The eXpress Data Path: Programmable Packet Processing for the Linux Kernel

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ABSTRACT

Programmable packet processing in software has become increasingly popular, as increases in computational power has made it possible to run custom programmable pipelines at high speeds. This is generally implemented by so-called kernel bypass techniques, where a userspace application takes complete control of the networking hardware to avoid expensive context switches between kernel and user space.

However, this approach makes high-speed packet processing an all-or-nothing proposition, where the processing application has to handle all network traffic, reinventing a lot of functionality already present in the kernel. Interoperability with other applications is also difficult, requiring cumbersome re-injection of packets into the kernel.

In this paper, we present an alternative approach to programmable packet processing, where the kernel provides a safe execution environment for custom packet processing applications, executed directly in the context of the kernel device driver. This system, called the eXpress Data Path (XDP), is part of the mainline Linux kernel, and has been gradually expanded over the last several releases. We describe the design of the system and how it integrates with the rest of the kernel. Through a range of real-world examples we illustrate the flexibility of this model and how it can be used to implement a wide range of applications with performance measure in tens of millions of packets per second.

KEYWORDS

XDP, Programmable Networking

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1 INTRODUCTION

High-performance packet processing in software has very tight bounds on the time spent processing each packet (\simeq 17 ns per packet at 40 Gbps). Network stacks in general purpose operating systems typically perform too many operations per packet to be able to keep up with this packet rate, which has led to increased popularity of special-purpose networking toolkits for software packet processing, which either bypass the operating system completely, or modify it to better accommodate high-speed packet processing. Both of these approaches improve performance, but have the drawback that they are more difficult to integrate with the existing networking stack, sometimes even leading to the need to re-implement large parts of the stack. In the worst case, this leads to the need to operate two separate stacks; one to perform high-speed packet processing and one to run normal applications.

In this work we present an alternative approach: A novel way to integrate programmable packet processing directly into the operating system networking stack in a cooperative way, making it possible to perform high-speed packet processing that integrates seamlessly with existing systems, while selective leveraging functionality in the operating system. This framework, called the eXpress Data Path (XDP), works by defining a limited execution environment based on an extended version of the Berkeley Packet Filter virtual machine, which allows verified programs to run directly in the device driver context, before the kernel performs any other packet processing tasks.

XDP achieves extremely high packet processing performance on a single core, making it possible to implement applications that previously required their own appliance, such as DDOS protection and load balancing, directly on application servers. It also allows a hybrid approach, where certain fast path processing is offloaded to XDP while retaining normal network stack processing for other packets.

This allows for high throughput and low latency processing without sacrificing flexibility.

While XDP has been gradually integrated into the Linux kernel over the last several releases, no complete description of the system as a whole exists. In this work we remedy this, and present the design of XDP, its capabilities and integration with the rest of the Linux kernel. Our performance analysis shows raw packet processing performance on a single core exceeding 20 million packets per second, and scaling linearly with the number of cores. We supplement this with three examples of real-world use cases that can be straightforwardly implemented in XDP: inline DDOS protection on a hypervisor host or application server; load balancing by rewriting packets and resubmitting them to the network; and a layer-3 software router implementation.

The rest of this paper is structured as follows: Section 2 first outlines related work. Section 3 then presents the design of XDP and Section 4 presents the raw packet processing performance analysis. Section 5 presents the real-world use cases and their performance. Finally, Section 6 presents current limitations of XDP and future work, and Section 7 concludes.

2 RELATED WORK

3 THE DESIGN OF XDP

XDP is designed to integrate with the Linux networking stack, enhancing it with high-performance programmable hooks in strategic places. This makes it possible to take advantage of the extensive and robust features of the operating system, while adding custom packet processing as required. For this reason, XDP should not be seen as a monolithic system one injects a single program into, but rather a composition of individual parts that operate in concert to achieve the desired outcome.

This section describes the various parts of the XDP system and how they fit together. We begin with a high-level overview of the XDP programming model and how various features of the kernel combine to form a powerful programmable data plane. Following this, we look in detail at the extended BSD Packer Filter (eBPF) virtual machine providing the execution model, and the in-kernel verifier that ensures the safety of loaded eBPF programs.

3.1 The XDP programming model

The XDP system enables high-performance packet processing integrated tightly with the rest of the Linux networking stack. This makes XDP unique compared to other high-performance software packet processing frameworks, because it makes it possible to selectively leverage features already implemented in Linux, while writing custom programs to perform application-dependent processing, or to

accelerate certain parts of the data path. This section gives a conceptual overview of the XDP programming model, explaining how the different parts fit together.

An XDP program is run in the eBPF virtual machine and is entirely event driven. The program is executed directly in context of the device driver, without context switching to userspace. The program is executed at the earliest possible moment after a packet is received from the hardware, before the kernel allocates any data structures or performs any parsing of packet data. This allows for high performance, but the program has to parse raw packet data itself.

Figure 1 gives a conceptual overview of the execution of a typical XDP program. The program starts its execution with access to a pointer to a context object. This object contains the buffer of the raw packet data, along with metadata fields describing which interface and receive queue the packet came in on, etc. The program can read and write any parts of the packet data buffer, including expanding or shrinking the packet to add or remove headers. It can also pass control to a different XDP program, through a so-called tail call, which executes the target program and never returns to the caller, thus splitting processing into logical sub-units (based on, say, IP header version). The context object also contains a pointer to a special memory area is available for XDP to store arbitrary metadata that will be available to other XDP programs, as well as to other parts of the kernel and userspace (under certain circumstances).

Similar to a regular userspace program, an XDP program ends its execution with a return code, instructing the kernel what to do with the packet. There are three simple return codes which either drop the packet, immediately re-transmit it out the same network interface, or allow the packet to be processed by the kernel networking stack. In addition to these simple actions, the XDP program can *redirect* the packet, which controls its further processing. Redirecting can be used to transmit the packet out a different network interface, to pass it to a different CPU to further processing, to pass it to a virtual machine running on the host, or to pass it directly to a special userspace socket without copying.

During its execution, and XDP program also has access to kernel facilities that provide helper functions and additional metadata. Figure 2 shows a diagram of how XDP integrates into the full system. The XDP hook in the driver is the first thing that is executed after a packet is received from the network hardware. This program can control how further packet processing is performed as described above (solid lines). In addition to this, the facilities given to interact with the kernel allow the XDP program to gather additional metadata (dotted lines), through helper functions and maps. Helper functions are callbacks implemented in the kernel that an XDP program can call to make use of kernel functionality in its processing. These helpers range serve various purposes,

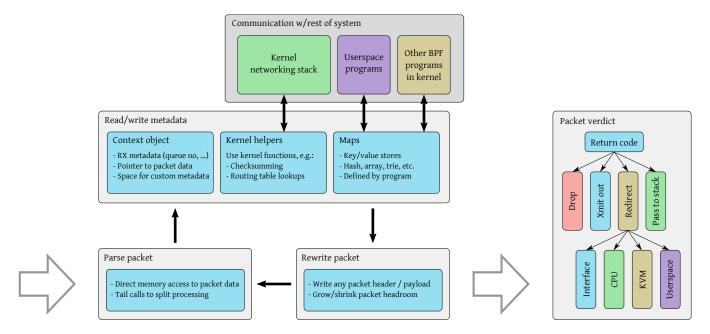


Figure 1: Execution diagram of a typical XDP program. When a packet arrives, the program starts by parsing packet headers to extract the information it will react on. Based on this, combined with information from one or more of the metadata facilities, a packet can be rewritten and a final verdict for the packet determined. The program can alternate between packet parsing, metadata lookup and rewriting, all of which are optional. The final verdict is given in the form of a program return code.

ranging from simple checksum computation and hashing, to full access to the kernel routing table. New helpers are actively been added by the kernel development community in response to user requests, continuously expanding the functionality that XDP programs don't have to re-implement themselves.

Maps are key/value stores that are defined by the user before loading an XDP program, and can be referred to from within the eBPF code. Maps are shared, both between different eBPF programs running at various places in the kernel, as well as between eBPF and userspace. The map types include generic hash maps, arrays and radix trees, as well as specialised types containing pointers to eBPF programs, or even recursive pointers to other maps. Maps serve several purposes: they are a persistent data store between invocations of the same eBPF program; a global coordination tool, where eBPF programs in one part of the kernel can update state that changes the behaviour in another; and a communication mechanism between userspace programs and the kernel eBPF programs, similar to the communication between control plane and data plane in other programmable package processing frameworks. These different communication paths are marked with dotted lines in Figure 2.

Another piece of the XDP picture is the ability to run eBPF programs in other parts of the kernel. These include packet processing in the Traffic Control (TC) subsystem, where eBPF

programs can filter packets after they have been parsed by the kernel, or before they are passed to the hardware from applications. This is marked as "TC BPF" in the figure. In addition, eBPF programs can be attached to various places in the kernel that are unrelated to networking (not shown on the figure). These include *cgroups*, which control resource usage for groups of processes (used for implementing containers on Linux, for instance), as well the tracepoint and kprobe introspection subsystems which allow attaching eBPF programs to arbitrary kernel functions. Because all eBPF programs can share the same set of maps, this makes it possible for XDP programs to react to arbitrary events in the kernel, for instance by dropping packets if processing load increases. Because of this integration, the XDP programming model is considerably more powerful than just the XDP programs itself.

A final important feature of the XDP system is the ability to dynamically load eBPF programs. Because the kernel manages the life cycle of all eBPF programs, they can be dynamically loaded and reloaded at runtime. Combined with dynamic dispatch to other programs using tail calls, this makes it possible to limit the amount of processing actually performed on packets. A processing pipeline can simply split its processing into separate XDP programs and dynamically load and unload them as features are enabled or disabled

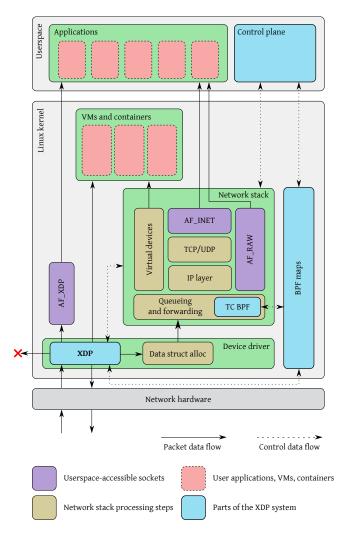


Figure 2: Diagram of how XDP integrates into the Linux kernel network receive path.

through control plane configuration. This also makes it possible to dynamically compile programs with hard-coded values derived from configuration, avoiding expensive data structure lookups for common tasks.

The various pieces of the XDP system outlined above combine to form a powerful programmable data plane, with integration into the Linux kernel aiding deployment on existing systems. The following sections describe the eBPF virtual machine itself, and the verifier that ensures that loaded programs are safe to run in kernel space.

3.2 The eBPF virtual machine

The eBPF virtual machine is an evolution of the original BSD packet filter (BPF) [4] which has seen extensive use in various packet filtering applications over the last decades.

Table 1: eBPF to x86_64 register mapping.

eBPF	x86_64	eBPF	x86_64	eBPF	x86_64
R0	rax	R4	rcx r8 rbx r13	R8 R9 R10	r14
R1	rdi	R5	r8	R9	r15
R2	rsi	R6	rbx	R10	rbp
R3	rdx	R7	r13		

BPF uses a register-based virtual machine to describe filtering actions. This virtual machine has two 32-bit registers and understands 22 different instructions. This makes BPF well-suited for packet filtering operations, but limited as a general purpose virtual machine. eBPF extends the original BPF virtual machine to allow full general purpose execution and efficient just-in-time (JIT) compilation into native machine code. Support for compiling (restricted) C code into eBPF is included in the LLVM compiler suite

The code running in the virtual machine is executed directly in the kernel address space, which makes eBPF useful for a wide variety of tasks in the Linux kernel. The verifier (described in the next section) ensures that user-supplied programs cannot harm the running kernel, which enables a wide array of integrations between the running kernel and the XDP system.

The eBPF modifies the BPF virtual machine as follows:

- The number of registers is increased to eleven, and register widths are increased to 64 bits, with 32-bit sub-registers accessible through certain instructions to provide compatibility with classic BPF programs. The 64-bit registers map one-to-one to hardware registers on all 64-bit architectures supported by the kernel, which eases JIT compilation. For instance, the x86_64 JIT compiler uses the mapping shown in Table 1.
- eBPF adds a *call* instruction for function calls, and adopts the same calling convention as the C language conventions used on the architectures supported by the kernel. Along with the register mapping mentioned above, this makes it possible to map a BPF call instruction to a single native call instruction, enabling function calls to native kernel functions with close to zero overhead. This facility is used by eBPF to support helpers that eBPF programs can call to interact with the kernel while processing.

The eBPF calling convention is as follows:

- R0 contains the function return value
- R1-R5 contains function arguments
- R6-R9 are callee saved registers that will be preserved across the call
- R10 is a read-only frame pointer to the beginning of the eBPF stack space

Table 2: eBPF verifier state variables

Variable	Contains
type	One of the types in Table 3
id	ID for tracking copies of same variable
fixed_offset	Pointer offset (after arithmetic)
range_unsigned	Min and max values (unsigned)
range_signed	Min and max values (signed)
tnum	Mask and value of known bits

A BPF program starts its execution with R1 containing a pointer to a *context* object, the contents of which varies with the type of program. For XDP, this points to a structure that allows the BPF program to access the packet data itself, as well as various items of metadata, including space for arbitrary data that is carried along with the packet and is accessible by other BPF programs that operate on the packet at later stages of processing.

3.3 The eBPF program verifier

As mentioned in the previous section, eBPF code runs directly in the kernel address space, which means that it theoretically has full access to the running kernel and can either crash or compromise this. To avoid this unpleasant situation, the kernel enforces a single entry point for loading all BPF programs (through the bpf() system call). When loading a BPF program it is first analysed by the in-kernel BPF verifier, which ensures that the program performs no actions that are unsafe (such as reading arbitrary memory), and that the program will terminate by disallowing loops and limiting the maximum program size. The verifier works by first building a directed acyclic graph (DAG) of the control flow of the program. This DAG is then verified as follows:

First, the verifier performs a depth-first search on the DAG to ensure it contains no loops (no backwards jumps) and that it contains no unsupported or unreachable instructions. Then, in a second pass, the verifier walks all possible paths of the DAG while tracking the state of all registers. The purpose of this second pass is to ensure that the program performs only safe memory accesses, and that any helper functions are called with the right argument types. This is ensured by rejecting programs that perform load or call instructions with invalid arguments. Argument validity is determined by tracking the state of all registers and stack variables through the execution of the program, as explained in the following.

3.3.1 Register state tracking. To track data access, the verifier assigns five state variables to each register, listed in Table 2, with the possible types listed in Table 3. The fixed offset is used to track the result of pointer arithmetic with fixed values, while the ranges and *tnum* are used to track

Table 3: eBPF verifier type annotations. The last column indicates whether pointer arithmetic is allowed for this type of pointer.

Non-pointer types						
Name	Meaning					
NOT_INIT	Not initialised					
SCALAR_VALUE	Any numerical value					
Pointer types						
Name	Pointing to	Arithm				
CTX	Context	Yes				
MAP	BPF map	No				
MAP_VALUE	Value in map	Yes				
MAP_VALUE_OR_NULL	Value in map or NULL	No				
STACK	Stack frame	Yes				
PACKET	Packet data start	Yes				
PACKET_END	Packet data end	No				

variable offsets of pointers, as well as the ranges of scalar variables.

At the beginning of the program, R1 contains a pointer to the execution context, and its type is a CTX pointer; R10 is a STACK pointer, and all other registers are NOT_INIT. At each execution step, register states are updated based on the operations performed by the program. When a new value is stored to a register, it inherits the state variables of the source of the value. Arithmetic operations on scalar values will affect the value of the *tnum* state variable, which tracks which bits in a register are known, and their value. The *tnum* is a pair of *mask*, which contains the bits whose value is unknown, and a *value* which contains the bits that are known to be set to 1. Load operations set these, for instance loading a byte from memory will result in the top 56 bits being known to be zero, and the bottom 8 bits to be unknown. Arithmetic updates these values according to their operation.

Branches in the instruction tree will update the register state according to the logical operation contained in the branch. For example, a comparison "R1 > 10" compare will set the maximum value of R1 to 10 in one branch, and the minimum value to 11 in the other. If a comparison is performed with a scalar value rather than a constant, the knowledge of which bits are set is used to compute the ranges for the branches (using the minimum and maximum possible values of unknown bits as appropriate). Finally, a branch that checks whether register with a MAP_VALUE_OR_NULL pointer is different from NULL will turn that register into a pointer with type MAP_VALUE in the *true* branch, which makes it possible to derefence the pointer.

Using the information contained in the state variables, it is possible for the verifier to predict the ranges of memory that it is possible for each load instruction to access. It uses this information to ensure that only safe memory accesses are performed. For pointers to context objects, the execution context of the eBPF program indicates allowed memory offsets for their context objects through a callback performed by the verifier. For map values, the map definition defines the size of the values, which is used to bound the allowed memory accesses. For pointers to stack values, only ranges previously stored on the stack are valid. And finally, for pointers to packet data, only ranges known to be less than the packet length (by appropriate compares against the packet end pointer) are allowed. Any eBPF program that makes memory accesses that the verifier cannot prove are safe are simply rejected at load time. The verifier also uses the range information to enforce aligned memory accesses.

When pointers are copied to other registers, a bounds check on one copy can be used to infer the valid ranges of the other copies, even after the copy occurred. The *id* state variable is used for this purpose for packet access and map value pointers. For packet access, all pointers with the same variable range will have the same *id*, even if their fixed offset differs. Thus, a range check on one copy will mark the same range (minus any differences in fixed offsets) as valid in the other copies. Similarly, for pointers to map values, all copies of a pointer returned from the same map lookup share their *id*, and a check against NULL will be valid for all of them.

4 PERFORMANCE EVALUATION

In this section we present our performance evaluation of XDP, using synthetic benchmarks to look at specific aspects of the packet processing capabilities. In the next section, we supplement this with a description and evaluation of a series of real-world use cases.

For all benchmarks, we use a machine equipped with a hexa-core Intel Xeon E5-1650 v4 CPU running at 3.60GHz, and memory modules installed in all four memory slots, to get the full available memory bandwidth. This CPU supports Intel's Data Direct I/O (DDIO) technology, which makes it possible for the networking hardware using Direct Memory Access (DMA) to place data directly into the processor cache, which eliminates cache misses on subsequent processing of the data. The test machine is equipped with two Mellanox ConnectX-5 dual-port 100Gbps network adapters, installed in PCI Express v3 16-lane slots, which ensures that the PCI bus has enough nominal bandwidth available to match the network adapter speed for a single port on each card. However, even so, in some of our tests the performance is bottlenecked at the PCI bus, as we will see below.

We use the TRex packet generator [2] to produce the test traffic. The test machine runs a version of the Linux kernel that will be released as v4.18. We make details of our setup, links to source code and the raw test data available in an online repository [1].

To show the performance achievable with XDP, we perform the following measurements, which correspond to the four different return codes shown in Figure 1 above:

- Packet drop performance. We install a simple XDP program that drops packets after receiving them, to examine the maximum possible packet processing performance
- Packet mirroring performance. Here we measure the performance of sending packets out the same network interface that they arrived on.
- Packet forwarding performance. Here we install a simple XDP program that redirects packets out a different interface as they arrive.
- Inline packet processing. We install an XDP program
 that allows the packets to proceed to the kernel networking stack, to measure the overhead that XDP processing introduces in the kernel receive path.

For all of these tests, we measure the maximum how many packets per second the system can process, as well as the CPU usage required for processing different offered loads. We compare the performance with the testpmd example application shipped with DPDK framework, and with the regular Linux kernel network stack (except for the inline processing use case, which is specific to XDP). For all tests, we use minimum-sized (64 bytes) packets, since processing a high number of packets per second is the most challenging, and using larger packets only exacerbates the PCI bus bottleneck.

4.1 Packet Drop Performance

Figure 3 shows the packet processing performance as a function of the number of cores. The baseline performance of XDP for a single core is 26 Mpps, while for DPDK it is 43.5 Mpps. This scales linearly with the number of cores, until it hits the maximum capacity of our traffic generator, at 82.5 Mpps. DPDK reaches this with 3 cores, while for XDP it takes 4. However, we believe it is likely that both XDP and DPDK would be able to continue scaling beyond these limits given a suitable traffic source. **FIXME: Is this true?**

The reason the performance dips at five and six cores is because dividing the traffic over several cores requires using the Receive Side Scaling (RSS) features of the hardware, which can divide up traffic between hardware receive queues (each of which is bound to a separate core) based on packet header information. Using this requires the traffic generator

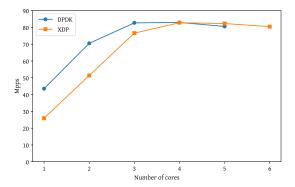


Figure 3: Packet drop performance. DPDK uses one core for control tasks, which is why it only goes to 5. The slight downward trend at above 4 cores is because the performance of our packet generator decreases when it has to generate more streams.

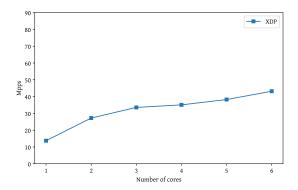


Figure 4: Packet forwarding performance.

to generate the traffic as separate flows, which means its maximum throughput drops.

4.2 Packet Mirroring Performance

TBD. FIXME: Can we do this with DPDK?

4.3 Packet Forwarding Performance

Figure 4 shows the packet forwarding performance. Again, we see an almost linear scaling with the first couple of cores, tapering off to sub-linear performance increases as more cores are added. We attribute this to **FIXME**.

5 REAL-WORLD USE CASES

In this section we describe and evaluate three real-world use cases that showcase various ways in which XDP can used to implement useful applications or features. These use cases have all seen real-world deployment in one form or another, although we use simplified versions in our evaluation so as to be able to make the code available.

The three use cases are inline Denial of Service (DoS) mitigation, a software layer-3 router, and an application load-balancer, and are described in turn in each of the following subsections.

5.1 Inline DoS Mitigation

DoS attacks continue to plague the internet, typically in the form of distributed attacks (DDoS attacks) from compromised devices attached to the internet. There are various ways to mitigate them, but having some kind of service that protects critical infrastructure is typically at least a component of DDoS mitigation **FIXME: citation needed**. This can be done by filtering all traffic through a device that distinguish legitimate traffic from attacks, and drop the attack packets before they reach the application server.

The obvious problem with protecting against a DDoS attack is the sheer scale of the traffic that needs to be dropped, which leads to the use of expensive appliances to handle the dropping. However, with XDP we have another option: installing the traffic filter directly on the application server in the form of an XDP program, which is possible without any other modifications to the server. In the case of a virtual machine deployment, the filter can even be installed on the hypervisor, and thus protect all virtual machines running on the host.

How to identify attack traffic is not our focus here, but rather the mechanism that drops the unwanted traffic. We simply assume that there exists *some* way of identifying which traffic is legitimate and which isn't. Because of the dynamic nature of XDP, there are many options available: BPF maps could be used for while-listing or black-listing, the packet payload could be inspected, etc. It is even possible to load new XDP programs especially tailored towards dropping a particular kind of attack traffic as the need arises. However, in our example, we simply assume that a server hosts a TCP-based service, and so consider all UDP traffic as unwanted.

To test the performance of such a solution, we use the Netperf benchmarking tool [3]. This is equipped with a TCP-based round-trip benchmark, which opens a TCP connection and sends a small payload which is echoed back from the server, repeating as soon as a reply is received. The output is the number of transactions per second, which is a good proxy for an interactive TCP session, such as small remote procedure calls.

We first measure the baseline performance of this test, and see that we are able to perform around 25.000 transactions per second with no competing traffic. We then, from a separate machine, offer an increasing load of small UDP packets,

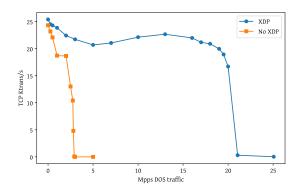


Figure 5: DDOS performance. Number of TCP transactions per second with different levels of UDP packet floods being sent to the server.

which simulates the DoS attack, and measure how the TCP application is affected. The network interface is configured to redirect all traffic to a single receive queue, so all packets are processed by the same CPU core. This is important in this use case, because the machine will be running other applications on the remaining cores, and so we don't want to dedicate too many resources to just packet processing¹.

The results of this is shown in Figure 5. It is clearly seen that without the XDP filter, performance drops significantly, being halved at 2.5 Mpps and effectively zero at just below 3 Mpps. However, with the XDP filter in place, performance is kept above 20.000 transactions per second up to 19 Mpps, after which it drops rapidly. The small increase in baseline performance (from 24,500 to 25,500 transactions per second) is because the XDP program uses the *redirect* feature to move the network stack processing of the application traffic to a separate CPU core, to make sure the application performance is not impacted by handling of the DoS traffic.

As these results show, it is quite feasible to perform this kind of filtering in XDP, and comfortably handle packet rates above 10 Gbps of DoS traffic (with minimum packet sizes) on a single CPU core. Deploying DoS mitigation this way leads to increased flexibility, both because of the programmability offered by XDP, but also because it eliminates the need for at separate appliance to scrub the traffic.

5.2 Packet forwarding layer 2/3

5.3 Load-balancer

- XDP TX
- XDP_REDIRECT to CPU/VM

6 LIMITATIONS AND FUTURE WORK

7 CONCLUSIONS

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¹The actual number of cores dedicated to packet processing will of course have to depend on the volume of traffic the filter should be able to process.