

## TraceCompare: Automatic Identification of Differences between Executions

François Doray Tracing Summit - August 2015

#### Introduction



### Performance

is a critical requirement



#### Sources of performance variations

- Update to a program, library or OS  $oldsymbol{igo}$
- Interaction between tasks ۲
- Programming error  $oldsymbol{O}$
- Different system load



Developers don't understand 100% of the systems they develop.



**Tracing:** Record events that occur during the execution of a system.

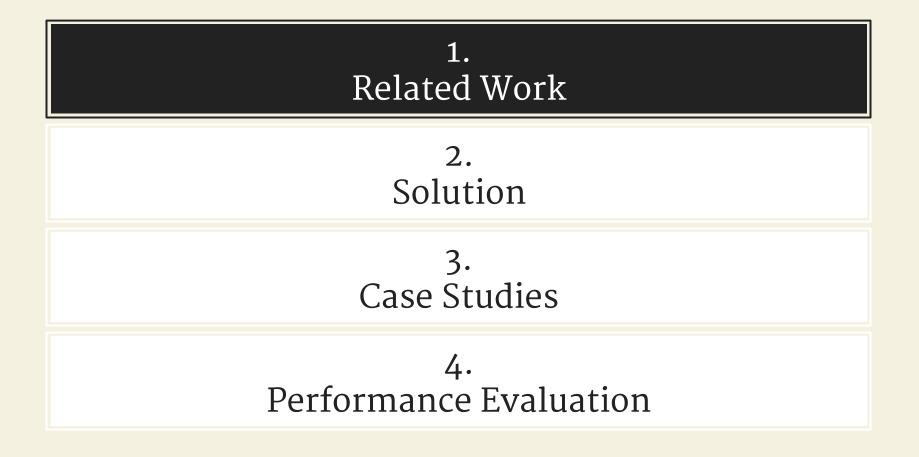
# View a trace in **TraceCompass**

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apache2	4684	1884	10:57:42.710542695	lo				
apache2	4685	1884	10:57:42.710544109	lo				
apache2	4689	1884	10:57:42.710545474	lo				
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Statistics    E    Re    Re     2     2     CPU 0     CPU 1     CPU 2     CPU 3     CPU 4     CPU 5     CPU 6     CPU 7	015 Jan 06 1							

Introduction



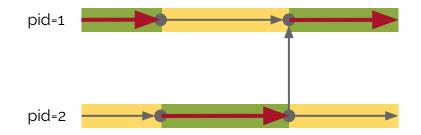
Can we facilitate the diagnosis of performance variations with an algorithm that automatically identifies <u>differences between two groups</u> <u>of execution traces</u>?



#### 1. Related Work / Extracting Task Executions

#### Approximation of Critical Path Giraldeau & Dagenais

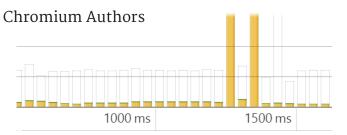
- Heuristic that uses kernel events to build:
  - Graph of dependencies between threads.
  - List of segments that belong to the critical path of an execution.



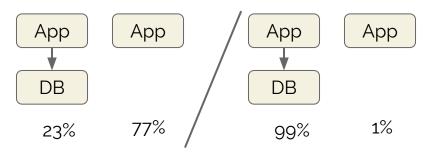
Alternate solution: **Dapper** Sigelman & al. (2010)

#### 1. Related Work / Comparing Task Executions

#### "Frames" mode of Chrome



#### Spectroscope Sambasivan & al. (2007)



#### Differential Flame Graphs Gregg (2014)

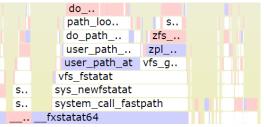


Image credit: Brendan Gregg / With permission.

#### TraceDiff Trumper & al. (2013)

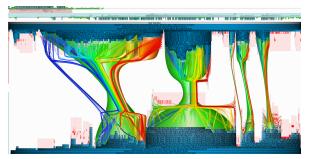
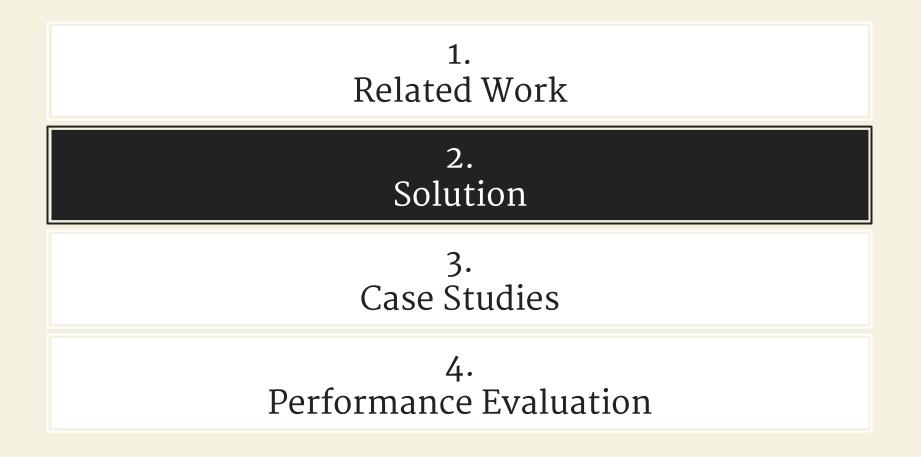


Image credit: Jonas Trümper / With permission.



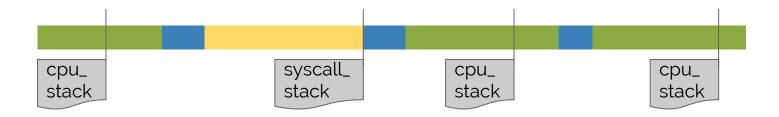
#### 2. Solution / Required Events

#### cpu\_stack

- Generated periodically when a thread is on the CPU.
- Uses ITIMER\_PROF.

#### syscall\_stack

- Generated on long system calls.
- Duration of system calls tracked in a kernel module.
- Stack captured from a <u>signal</u> handler.



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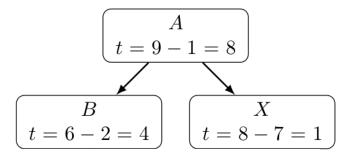
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- Generated on long system calls.
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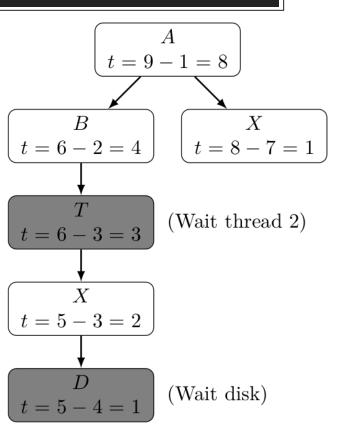
#### **Kernel Events**

• To compute the critical path of executions.

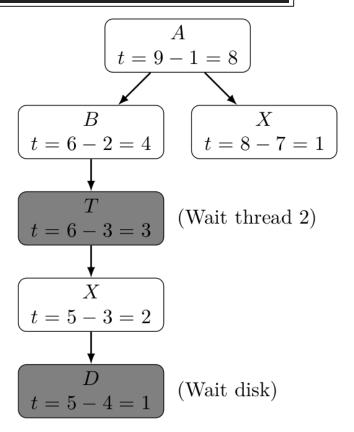
Time	Thread 1	
1	Call A	
2	Call B	
3		
4		
5		
6	Return B	
7	Call X	
8	Return X	
9	Return A	



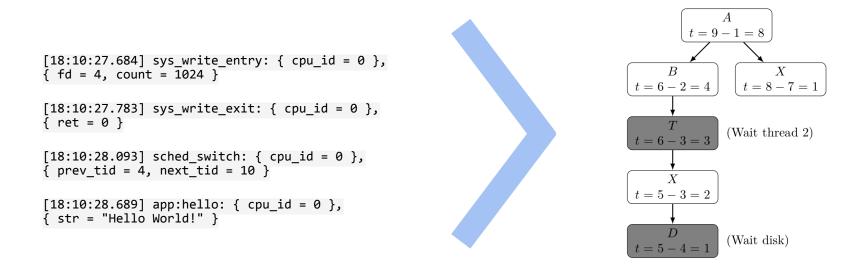
Time	Thread 1	Thread 2
1	Call A	
2	Call B	
3		Call X
4	Wait thread 2	Wait disk
5		Return X
6	Return B	
7	Call X	
8	Return X	
9	Return A	



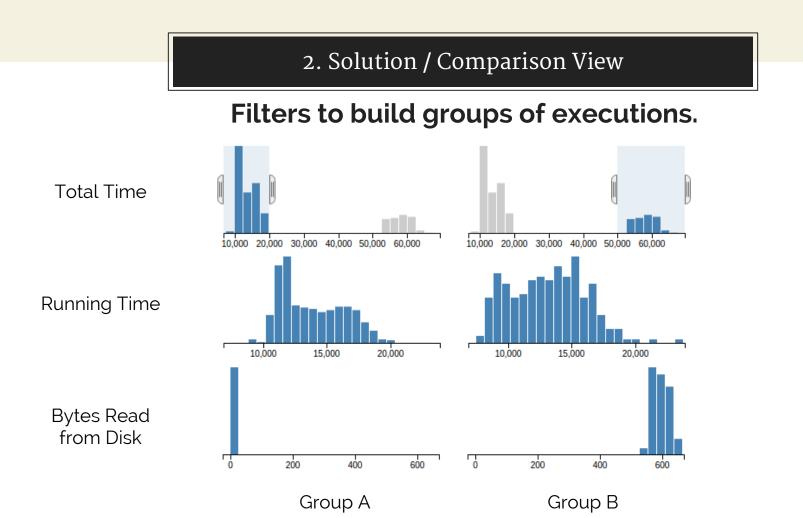
- Any type of latency.
  - CPU usage
  - Disk / network
  - Dependencies between threads



• Context of each latency.



State History Tree

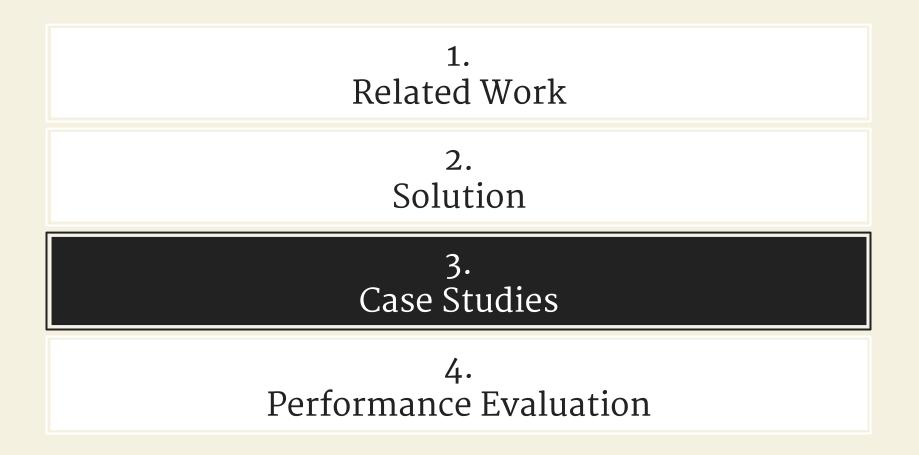


2. Solution / Comparison View

#### « Enhanced» Differential Flame Graph



• Red = time difference between compared groups.



#### **MUTEX**



Mutex held during a long operation for no reason. In MongoDB.

#### **SLEEP**

Using sleeps to synchronize threads. In MongoDB.

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#### PREEMPTION

Critical operation preempted by a low priority thread.

#### DISK

Web request slowed down by the OS committing data to the disk.



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http://fdoray.github.io/tracecompare/tracecompare.html?data=mongowrite

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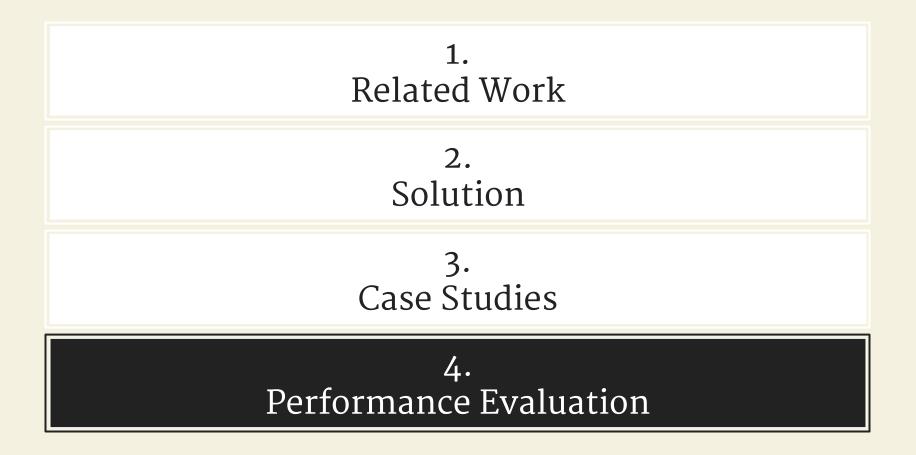
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#### 4. Performance Evaluation / Overhead

Application	LTTng overhead
<b>Prime</b> CPU only.	0.2%
<b>Find</b> Long disk requests.	5%
<b>Mongod</b> Interactions between threads.	9%

\* Quad-core Intel® Core™i7-3770 CPU @ 3.4 GHz, 16 GB RAM, 7200 RPM hard drive.

#### 4. Performance Evaluation / Overhead Comparison

Application	LTTng Overhead	DTrace Overhead	ETW Overhead
	(Linux)	(Mac)	(Windows)
<b>Prime</b>	-0.1%	1.0%	0.0%
CPU only.	±0.3%	±0.1%	±0.1%
<b>Mongod</b> Interactions between threads.	8% ±1%	24% ±0%	24% ±1%

\* 95% confidence intervals.

\* **MacBook Pro** Quad-core Intel® Core i7<sup>™</sup>-3720QM @ 2.6 GHz, 8 GB RAM, SSD.

#### Conclusion

#### Summary

- Trace call stacks.
- Enhanced calling context trees.
- Compare groups of executions using filters and flame graphs.
- Works with open-source and enterprise apps.

#### **Future Work**

- Support more interactions:
   VMs
  - GPUs
- Dynamic languages / JIT
- Support code refactoring



#### References

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J. Trumper, J. Dollner, and A. Telea, "Multiscale visual comparison of execution traces", in IEEE 21st International Conference on Program Comprehension (ICPC), May 2013, pp. 53–62. DOI : 10.1109/ICPC.2013.6613833.

#### Credits

Presentation by François Doray, master's student at the <u>Distributed open reliable systems analysis lab (DORSAL)</u> of Polytechnique Montreal.

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