



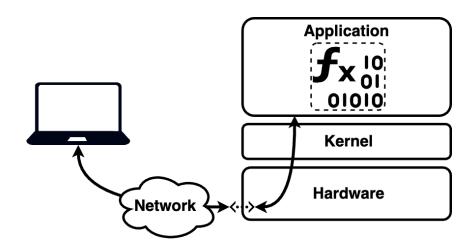
Tutorial: Observability into Application-level Metrics with **eBPF**

Mohammadreza Rezvani, Muntaka Ibnath, Daniel Wong

2025 IEEE International Symposium on Workload Characterization

Modern Data Centers

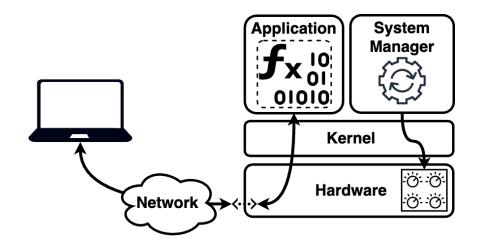
 Dynamic environment of data centers, demands efficient management.





System Management

- Dynamic environment of data centers, demands efficient management.
- System manager tune performance knobs
 - Cores, Frequency, Cache, ...
- System manager requires observability into applications.



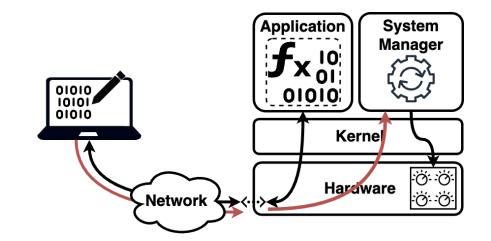


Observability Challenges

 Observabilities fulfilled by clients as performance metrics.

II. Application must be *instrumented* to provide observability.

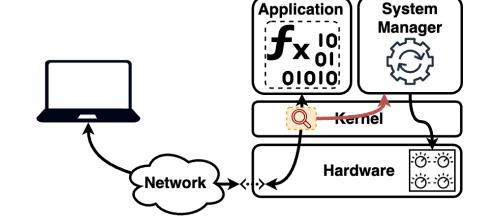
III. Timely action incurs significant **overhead**.





Idea: Increase Observability From Kernel Interactions

- Benefits of observing kernel interactions
 - No need for instrumentation
 - Open doors for data to be used in kernel





How To Observe Kernel Activities?

Run sandboxed programs in kernel*

• eBPF allows safe custom programs to be attached to parts of kernels in order to monitor the event, gather information, or do somethings based on the event





Emerging eBPF Use Cases

- Connection security between application deployed using container management
- eBPF based OS scheduler (sched_ext)
- Load balancing
- Anomaly detection











Today's agenda

Step 1:

- Gain high-level understanding of Linux kernel
- Learn about eBPF, its benefits, and some use cases

Step 2:

Dissect and run eBPF programs

Step 3:

Introduction to Server-Client Workloads

Step 4:

Tracing syscalls using kprobes

Step 5:

Tracing user-space functions using uprobes



What is webpf?



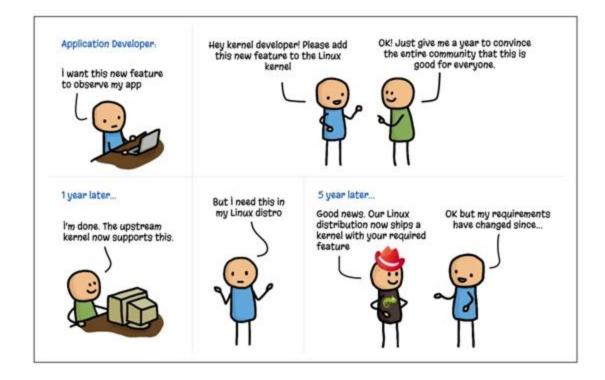
What is **Tebes**

extended

Berkeley

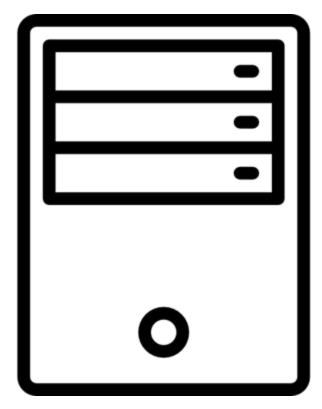
Packet

Filter



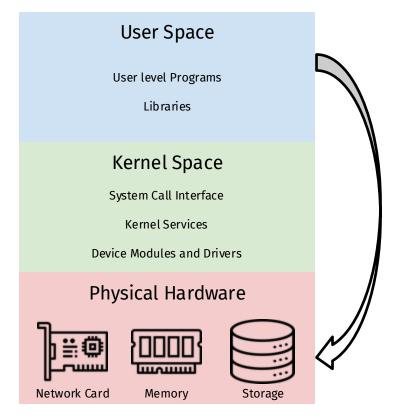


Operating system fundamentals





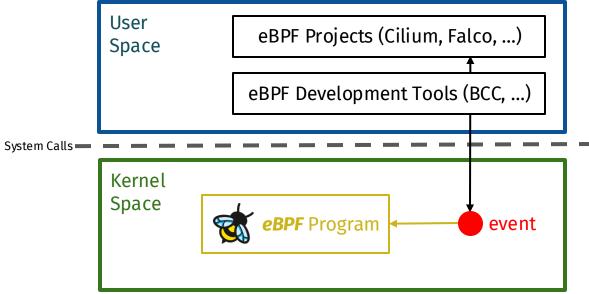
Operating system fundamentals





So what if we have to easily extend the capabilities of kernel?

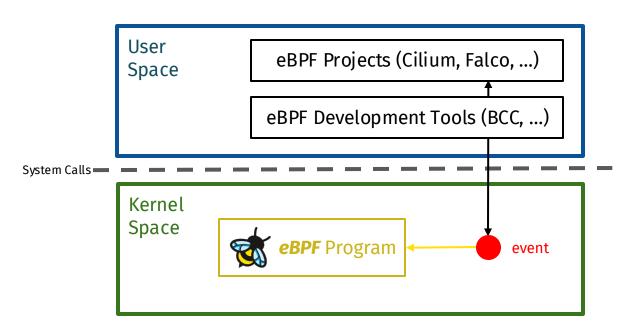






eBPF programs can be attached to different events

- Kprobes
- Uprobes
- Tracepoints
- Network packets
- Security Modules
- Perf events
- ...





Emerging *eBPF* use cases

- Connection security between application deployed using container management
- eBPF-based OS scheduler
- Load balancing
- Anomaly detection













Setup environment



Scan the QR code or visit the link for server access



https://forms.gle/w717jHchTXiVhw2Y8

- You will receive an email with credentials
- Please let us know before submitting another form

How to use command line:

https://tinyurl.com/cmdlinetutorial

Please ssh to the server after receiving the credentials.



Tutorial repository



https://github.com/socal-ucr/eBPF-tutorial

Clone the repository

How to use git:

https://tinyurl.com/git-tut

How to use vim:

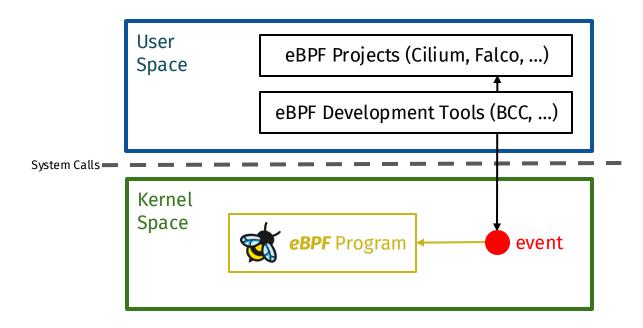
https://tinyurl.com/vim-tut



eBPF Development

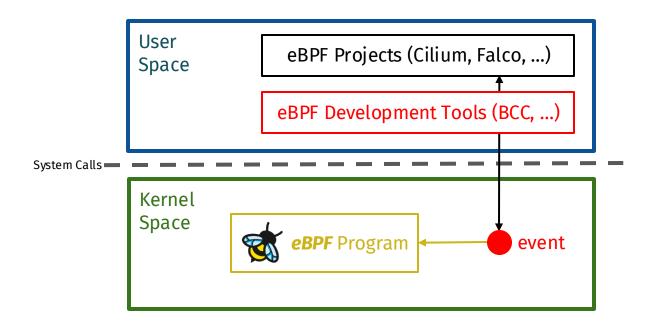


eBPF Development Tools





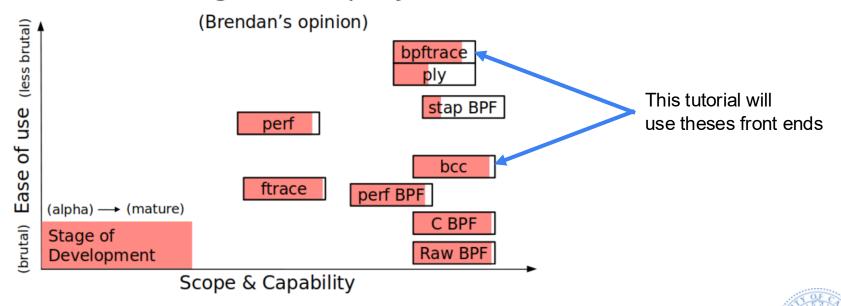
eBPF Development Tools





eBPF Front Ends

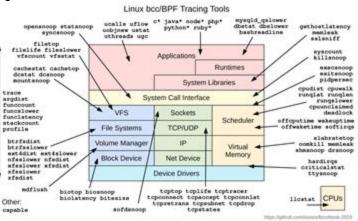
The eBPF Tracing Landscape, Jan 2019



Brendan Gregg, "Linux Extended BPF (eBPF) Tracing Tools", https://www.brendangregg.com/ebpf.html

eBPF Development Tools - **BPF Compiler Collection (BCC)**

- Helps developers write, load, and attach eBPF programs to kernel events
- Biggest advantages
 - Write eBPF logic in C and control logic in Python or Lua
 - **BCC compiler** translates embedded C code into eBPF bytecode.
 - Data collection and analysis can run it Python.
- Many ready to use tracing tools

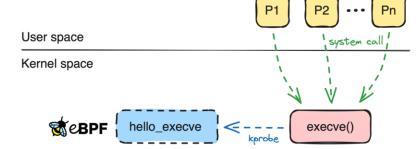




Helloworld with **BCC**

• Please navigate to **{tutorial directory}/2-HelloWorld/BCC** to experiment with BCC.

• *Goal*: print from eBPF space anytime a Program uses *execve* system call.



execve is responsible for executing a new program.



How to print from eBPF space? **bpf_trace_printk**

• Please navigate to **{tutorial directory}/2-HelloWorld/BCC** to experiment with BCC.

- **bpf_trace_printk** is a helper prints messages to the trace log of the kernel.
- bpf_trace_printk("message");



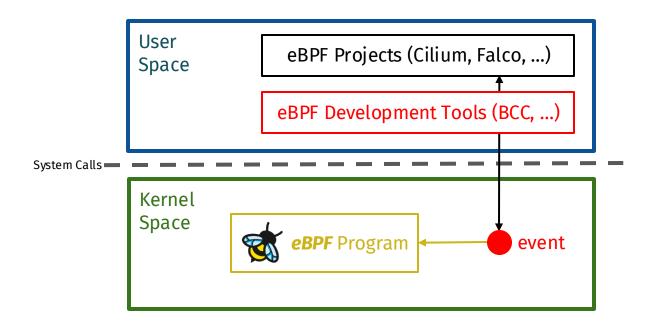
Helloworld with **BCC**

- Please navigate to {tutorial directory}/2-HelloWorld/BCC to experiment with BCC
- Please fill the hello function to print "Hello World!" in eBPF space.

sudo python3 helloWorld.py

```
b' <...>-70101 [000] ....1 82841.999068: bpf_trace_printk: Hello World!'
b' <...>-70103 [001] ....1 82844.558208: bpf_trace_printk: Hello World!'
b' <...>-70105 [000] ....1 82853.858909: bpf_trace_printk: Hello World!'
```

eBPF Development Tools





eBPF Development Tools - bpftrace

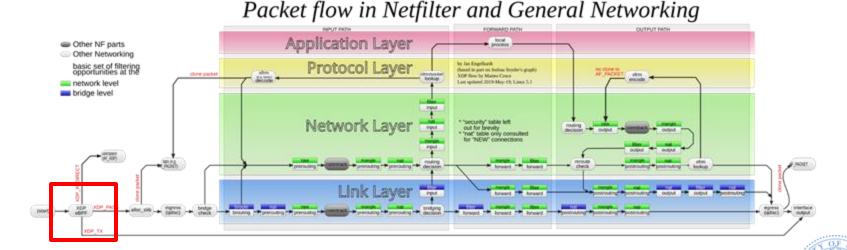
bpftrace is a command-line tool that makes eBPF accessible.

- Biggest advantages
 - No Setup Needed: No need for wrappers in C & Python. Can even accept 1 liner programs
 - Syscall count by thread name:
 - bpftrace -e 'tracepoint:raw_syscalls:sys_enter { @[comm] = count(); }'
 - Fast Debugging: Perfect for on-the-fly performance analysis.

 Please navigate to {tutorial directory}/2-HelloWorld/bpftrace to see this tool in action

eBPF Development Tools - bpftrace

• Please navigate to **{tutorial directory}/2-HelloWorld/bpftrace** to see this tool in action



eBPF Development Tools - bpftrace

 Please navigate to {tutorial directory}/2-HelloWorld/bpftrace to see this tool in action

Please move forward until you reach Inspecting the Compiled eBPF Object
 File section



bpftrace - Inspecting the Compiled eBPF Object File

• The *file* utility is commonly used to determine the contents of a file.

file helloWorld.bpf.o

helloWorld.bpf.o: ELF 64-bit LSB relocatable, eBPF, version 1 (SYSV), with debug_info, not stripped

• This shows it's an **ELF (Executable and Linkable Format)** file, containing **eBPF code**, for a **64-bit platform** with **LSB (least significant bit) architecture**.



bpftrace - eBPF bytecode with llvm-objdump

llvm-objdump-18 -S helloWorld.bpf.o

```
helloWorld.bpf.o:
              file format elf64-bpf
Disassembly of section xdp:
00000000000000000000 <helloWorld>:
    bpf_printk("Hello World %d", counter);
     0:
            61 63 00 00 00 00 00 00 r3 = *(u32 *)(r6 + 0x0)
     3:
            b7 02 00 00 0f 00 00 00 r2 = 0xf
            85 00 00 00 06 00 00 00 call 0x6
    counter++:
            61 61 00 00 00 00 00 00 r1 = *(u32 *)(r6 + 0x0)
     7:
     8:
            07 01 00 00 01 00 00 00 r1 += 0x1
             63 16 00 00 00 00 00 00 *(u32 *)(r6 + 0x0) = r1
    return XDP_PASS:
     10:
            b7 00 00 00 02 00 00 00 r0 = 0x2
     11:
            95 00 00 00 00 00 00 00 exit
```



bpftrace - Loading the Program into the Kernel

sudo bpftool prog list name helloWorld

```
47: xdp name helloWorld tag d35b94b4c0c10efb gpl loaded_at 2025-10-08T22:00:10+0000 uid 0 xlated 96B jited 68B memlock 4096B map_ids 6,7 btf_id 52
```



bpftrace - Loading the Program into the Kernel

sudo bpftool prog show id {ID} --pretty

```
ક્
   "id": 47,
    "type": "xdp",
    "name": "helloWorld",
    "tag": "d35b94b4c0c10efb",
    "gpl_compatible": true,
    "loaded_at": 1759960810,
    "uid": 0,
    "orphaned": false,
    "bytes_xlated": 96,
    "jited": true,
    "bytes_jited": 68,
    "bytes_memlock": 4096,
    "map_ids": [6,7
    "btf_id": 52
```



bpftrace - Loading the Program into the Kernel

sudo bpftool prog dump xlated name helloWorld

```
int helloWorld(struct xdp_md * ctx):
; bpf_printk("Hello World %d", counter);
  0: (18) r6 = map[id:18][0]+0
  2: (61) r3 = *(u32 *)(r6 +0)
  3: (18) r1 = map[id:19][0]+0
  5: (b7) r2 = 15
  6: (85) call bpf_trace_printk#-118144
; counter++;
  7: (61) r1 = *(u32 *)(r6 +0)
  8: (07) r1 += 1
  9: (63) *(u32 *)(r6 +0) = r1
; return XDP_PASS;
   10: (b7) r0 = 2
   11: (95) exit
```



Introduction to Server-Client Workloads



NVIDIA Triton Inference Server and Client

NVIDIA Triton Workload

Setting up the server: <u>Here</u>

• Setting up the client: Here

Triton exposes both HTTP/REST and GRPC endpoints

o HTTP port: 8000

o gRPC port: 8001

- gRPC
 - gRPC = Remote Procedure Call by Google
 - Open-source, high-performance RPC framework
 - Uses HTTP/2 as transport, supports bi-directional streaming
 - Data serialized with Protocol Buffers (Protobuf)
 - Widely used in microservices, ML serving (e.g., Triton Inference Server)





Check whether the workloads are running properly

- Run the following commands:
 - docker start triton-server
 - docker start triton-client

These commands will start the containers that we have already set up for you

- Now check whether the containers are running properly
 - docker ps

```
(bpfenv) ebpftutorial@iiswc-tutorial-main-instance-ubuntu24:-$ docker ps
CONTAINER ID
                                                           COMMAND
                                                                                    CREATED
                                                                                                    STATUS
                                                                                                                  PORTS
            nvcr.io/nvidia/tritonserver:24.08-py3-sdk
                                                           "/opt/nvidia/nvidia_..."
                                                                                                   Up 17 hours
                                                                                    19 hours ago
                                                                                                                            triton-client
             nvcr.io/nvidia/tritonserver:24.08-py3
                                                           "/opt/nvidia/nvidia_..."
                                                                                    19 hours ago
                                                                                                   Up 19 hours
                                                                                                                            triton-server
(bpfenv) ebpftutorial@iiswc-tutorial-main-instance-ubuntu24:-$
```



Check whether the workloads are running properly

- Execute the triton-client docker container in a separate terminal
 - docker exec -it triton-client /bin/bash
- Inside this folder, there are some simple client codes for both HTTP and gRPC
 - /workspace/client/src/python/examples
- We have also put two simple codes for the starter
 - http_test.py ---> <u>HTTP client code</u>
 - grpc_test.py ---> gRPC client code



Sending simple requests from client to server

- From the client docker container, we can send requests to the server
- This time we have the triton server and client both on the same machine, but we can have them on different machines and test
- To test whether the workloads are functioning, run:
 - python3 <client-python-filename> <duration-in-seconds>

```
root@iiswc-tutorial-main-instance-ubuntu24:/workspace/client/src/python/examples# python3 grpc_test.py 10 Connected to Triton server at localhost:8001 Running for 10 seconds at 1 requests/second...

Sending request...
Response received successfully.

Sending request...
Response received successfully.
```

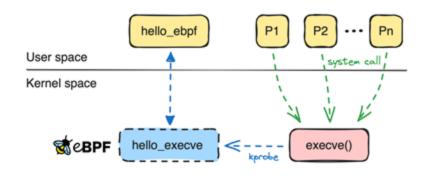


Tracing System Calls with eBPF kprobes



What is a kprobe?

- Dynamically trace kernel functions at runtime
- Attach the eBPF program to the system call using kprobe
- eBPF program runs whenever the particular syscall is called
 - kprobe: before syscall execution
 - kretprobe: after syscall execution





What we are trying to do

- What are the syscalls we want to trace?
 - 1. recyfrom
 - 2. sendto
- Container specific filtering
- Collect:
 - a. PID
 - b. Timestamp
 - **C.** Process name (comm)
 - **d.** File Descriptor(fd)
 - e. Syscall name

accept4

sendto

readv

•

•

readv

recvfrom

writev

readv

close



Let's have a look at the syscall synopsis

Before starting to write the code for tracing these syscalls, we need to have a look at their synopses

recvfrom(2) - Linux man page

Name

recv, recvfrom, recvmsg - receive a message from a socket

Synopsis

```
#include <sys/types.h>
#include <sys/socket.h>
ssize t recv(int sockfd. void *buf. size t len. int flags):
ssize t recvfrom(int sockfd, void *buf, size t len, int flags,
                 struct sockaddr *src_addr, socklen_t *addrlen);
ssize_t recvmsg(int sockfd, struct msghdr *msq, int flags);
```

sendto(2) - Linux man page

Name

send, sendto, sendmsg - send a message on a socket

Synopsis

```
#include <sys/types.h>
#include <svs/socket.h>
ssize t send(int sockfd, const void *buf, size t len, int flags);
ssize t sendto(int sockfd, const void *buf, size t len, int flags,
               const struct sockaddr *dest_addr, socklen_t addrlen);
ssize t sendmsq(int sockfd, const struct msqhdr *msq, int flags);
```







Writing a kprobe

Please navigate to **{tutorial directory}/4-kprobe/** to experiment with kprobe

Step 1: Getting the container PID

```
This function returns the server container PID, so that we can only probe the syscalls made by the container

def get_pid(container_name):
    cmd = f"docker inspect --format '{{{{.State.Pid}}}}}' {container_name}"
    return int(os.popen(cmd).read().strip())
```



Writing a kprobe

Step 2: Define the eBPF program to attach to the syscall



Writing a kprobe

Step 3: Sending the triton PID to the eBPF code

```
bpf_text = r"""

Now the TRITON_PID variable will be accessible to the eBPF code

//bpf code goes here

""".replace("TRITON_PID", str(TRITON_PID))
```

Step 4: Load the eBPF code and attach kprobes

```
b = BPF(text=bpf_text, cflags=["-w"]) Loads the eBPF code
b.attach_kprobe(event="__x64_sys_recvfrom", fn_name="syscall_recvfrom") Attaches the syscall specific function to the syscall
```



Writing the kprobe

Step 5: Run the kprobe code

```
sudo python3 <filename> -c <container-name>
Which is in our case:
sudo python3 kprobe.py -c triton-server
```

On a different terminal, execute the triton-client docker container and send some http requests

Step 6: Example Output

```
(bpfenv) ebpftutorial@iiswc-tutorial-main-instance-ubuntu24:~/eBPF-tutorial/4-kprobes$ sudo python3 kprobe.py -c triton-server Tracing Triton (PID 1447) inside container triton-server Printing kprobe messages (Ctrl+C to stop)...
b' tritonserver-1593 [000] ....1 202459.521438: bpf_trace_printk: sendto pid=1447 fd=10 comm=tritonserver' b''
b' tritonserver-1585 [001] ....1 202459.521519: bpf_trace_printk: recvfrom pid=1447 fd=9 comm=tritonserver' b''
b' tritonserver-1570 [000] ....1 202459.643989: bpf_trace_printk: sendto pid=1447 fd=10 comm=tritonserver' b''
b' tritonserver-1585 [000] ....1 202459.644114: bpf_trace_printk: recvfrom pid=1447 fd=9 comm=tritonserver' b''
b' tritonserver-1593 [000] ....1 202460.520534: bpf_trace_printk: sendto pid=1447 fd=10 comm=tritonserver' b''
b' tritonserver-1585 [000] ....1 202460.520599: bpf_trace_printk: recvfrom pid=1447 fd=9 comm=tritonserver'
```



Tracing User Space Functions with eBPF uprobes



What we are trying to do

To write a uprobe:

- Find the tritonserver binary
- Pick some functions of interest from the source code of c grpc <u>here</u> to uprobe
- Find the symbols for the functions of interest
- Container specific filtering

Please navigate to **{tutorial directory}/5-uprobe/** to experiment with uprobe



Writing a uprobe

Step 1: To attach uprobes, you need the absolute path of the triton server binary

This is the binary file path

Note:

There might be more than one binary file path . The *merged/* path may disappear or be remounted. If the container restarts or stops:

- The merged/ mount is unmounted automatically.
- The diff/ directory remains on disk.



Writing a uprobe

Step 2: Select the function that we want to probe

For example, we want to trace the following function from the gRPC source code

grpc_chttp2_maybe_complete_recv_trailing_metadata



Look at the function signature



Writing a uprobe

Step 3: Look for the function symbol in our target binary

sudo objdump -t <tritonserver-binary-path> | grep <function-name>

Writing the uprobe

Step 4: Define the eBPF program to attach to the function

```
This function gets triggered whenever the targeted function gets called int trace_metadata_func(struct pt_regs *ctx) {
    u32 pid = bpf_get_current_pid_tgid() >> 32;
    if (pid != PID) return 0;

    bpf_trace_printk("gRPC Metadata Function Called - PID: %d\n", pid);
    return 0;
}

Step 5: Attach uprobe

def attach_uprobe(bpf, triton_binary):
    func_symbol="_Z49grpc_chttp2_maybe_complete_recv_trailing_metadataP21grpc_chttp2_transportP18grpc_chttp2_stream"
```



bpf.attach_uprobe(name=triton_binary, sym=func_symbol, fn_name="trace_metadata_func")

For uprobe attachment, the appropriate binary path and function symbol is crucial



Writing the uprobe

Step 6: Run the uprobe code

sudo python3 <filename> -c <container-name>

For our case:

sudo python3 uprobe.py -c triton-server

On a different terminal, execute the triton-client docker container and send some gRPC requests

Step 7: Example Output

```
(bpfenv) ebpftutorial@iiswc-tutorial-main-instance-ubuntu24:~/eBPF-tutorial/5-uprobes$ sudo python3 uprobe.py -c triton-server Initializing tracing for container 'triton-server' (PID 1447)
Tracing gRPC function calls... Press Ctrl+C to stop.
b' tritonserver-1584 [001] ....1 243829.110709: bpf_trace_printk: gRPC Metadata Function Called - 1447: 1447'
b''
b' tritonserver-1582 [000] ....1 243829.123963: bpf_trace_printk: gRPC Metadata Function Called - 1447: 1447'
b''
b' tritonserver-1570 [001] ....1 243829.393247: bpf_trace_printk: gRPC Metadata Function Called - 1447: 1447'
b''
b' tritonserver-1582 [000] ....1 243830.087826: bpf_trace_printk: gRPC Metadata Function Called - 1447: 1447'
b''
b' tritonserver-1582 [001] ....1 243830.090625: bpf_trace_printk: gRPC Metadata Function Called - 1447: 1447'
```



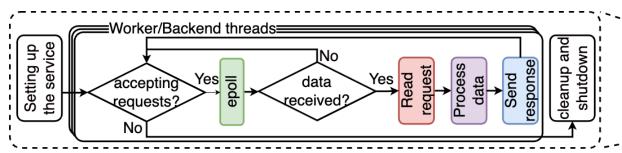
Characterizing In-Kernel Observability of Latency-Sensitive Request-level Metrics with eBPF

Mohammadreza Rezvani, Ali Jahanshahi, Daniel Wong

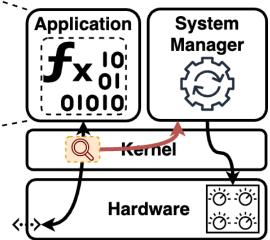




Goal: Characterizing In-Kernel Observability With eBPF

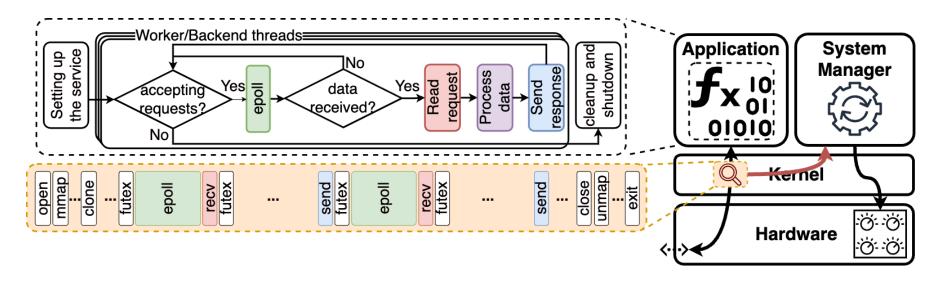


- Repetitive pattern
- Loop of receiving a request, processing, sending the result and waiting.
- Except processing, handling a process requires interaction with kernel that we can observe.





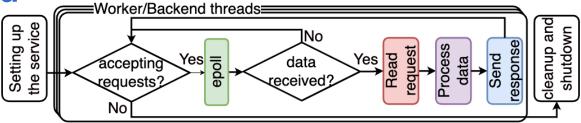
Interaction With Kernel Is Done Through System Calls





Q1: Which System Calls Provide Observability into

workload



Network

- Receiving request
 - read, recv, recvfrom, recvmsg, ...
- Sending response
 - write, send, sendto, sendmsg, ...

Processing/Waiting

- Processing
 - Doesn't require interaction with kernel
- Waiting
 - epoll, epoll_wait, select



Q2: What application-level metrics are observable through system call activities?

- Observing Throughput by estimating Request Per Second (RPS)
- Observing Latency by Observing Saturation and estimating Saturation Slack



Evaluation Methodology

Benchmarks

- TailBench [1]
 - Img_dnn, xapian, silo, specjbb, moses
- CloudSuite [2]
 - Data Caching and Web search
- Triton [3]
 - HTTP Protocol and GRPC protocol

System Specification

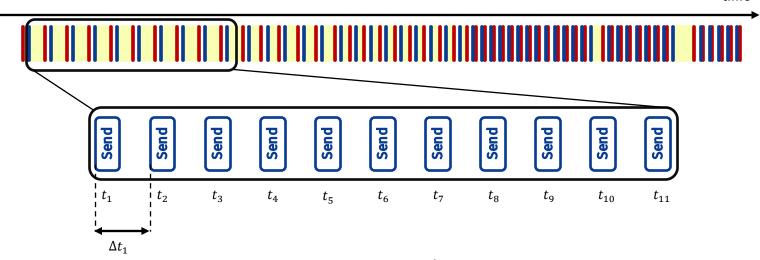
- AMD based server
 - AMD EPYC 7302
 - Ubuntu 20.04.1
- Intel based server
 - Intel Xeon CPU E5-2620
 - Red Hat 4.8.5-36



How to observe RPS?

Intuition: Every response through socket will use a send system call

Approach: Measure inter-send time to estimate throughput

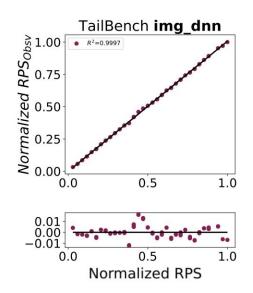


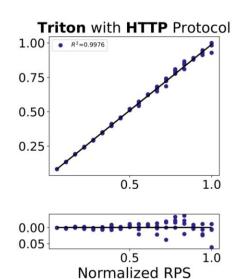
$$RPS_{Obsv} = \frac{r}{t_r^{send} - t_1^{send}} = \frac{1}{\Delta t^{send}}$$

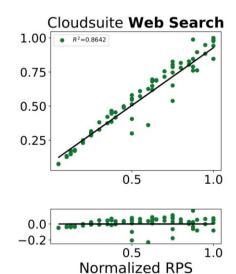


time

Observed RPS Correlates Well With Actual RPS





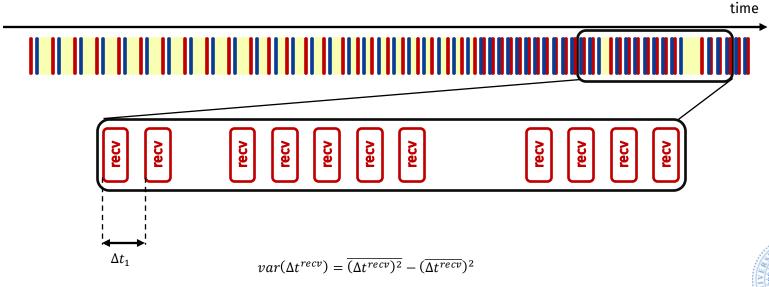




How Do We Observe System Saturation?

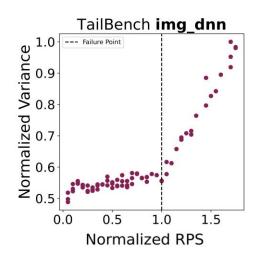
Intuition: Under saturation, system experience longer than usual delays that are noticeable in system call timings

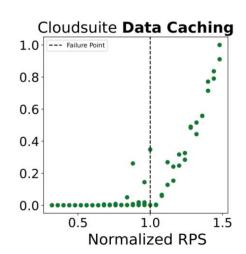
Approach: Measure variance of inter-receive time.

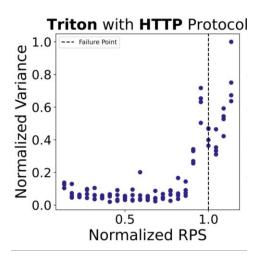




Variance Increase During Saturation





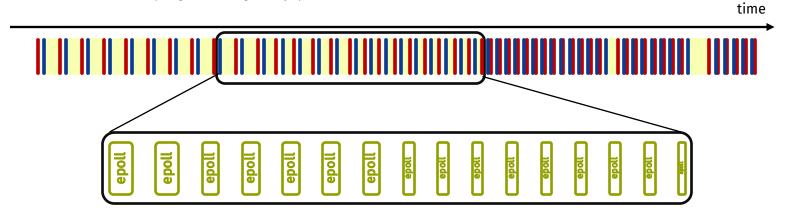




How Do We Observe saturation slack?

Intuition: Wait time captured by duration of epoll, decrease as load increases

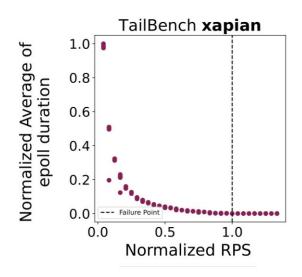
Approach: Duration of epoll as proxy for slack

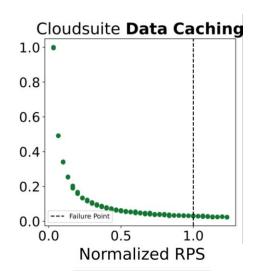


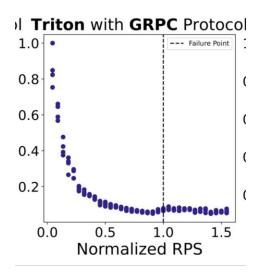
avg(duration(epoll))



Saturation Slack Observability





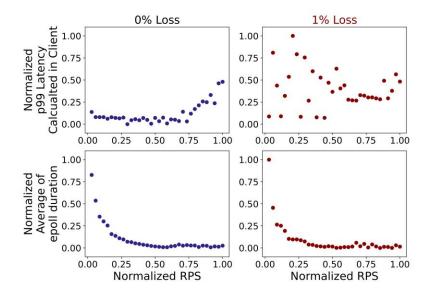




How Robust is eBPF-based observability?

Network

Fluctuations of network does not affect the metrics



Network config for $RPS_{Obsv}(R^2)$	0ms Delay 0% Loss	10ms Delay 1% Loss
TailBench img-dnn	0.9997	0.9998
TailBench xapian	0.9976	0.9964
TailBench silo	0.9998	0.9986
TailBench specjbb	0.9997	0.9996
TailBench moses	0.9411	0.9435
CloudSuite Data Caching	0.9995	0.9989
CloudSuite Web Search	0.8642	0.8573
Trtion w/ HTTP Protocol	0.9976	0.9981
Trtion w/ GRPC Protocol	0.9711	0.9703



Use cases

Resource management

eBPF kernel tracing offers a non-invasive way to understand and optimize resource demands and latency drivers

O2 low overhead monitoringAll our metrics can be calculated in eBPF space therefore it has super low overhead

O3 Predictive Provisioning
Studying the information left in kernel will open doors for predicting application behavior.

Summary

- non-invasive tools for observability have become increasingly important for data center management and optimization
- Characterizing system call activity can open up opportunities to increase observability.
- eBPF can provide robust observability to various set of metrics.
- System call activities are correlated to throughput and latency based metrics
- Use Cases
 - Resource management
 - low overhead monitoring
 - Predictive Provisioning



Thank you!

Questions?

