Imperial College London

MEng Individual Project

Accelerating data centre communication patterns using eBPF

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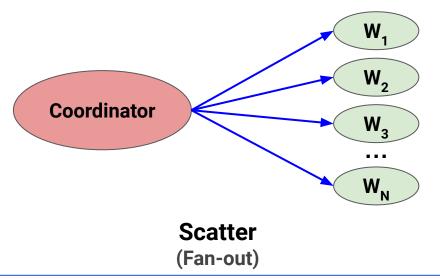
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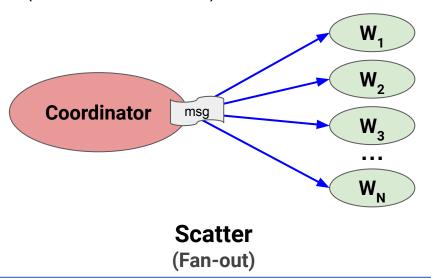
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- This leads to a huge volume of network messages, incurring a significant amount of:
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 - In-kernel network stack traversals
- The default Linux kernel network stack is designed for a small number of long-lived connections, rather than a large number of small messages.
 - High per-packet overhead

- This problem is further exaggerated when high-speed NICs are used
 - This moves the communication bottleneck to the kernel
- This is especially true for applications following scatter-gather workloads which generate a large number of messages.
- Scatter-gather communication is a very common pattern in data centre applications
 (also known as fan-out/fan-in pattern in "The tail at scale" article [1])

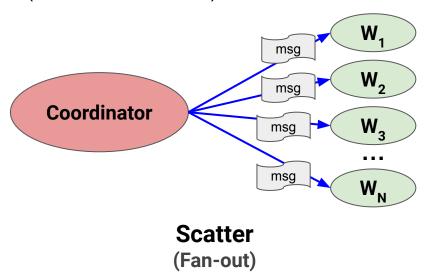
- The scatter-gather pattern refers to a single coordinator node scattering a message to multiple worker nodes and then gathering their responses into a single result.
- Typically, the coordinator performs some aggregation logic on the responses to produce a final reduced result (aka *scatter-reduce*).



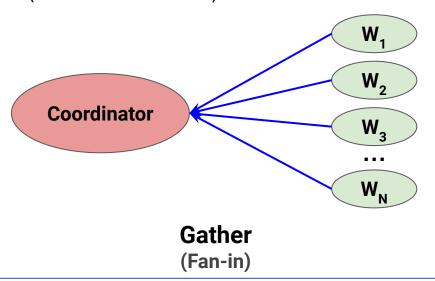
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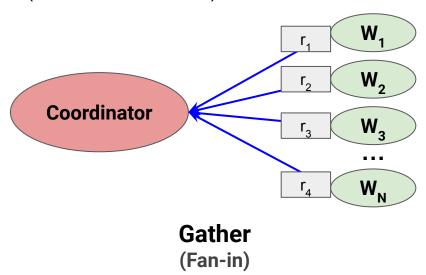
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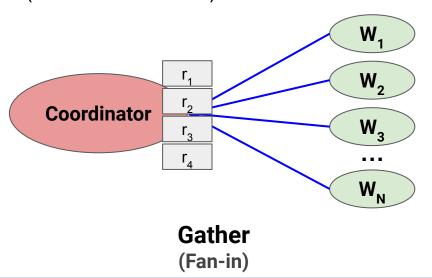
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 - Distributed graph processing
 - Distributed (network) file systems

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- Problem: scatter-gather communication incurs a large volume of messages.
 - Excessive number of system calls (and context switches)
 - X Excessive number of kernel network stack traversals

Accelerating scatter-gather communication

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 - X User-space networking and hardware-offloaded solutions not suitable.
- Our approach uses eBPF as a performance accelerator.
- Presentation outline:
 - a. Introduction to eBPF
 - b. sgbpf, an eBPF-accelerated scatter-gather primitive
 - c. Demonstration of the *sgbpf* API
 - d. Performance evaluation

eBPF is a technology that allows users to write code that runs inside the Linux kernel.

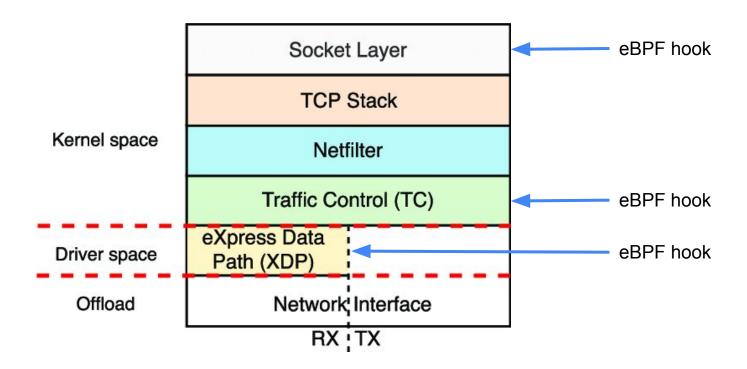
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 - Programs are attached to a specific hook point inside the kernel
 - Written in a high level language like C and compiled to eBPF bytecode
- State can be managed using eBPF maps
 - Program

 program communication

Network hooks in eBPF



Using eBPF to accelerate network applications

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Using eBPF to accelerate network applications

- Applications such as Memcached [2] and Multi-Paxos consensus [3] have seen successful performance boosts with eBPF.
- By performing application logic before the kernel networking stack, high packet processing rates can be achieved by minimising user-kernel crossings.
- Memcached example:
 - Fast replying: prepare a response packet in XDP to serve requests quickly by reading from a working copy of a cache in the kernel using eBPF maps.
- Multi-Paxos example:
 - Wait-on-quorums: count ACK messages from followers in the kernel and only wake up the leader application when enough ACKs have been received.

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 - Minimises system calls
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- Supports several other features:
 - "All-gather" mode: broadcast final aggregated result to all workers
 - Configurable timeouts and completions policies
 - Multiple data delivery modes available to access aggregated data

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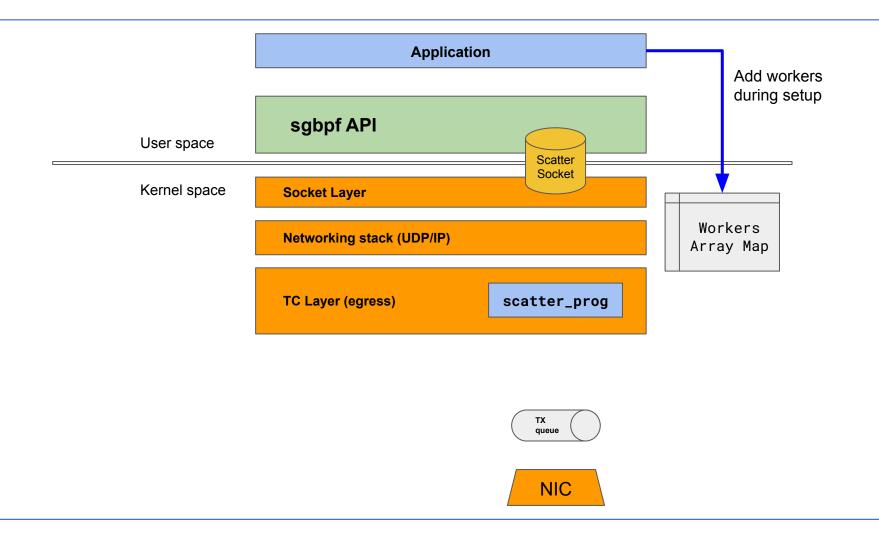
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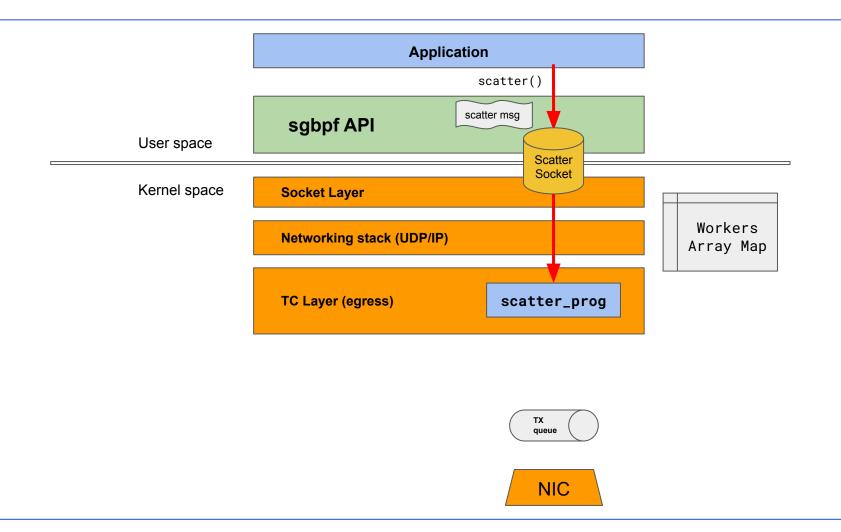
With eBPF, we can perform the broadcast inside the kernel

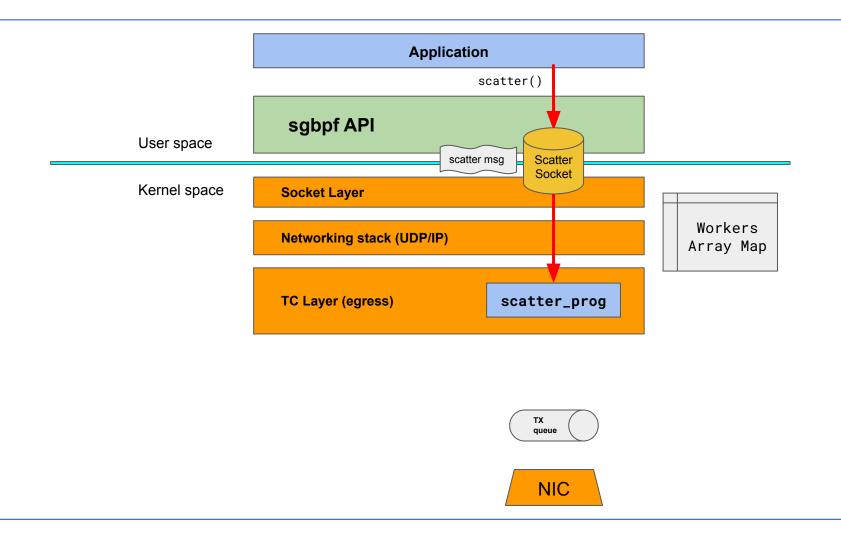
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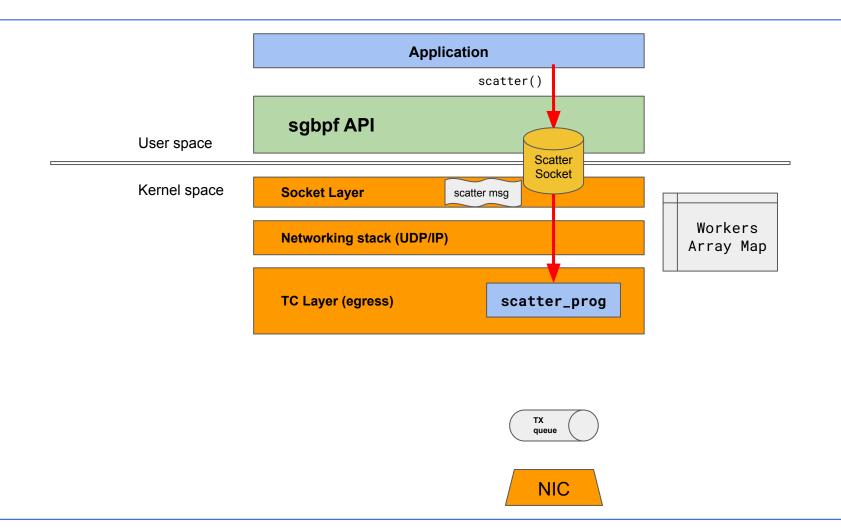
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- Specifically, it occurs **after** the main networking stack
- The cloned packets do not re-traverse the kernel networking stack

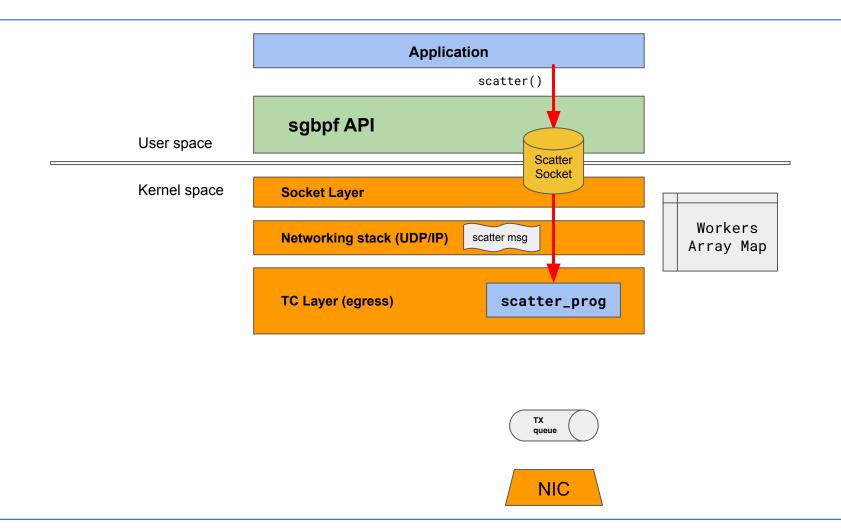
- With eBPF, we can perform the broadcast inside the kernel
- Specifically, it occurs **after** the main networking stack
- The cloned packets do not re-traverse the kernel networking stack
- Only a single message is written into the socket from the application to trigger the broadcast operation in the eBPF program
 - Hence a single network stack traversal is needed

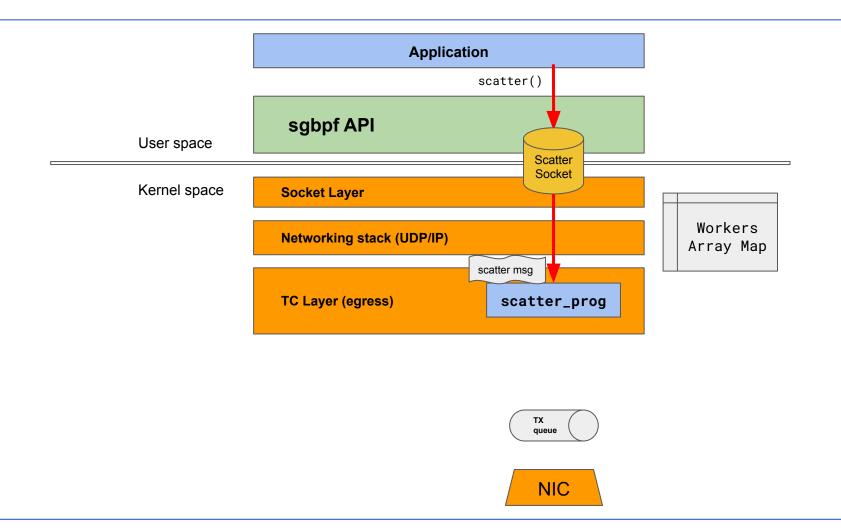


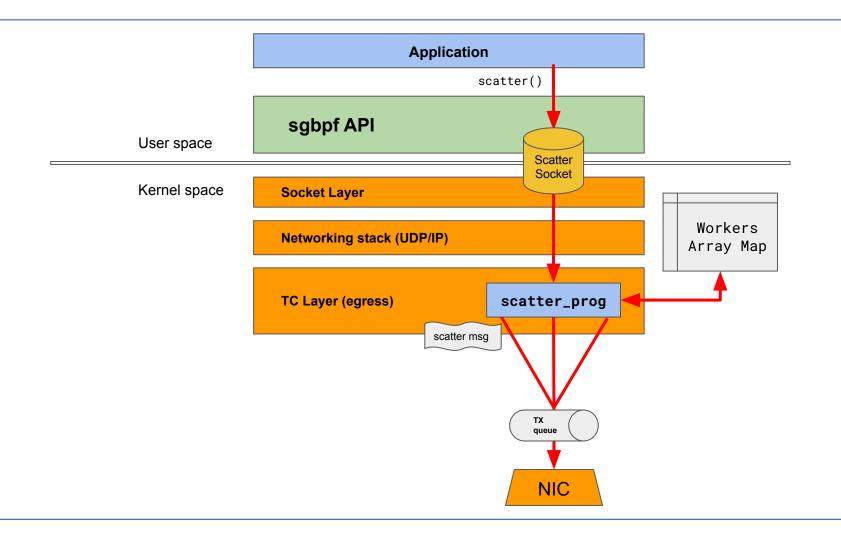


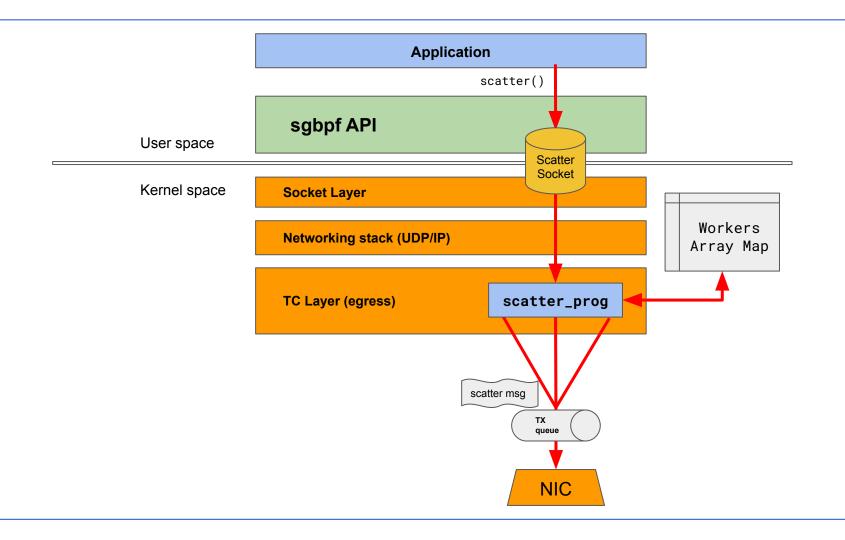


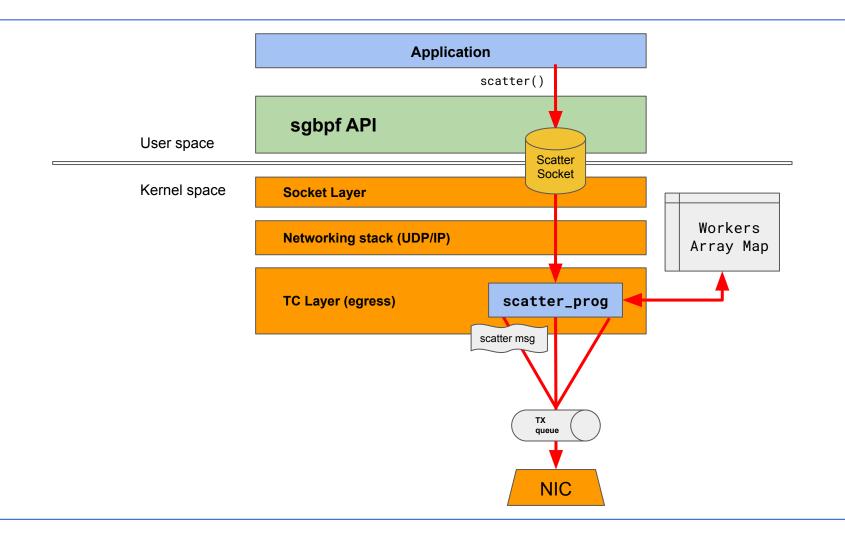


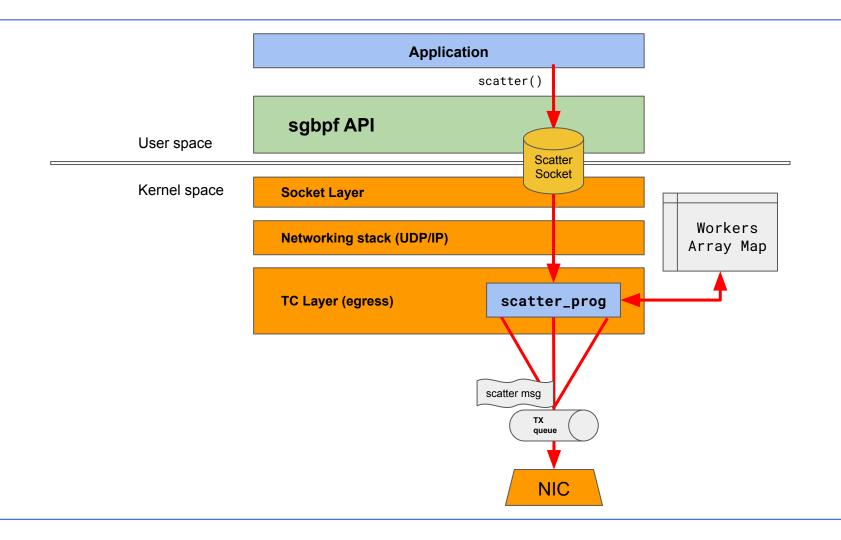


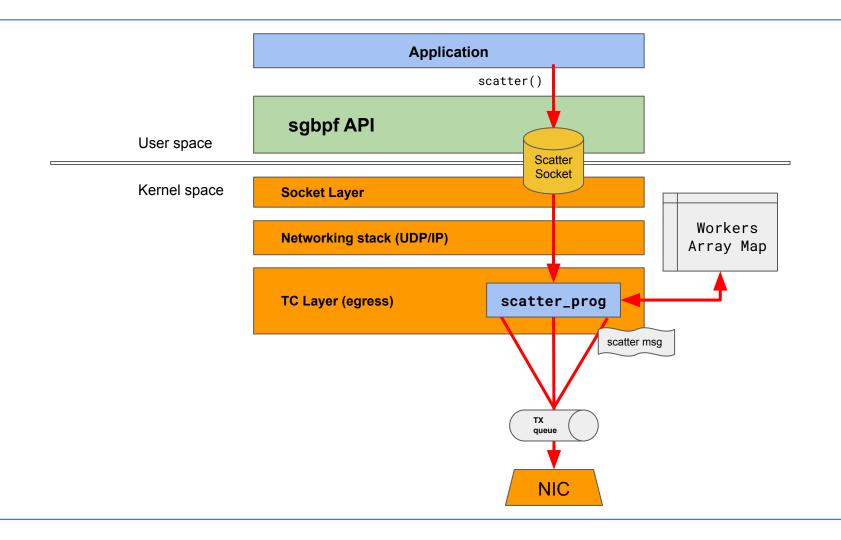


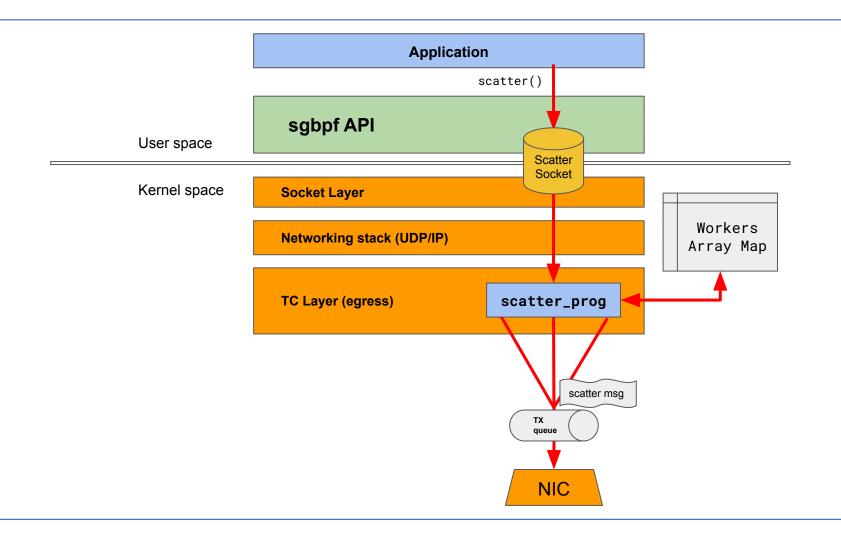












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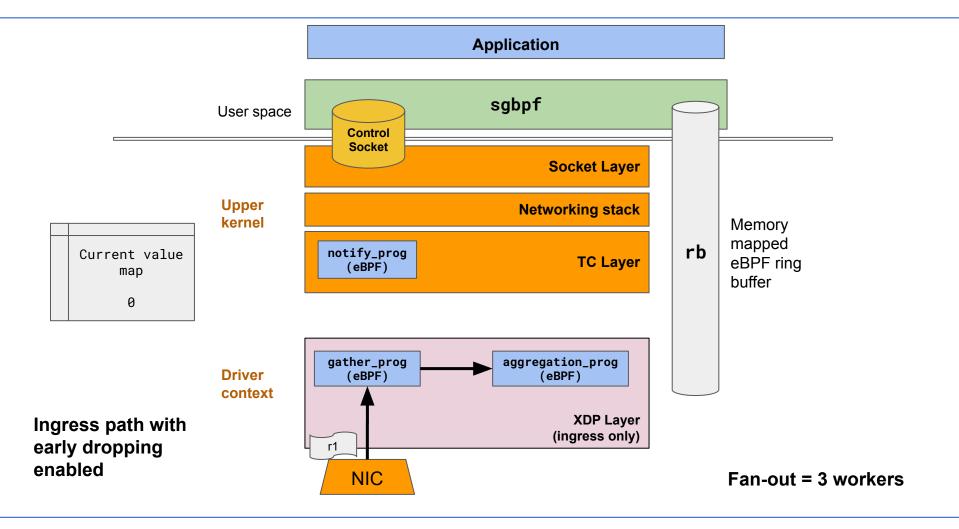
Good start, but the main source of overhead lies in the gather phase.

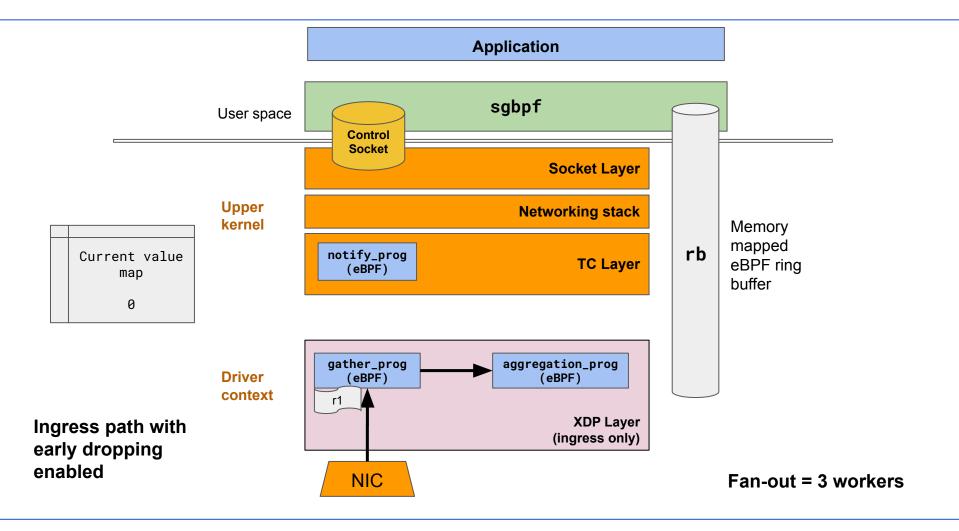
 Can we process incoming responses as early as possible without incurring a kernel-to-user crossing per packet?

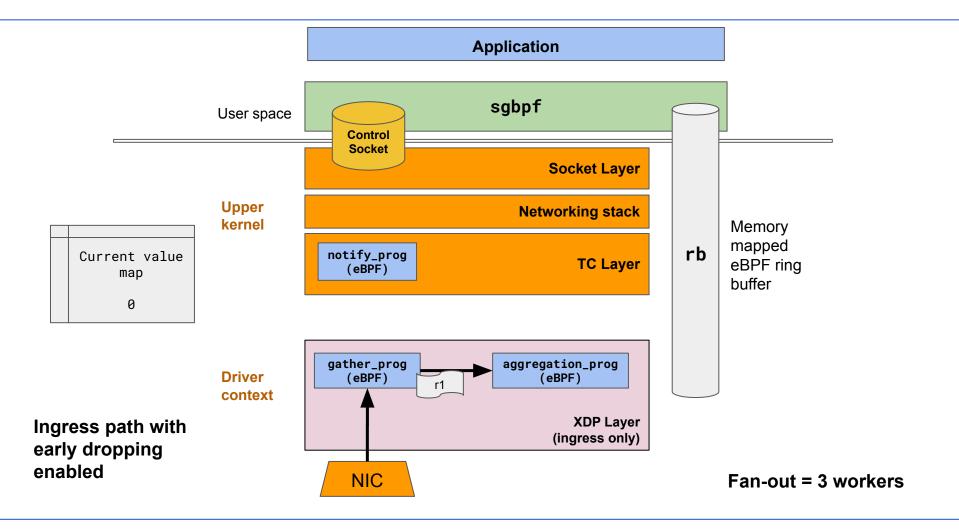
- Can we process incoming responses as early as possible without incurring a kernel-to-user crossing per packet?
- Idea: execute the aggregation logic in the kernel using eBPF
 - Perform pre-stack packet processing to bypass the kernel networking stack
 - The application only gets the final aggregated value
 - Minimises the number of syscalls, number of copies and network stack traversals required

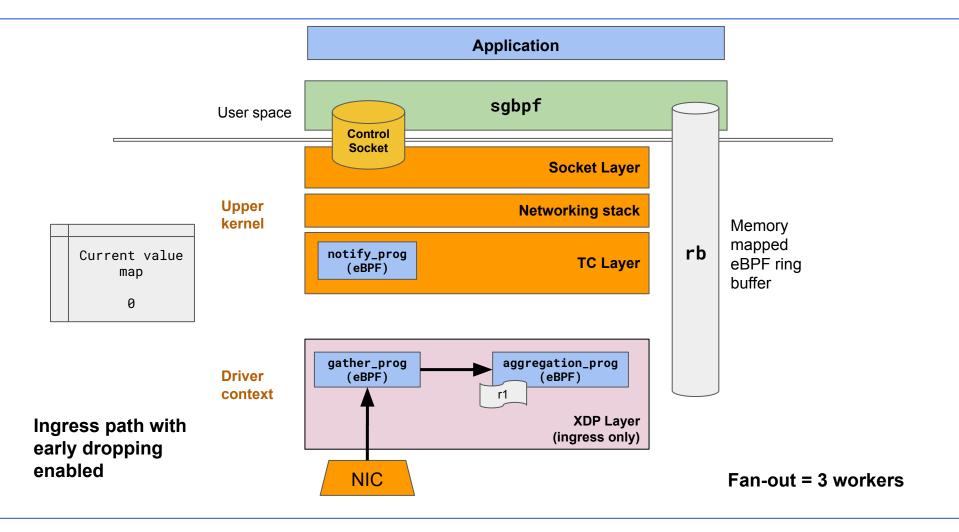
- sgbpf relies on pre-stack processing with XDP to aggregate the responses as early as possible
- The aggregation logic is a user-supplied eBPF XDP program
 - Allows flexibility for developer to define the semantics of the aggregation
 - However, must conform to the rules imposed by the eBPF static verifier
- The packet's fate after the aggregation is also specified by the developer:
 - Drop the packet, if no longer needed (referred to as early dropping recommended)
 - Allow the packet, if needed in the application for further processing

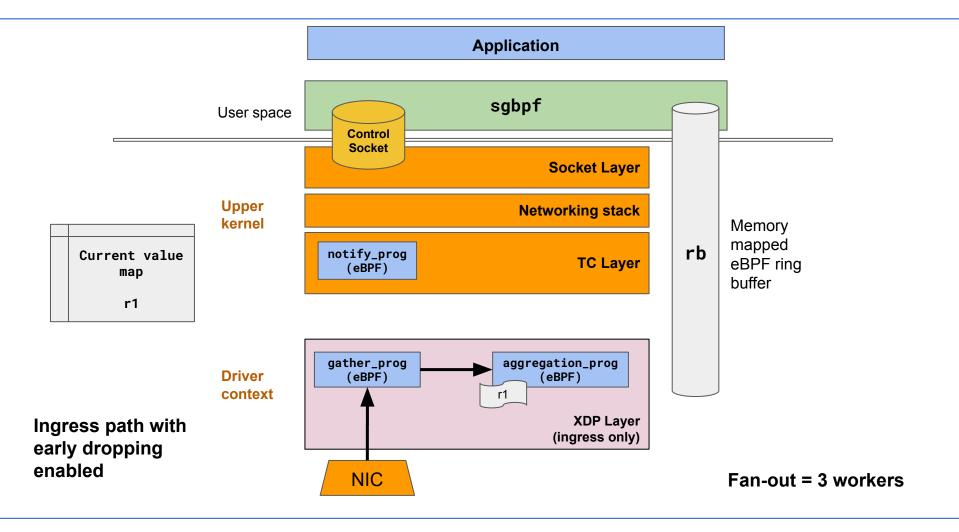
- Once all the worker responses have been aggregated, the final aggregated value is delivered to the user-space application.
- This takes place via one of the following communication channels:
 - Control socket: deliver data using a packet redirected into a specific socket monitored by the application
 - Ring buffer: use a shared mmaped buffer to deliver data to the application

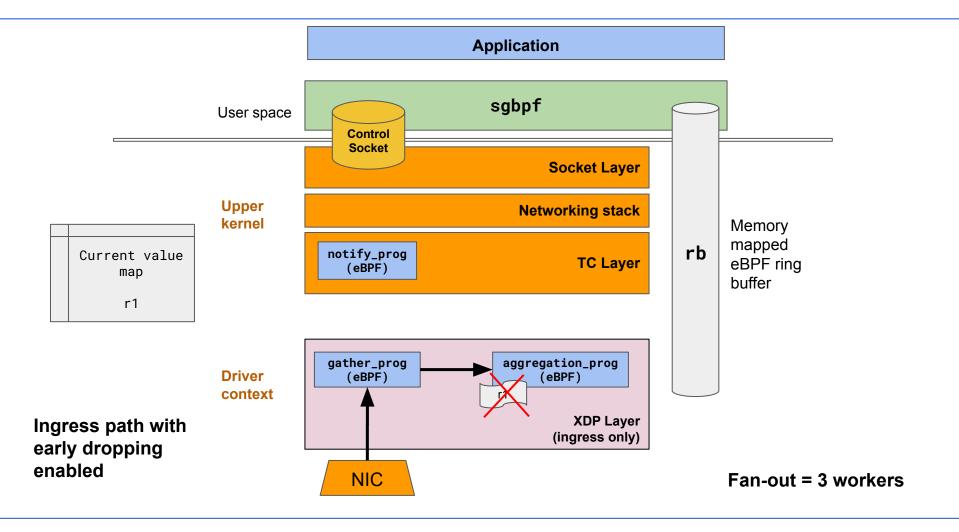


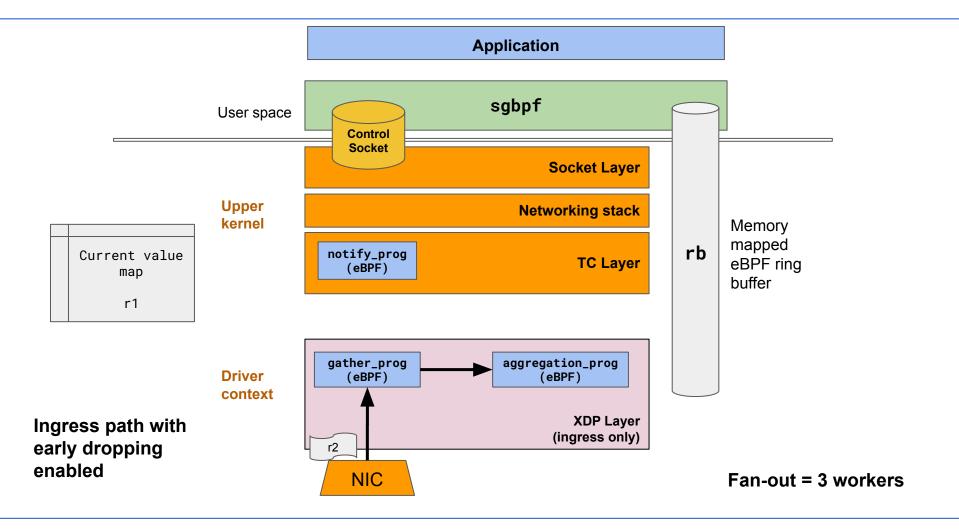


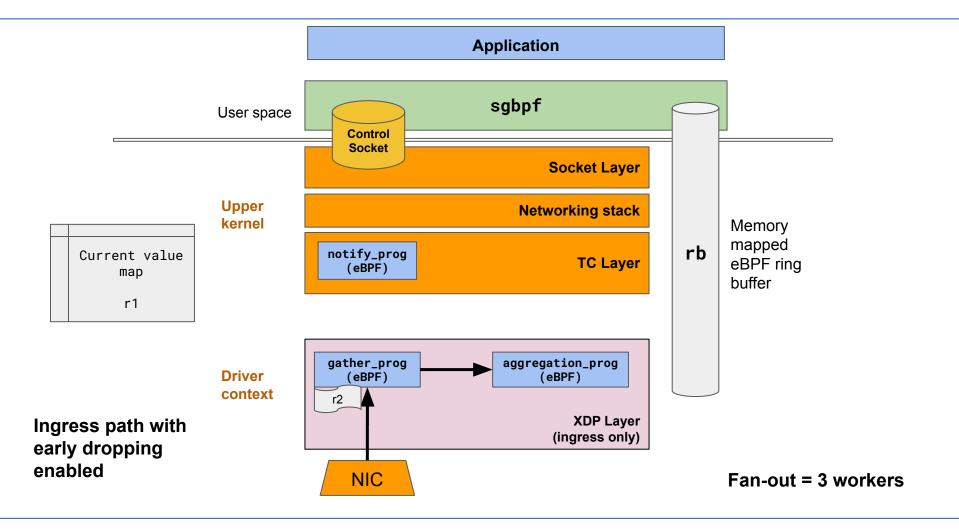


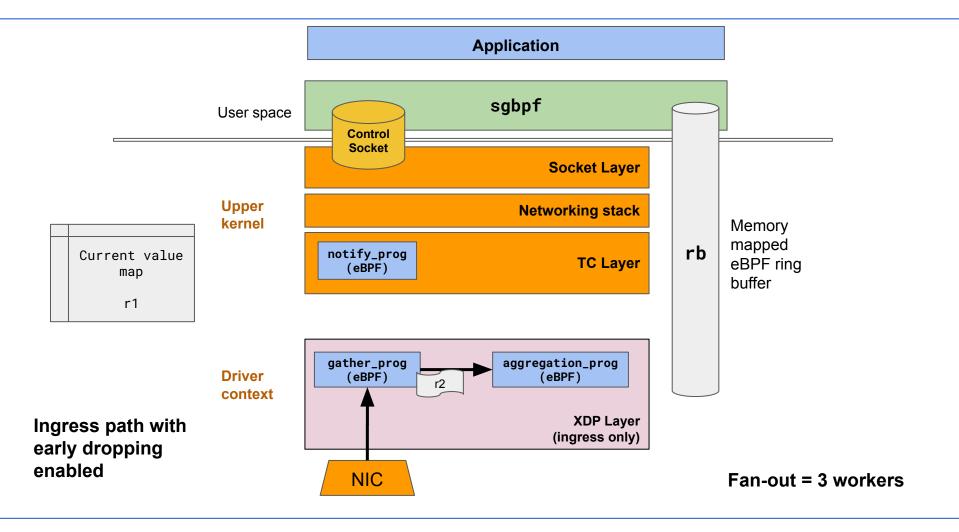


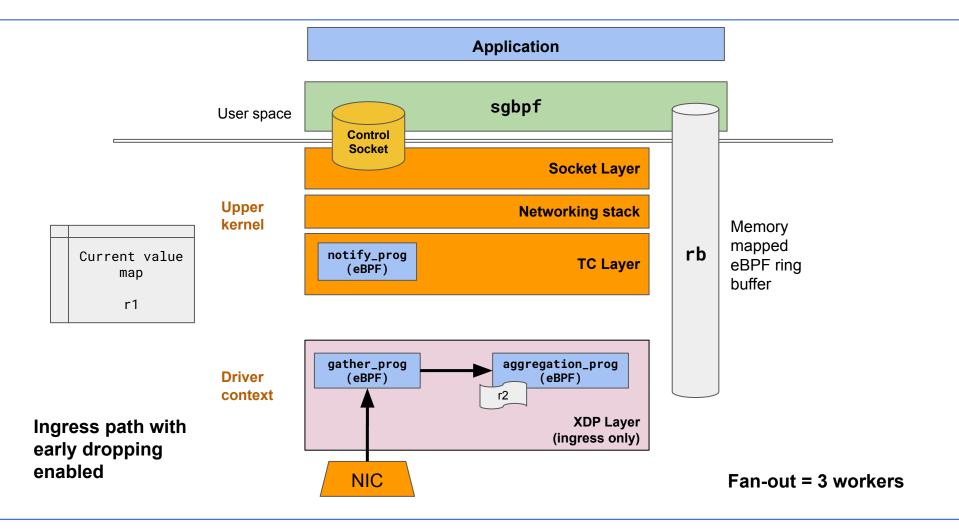


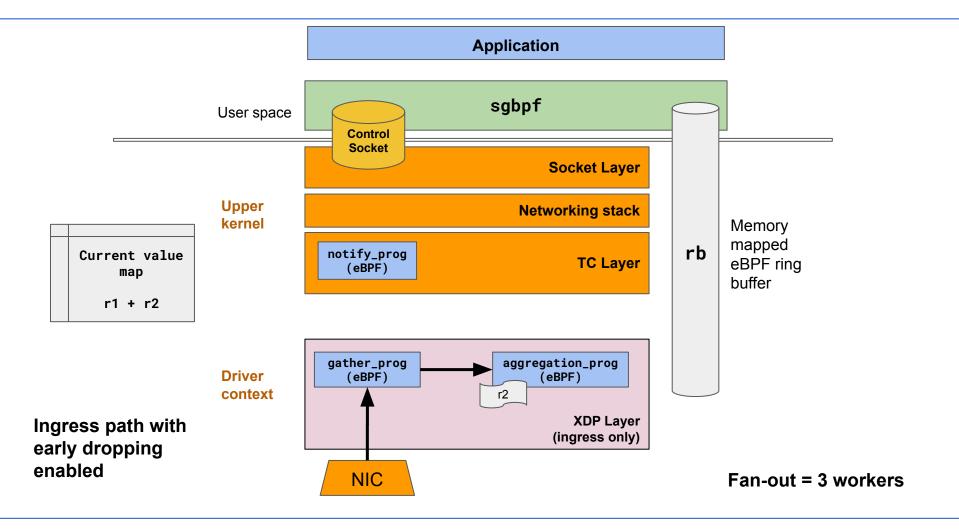


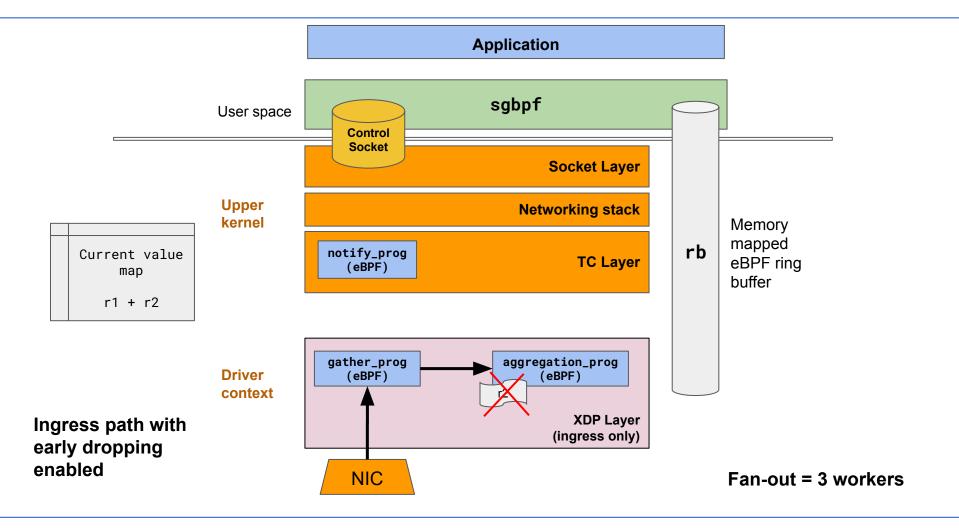


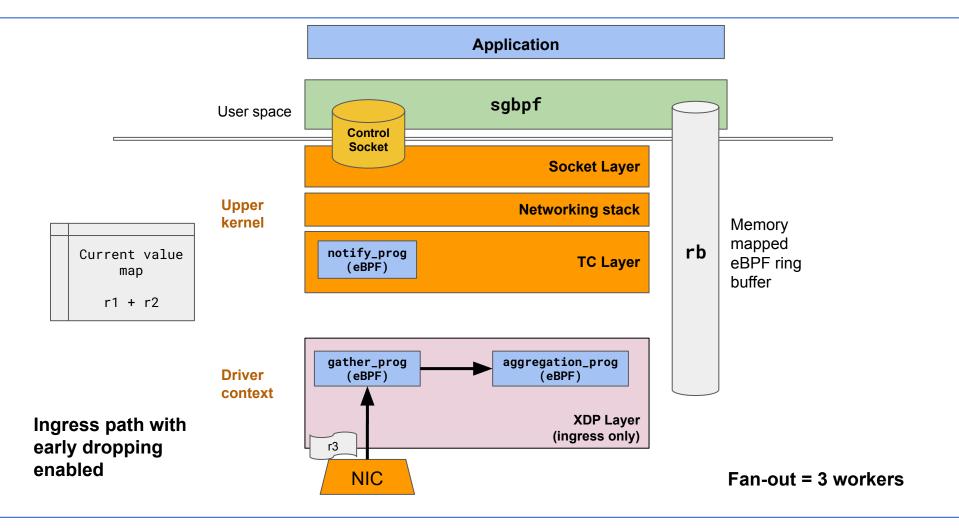


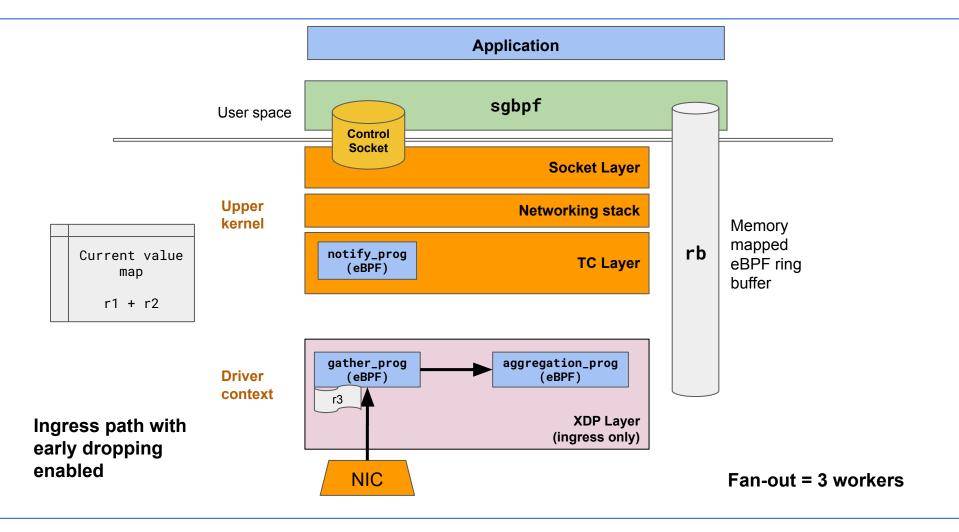


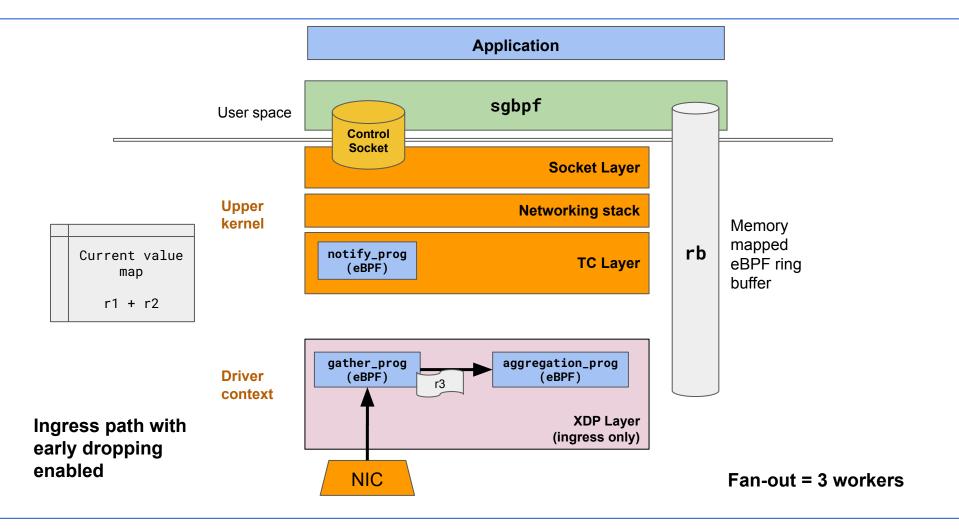


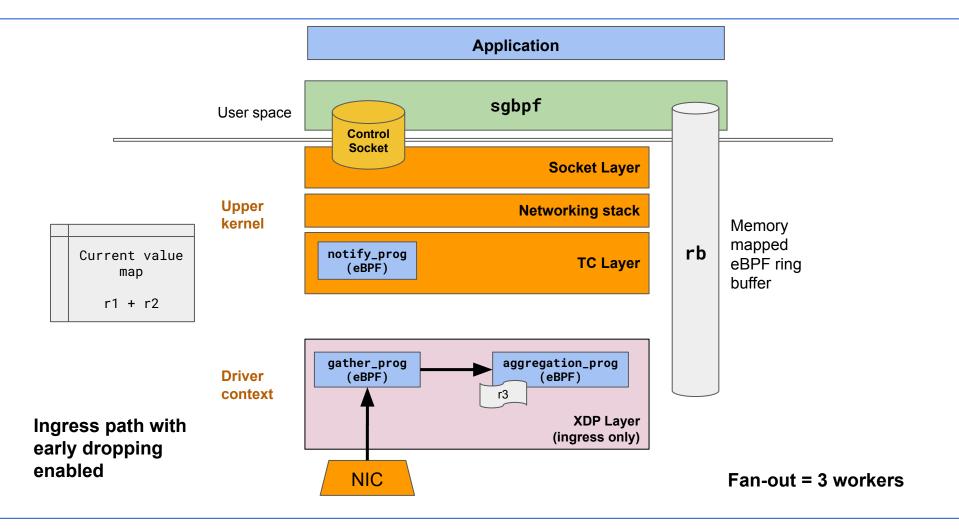


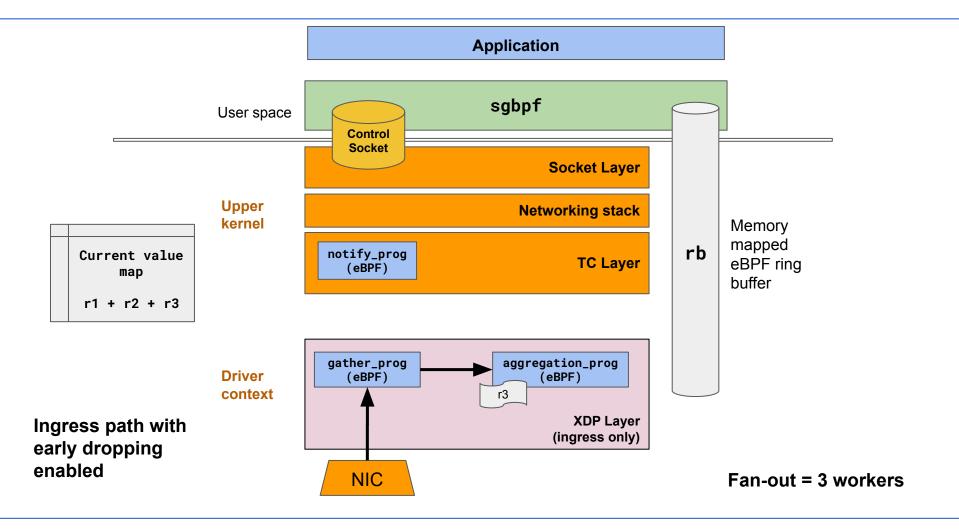


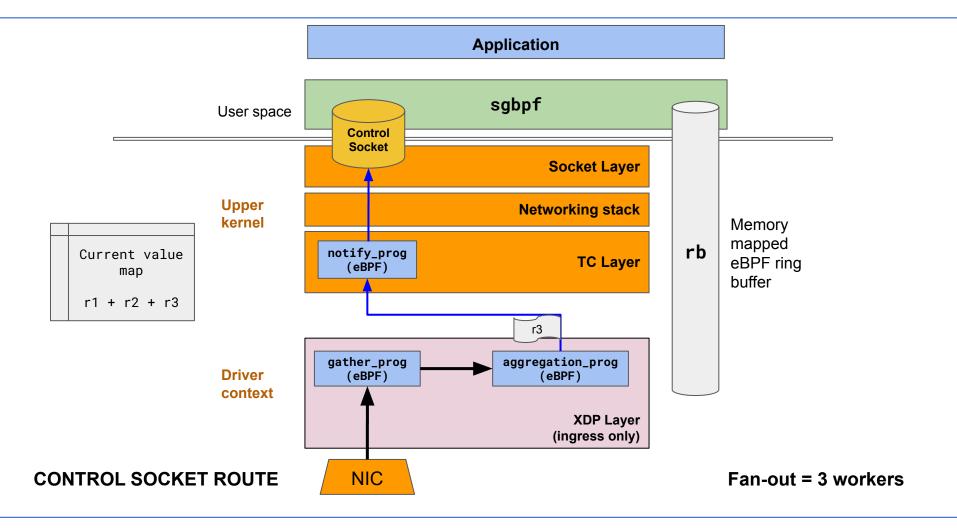


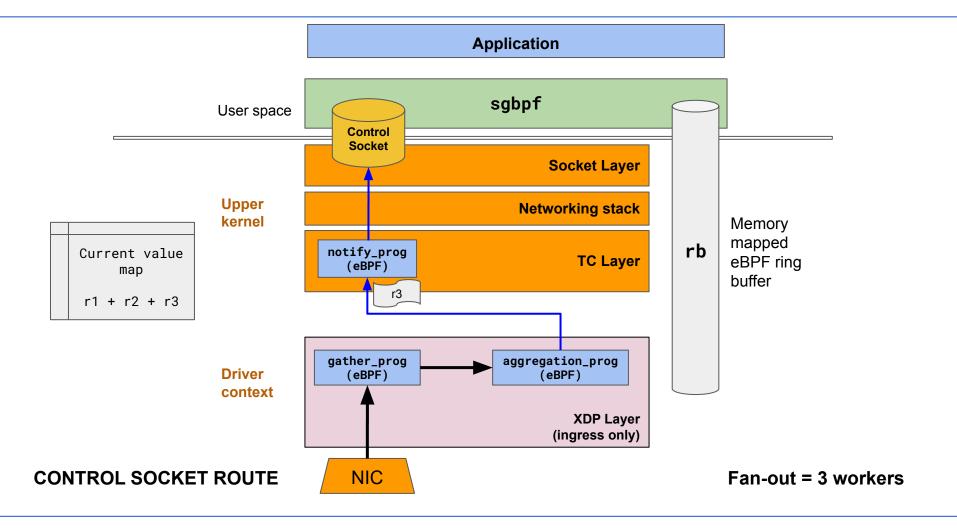


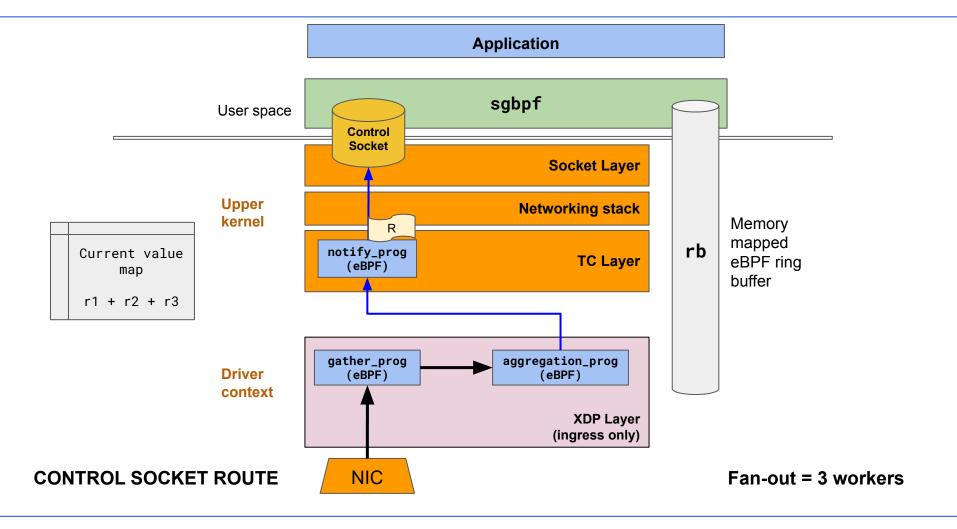


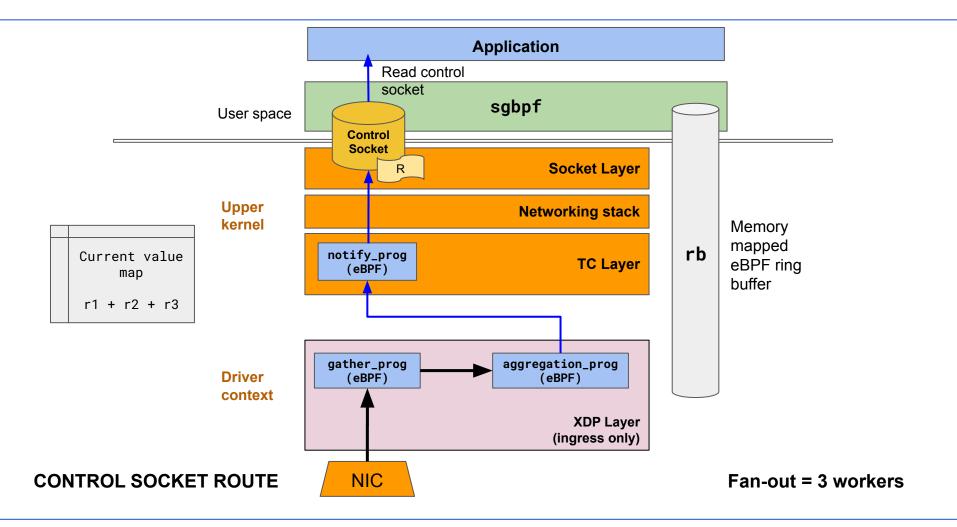


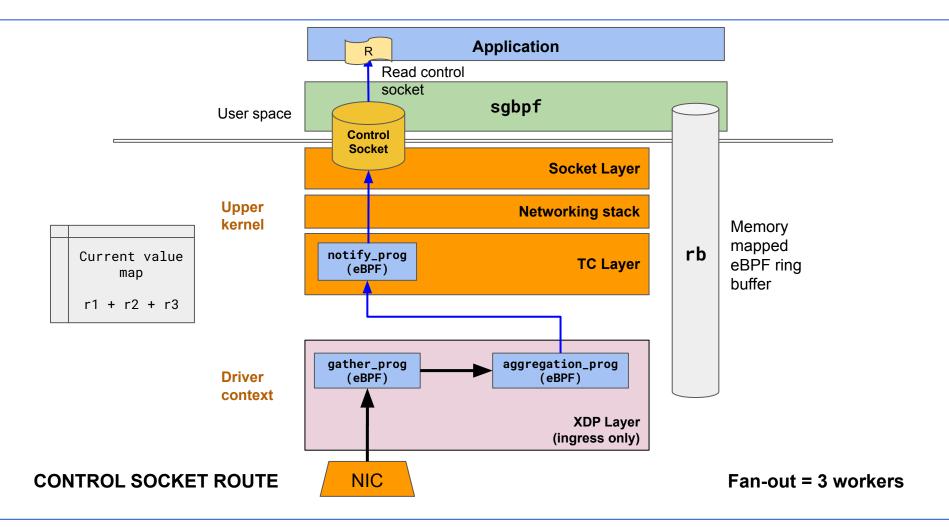


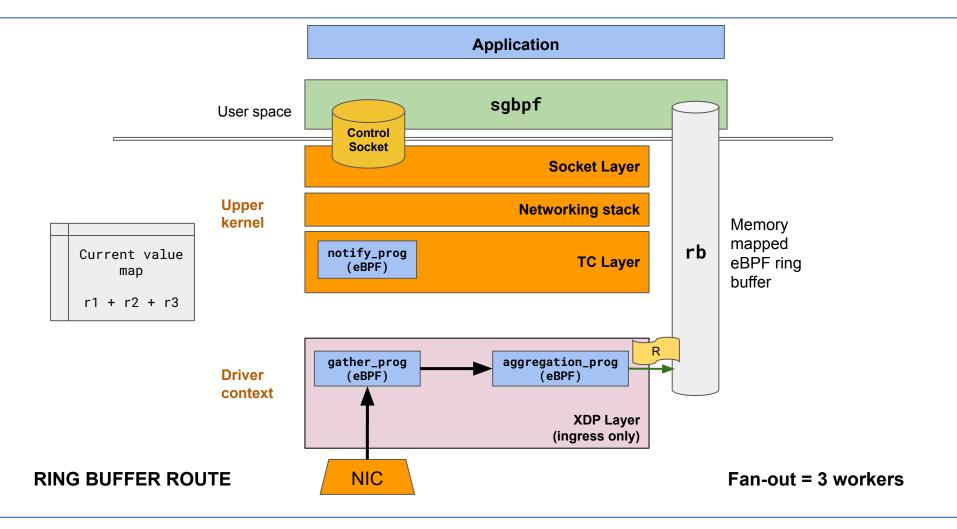


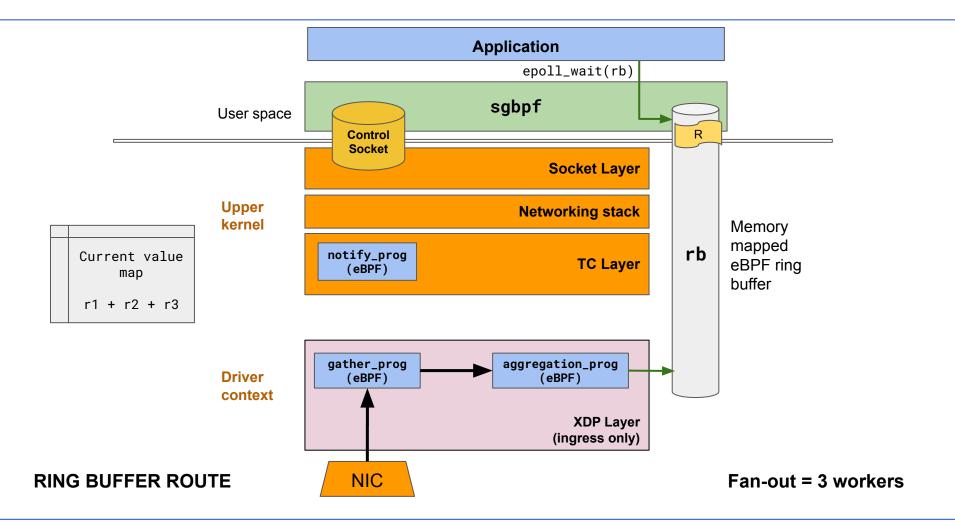


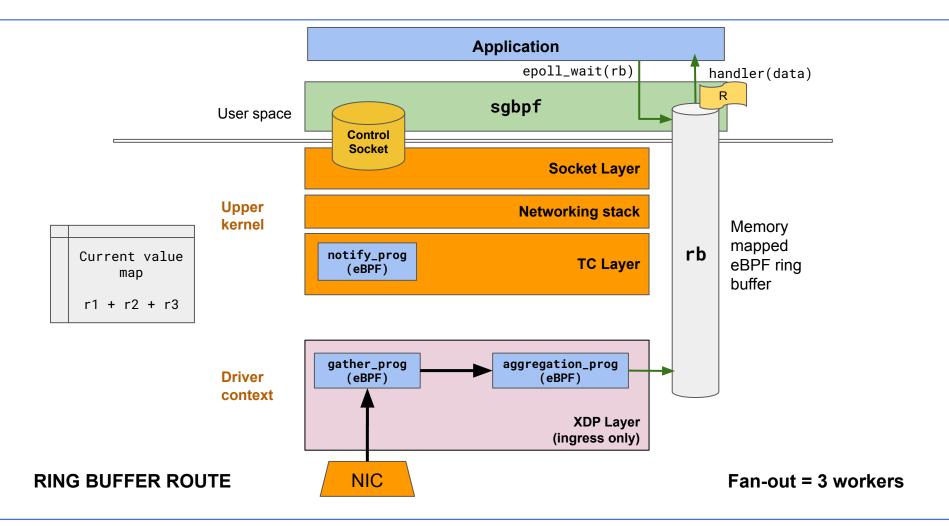


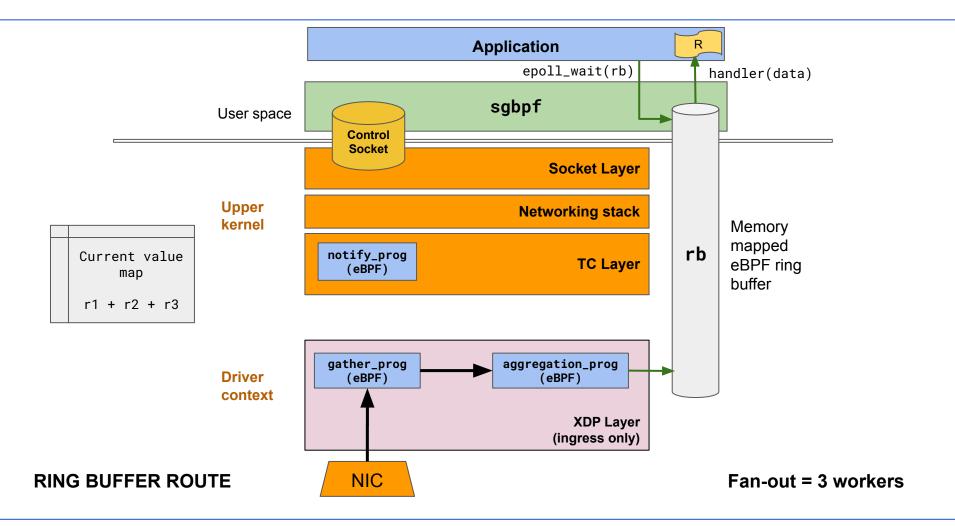












```
#include "bpf h/helpers.bpf.h"
SEC("xdp")
int aggregation_prog(struct xdp_md* xdp_ctx) {
    struct aggregation_prog_ctx ctx;
    AGGREGATION PROG INTRO(ctx, xdp_ctx);
    AGGREGATION_PROG_ACQUIRE_LOCK(ctx);
    for ( u32 i = 0; i < RESP MAX VECTOR SIZE; ++i) {
        ctx.current_value[i] += ((RESP_VECTOR_TYPE*) ctx.pk_msg->body)[i];
    AGGREGATION PROG RELEASE LOCK(ctx);
    AGGREGATION_PROG_OUTRO(ctx, DISCARD_PK);
```

```
#include "bpf h/helpers.bpf.h"
SEC("xdp")
int aggregation_prog(struct xdp_md* xdp_ctx) {
    struct aggregation prog ctx ctx;
                                                      Helper macros to
    AGGREGATION PROG INTRO(ctx, xdp_ctx); 	←
                                                      reduce boilerplate
    AGGREGATION_PROG_ACQUIRE_LOCK(ctx);
    for ( u32 i = 0; i < RESP MAX VECTOR SIZE; <math>++i) {
        ctx.current_value[i] += ((RESP_VECTOR_TYP/E*) ctx.pk_msg->body)[i];
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                                              Aggregation takes
    AGGREGATION PROG RELEASE LOCK(ctx);
                                              place holding a
                                              per-request spinlock
    AGGREGATION_PROG_OUTRO(ctx, DISCARD_PK);
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        ctx.current_value[i] += ((RESP_VECTOR_TYPE*) ctx.pk_msg->body)[i];
    AGGREGATION PROG RELEASE LOCK(ctx);
                                             Early dropping specified
    AGGREGATION_PROG_OUTRO(ctx( DISCARD PK)
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```

Provided by the developer as a C file

Compiled into a BPF object file which is loaded into the kernel at runtime

```
sgbpf::Service service{
                                      Configure sqbpf
   "path/to/bpjobjs",
   "lo",
   sgbpf::Worker::fromFile("workers.cfg"),
   sgbpf::CtrlSockMode::DefaultUnix  // data delivery API
sgbpf::ReqParams params {
   .completionPolicy = sgbpf::GatherCompletionPolicy::WaitN,
   .numWorkersToWait = 5,
   .timeout = std::chrono::microseconds{500}
sgbpf::Request* req = service.scatter(msg, msgLen, params);
```

```
sgbpf::Service service{
   "path/to/bpjobjs",
   "lo",
   sgbpf::Worker::fromFile("workers.cfg"),
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sgbpf::ReqParams params {
   .completionPolicy = sgbpf::GatherCompletionPolicy::WaitN,
   .numWorkersToWait = 5,
   .timeout = std::chrono::microseconds{500}
                                            Invoke a scatter-gather
                                            request
sgbpf::Request* req = service.scatter(msg, msgLen, params);
```

```
// Using sgbpf::CtrlSockMode::DefaultUnix
sg_msg_t buf;
read(service.ctrlSkFd(), &buf, sizeof(sg_msg_t));
handle(buf.body);
```

The application can use the raw Unix file descriptor of the control socket as it wishes (including configuring it as a non-blocking file)

```
// Using sgbpf::CtrlSockMode::Ringbuf
service.setRingbufCallback([&](char* data, int reqID) -> void {
    handle(data);
});
while (1) {
    int completions = service.epollRingbuf(EPOLL TIMEOUT MS);
    if (completions > 0)
        break;
```

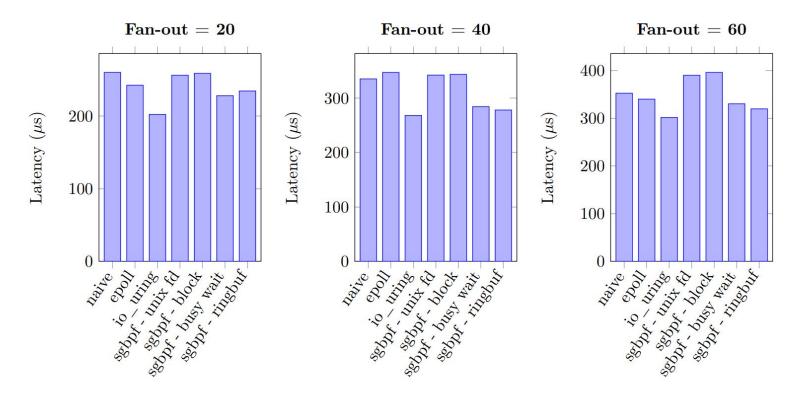
The application can register a callback function which executes whenever aggregated data is written to the ring buffer (monitored by epoll)

```
// Using sgbpf::CtrlSockMode::BusyWait
while (!req->isReady()) {
    service.processEvents(req->id());
}
handle(req->ctrlSockData());
```

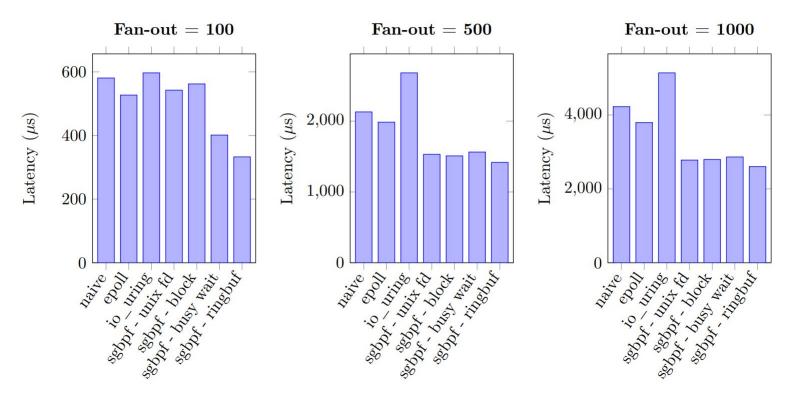
The application can busy-wait on the control socket using the methods provided in *sgbpf* without incurring any extra system calls

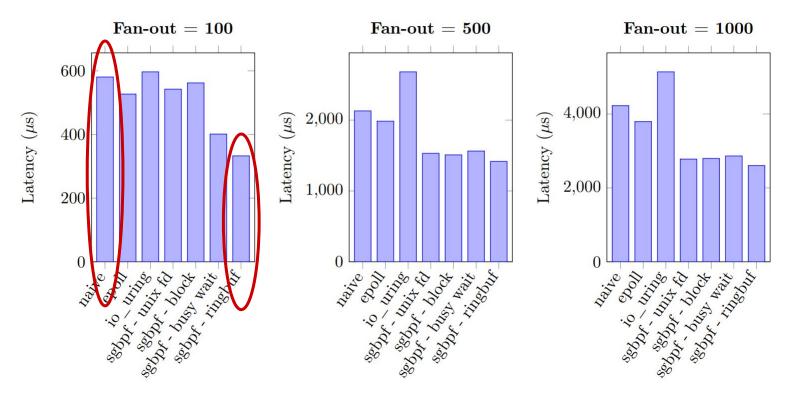
Performance evaluation

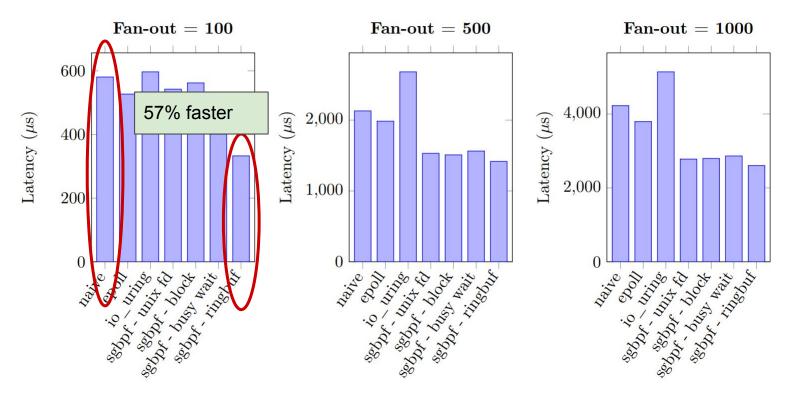
- Metrics of interest:
 - Unloaded latency
 - Throughput under load
- Compare performance with baseline implementations using standard Linux I/O APIs
 - Naive implementation
 - epoll-based implementation
 - io_uring-based implementation (with provided buffers)
- Results shown are obtained from local benchmarks
 - Workers are executed as local processes on a single machine

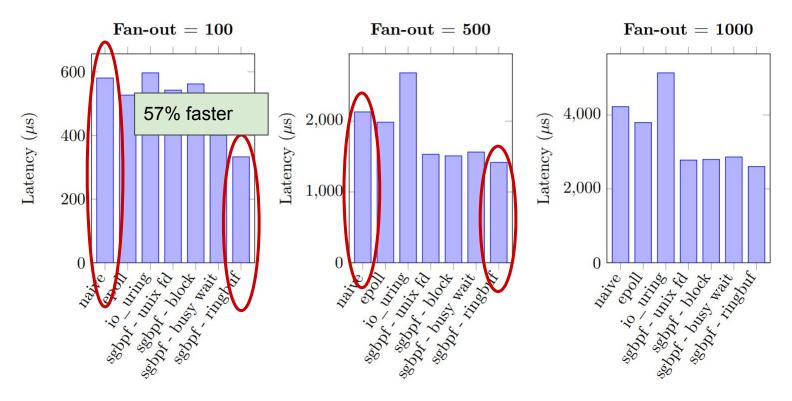


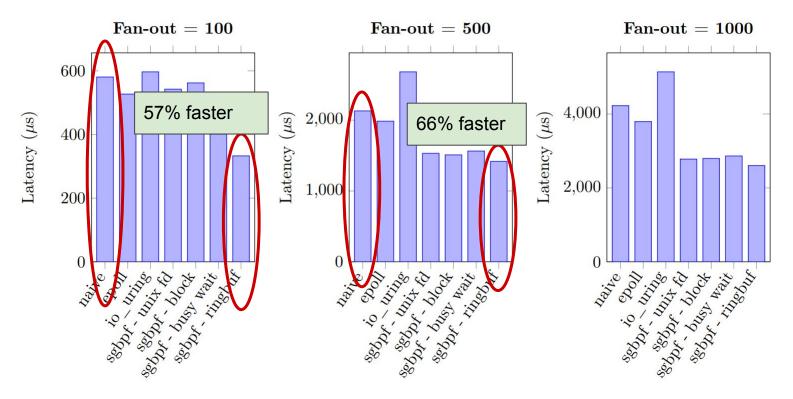
sgbpf achieves comparable latency results for small fan-outs

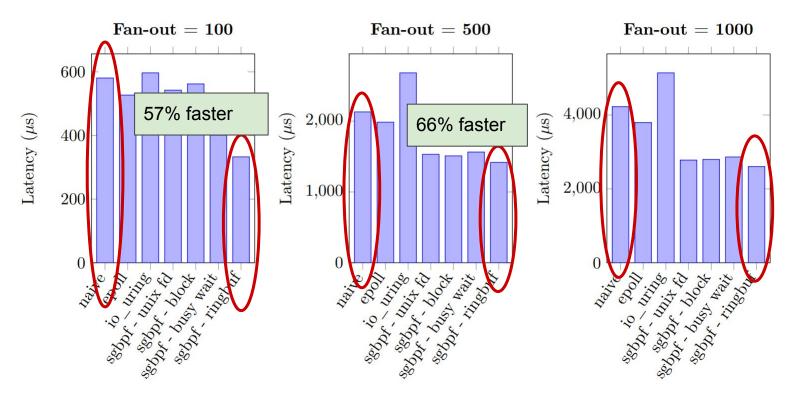


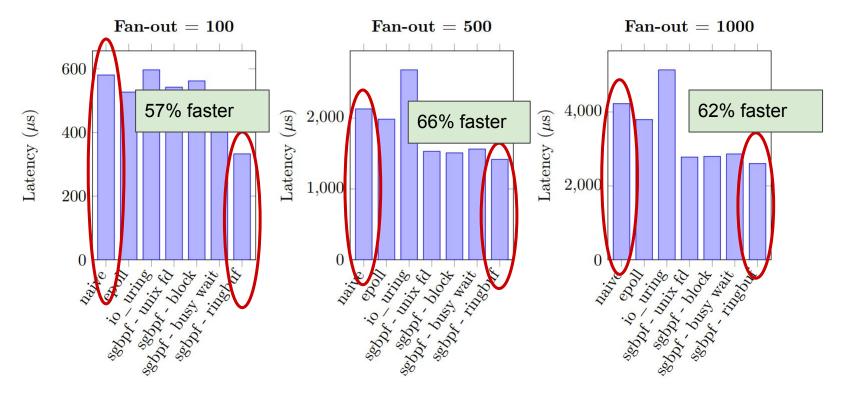


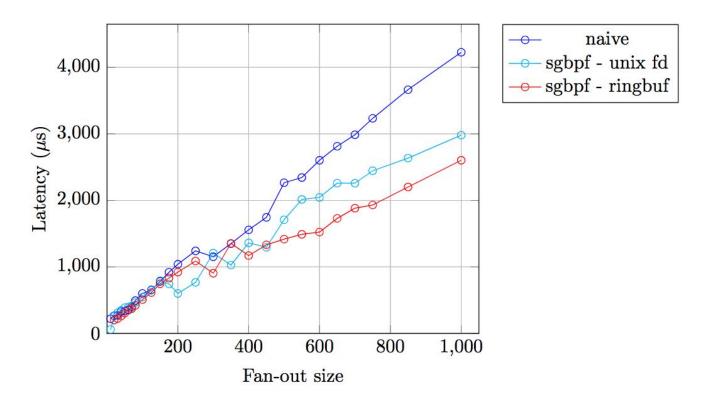




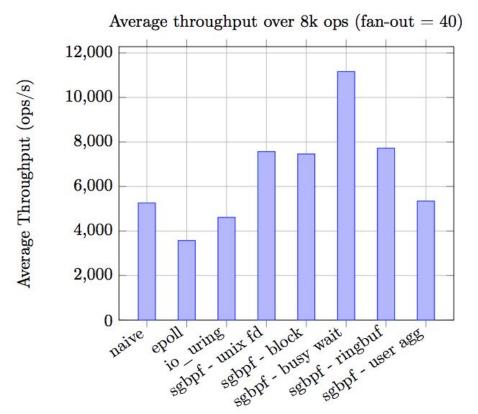


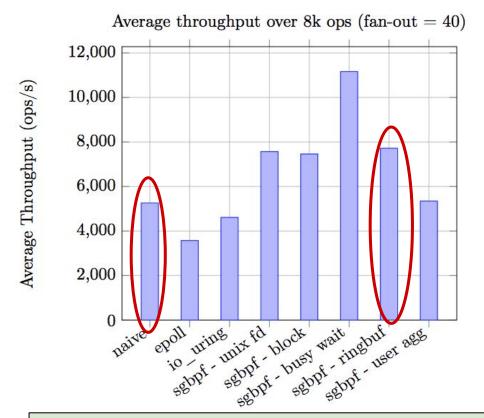




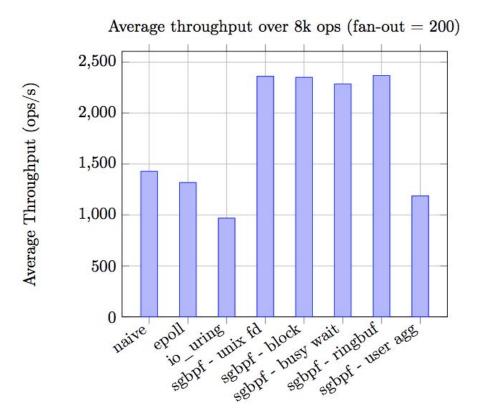


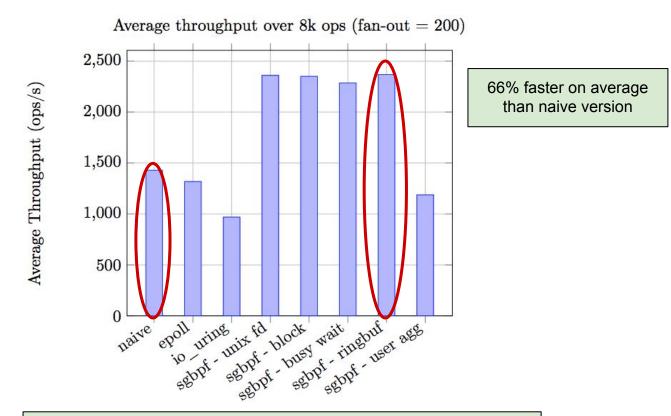
sgbpf scales better than standard I/O APIs due to total kernel overhead



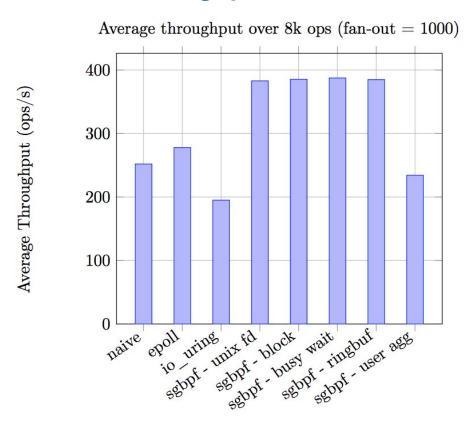


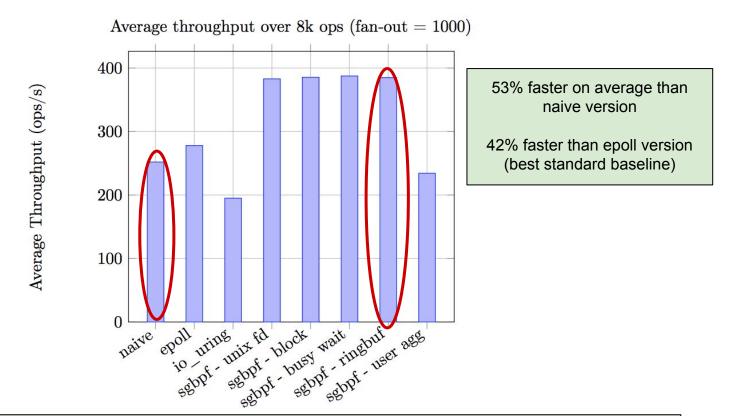
Even at small fan-outs, sgbpf achieves at least 46% better throughput





As the fan-out increases, throughput difference starts to increase





At extremely large fan-outs, the relative difference decreases slightly but still comfortably beats the standard APIs

Conclusions

- sgbpf reduces the kernel bottleneck in scatter-gather communications using eBPF
 - Minimises user-kernel crossings and kernel network stack traversals
 - Requires at most 2 syscalls (depends on API used)
 - Mainly achieved by performing aggregation as soon as possible inside the kernel
- While previous work shows eBPF can be used to accelerate specific applications, this project shows that generic high-level communication patterns can also incur performance benefits without resorting to extreme solutions.
- The code is open-sourced on <u>Github</u>

Future work

- Supporting in-kernel aggregation for multi-packet responses
- TCP implementation for responses
- Other optimisations and techniques for higher performance (see report)

Thank you for listening

sgbpf source code is available here on Github

References

- [1] Dean J, Barroso LA. The tail at scale. Communications of the ACM. 2013 Feb 1;56(2):74-80.
- [2] Yoann Ghigoff, Julien Sopena, Kahina Lazri, Antoine Blin, and Gilles Muller. BMC: Accelerating Memcached using Safe In-kernel Caching and Pre-stack Processing. In 18th USENIX Symposium on Networked Systems Design and Implementation (NSDI 21), volume 3, page 4, 2021.
- [3] Yang Zhou, Zezhou Wang, Sowmya Dharanipragada, and Minlan Yu. Electrode: Accelerating Distributed Protocols with eBPF. In 20th USENIX Symposium on Networked Systems Design and Implementation (NSDI 23), pages 1391–1407, 2023.