Hardware acceleration for Unikernels

A status update of vAccel



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Unikernels are promising

- Fast boot times
- Low memory footprint
- Increased security





Use cases for Unikernels

- Traditional applications
- NFV
- Microservices / Serverless
- ML/AI (?)





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- Traditional applications
- NFV
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ML/AI workloads

- Heavy frameworks
- Compute-intensive workloads











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Hardware acceleration in the cloud and the edge

- Traditional hardware accelerators
 - GPUs
 - FPGAs
- New and specialized Processing Units
 - TPUs
 - ASICs









ML/AI workloads in Unikernels

No support for ML/AI frameowkrs



ML/AI workloads in Unikernels

No support for ML/AI framewokrs

No support for hardware acceleration



Overview

Motivation

- Virtualization of the hardware acceleration stack
- Our approach: vAccel
- Insights of vAccel
- Extending vAccel
- Demo



Hardware acceleration software stack

- Acceleration framework
 - OpenCL, CUDA
 - Pytorch, Tensorflow
- Vendor Runtime/Operator
 - Xilinx Runtime, Nvidia GPU operator
- Device driver
 - FPGA, GPU



Hardware accelerator



Virtualization of hardware accelerators

- Unikernels are virtual machines
 - Same techniques for device virtualization as in usual VMs
- Device virtualization of hardware accelerators
 - Hardware partitioning
 - Paravirtualization
 - Remote API



Hardware partitioning

- Split accelerator in partitions
 - \circ % Assign a partition to a VM <math display="inline">% Assign a partition to a VM <math display="inline">% Assign a partition to the second statement of the second s
- Characteristics
 - Entire hardware acceleration stack needs to be in VM
 - Bound to device support/#partitions







Paravirtualization

- Hypervisor manages the device
 - VMs access device through hypervisor
- Characteristics
 - Significant portion of hardware
 acceleration stack needs to be in VM
 - Device-agnostic driver, support from hypervisor



Hardware accelerator



Remote API

- Hypervisor manages the device
 - \circ $\;$ intercept and forward calls to the host $\;$
- Characteristics
 - Performance overhead
 - Framework specific

Application)
Acceleration framework	Userspace
VM	
Hypervisa	>r))
Accelerat	ion
Vendor runtime/oper	rator
Device dri	ver
Host	



Which one is suitable for Unikernels?

- Hardware partitioning
 - Port of each device driver and rest acceleration stack
- Paravirtualization
 - Port of one device and rest acceleration stack
- Remote API
 - Port only the framework



Porting hardware acceleration frameworks

- Challenges
 - Huge code base
 - Dynamic linking
 - Many dependencies





Porting hardware acceleration frameworks

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 - Many dependencies



Such frameworks are not suitable for a Unikernel design







Problem statement

Provide a hardware acceleration solution suitable for Unikernels



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Our approach: vAccel

- vAccel decouples the function call from its hardware-specific implementation
- Features:
 - Hardware-agnostic API
 - Acceleration in function granularity
 - Portability and interoperability



Hardware accelerator

Host



Userspace

Pytorch

vAccel overview



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vAccel core runtime library

- Exposes vAccel API
 - Native / Static API, supports accelerated functions (BLAS, classification etc.)
 - Framework bindings (tensorflow, pytorch)
- Receives and manages requests
 - Forwards requests to available implementations





vAccel plugins

- Glue code between vAccel and actual implementation / framework
 - Plugins for acceleration frameworks
 - Plugins for transport layers





vAccel plugins for acceleration frameworks

- Glue code between vAccel and function implementation
- Acceleration frameworks (Tensorflow, Pytorch)
- Hardware / framework
 implementation of an operation
 (Image classification, BLAS etc.)



vAccel plugins for transport layers

- Forward requests from guest to host
- Transport layers:
 - Virtlo (PCI / MMIO)
 - Socket interface:
 - AF_VSOCK (virtio-vsock)
 - AF_INET (TCP sockets)

Image Inference		Tensorflow				
vAccelrt						
PyTorch	Jetson Inference	BLAS FPGA	TPU	VirtIO		
libtorch.so	jetson-inference	libcublas	libgcoral	PCI		
	PyTorch libtorch.so	e BLAS VACCE PyTorch Jetson Inference	e BLAS Tensorflow VAccelrt PyTorch Jetson BLAS Inference PPGA libtorch.so jetson-inference libcublas	e BLAS Tensorflow VAccelrt PyTorch Jetson BLAS TPU libtorch.so jetson-inference libcublas libgcoral		

vAccel in Unikernels

- Ideal abstraction and easy to port
 - Specialization of hardware acceleration
 - Thin layer of C code without any dependencies
 - Only transport plugins are needed

vAccel in Unikernels

- Portability / Interoperability
 - Identical native/unikernel code
 - Access to various frameworks and hardware without code changes

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- Example: vector addition in OpenCL
 - Setup vector_add bitstream in FPGA
 - Transfer arrays A and B in FPGA
 - Invoke FPGA kernel
 - Transfer array C from FPGA

1. "Libification" of the application

- **1.** "Libification" of the application
- 2. Integrate the library in Vaccel as a plugin
- **3.** Expose the new function in vAccelrt

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Insights of vAccel

• Demo

Demo

- Usage of acceleration frameworks from Unikraft
 - BLAS cuda (CPU/GPU)
 - Jetson-inference (GPU)
 - OpenCL (FPGA)

Current state of vAccelrt

- <u>vAccelRT v0.5.0</u> released!
 - https://github.com/cloudkernels/vaccel/releases/tag/v0.5.0
- Language Bindings for C/C++, Python, Rust, TF
 - https://docs.vaccel.org/language_bindings/
- <u>Simple plugin API</u>
 - https://docs.vaccel.org/plugin

vAccel systems support

- Hypervisors:
 - QEMU (VirtlO & vsock)
 - Rust-VMM clones:
 - AWS Firecracker (VirtIO & vsock)
 - Cloud Hypervisor (vsock)
 - Dragonball (vsock)

- Unikernels:
 - Unikraft

- Rumprun
- Integration with k8s, kata-containers and OpenFaaS

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vAccel support for frameworks & hardware

- Acceleration frameworks:
 - Jetson-inference (dusty-nv)
 - Tensorflow / Pytorch
 - TensorRT / OpenVINO
 - OpenCL / CUDA
- Hardware:
 - GPUs (NVIDIA RTX/T4, NVIDIA Volta/Maxwell etc.)
 - Edge TPUs/NPUs (MyriadX, Coral, AMlogic etc)
 - FPGAs UC50/200, PYNQ

Summary

- Hardware acceleration stacks are huge and complicated
- vAccel abstracts the heterogeneity of the hardware and the frameworks
- Perfect fit for Unikernels

Summary

- Hardware acceleration stacks are huge and complicated
- vAccel abstracts the heterogeneity of the hardware and the frameworks
- Perfect fit for Unikernels

Try it out!!!

https://vaccel.org & https://docs.vaccel.org

https://github.com/cloudkernels/vaccelrt

https://github.com/nubificus/vaccel-tutorials

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https://unikraft.org/community/hackathons/2023-03-athens/ https://unikraft.org

Register now: <u>https://forms.gle/a315sJrzRQV8rZdz8</u>

Thanks!

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