

# Trend-Based Multi-Level Adaptive Tracing

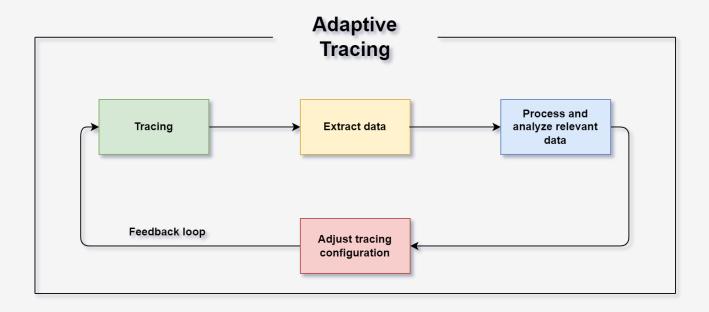
Mohammed Adib Khan ak19qp@brocku.ca Supervisor: Dr. Naser Ezzati-Jivan

Department Of Computer Science

Brock University, Canada

## Adaptive Tracing

Adaptive tracing – tracing instruments are controlled by a framework to figure out points of interest and keep on adjusting them automatically.



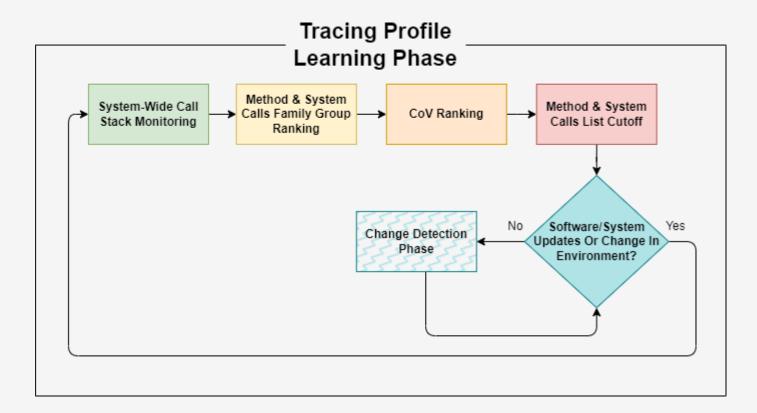
## Ideas & Research Questions

- Different types of approach:
  - Anomaly based
  - Clustering / Grouping
  - > Pairwise similarity
  - > Trend based
- □ We are interested in change detection of a trend.
  - We assume a change in trend of method execution time or system call execution time may become a culprit for performance problems at present or in the future.
- □ Problem we are trying to address:- performance related issues in production.
- **Research questions:** 
  - > How can we learn the tracing profile of each application?
  - How can we detect behavior changes on runtime?
    - > Should we adjust tracing config whenever there is a major change?
    - > What are the possible actions in regard to the detected changes?
  - How do we decide to change the tracing config?
  - How do we evaluate the trace adjustments?



□ Multi-level (user level and kernel level) trend-based adaptive tracing.

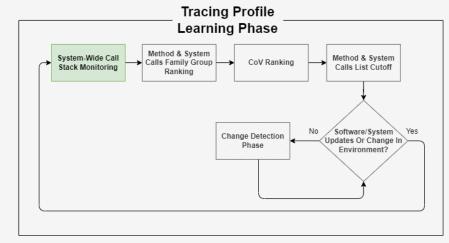
- □ The method has two phases:
  - Learning phase-
    - Build application tracing profile.
  - > Change detection phase-
    - Detect change in trend of methods and syscalls execution time.
    - ✤ Adjust tracing configurations based on the detected changes.



□ Preliminary Monitoring:

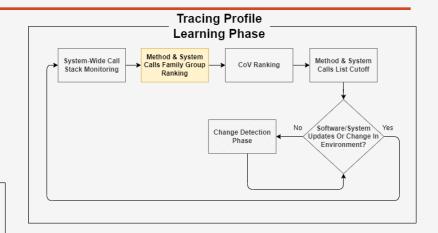
- > Application and system-wide monitoring of call stacks.
- Set a reasonable snapshot period (e.g 10ms for a browser)
- Stop after sufficient number of tasks have been performed by the system and recorded.
- We run the applications several times under different loads and stress satiations for the different scenarios of the software.

Арр	lication Ru	n #1	Applicatio	on Run #2	Application Run #n			
	30 ms		ms			ms		
10 ms	10 ms	10 ms	10 ms	10 ms	10 ms	10 ms		
Call Stack#1	Call Stack#2	Call Stack#	Call Stack#1	Call Stack#	Call Stack#	Call Stack#		
Method_x Method y	Method_f Method c		Method_x Method y					
	 Syscall x							
Method_z	Method_z		Method_z		55			
Syscall_x	Syscall_y	· · · · · · · · ·	Syscall_x	· · · · · · · ·				



#### **Gamily group identification:**

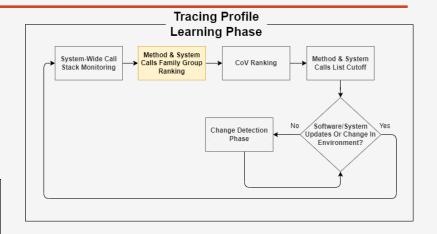
> Breakdown method calls into pairs of parent and child.



10ms	····· 20ms ·····	····· 30ms ·····	:	50ms	:	70ms
MethodA()	MethodA()	MethodX()	MethodA()	MethodX()	MethodX()	MethodX
	Ļ	Ļ		Ļ	Ļ	Ļ
¥	MethodB()	MethodY()	¥	MethodY()	MethodY()	MethodY(
MethodB()	Ļ	Ļ	MethodB()	Ļ	÷ ↓	Ļ
•	MethodC()	MethodZ()	•	MethodZ()	MethodZ()	MethodZ(
MethodC()	Ļ	Ļ	MethodC()	Ļ	Ļ	Ļ
	MethodD()	MethodQ()		MethodQ()	MethodQ()	MethodQ(
	Initial Family Group Li					
	With Number Of Call AB = 2					
	With Number Of Call A B = 2 B C = 2 C D = 1					
	With Number Of Call A B = 2 B C = 2					

#### **Gamily group identification:**

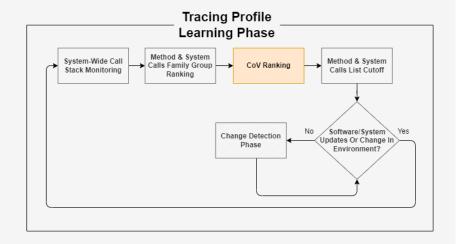
- > Breakdown method calls into pairs of parent and child.
- > Rank list in descending order of number of calls between parent and child.



MethodA() ↓ MethodB() ↓ MethodC() ↓	MethodX() ↓ MethodY() ↓ MethodZ()	MethodA() ↓ MethodB()	MethodX() ↓ MethodY() ↓	MethodX() ↓ MethodY() ↓	MethodX( ↓ MethodY(
↓ MethodC() ↓	Ļ	MethodB()	Ļ	↓ MethodY() ↓	↓ MethodY(
↓ MethodC() ↓	Ļ	v MethodB()	Ļ	MethodY() ↓	MethodY(
Ļ	₩ethodZ()	MethodB()	↓ ↓	Ļ	:
Ļ	MethodZ()				: <b>*</b>
Ļ			MethodZ()	MethodZ()	MethodZ(
	· 🔶	MethodC()	Ļ	Ļ	Ļ
MethodD()	MethodQ()		MethodQ()	MethodQ()	MethodQ(
ith Number Of Calls A B = 2 B C = 2 C D = 1 X Y = 2 Y Z = 2	5	By Number Of Calls A B = 2 B C = 2 Z Q = 2 X Y = 2 Y Z = 2			
	ith Number Of Calls A B = 2 B C = 2 C D = 1 X Y = 2	ith Number Of Calls A B = 2 B C = 2 C D = 1 X Y = 2	ith Number Of Calls     By Number Of Calls       A	ith Number Of Calls     By Number Of Calls       A B = 2     A B = 2       B C = 2     B C = 2       C D = 1     Z Q = 2       X Y = 2     X Y = 2	B = 2     B = 2       B = 2     A ==== B = 2       B === C = 2     B === C = 2       C === D = 1     Z ==== Q = 2       X ==== Y = 2     X ==== Y = 2

#### **Gamily group identification:**

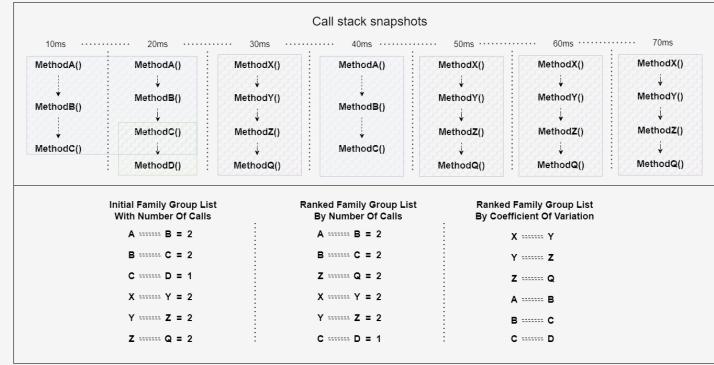
- Breakdown method calls into pairs of parent and child.
- > Rank list in descending order of number of calls between parent and child.
- > Find execution time of method calls.

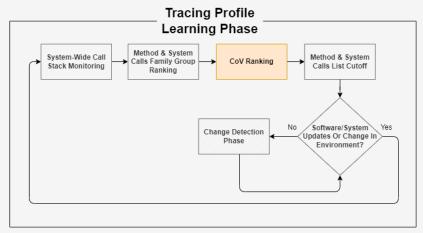


MethodA() MethodB() v MethodC()	MethodA() ↓ MethodB() ↓ MethodC() ↓ MethodD()	MethodX() ↓ MethodY() ↓ MethodZ() ↓ MethodQ()	MethodA() MethodB() MethodC()	MethodX() ↓ MethodY() ↓ MethodZ() ↓ MethodQ()	MethodX() ↓ MethodY() ↓ MethodZ() ↓ MethodQ()	MethodX() ↓ MethodY() ↓ MethodZ() ↓ MethodQ()
		Time s	series data of method e	execution time		

#### **Gamily group identification:**

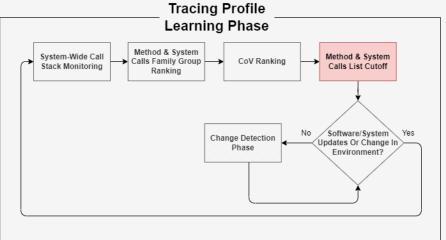
- Breakdown method calls into pairs of parent and child.
- > Rank list in descending order of number of calls between parent and child.
- > Find execution time of method calls.
- Rank list in descending order of coefficient of variation of their execution time (i.e., fluctuation of their duration).



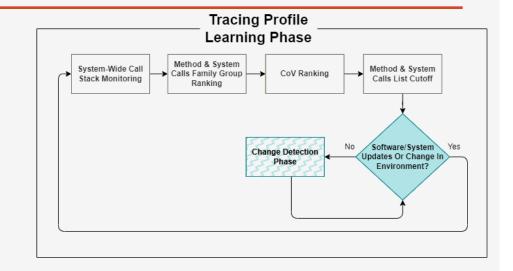


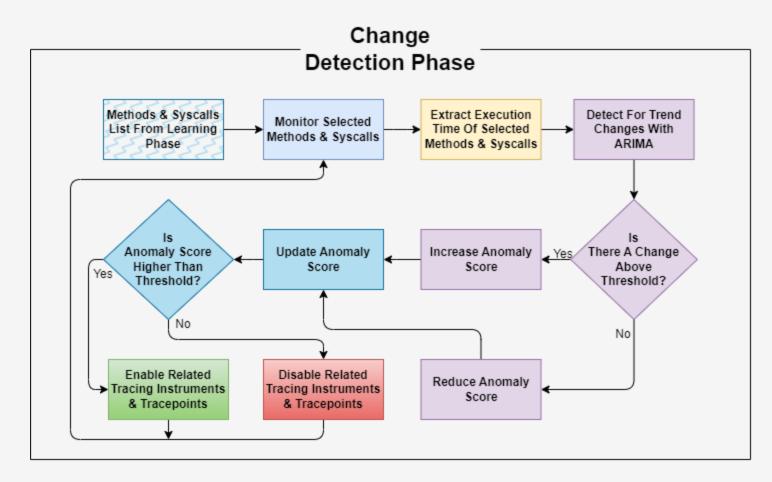
Select a reasonable cutoff number for the list. Example: top 500 method calls (~5 % of the methods) for Firefox used for PDF reading.

10ms	····· 20ms ·····		Call stack snap	oshots	••• 60ms ••••••	70ms
VethodA()	MethodA()	MethodX()	MethodA()	MethodX()	MethodX()	MethodX()
	Ļ	Ļ		Ļ	Ļ	Ų
*	MethodB()	MethodY()	*	MethodY()	MethodY()	MethodY()
MethodB()	Ļ	Ļ	MethodB()	Ļ	Ļ	Ų
¥	MethodC()	MethodZ()	¥	MethodZ()	MethodZ()	MethodZ()
MethodC()	Ļ	Ļ	MethodC()	Ų	Ļ	Ļ
	MethodD()	MethodQ()		MethodQ()	MethodQ()	MethodQ()
nitial Family Gro With Number C		Ranked Family Gro By Number Of C		Ranked Family Group List By Coefficient Of Variation		ons List To Monitor nily Group List Cutoff
A B =	2	A B = 2		X Y		22222222
B C =	2	B C = 2		Y Z		X
C D =	1	Z Q = 2		Z Q		z
X Y =	2	X Y = 2		A B		2222222
Y Z =	2	Y Z = 2		B C		
Z Q =	2	C D = 1	:	C D	÷	

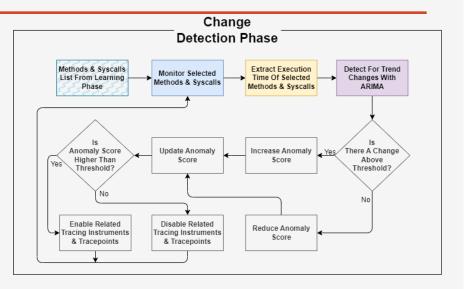


- We must update the tracing profile whenever there is a change is the application usage, software usage, system updates, etc.
- Feed the methods and system calls list to follow to the change detection process.





- Monitor selected methods and system calls continuously unless a changed list is supplied from the learning phase.
- □ Extract the methods and system calls' execution time.
- Predict the execution time at time T using autoregressive integrated moving average (ARIMA) while feeding it time series data till T-1.

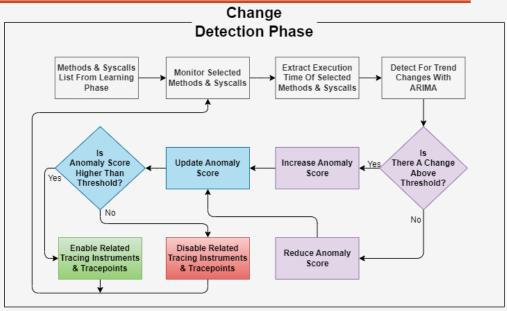


- ARIMA is an analysis methodology that utilizes time series data along with statistical analysis to predict future values based on data trends.
- □ Components of ARIMA:
  - Autoregression (AR): a paradigm in which a moving variable is pushed back on its previous, or lag, values.
  - > Integrated (I): depicts raw data separation in order for the time series towards becoming stabilized.
  - Moving average (MA): displays the relationship between a sample and the remaining error of a delayed moving average model.
- □ Input parameters of ARIMA:
  - > **p:** the model's quantity of lag observations.
  - ➤ d: the extent to which the raw readings are differed.
  - ➤ q: the moving average window size.

□ Why choose ARIMA?

- ARIMA models make the implicit assumption about the future that it will be very similar to the past trends. As a result, in particular market situations, such as economic crises or periods of fast technology development, they may prove to be wrong.
- > It is this drawback property of ARIMA that we are interested in.
- > A mismatch between actual reading and ARIMA's predicted reading would mean previous trend has been broken.
- > If the mismatch is beyond a threshold, then we could flag that method/syscall as problematic.

- Should we change our tracing configuration whenever there is a mismatch with ARIMA's prediction?
  - No! What if it was just one anomaly which is to never happen again? It's not worth it to keep changing tracing configuration every time for such occurrences which doesn't result in any noticeable performance issue.
- □ Anomaly Score:
  - $\succ$  anomaly score = (β \* is anomaly) + ((1 β) \* anomaly score)
  - Higher frequency of anomaly -> rapid increase of anomaly score.
  - Lower down of anomaly occurrence -> anomaly score drops down.
- □ If anomaly score is above threshold → enable related tracing instruments, tracepoints, events, etc.
- □ If anomaly score is below threshold → disable related tracing instruments, tracepoints, events, etc.



□ Three different types of issues in Firefox (as a complex multithreaded application):

- > Issues with application method calls to graphics driver.
- > Specific methods in application source code level causing performance problems.
- > System level components and system calls responsible for performance problems.

#### Case-studies: Issues with method calls to a driver in Firefox

Example1: Firefox Vsync issue with larger PDFs.

Issue: problem between Firefox and the way it calls graphic driver functions.

Clessili (Reporter) Description • 7 months ago

-download a large PDF (I used https://fabiensanglard.net/gebbdoom.pdf) -try opening it locally -opening it is slow (around 6 seconds) and a progress bar is shown

It seems the viewer does almost nothing during 6 seconds except showing the progress bar and triggering vsync: https://share.firefox.dev/3M2bDCg

Commenting line 858 of toolkit/components/pdfjs/content/web/viewer.js, (https://searchfox.org/mozillacentral/source/toolkit/components/pdfjs/content/web/viewer.js#858) responsible for showing the initial loading of the document (not its pages), brings the loading down to around 1 second.

An other clue of this: loading the PDF in a background tab also takes way less time than if the tab is in foreground.

🌾 1768481 - "I	oading bar" makes of 🗙	+								
$\leftrightarrow$ $\rightarrow$ G	🗎 bugzilla.mozilla.d	org/show_bu	ug.cgi?id=17	768481						Ê
m	Bugzilla ९	Search Bug	(5		•	٩	»	New Acco	ount	Log
	1768481 Opened 7 mc		-		ı					
Categories		-								
Component: Version:	Firefox ▼ PDF Viewer ▼ Firefox 102 x86_64 Windows 10				P		: 📀 ( : P2	lefect Severity:	S3	
Tracking										
	RESOLVED WORKSFOR									
• People										
Assignee:	🧝 calixte					Owner:	1.1	<b>clessili</b> <b>calixte</b> ople		
<ul> <li>References</li> </ul>										
Depends on:	<ul> <li><del>1772598</del></li> <li>Dependency tree / grade</li> </ul>	ıph			Se	e Also:		<del>1668214</del> 1769023		
<ul> <li>Details</li> </ul>										
	perf, perf:responsiven [pdfjs-performance] 0	ess								

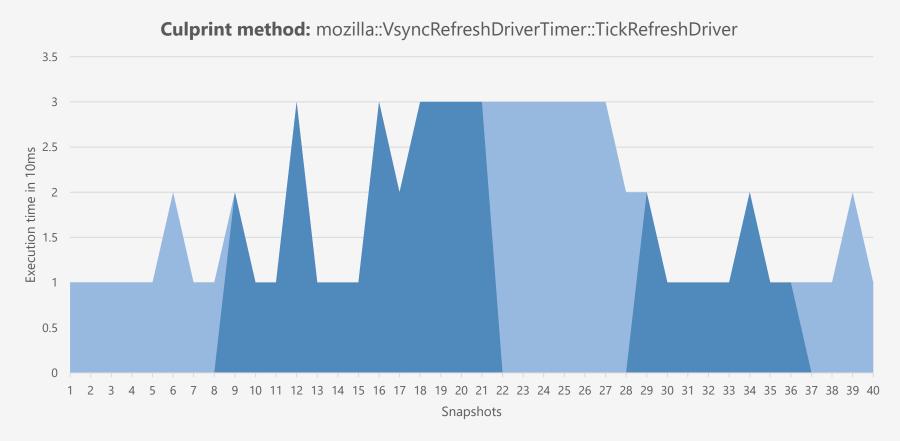
-

□ After the learning phase, only ~500 methods (5%) were selected to be followed out of ~10,000 method calls.

Multi-level TAT method flagged Vsync related method calls within its sorted top 20 method calls list.

1 ('js::Call-----js::InternalCallOrConstruct', 30267) 2 ('js::InternalCallOrConstruct----js::RunScript', 27707) 3 ('js::RunScript----Interpret', 22644) 4 ('JS::Call----js::Call', 8826) 5 ('js::jit::DoCallFallback----js::InternalCallOrConstruct', 7347) 6 ('mozilla::TaskController::ExecuteNextTaskOnlyMainThreadInternal----mozilla::TaskController::DoExecuteNextTaskOnlyMainThreadInternal', 6676) 7 ('mozilla::TaskController::DoExecuteNextTaskOnlyMainThreadInternal----mozilla::RunnableTask::Run', 6317) 8 ('mozilla::TaskController::ProcessPendingMTTask-----mozilla::TaskController::ExecuteNextTaskOnlyMainThreadInternal', 6227) 9 ('PromiseReactionJob----js::Call', 5245) 10 ('js::jit::InvokeFunction----js::Call', 4958) 11 ('mozilla::RefreshDriverTimer::TickRefreshDrivers-----nsRefreshDriver::Tick', 4752) 12 ('std::panicking::try-----<core::panic::unwind safe::AssertUnwindSafe<F> as core::ops::function::FnOnce<()>>::call once', 4731) 13 ( mozilla::RefreshDriverTimer::Tick-----mozilla::RefreshDriverTimer::TickRefreshDrivers', 4598) 14 ('mozilla::VsyncRefreshDriverTimer::RunRefreshDrivers----<mark>mozilla::RefreshDriverTimer::Tick</mark>', 4420) 15 ('mozilla::VsyncRefreshDriverTimer::TickRefreshDriver----mozilla::VsyncRefreshDriverTimer::RunRefreshDrivers', 4242) **16** ['std::panic::catch unwind----std::panicking::try', 4202] 17 ('MessageLoop::Run----mozilla::ipc::MessagePump::Run', 4052) 18 ('mozilla::detail::RunnableFunction<mozilla::TaskController::InitializeInternal()::\$ 2>::Run-----mozilla::TaskController::ProcessPendingMTTask', 4028) 19 ('mozilla::VsyncRefreshDriverTimer::NotifyVsyncOnMainThread-----mozilla::VsyncRefreshDriverTimer::TickRefreshDriver', 3803) 20 ('nsThread::ProcessNextEvent----mozilla::detail::RunnableFunction<mozilla::TaskController::InitializeInternal()::\$ 2>::Run', 3673) 21 ('mozilla::VsyncRefreshDriverTimer::RefreshDriverVsyncObserver::NotifyVsyncTimerOnMainThread-----mozilla::VsyncRefreshDriverTimer::NotifyVsyncOnMainThread', 3639) 22 ('js::CallGetter----js::Call', 3076) 23 ('MessageLoop::Run----mozilla::ipc::MessagePumpForNonMainThreads::Run', 2957) 24 ('entry\_SYSCALL\_64\_after\_hwframe----do\_syscall\_64', 2906) 25 ('<core::panic::unwind\_safe::AssertUnwindSafe<F> as core::ops::function::FnOnce<()>>::call\_once----std::sys\_common::backtrace::\_\_rust\_begin\_short\_backtrace', 2682) 26 ('webrender::renderer::Renderer::render----webrender::renderer::Renderer::render impl', 2672) 27 ('wr\_renderer\_render----webrender::renderer::Renderer::render', 2507) 28 ('mozilla::VsyncRefreshDriverTimer::RefreshDriverVsyncObserver::NotifyVsync----mozilla::VsyncRefreshDriverTimer::RefreshDriverVsyncObserver::NotifyVsyncTimerOnMainThread' 2451) 29 ('mozilla::wr::RendererOGL::UpdateAndRender----wr renderer render', 2327)

□ How the change detection phase adjusts tracepoints:



Disable Tracepoint Enable Tracepoint

## Case-studies: Specific method call in Firefox causing performance problems

#### □ Firefox 3d transformation rendering issue:

Reporter Comment 4 • 3 years ago	-
How about here: https://searchfox.org/mozilla-central/rev/9f074fab9bf905fad62e7cc32faf121195f4ba46/gfx/layers /wr/WebRenderCommandBuildercpp#303	
Flags: <del>needinfo?(jmuizelaar)</del>	
Reporter Comment 5 • 3 years ago	_
FWIW, upstream fixed/improved the issue: https://github.com/jonobr1/two.js/commit/ff9ade2308da3e28b43c9d8ed1adea79646d9ca8	
Glenn Watson [;gw] Comment 6 • 4 months ago	-
This is still quite bad - looks like it's all in blob rasterization.	
Flags: <del>needinfo?(tnikkel)</del>	
Timothy Nikkel (:tnikkel) Updated • 4 months ago	_
Flags: needinfo?(tnikkel)	

$\leftrightarrow$ $\rightarrow$ G	🔒 bugzilla.m	ozilla.org/sho	w_bug.cgi?i	id=1637586						Ŀ
m	Bugzilla	<b>Q</b> Search	Bugs				٩	»	New Accour	It
Open Bug 10	637586 Opened	3 years ago	Updated 4 m	nonths ago						
Terrible pe	rformance	on https	://loopi	ng-squa	res.sup	oerhi	.con	n		
<ul> <li>Categories</li> </ul>										
Product:							Туре:	😟 de	fect	
Component:	Graphics: WebR	ender 🔻				Pr	iority:	Not se	et Severity	: 5
<ul> <li>Tracking</li> </ul>										
Status:	NEW									
• People										
Assignee:	Unassigned					Rep	orter:	j.	rmuizel	
					т	riage C	wner:	E S	w	
					Ne	edInfo			el 4 months a	igo
							CC:	9 peo	ple	
<ul> <li>References</li> </ul>										
Blocks:	1637580									
	Dependency tre	e / graph								
• Details										
Votes:	4									

#### Case-studies: Specific method call in Firefox causing performance problems

The problematic method call was found in the top 10 by following the ranked list of 1000 (5%) method calls. Actual number of unique callee and caller pair methods exceeded over 20,000.

output2.txt	×	output1.txt	
1 ['binary_space_partition::BspNode <t>::insertbinary_space_part</t>			
2 ('binary_space_partition::add_sidebinary_space_partition::Bsp	Node <t>::insert', 11800)</t>		
3 ('js::InternalCallOrConstructjs::RunScript', 7134)			1
4 ('js::RunScriptInterpret', 5437)			
5 ('js::Calljs::InternalCallOrConstruct', 5391)			
6 ('mozilla::layers::WebRenderCommandBuilder::CreateWebRenderCommand			
7 ('core::ptr::drop_in_place <alloc::boxed::box<binary_space_partition< td=""><td></td><td></td><td></td></alloc::boxed::box<binary_space_partition<>			
	:BspNode <plane_split::po< td=""><td>.ygon::Polygon<f64,webrender_api::units::worldpixel,webrender::intern< td=""><td>al_typ</td></f64,webrender_api::units::worldpixel,webrender::intern<></td></plane_split::po<>	.ygon::Polygon <f64,webrender_api::units::worldpixel,webrender::intern< td=""><td>al_typ</td></f64,webrender_api::units::worldpixel,webrender::intern<>	al_typ
3803)			
8 ('DisplayLinensIFrame::BuildDisplayListForChild', 3137)			
9 ('nsBlockFrame::BuildDisplayListDisplayLine', 3117)			
10 ('mozilla::layers::WebRenderCommandBuilder::CreateWebRenderCommands	smozilla::nsbisplay	ransform::createwedRenderCommands', 3002)	
<pre>11 ('Interpretjs::jit::MaybeEnterJit', 2968) 12 ('mozilla::nsDisplayTransform::CreateWebRenderCommandsmozilla</pre>	··· lawass ··· HabBandasComma	dRuildor::CroatoWobBoodorCommandrEromDicplayLict' 2720)	
13 ('js::jit::InvokeFunctionjs::Call', 2512)	:: tayers:: webkender comma	ubuttuer::createwebkendercommandsriombisplayList , 2739)	
14 ('NS_ProcessNextEventnsThread::ProcessNextEvent', 2507)			
15 ('js::jit::InvokeFromInterpreterStubjs::jit::InvokeFunction'.	2483)		
16 ('nsIFrame::BuildDisplayListForChildnsIFrame::BuildDisplayList		3)	
17 ('js::jit::DoCallFallbackjs::InternalCallOrConstruct', 2259)	er or bredektingeontekter, 25	5)	
18 ('webrender::render_backend::Document::build_framewebrender::	frame builder::FrameBuil	ler::build'. 2116)	
19 (' <core::panic::unwind_safe::assertunwindsafe<f> as core::ops::fund</core::panic::unwind_safe::assertunwindsafe<f>			2093)
20 ('std::panicking::try <core::panic::unwind_safe::assertunwindsafe< td=""><td></td><td></td><td></td></core::panic::unwind_safe::assertunwindsafe<>			
21 ('js::RunScriptjs::jit::MaybeEnterJit', 2001)		(,,,	
22 ('webrender::render_backend::RenderBackend::update_documentwel	brender::render backend:	Document::build frame', 1922)	
23 ('webrender::render_backend::RenderBackend::runwebrender::render	der_backend::RenderBacke	d::update_document', 1904)	
24 ('std::sys_common::backtrace::rust_begin_short_backtraceweb			
<pre>25 ('0x33f90be73d05js::jit::InvokeFromInterpreterStub', 1816)</pre>	_		
<pre>26 ('nsIFrame::BuildDisplayListForChildnsIFrame::BuildDisplayList</pre>			
<pre>27 ('nsIFrame::BuildDisplayListForStackingContextnsBlockFrame::BuildDisplayListForStackingContextnsBlockFrame::BuildDisplayListForStackingContextnsBlockFrame::BuildDisplayListForStackingContextnsBlockFrame::BuildDisplayListForStackingContext</pre>			
28 ('mozilla::TaskController::DoExecuteNextTaskOnlyMainThreadInternal	mozilla::RunnableTa	k::Run', 1736)	

## Case-studies: Network connectivity issue causing high loading time with Firefox

	← → C					
No network connectivity and DNS issue:	m Bugzilla Q Search Bugs II Q >> New Account					
	Open Bug 1776469 Opened 6 months ago Updated 5 months ago					
james.cook     (Reporter)       Description • 6 months ago	very slow startup when network is broken (I suspect DNS)					
	<ul> <li>Categories</li> </ul>					
User Agent: Mozilla/5.0 (X11; OpenBSD amd64; rv:101.0) Gecko/20100101 Firefox/101.0	Product: Core • Type: 🧿 defect					
Steps to reproduce:	Component: Networking • Priority: P3 Severity: S3					
Tried to start Firefox (using the command "firefox") when my network connection was poor specifically, it seems to happen when	Version: Firefox 101					
my OS thinks I have a network connection, but it is temporarily not working, e.g. a flaky mobile hotspot.	▼ Tracking					
I am using OpenBSD current. I think this has been happening for years; haven't bothered to report it until now.	Status: UNCONFIRMED					
I notcied https://bugzilla.mozilla.org/show_bug.cgi?id=433665 looks similar, in that it involves DNS and slow startup, but I don't know if	▼ People					
this has anything to do with profile locking.	Assignee: Unassigned Reporter: 🌅 james.cook					
Actual results:	Triage Owner: 🏹 jesup					
It takes a long time maybe a minute? before any Firefox windows appears.	CC: 2 people					
	▼ Details					
I briefly looked at ktrace output. I see a bunch of stuff at 0 seconds, then a bunch of stuff at 5 seconds, then at 15, then 35 I guess it is	Whiteboard: [necko-triaged]					
retrying something. Here is the block at 15 seconds:	Votes: 0					
90429 firefox 15.067960 STRU struct kevent						
90429 firefox 15.067968 STRU struct pollfd { fd=8, events=0x1 <pollin>, revents=0&lt;&gt; }</pollin>	log files; moz_log.txt.moz_log.0 is clipped after 1000 lines					
90429 firefox 15.067969 RET poll 0 90429 firefox 15.067974 CALL recyfrom(8.0x29fabb1f000.0x1000.0.0.0)	5 months ago <b>james.cook</b> 19.86 KB, application/octet-stream					
90479 TILETOX IN 067974 CALL PECVICOMICS 0279TADDIT000 021000 0.0.01						

□ Sendmsg system call was flagged.

Linux system call table shows its related to net/socket.c which is the network component of Linux kernel.

output2.txt		×		output1.txt ×
576 ('InterpretJSFunction::delazifyLazilyInterpre	etedFunction			
577 ('js::frontend::GeneralParser <js::frontend::fu''< td=""><td></td><td></td><th></th><th></th></js::frontend::fu''<>				
js::frontend::GeneralParser <js::frontend::full 578 (' l<u>i</u>bc sendmsgentry SYSCALL 64 after hw</js::frontend::full 	46 <mark>Se</mark>	endmsg sys	sendmsg	<u>net/socket.c</u>
579 ('do_syscal(_64x64_sys_sendmsg', 156)	and the set			
580 ('x64_sys_sendmsgsys_sendmsg', 156)	0/	0/!		0/
581 ('sys_sendmsgsys_sendmsg', 156)	%rdi	%rsi		%rdx
582 ('j🚓 gc::StoreBuffer::MonoTypeBuffer <js::gc::< td=""><td>turk Ed</td><td>at weather and a second to a s</td><th></th><th>unation and test floors</th></js::gc::<>	turk Ed	at weather and a second to a s		unation and test floors
583 ('X <sup>P</sup> CWrappedNative::CallMethodCallMethodH	int fd	struct msghdruser * ms	sg	unsigned int flags
584 ('s::frontend::BytecodeEmitter::emitTree				
585 ('libc_writeentry_SYSCALL_64_after_hwframe				
<pre>586 ('mpzilla::psm::CheckCandidatesmozilla::pkix: 587 ('nsRefreshDriver::Tickmozilla::PresShell::Do</pre>				
588 ('XRE InitEmbedding2NS_InitXPCOM', 154)	ortusiireilutii	gNottiteations, 154)		
589 ('js:::gc::ArenaLists::refillFreeListAndAllocate	js::qc::T	enuredChunk::allocateArena', 15	54)	
590 ('DisplaylinensIFrame::BuildDisplayListForChi		,		
591 ('xpc::CloneIntoxpc::StackScopedClone', 154)				
592 ('mozilla::net::nsSocketTransportService::DoPollI				
593 ('mozilla::net::nsSocketTransport::OnSocketReady-				
594 ('js::frontend::GeneralParser <js::frontend::syntax< td=""><td></td><td></td><th></th><th></th></js::frontend::syntax<>				
js::frontend::ParserAnyCharsAccess <js::frontend::c 595 ('js::Nursery::traceRootsis::gc::StoreBuffer</js::frontend::c 				>>>::getTokenInternat, 154)
596 ('draw guaddraw guad spanskunsigned int>', 15			, 155)	
597 ('0x1c983dfa7d5bjs::jit::DoSetPropFallback',				
598 ('mozilla::RunnableTask::Runmozilla::dom::(ar	nonymous nam	espace)::IdleDispatchRunnable::	:Run', 152)	
599(('IPC::Channel::Send				
600 ('mozilla::dom::MessageEventRunnable::DispatchDOME				
601 ('mozilla::ipc::PBackgroundChild::OnMessageReceive		la::dom::indexedDB::PBackground	IIDBRequestChild::OnMess	sageReceived', 152)
602 ('nsBlockFrame::BuildDisplayListDisplayLine',				
603 ('NSC_FindObjectsInitsftk_searchDatabase', 1				

## Evaluation

#### 1. Effectiveness:

- □ **Informativeness:** Can we collect relevant information of the issues(s) whenever they are needed without tracing the whole application?
  - $\checkmark$  Three Firefox issues showed that the proposed method is effective
- **On-time**: How early we detect the change and start collecting the data about the issue?
  - $\checkmark$  By adjusting the β value of the anomaly score function and the anomaly threshold, depending on the seriousness of the application or system, we could adjust how early and how fast we would want to start collecting data about an issue.
- 2. Overhead: What is the computational overhead of this method?

#### □ Learning phase of tracing-profile

□ It is done offline

- Depends on how many times you would want to run your application to learn.
  - □ Under different runtime issues

#### **Q** Runtime Analysis

- □ Collecting the trace of the selected functions
  - □ User space tracing with LTTng or
  - □ Profiling
- □ Change detection based on Arima
  - □ Based on each function-tracing

## Conclusion

□ Adaptive tracing is a challenging task.

□ We proposed a trend based adaptive tracing method.

• Our method can handle multi-level adaptive tracing (application and system level).

□ Our method successfully tracked performance issues in the following categories:

- ✓ Issues with driver and application communication.
- ✓ Specific methods in application source code level causing performance problems.
- ✓ System level components and system calls responsible for performance problems.

## Thank you!



# ak19qp@brocku.ca https://github.com/ak19qp/dorsal-conference/