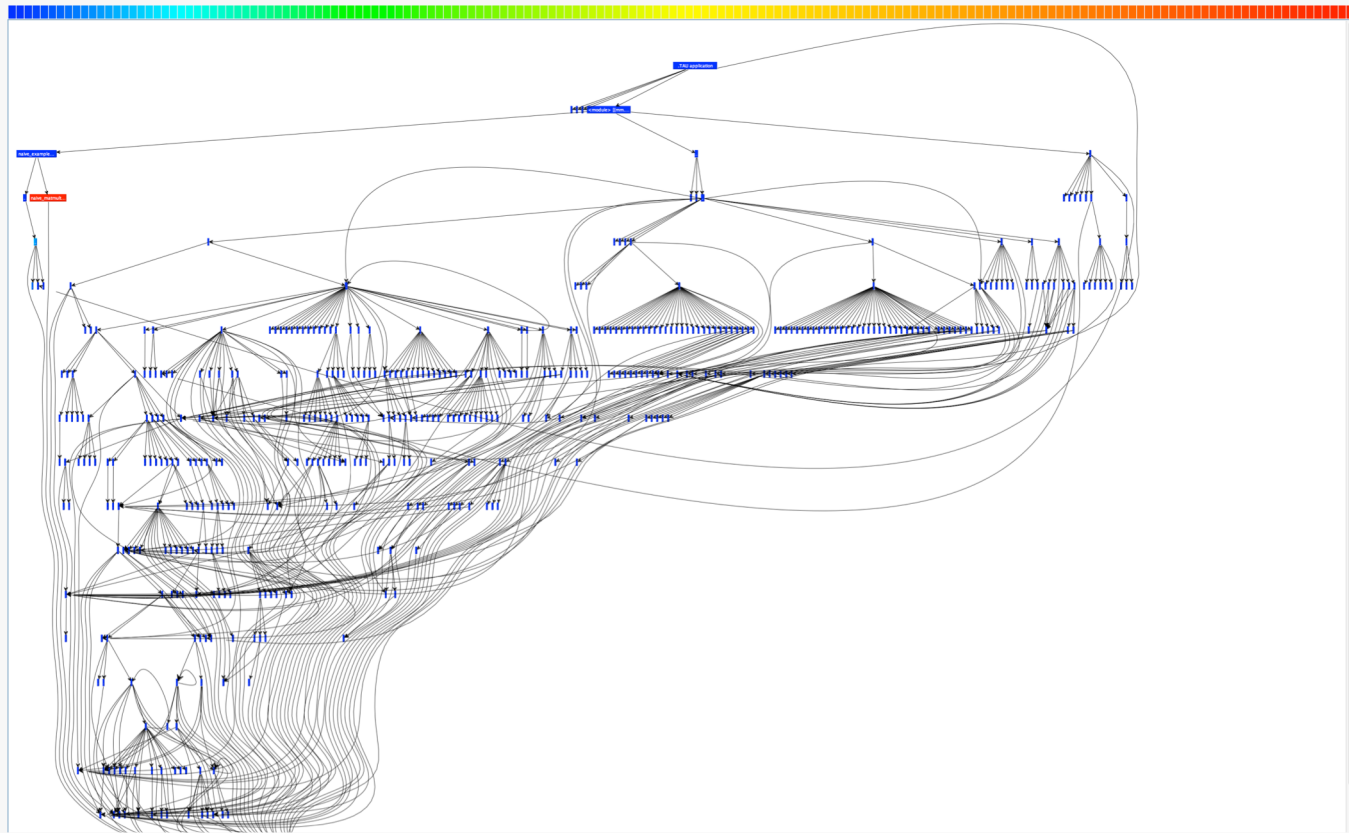


Statistics Table in ParaProf

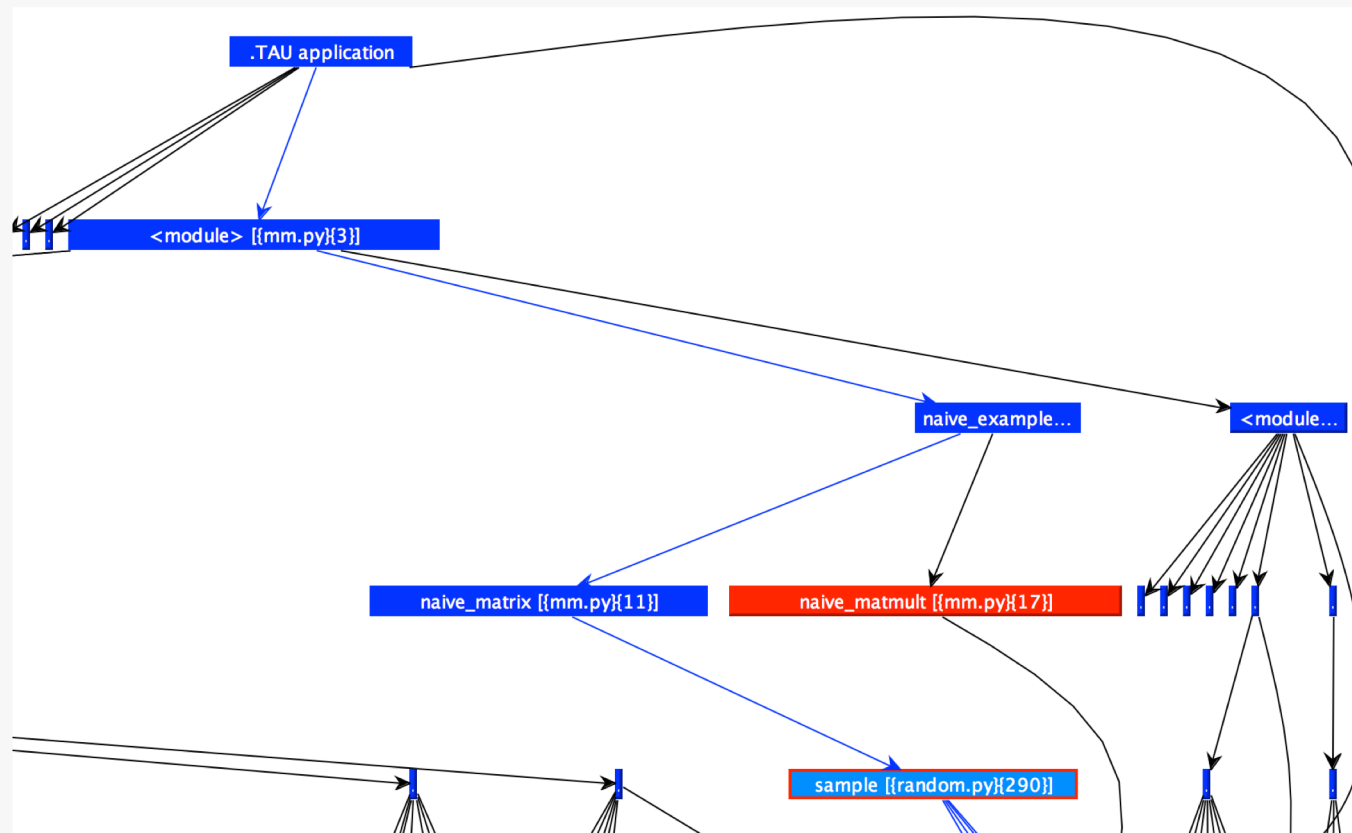
TAU: ParaProf: Statistics for: node 0 - profile.0.0.0

Name	Exclusive TIME	Inclusive TIME	Calls	Child C...
└─ .TAU application	2.051	54.92	1	5
└─ exec	0.001	52.801	1	1
└─ <module> [{fixedgrid.py}{1}]	0.001	52.8	1	2
└─ fixedgrid [{fixedgrid.py}{141}]	0.004	33.636	1	79
└─ discretize_rows [{fixedgrid.py}{96}]	0.143	22.428	36	1,908
└─ discretize [{fixedgrid.py}{80}]	0.225	22.283	1,800	10,800
└─ space_advec_diff [{fixedgrid.py}{33}]	3.381	20.457	3,600	183,600
└─ advec_diff [{fixedgrid.py}{4}]	17.063	17.063	180,000	0
└─ len	0.014	0.014	3,600	0
└─ <listcomp> [{fixedgrid.py}{93}]	0.47	1.471	1,800	90,000
└─ copy [{function_base.py}{1461}]	0.028	0.113	3,600	3,600
└─ empty_like	0.016	0.016	1,800	0
└─ empty	0.003	0.003	108	0
└─ discretize_cols [{fixedgrid.py}{117}]	0.074	11.198	18	1,854
└─ discretize [{fixedgrid.py}{80}]	0.117	11.089	900	5,400
└─ space_advec_diff [{fixedgrid.py}{33}]	1.691	10.168	1,800	91,800
└─ advec_diff [{fixedgrid.py}{4}]	8.47	8.47	90,000	0
└─ len	0.007	0.007	1,800	0
└─ <listcomp> [{fixedgrid.py}{93}]	0.236	0.741	900	45,000
└─ copy [{function_base.py}{1461}]	0.014	0.054	1,800	1,800
└─ empty_like	0.008	0.008	900	0
└─ copy [{function_base.py}{1461}]	0.009	0.033	900	900
└─ empty	0.001	0.001	54	0
└─ full [{numeric.py}{254}]	0.001	0.003	4	12
└─ print	0.003	0.003	21	0
└─ _find_and_load [{<frozen importlib._bootstrap>}{966}]	0.002	19.163	1	6
└─ find_module [{imp.py}{255}]	0.005	0.045	1	21
└─ compile	0.019	0.019	1	0
└─ read	0.002	0.004	1	1
└─ new_module [{imp.py}{48}]	0.001	0.001	1	0

Callgraph in ParaProf



Callgraph in ParaProf



Traces with Pure Python

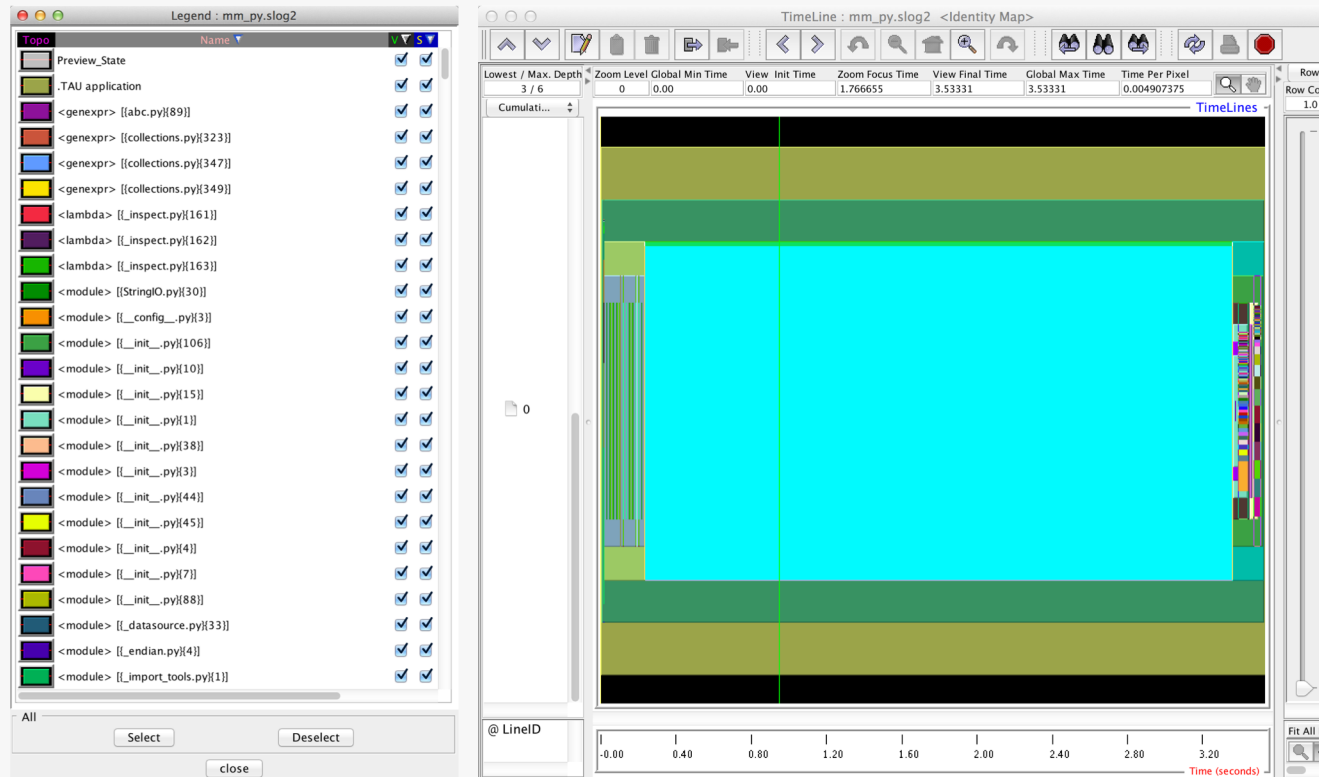
To generate traces:

```
$ unset TAU_CALLPATH    #recommended
$ export TAU_TRACE=1
$ aprun -n 1 -N 1 tau_python -T serial,intel,python fixedgrid.py
```

Trace files must be post-processed:

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

Jumpshot Trace Viewer



Example 4: TAU with Python + MPI

– Build a Python+MPI configuration of TAU:

```
module load miniconda-3.6/conda-4.5.4
```

```
cd <TAU directory>
```

```
./configure -bfd=download -unwind=download -arch=craycnl -python  
-mpi
```

```
make install
```

TAU with mpi4py

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

```
$ aprun -n 4 -N 4 tau_python -T mpi,intel,python fixedgrid.py
```

View the profiles:

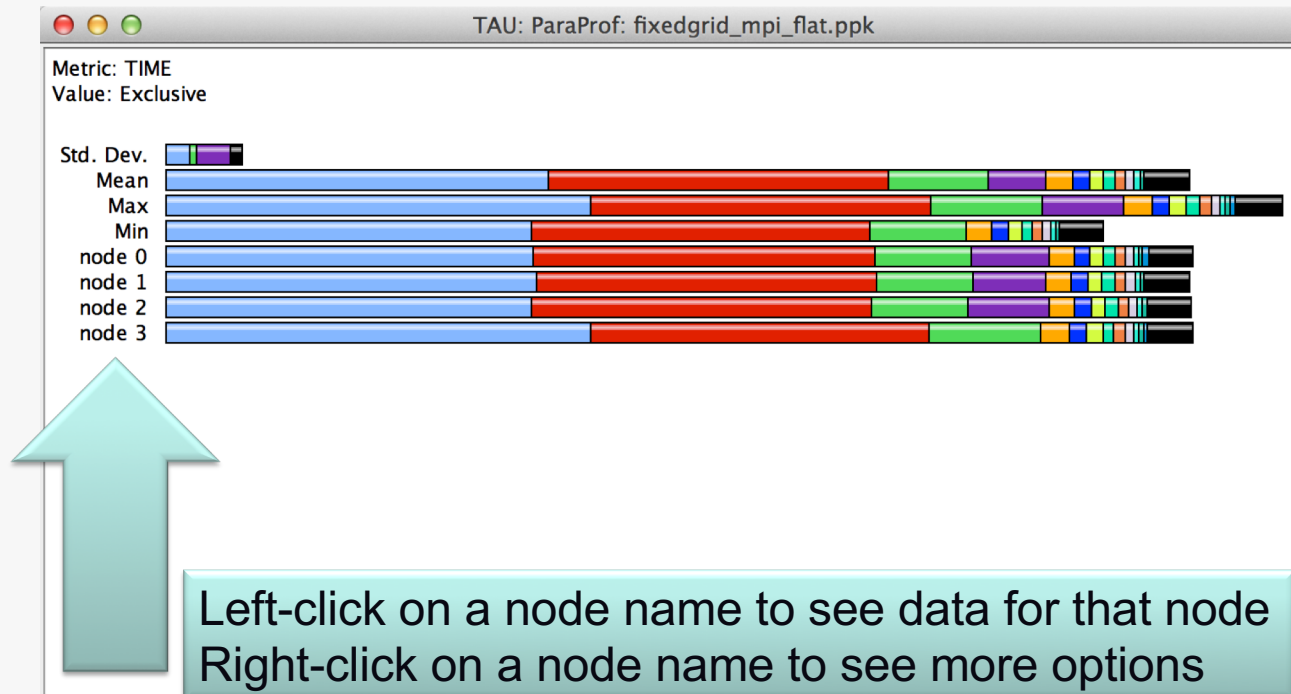
```
pprof -a | less
```

#Command line

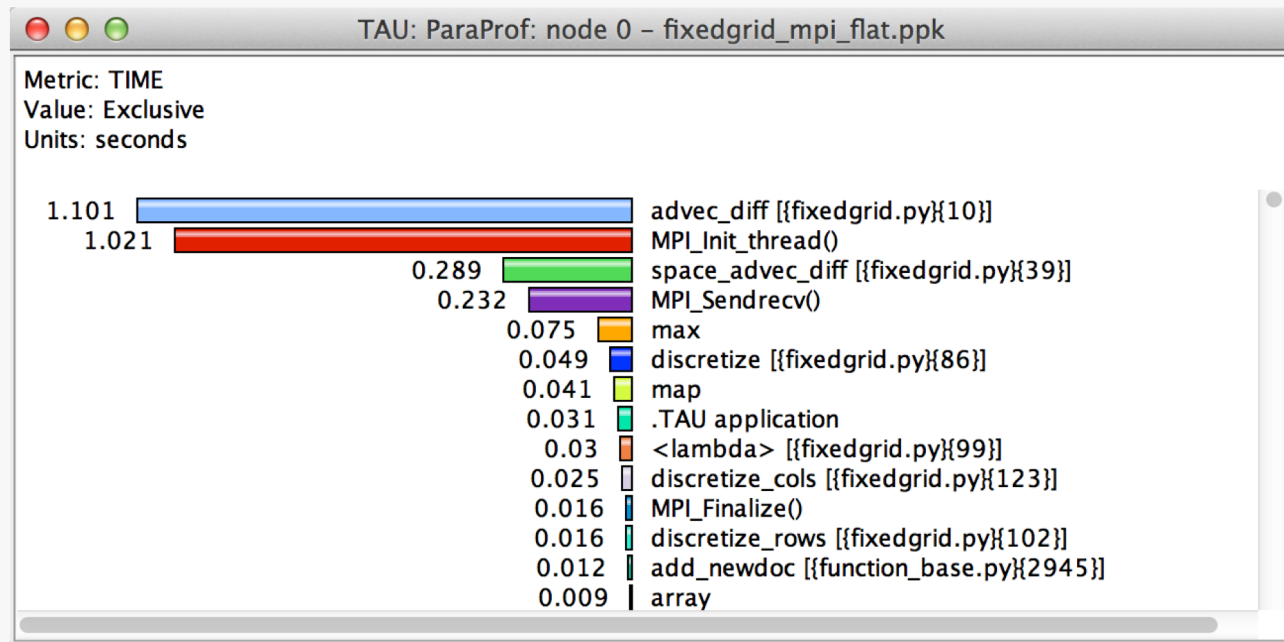
```
paraprof
```

#GUI (Java, X11)

FIXEDGRID Profile



FIXEDGRID Profile

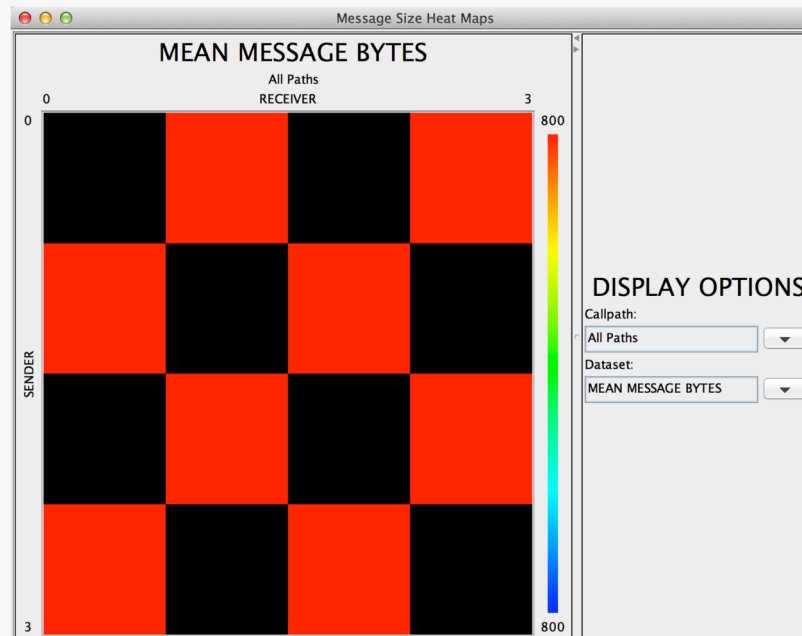


FIXEDGRID Communication Matrix

```
$ export TAU_COMM_MATRIX=1
```

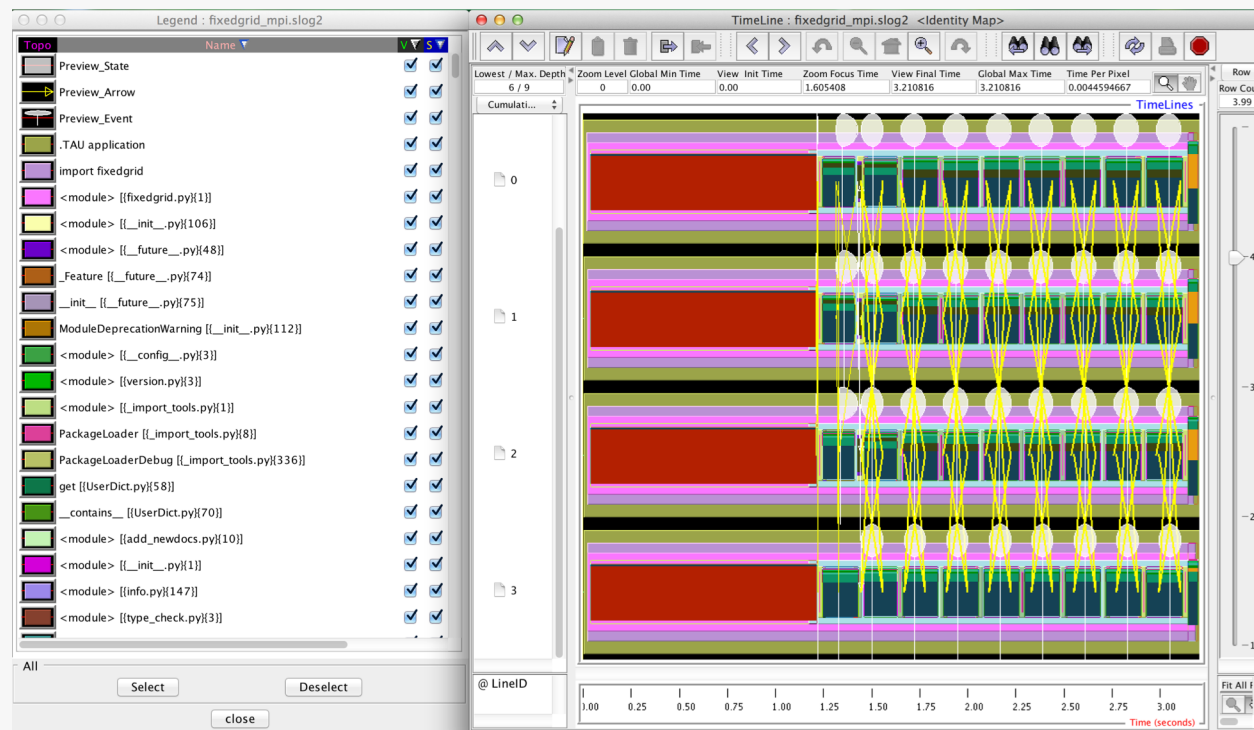
```
$ aprun -n 4 -N 4 tau_python -T mpi,intel,python fixedgrid.py
```

In Paraprof: Windows | Communication Matrix



FIXEDGRID Trace Shows Communication

\$ jumpshot fixedgrid_mpi.slog2

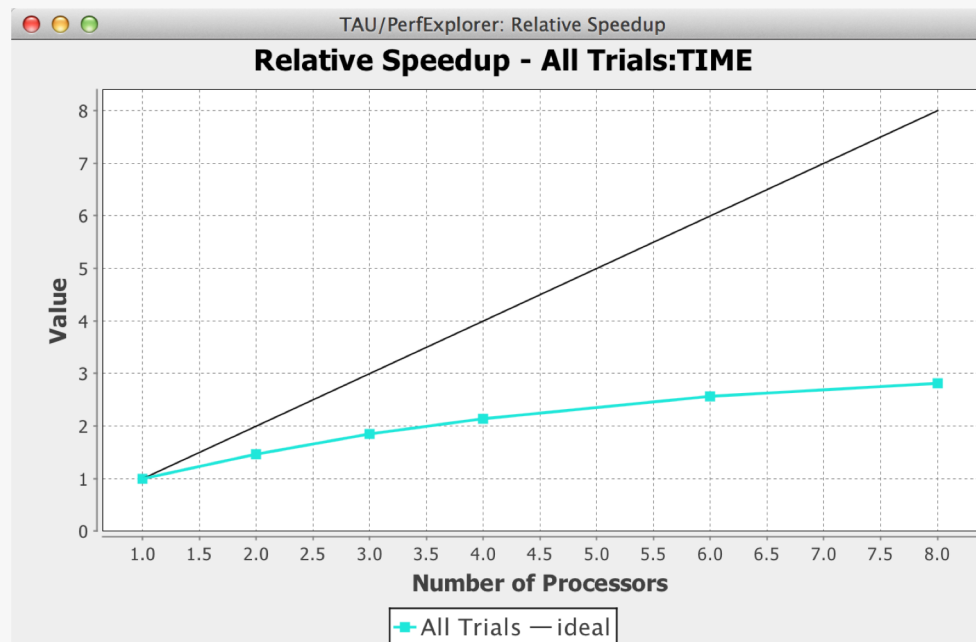


PerfExplorer

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

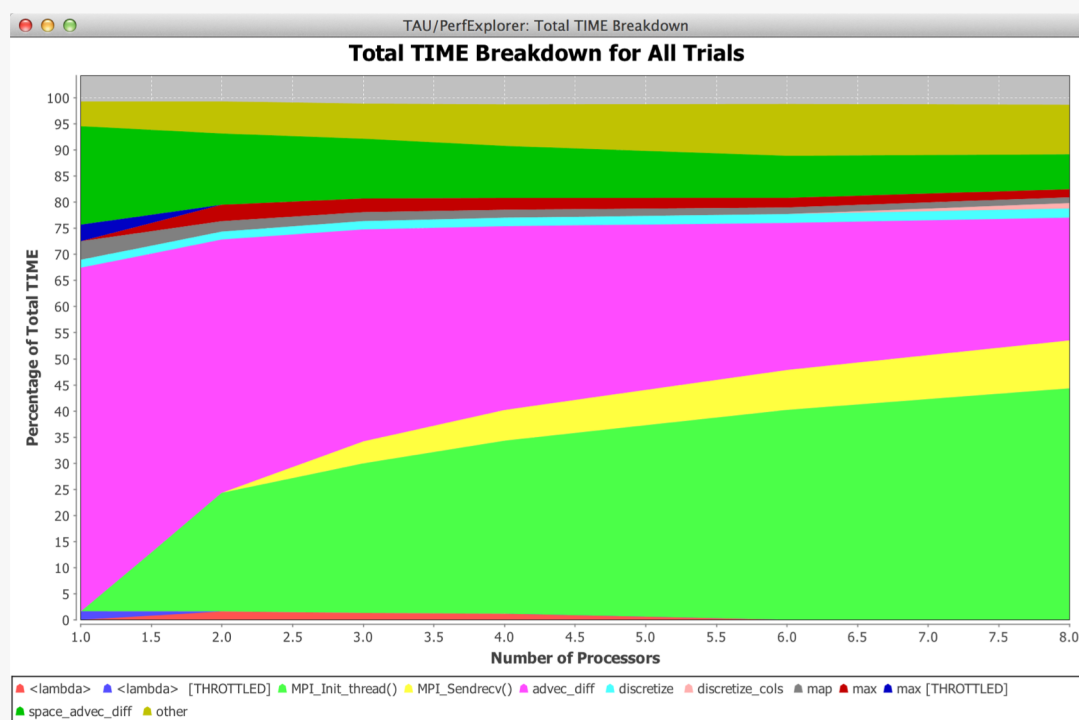
Relative Speedup Chart

In PerfExplorer: Charts | Relative Speedup



Runtime Breakdown Chart

In PerfExplorer: Charts | Runtime Breakdown



Example 5: TAU + Python + mpi4py + C + OpenMP

– Build a Python+MPI+OpenMP configuration of TAU:

```
module load miniconda-3.6/conda-4.5.4
```

```
cd <TAU directory>
```

```
./configure -bfd=download -unwind=download -arch=craycnl -python  
-mpi -ompt=download
```

```
make install
```

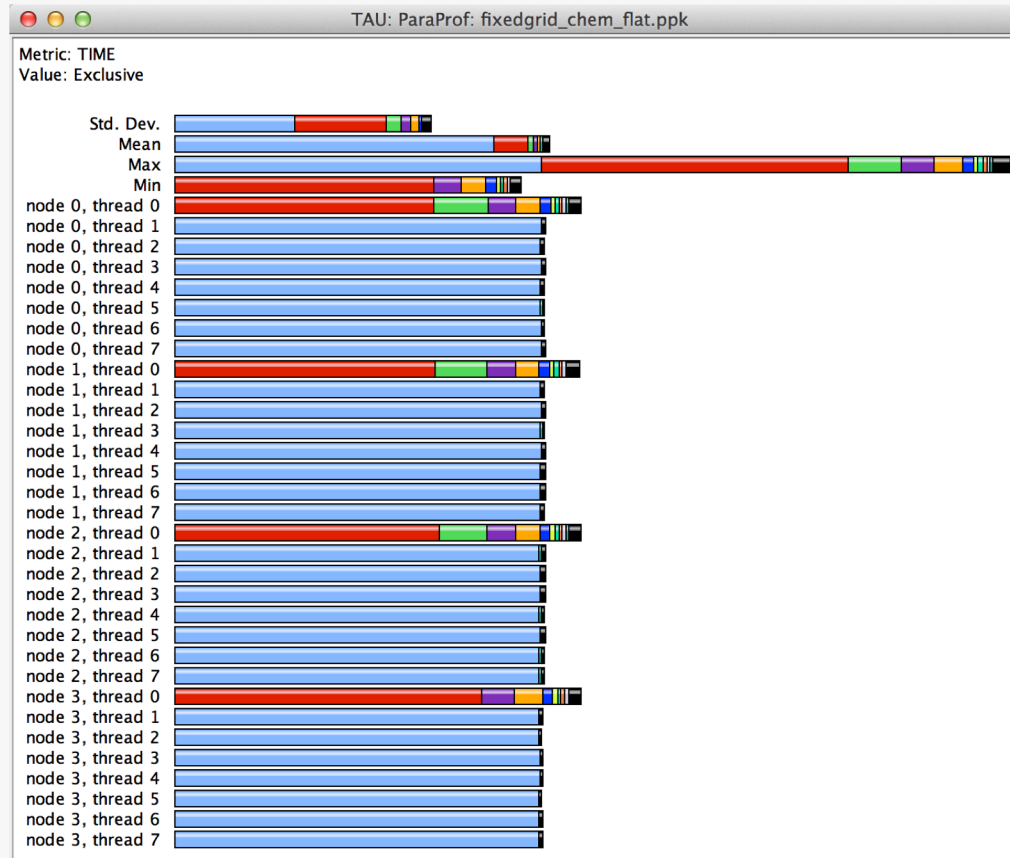

Example 5: TAU + Python + mpi4py + C + OpenMP

```
$ cd 05_fixedgrid-chem.c_py  
$ export TAU_MAKEFILE=<path to Makefile from install  
step>  
$ make CC=tau_cc.sh
```

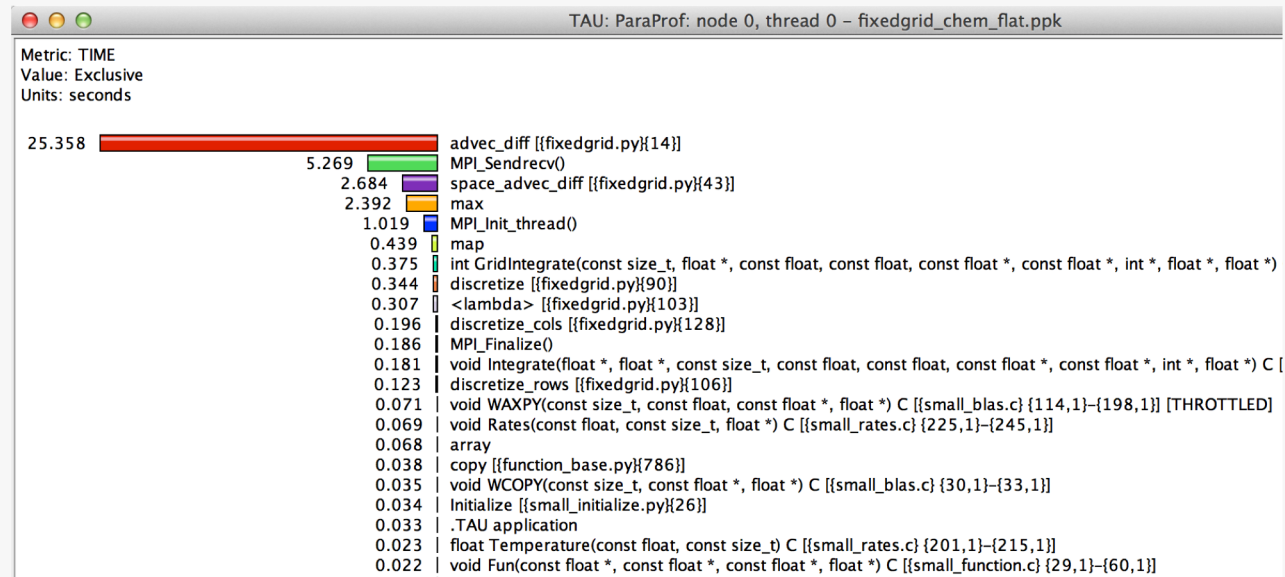
Run with tau_exec and wrapper.py to generate profiles:

```
$ make clean  
$ make CC=tau_cc.sh  
$ aprun -n 4 -N 4 tau_python -T  
python,mpi,openmp,intel,ompt,tr6 -ompt fixedgrid.py
```

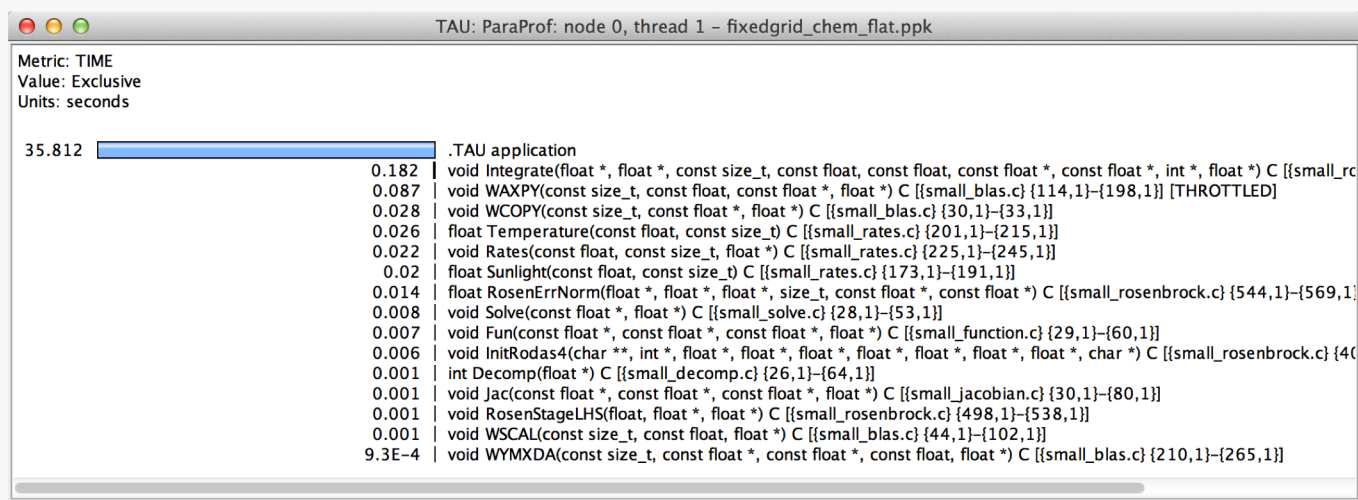
MPI + OpenMP Profiles



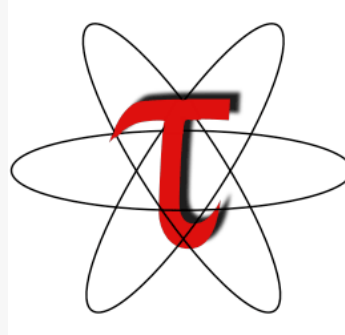
Rank 0, Thread 0



Rank 0, Thread 1



Download TAU from U. Oregon



<http://tau.uoregon.edu>

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

Free download, open source, BSD license

Questions or Problems?

support@paratools.com

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