

An Introduction to Profiling with Intel Trace Collector and Analyzer (ITAC)

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User and Reference Guide

<https://www.intel.com/content/www/us/en/developer/tools/oneapi/trace-analyzer.html>

- Intel
 - Advisor
 - VTune Amplifier
 - Application Performance Snapshot (APS)
 - **Trace Analyzer and Collector (ITAC)**
- Non-Intel
 - **GNU gprof profiler**
 - NHR@FAU LIKWID
("Like I Knew What I'm Doing")
 - VI-HPS Score-P
(A Joint Performance Measurement Infrastructure for Scalasca, Periscope, TAU, and Vampir)
 - BSC Paraver
 - ...

- **Intel Trace Analyzer and Collector**
<https://www.intel.com/content/www/us/en/docs/trace-analyzer-collector/user-guide-reference/2021-10/overview.html>
<https://www.fau.tv/clip/id/19956>
- **Intel VTune Profiler Performance Analysis Cookbook**
<https://www.intel.com/content/www/us/en/docs/vtune-profiler/cookbook/2024-0/overview.html>
- **Score-P: A Joint Performance Measurement Infrastructure for Scalasca, Periscope, TAU, and Vampir**
<https://vi-hps.org/training/documentation>
- **Paraver Performance Analysis Tool**
<https://tools.bsc.es/paraver>
- **Arm DDT Debugger**
<https://developer.arm.com/documentation/101136/22-1-2/DDT>
<https://fau.tv/clip/id/19957>

Intel Hardware Features

Intel® Omni
Path
Architectur
e**Distributed memory**

Message size

Rank placement

Rank Imbalance

RTL Overhead

Network Bandwidth
Cluster

HBM

Memory

False Sharing

Access with strides

Latency

Bandwidth

NUMA

Intel® Optane™
DC persistent
memory**I/O**

File I/O

I/O latency

I/O waits

System-wide I/O

Node

Multi-core
Intel®
Xeon®
processor**Threading**

Threaded/serial ratio

Thread Imbalance

RTL overhead

(scheduling, forking)

Synchronization

Intel®
Advanced
Vector
Extensions 512
(Intel® AVX-
512)**CPU Core**

uArch issues (IPC)

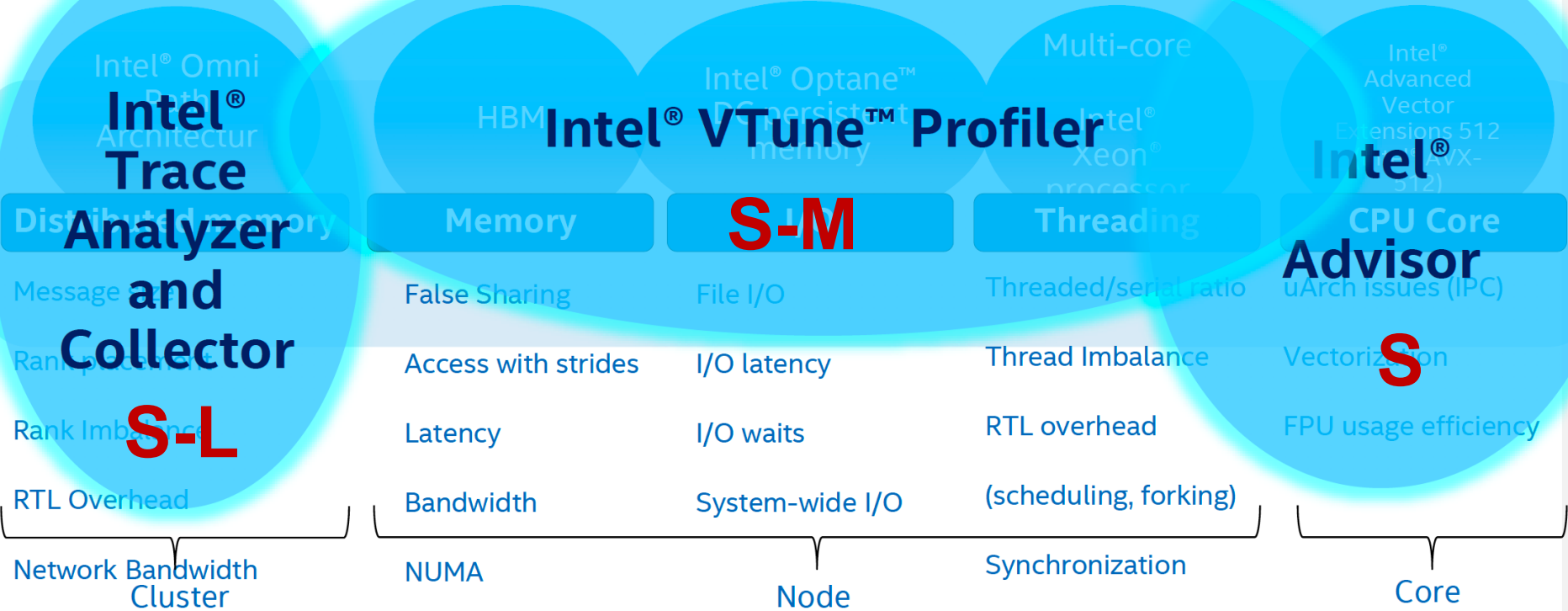
Vectorization

FPU usage efficiency

Core

© Intel

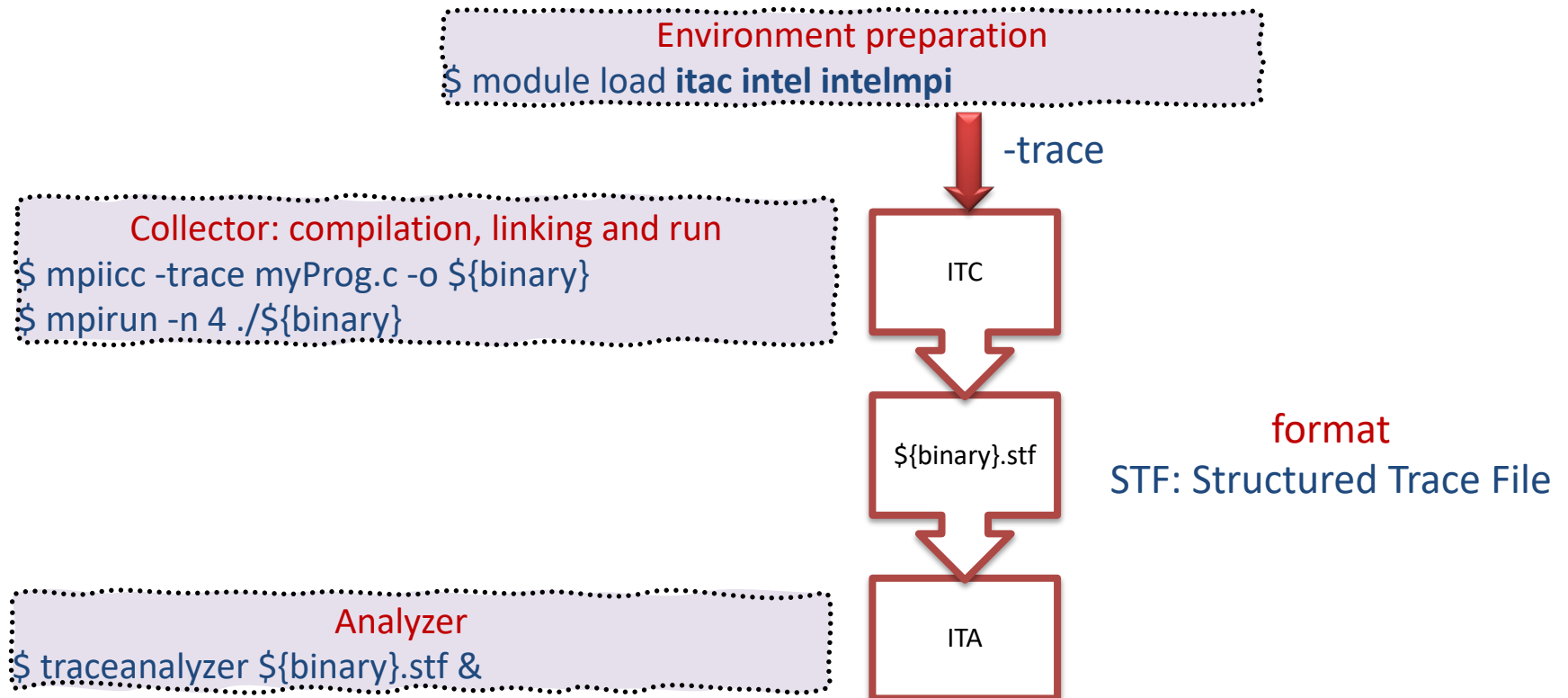
Intel Hardware Features



© Intel

Maximum collection times: **L**⌚=long (hours) **M**⌚=medium (minutes) **S**⌚=short (seconds-few minutes)

Application focus



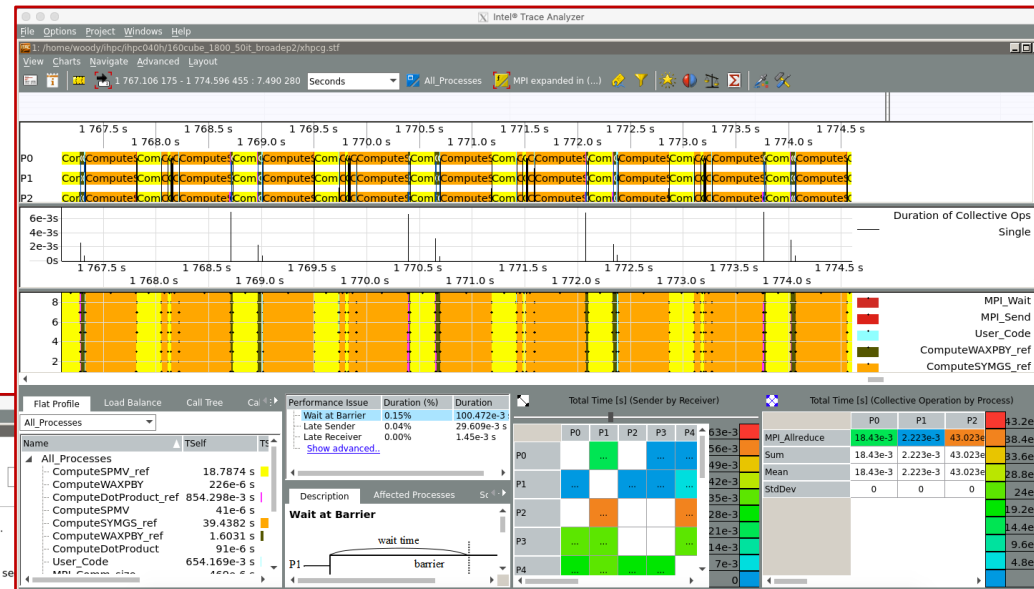
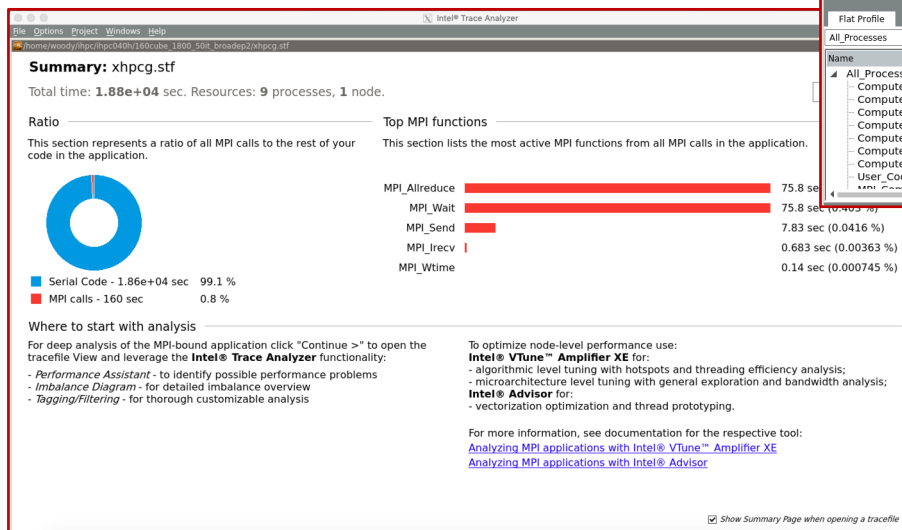


Basic features

**Profiling with graphical
visualization and statistical data**

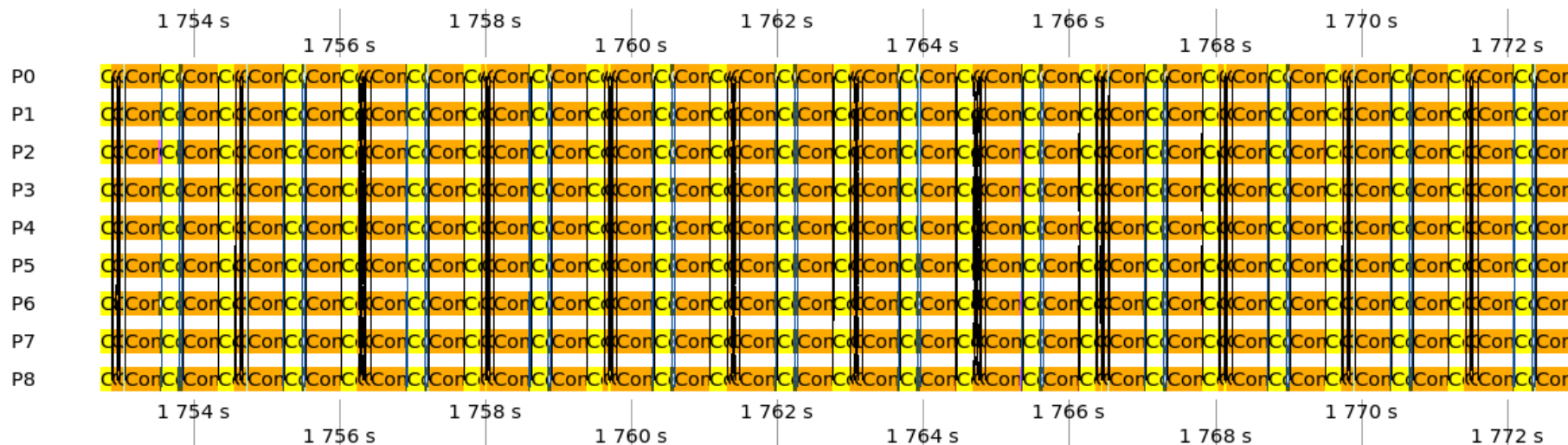
Event-based approach that record

- user function calls
- MPI communication calls



Event timeline

- program structure
- event details
 - functions
 - messages
 - collectives operations

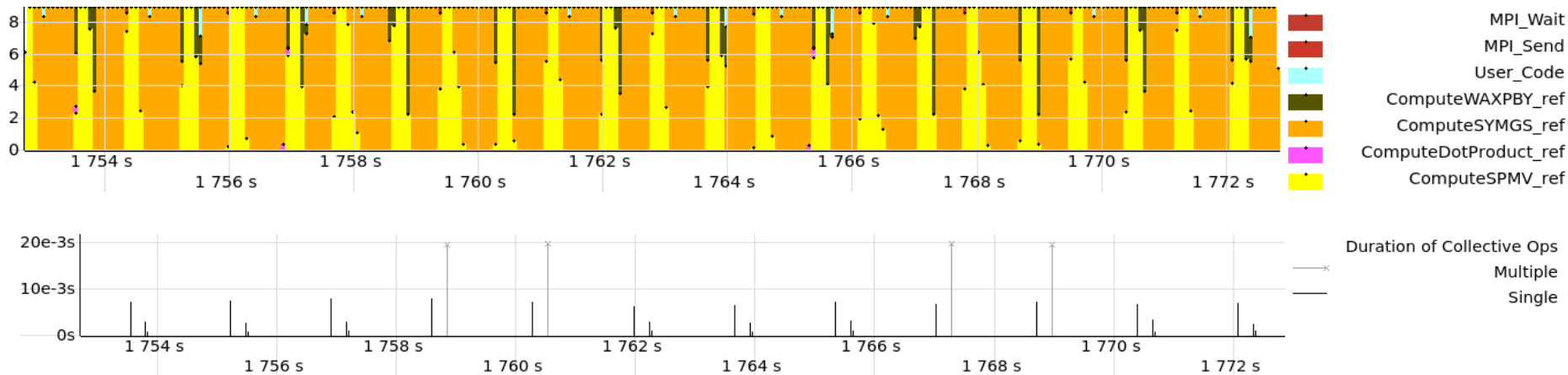


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Quantitative +
quantitative timeline

- transfer duration
- transfer volume
- activities measure



Event timeline

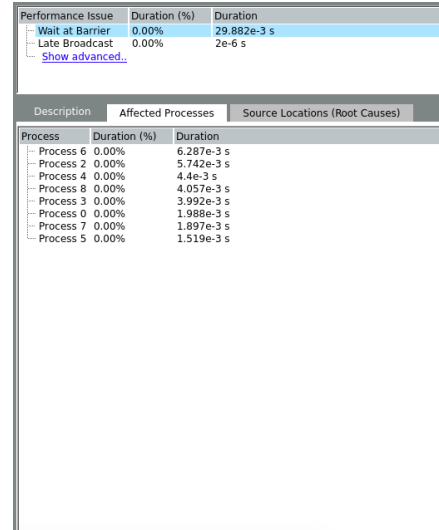
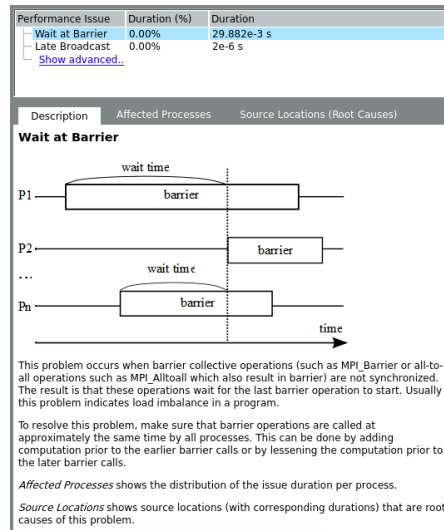
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Quantitative + quantitative timeline

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Performance assistance

- identify performance issues with explanation
- tips on potential solutions



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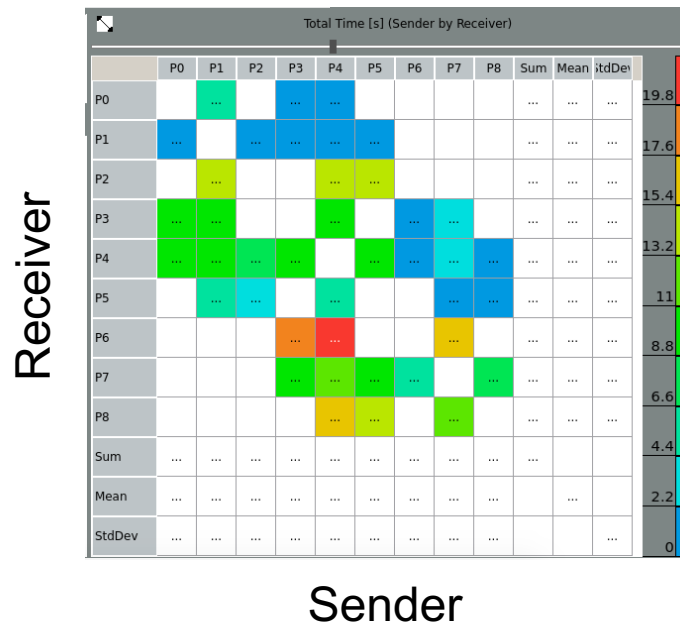
- transfer duration
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Performance
assistance

- identify performance issues with explanation
- tips on potential solutions

Message profile

- message volume, time, count
- finding communication hotspots
- communication patterns



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Message profile

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Collective ops profile

- all collective operations for each process



Total Time [s] (Collective Operation by Process)

	P0	P1	P2	P3	P4	P5	P6	P7	P8	Sum	Mean	StdDev	
MPI_Bcast	5e-6	7e-6	7e-6	7e-6	7e-6	7e-6	6e-6	7e-6	7e-6	60e-6	6.66667e-6	666.667e-9	13.5
MPI_Allreduce	6.98827	2.41008	14.1332	9.46671	9.80818	2.28141	12.1689	7.89127	10.6684	75.8164	8.42405	3.81376	12
Sum	6.98828	2.41009	14.1332	9.46671	9.80818	2.28142	12.1689	7.89127	10.6684	75.8165			10.5
Mean	3.49414	1.20504	7.06659	4.73336	4.90409	1.14071	6.08444	3.94564	5.33422		4.21203		9
StdDev	3.49413	1.20504	7.06658	4.73335	4.90409	1.1407	6.08444	3.94563	5.33422			5.00135	7.5
													6
													4.5
													3
													1.5
													0

Hotspot

Event timeline

- program structure
- event details

Quantitative + quantitative timeline

- transfer duration
- transfer volume

Performance assistance

- identify performance issues with explanation
- on potential bottlenecks

Message profile

- message volume, time, count
- finding

Collective ops profile

- all collective operations for each process

Function profile

functions statistics

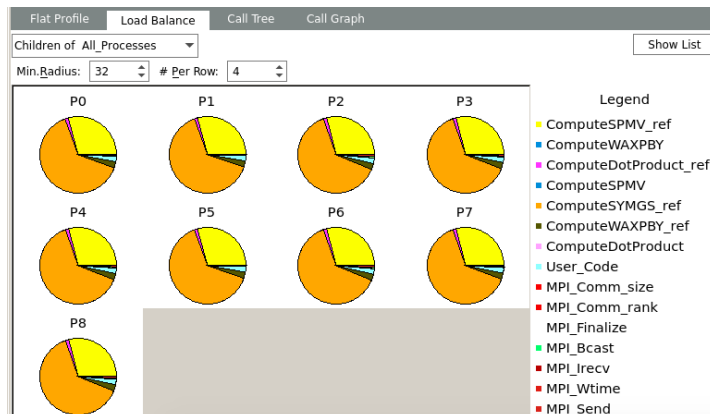
Call tree

- split to children of Group
- filtered view with expansion into various MPI and Application groups

Load balance

Call graph

Name	TSelf	TSelf	TTotal	#Calls	TSelf/Call
All_Processes					
ComputeSPMV_ref	5.46742e+3 s		5.51119e+3 s	44244	123.574e-3 s
ComputeWAXPBY	53.862e-3 s		475.234 s	31995	1.68345e-6 s
ComputeDotProduct_ref	264.986 s		329.014 s	33408	7.93181e-3 s
ComputeSPMV	15.826e-3 s		2.49945e+3 s	10863	1.45687e-6 s
ComputeSYMG5_ref	11.9892e+3 s		12.0259e+3 s	76608	156.5e-3 s
ComputeWAXPBY_ref	495.263 s		495.263 s	33345	14.8527e-3 s
ComputeDotProduct	31.118e-3 s		315.682 s	32049	970.951e-9 s
User_Code	432.994 s		18.8104e+3 s	9	48.1104 s
MPI_Comm_size	132.739e-3 s		132.739e-3 s	120861	1.09828e-6 s
MPI_Comm_rank	63.288e-3 s		63.288e-3 s	120861	523.643e-9 s
MPI_Finalize	4.043e-3 s		4.043e-3 s	9	449.222e-6 s
MPI_Bcast	60e-6 s		60e-6 s	9	6.66667e-6 s
MPI_Irecv	682.73e-3 s		682.73e-3 s	537120	1.27109e-6 s
MPI_Wtime	140.191e-3 s		140.191e-3 s	223353	627.666e-9 s
MPI_Send	7.83291 s		7.83291 s	537120	14.5832e-6 s
MPI_Allreduce	75.8164 s		75.8164 s	33534	2.26088e-3 s
MPI_Wait	75.7904 s		75.7904 s	537120	141.105e-6 s



Name	TSelf	TSelf	TTotal	#Calls	TSelf/Call
All_Processes					
▲ User_Code	432.994 s		18.8104e+3 s	9	48.1104 s
MPI_Bcast	60e-6 s		60e-6 s	9	6.66667e-6 s
MPI_Comm_rank	1e-6 s		1e-6 s	9	111.111e-9 s
MPI_Comm_size	3e-6 s		3e-6 s	9	333.333e-9 s
MPI_Wtime	95.84e-3 s		95.84e-3 s	156537	612.251e-9 s
MPI_Allreduce	11.8325 s		11.8325 s	126	93.909e-3 s
▲ ComputeSPMV_ref	2.97267e+3 s		3.01576e+3 s	33381	89.0527e-3 s
MPI_Comm_size	36.969e-3 s		36.969e-3 s	33381	1.10749e-6 s
MPI_Comm_rank	17.688e-3 s		17.688e-3 s	33381	529.802e-9 s
MPI_Irecv	175.253e-3 s		175.253e-3 s	148360	1.18127e-6 s
MPI_Send	2.13018 s		2.13018 s	148360	14.3582e-6 s
MPI_Wait	40.7319 s		40.7319 s	148360	274.548e-6 s
▲ ComputeSYMG5_ref	11.9892e+3 s		12.0259e+3 s	76608	156.5e-3 s
MPI_Comm_size	82.736e-3 s		82.736e-3 s	76608	1.07999e-6 s
MPI_Comm_rank	38.209e-3 s		38.209e-3 s	76608	498.76e-9 s
MPI_Irecv	420.928e-3 s		420.928e-3 s	340480	1.23628e-6 s
MPI_Send	4.18757 s		4.18757 s	340480	12.299e-6 s
MPI_Wait	31.9995 s		31.9995 s	340480	93.9836e-6 s
▲ ComputeWAXPBY_ref	20.0829 s		20.0829 s	1350	14.8762e-3 s
MPI_Finalize	10.7614 s		10.7614 s	1350	7.91865e-3 s
MPI_Wtime	1.935e-3 s		1.935e-3 s	2718	711.921e-9 s
MPI_Allreduce	2.60027 s		2.60027 s	1359	1.91337e-3 s
▲ ComputeSPMV	15.826e-3 s		2.49945e+3 s	10863	1.45687e-6 s
▲ ComputeSPMV_ref	2.49475e+3 s		2.49945e+3 s	10863	229.656e-3 s
MPI_Comm_size	13.031e-3 s		13.031e-3 s	10863	1.19958e-6 s
MPI_Comm_rank	7.39e-3 s		7.39e-3 s	10863	680.291e-9 s
MPI_Irecv	86.549e-3 s		86.549e-3 s	48280	1.79265e-6 s
MPI_Send	1.51516 s		1.51516 s	48280	31.3828e-6 s
MPI_Wait	3.059 s		3.059 s	48280	63.3595e-6 s
▲ ComputeWAXPBY	53.862e-3 s		475.234 s	31995	1.68345e-6 s

Name	TSelf	TSelf	TTotal	#Calls	TSelf/Call
All_Processes					
▲ Callers					
▲ ComputeSPMV_ref called by ComputeSPMV	2.49475e+3 s		2.49943e+3 s	10863	229.656e-3 s
▲ ComputeSPMV_ref called by User_Code	2.97267e+3 s		3.01576e+3 s	33381	89.0527e-3 s
▲ ComputeSPMV_ref	5.46742e+3 s		5.51519e+3 s	44244	123.574e-3 s
▲ Calleees					
▲ ComputeSPMV_ref calling MPI_Comm_size					
▲ ComputeSPMV_ref calling MPI_Comm_rank					
▲ ComputeSPMV_ref calling MPI_Irecv					
▲ ComputeSPMV_ref calling MPI_Send					
▲ ComputeSPMV_ref calling MPI_Wait					

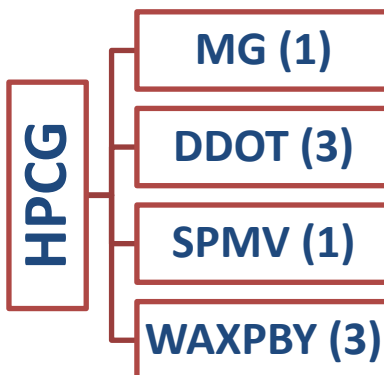
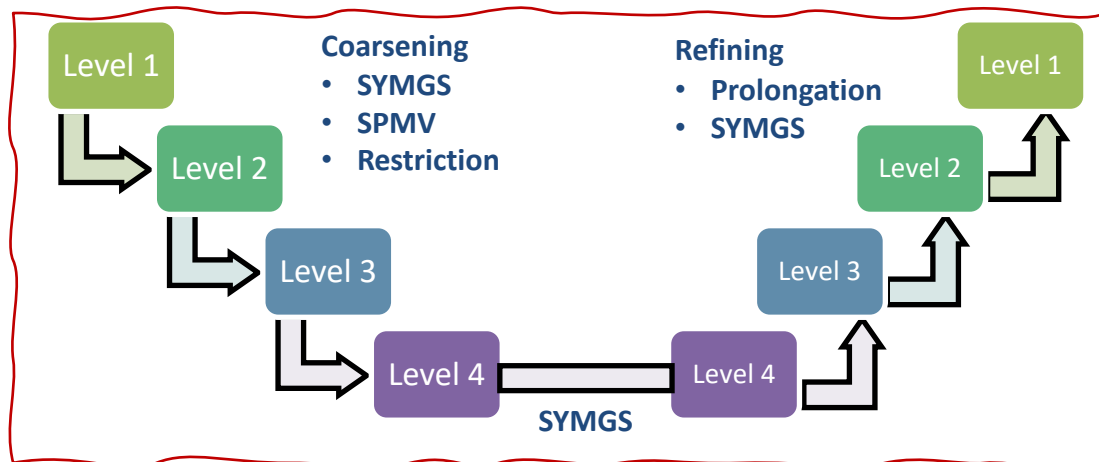


Event timeline visualization

MPI-parallel HPCG

```

 $\vec{p}_0 \leftarrow \vec{x}_0, \quad \vec{r}_0 \leftarrow \vec{b} - A\vec{p}_0$ 
for  $i = 1, 2, \dots, \text{max\_iterations}$  do
     $\vec{z}_i \leftarrow M^{-1}\vec{r}_{i-1}$ 
    if  $i = 1$  then
         $\vec{p}_i \leftarrow \vec{z}_i$ 
         $\alpha_i \leftarrow \text{dot\_prod}(\vec{r}_{i-1}, \vec{z}_i)$ 
    else
         $\alpha_i \leftarrow \text{dot\_prod}(\vec{r}_{i-1}, \vec{z}_i)$ 
         $\beta_i \leftarrow \alpha_i / \alpha_{i-1}$ 
         $\vec{p}_i \leftarrow \beta_i \vec{p}_{i-1} + \vec{z}_i$ 
     $\alpha_i \leftarrow \text{dot\_prod}(\vec{r}_{i-1}, \vec{z}_i) / \text{dot\_prod}(\vec{p}_i, A\vec{p}_i)$ 
     $\vec{x}_{i+1} \leftarrow \vec{x}_i + \alpha_i \vec{p}_i$ 
     $\vec{r}_i \leftarrow \vec{r}_{i-1} - \alpha_i A\vec{p}_i$ 
    if  $\|\vec{r}_i\|_2 < \text{tolerance}$  then
        STOP
  
```



<https://www.hpcg-benchmark.org>

12 user-defined functions + MPI communication

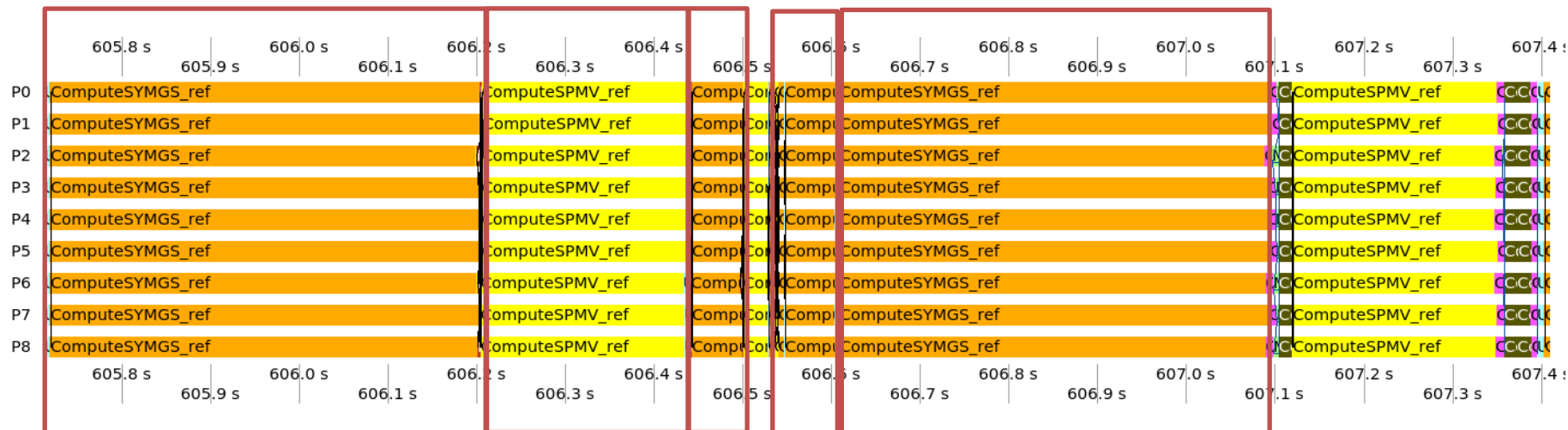
- SYMGS1+SPMV1+restriction+prolongation+SYMGS2

Default

Blue = Computation (user code)

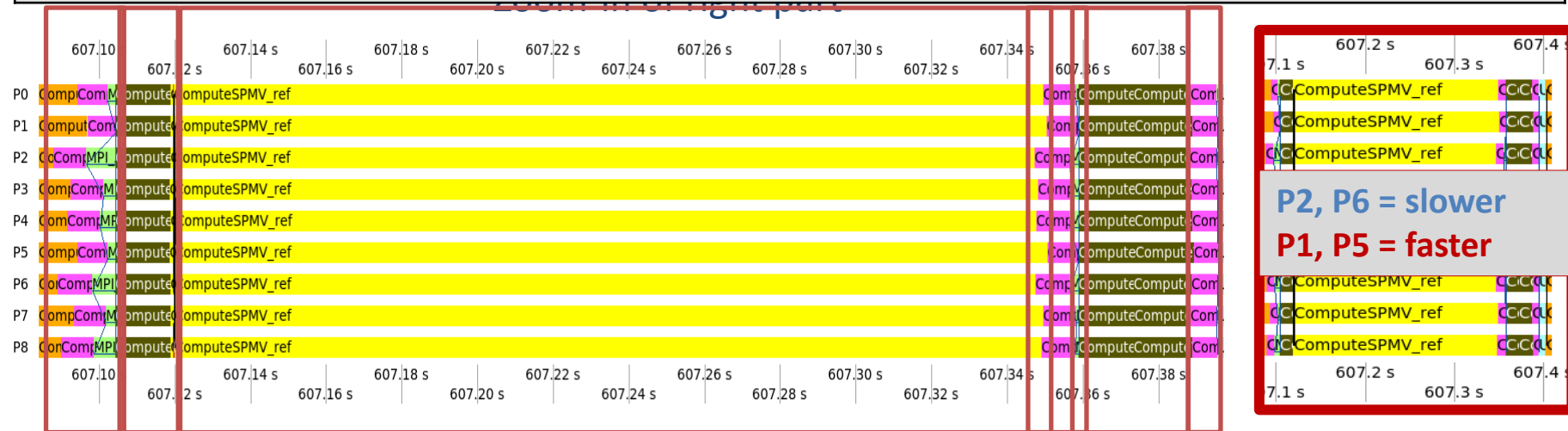
Red = Communication (MPI)

Black lines: Communication dependencies



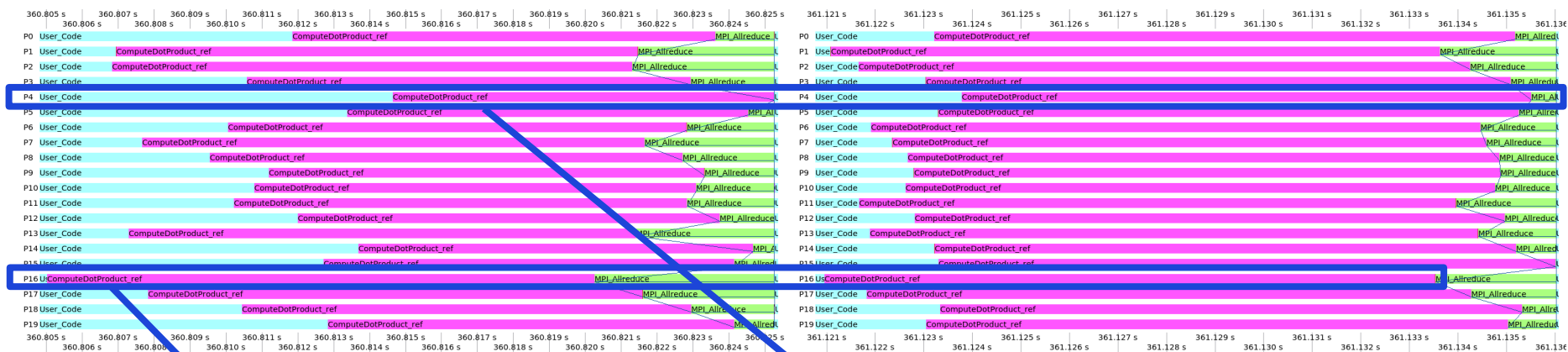
160³ problem size , 1800 second run, Broadwell EP, one socket, 9 processes, 3 GB memory per process

Broadwell EP	Min (ms)	Max (ms)	Mean (ms)	Median (ms)	Varianc e (ms)	Skewnes s (ms)	Kurtosis (ms)	SD (ms)	IQR=Q3-Q1 (ms)
DDOT1	7.355	9.045	8.398	8.474	0.272	-0.913	0.697	0.521	0.663
DDOT2	8.300	9.270	8.793	8.713	0.109	-0.080	-0.880	0.330	0.305
DDOT3	6.543	6.890	6.725	6.688	0.013	0.129	-0.607	0.112	0.139



160³ problem size , 1800 second run, Broadwell EP, one socket, 9 processes, 3 GB memory per process

Cascade Lake EP	Min (ms)	Max (ms)	Mean (ms)	Median (ms)	Varianc e (ms)	Skewnes (ms)	Kurtosis (ms)	SD (ms)	IQR=Q3-Q1 (ms)
DDOT1	10.592	15.225	12.635	12.426	1.761	0.372	-0.880	1.327	2.162
DDOT2	11.728	12.577	12.233	12.170	0.078	0.156	-1.142	0.279	0.536
DDOT3	7.603	8.008	7.723	7.686	0.014	1.364	0.909	0.116	0.111



DDOT1: Zoom-in

P16 = slowest

DDOT2: Zoom-in

P4 = fastest



Usage with cautions!

Be careful

check pinning correctness ✓

```
$ impi_info
$ export I_MPI_DEBUG=4
```

use filtering options for large problems ✓
 If not handled carefully,
 generates a lot of unnecessary data

Reduce startup time

```
$ traceanalyzer --cli ${binary}.stf -c0 -w
```

VT API

Manually instrument the code to profile only interesting parts of an application or a subset of iterations

- run without "-trace"
- #include <VT.h>
- -I\${VT_ROOT}/include
- inserting calls to VT_traceoff() and VT_traceon()
- VT_begin(mark), VT_end(mark)

Compiler switches

1. `-trace`
2. `-tcollect -trace`
function profile at a high price of maximum overhead
3. `-tcollect-filter=func.txt -tcollect -trace`

```
$ cat func.txt: 'funcX' ON|OFF
```

```
'*' OFF
'*ComputeDotProduct.*' ON
'*ComputeSYMGS.*' ON
'*ComputeSPMV.*' ON
'*ComputeWAXPBY.*' ON
```

1. `-qopt-report`
generate a full list of file and function names that the compiler recognizes from the compilation unit
2. `-tcollect -qopt-report -qopt-report-phase=tcollect`
generate an optimization report with tcollect information to get a list of the file or routine strings that can be matched by the regular expression filters

Binary instrumentation at runtime

1. `-trace-imbalance`
trace only the MPI functions that cause application load imbalance (idle at some point of the application run)
2. `-trace-collectives`
trace only about collectives operations
3. `-trace-pt2pt`
trace only about point-to-point operations

Environment variables	Default	Description
VT_FLUSH_PREFIX	/tmp	control directly for temporary flush files
VT_LOGFILE_PREFIX	current working directory	control directly for physical trace information files
VT_LOGFILE_FORMAT	STF	SINGLESTF: rolls all trace files into one file (.single.stf)
VT_LOGFILE_NAME	\${binary}	control the name for the trace file
VT_MEM_BLOCKSIZE	64 KB	trace data in chunks of main memory
VT_MEM_FLUSHBLOCKS	1024	flushing is started when the number of blocks in memory exceeds this threshold
VT_MEM_MAXBLOCKS	1024	maximum number of blocks in main memory, if exceed the application is stopped until AUTOFLUSH/ MEM-OVERWRITE/ stop recording trace info
VT_CONFIG_RANK	0	control the process that reads and parses the configuration file

<https://www.intel.com/content/www/us/en/docs/trace-analyzer-collector/user-guide-reference/2021-10/configuration-options.html>

Environment variables: set up in the

1. corresponding environment variables
2. command line when running your application
3. configuration file

\$ export VT_CONFIG=<config_file>

enable all Application activities
ACTIVITY Application ON

disable all MPI activity
ACTIVITY MPI OFF

enable all bcasts, barrier, allreduce, recvs and sends
SYMBOL MPI_WAITALL ON
SYMBOL MPI_IRecv ON
SYMBOL MPI_ISEND ON
SYMBOL MPI_BARRIER ON
SYMBOL MPI_ALLREDUCE ON

Use ITAC wisely
with custom
filtering preferences