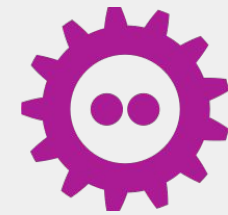


Hardware accelerated applications on unikernels for Serverless Computing



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 <https://blog.cloudkernels.net>
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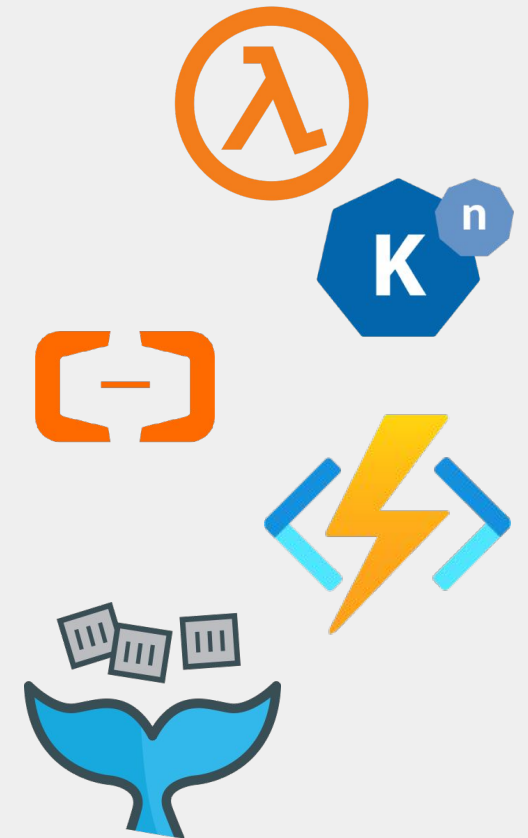
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Overview

- Serverless computing
- Unikernels as the basis for lightweight function execution
- Current state & missing pieces
 - "echo" demo on OpenFaaS with solo5
- ML workloads, hardware acceleration & unikernels
 - image classification demo on OpenFaaS with unikraft & vAccel

Serverless Computing

- Managed infrastructure orchestration by the service provider
- Effortless scaling (scale-out)
- Focus on Business logic
- Deploy code without provisioning the infrastructure



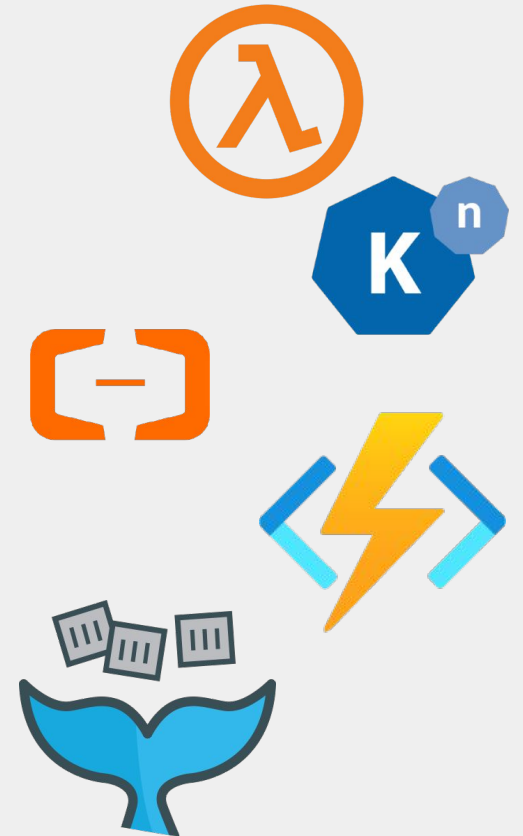
Serverless Computing

- Code deployed as a function with its dependencies
- Event-driven execution
- billing model: actual resource usage vs idle
- Stateless execution oriented to:
 - microservices
 - triggered actions



Serverless Computing

- mostly deployed on Cloud infrastructure
- mode of execution seems useful for Edge workloads as well
 - e.g. ML inference for fast decision making
- currently backed by containers

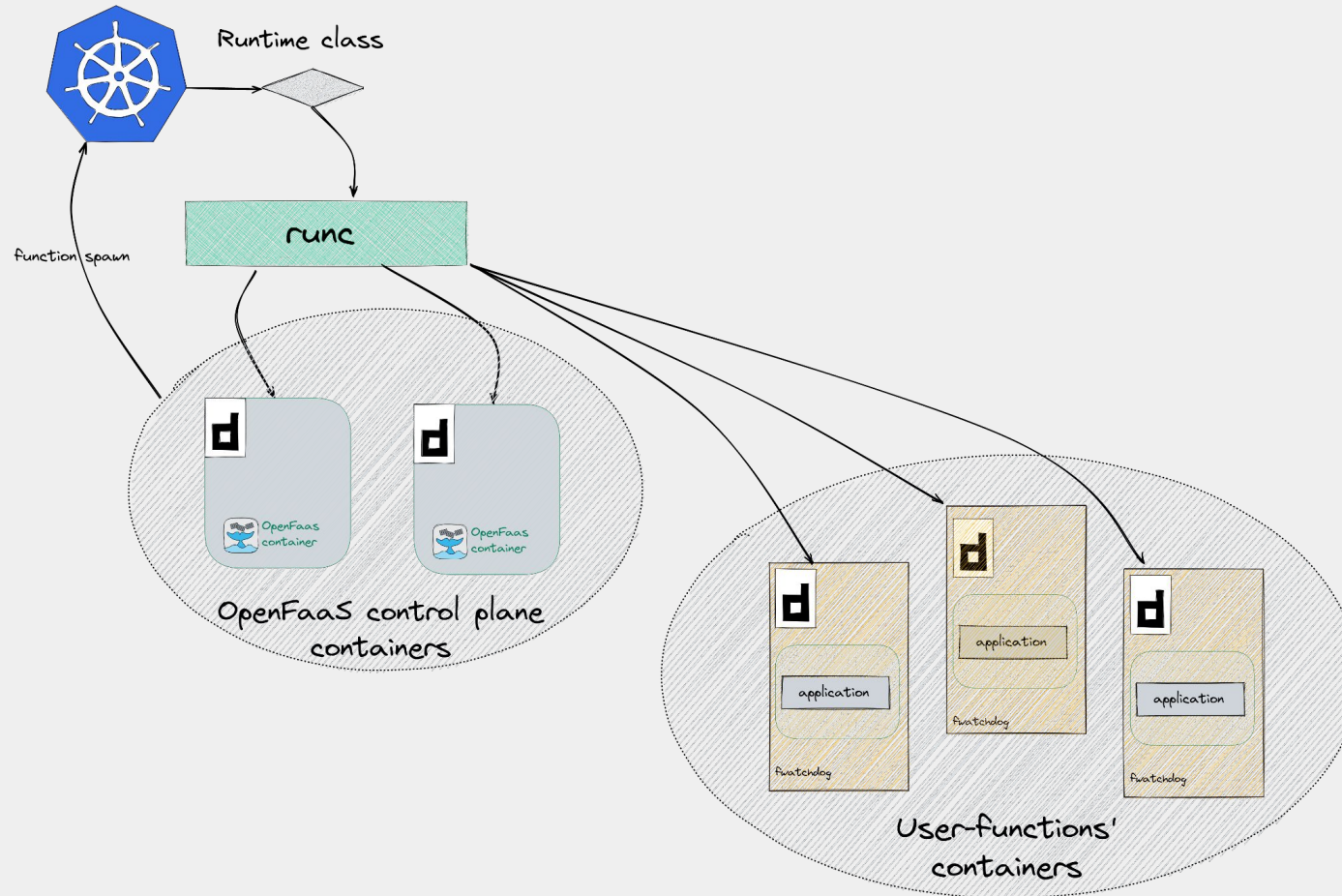


Serverless Computing - common workflow

- control plane:
 - API gateway/scheduler/queue worker
- functions:
 - main init function / endpoint (*provider*)
 - setup environment (interface/endpoint init)
 - setup handler (to trigger user code)
 - handler function (*user*)
 - spawned on invocation (via endpoint trigger)
 - actual code execution
- bundled in container images:
 - spawned (sandboxed or plain)
 - listen to events via the endpoint/gateway

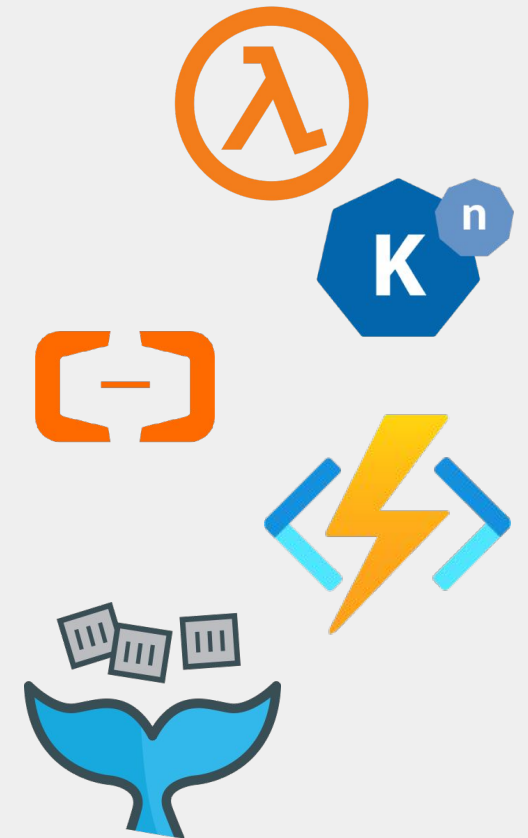


Serverless Computing - OpenFaaS in k8s



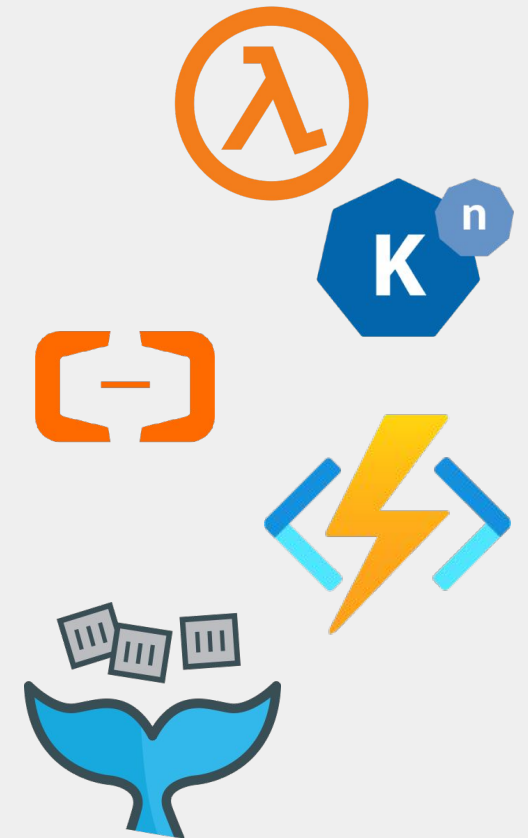
Serverless Computing - containers

- currently backed by containers: multi-tenancy issues (security/data leaks)
- current solution: sandbox containers using VMs (hardware extensions to isolate workloads).
- But, VMs:
 - exhibit non-negligible overhead (mem/mgt footprint)
 - do not facilitate hardware access / device sharing



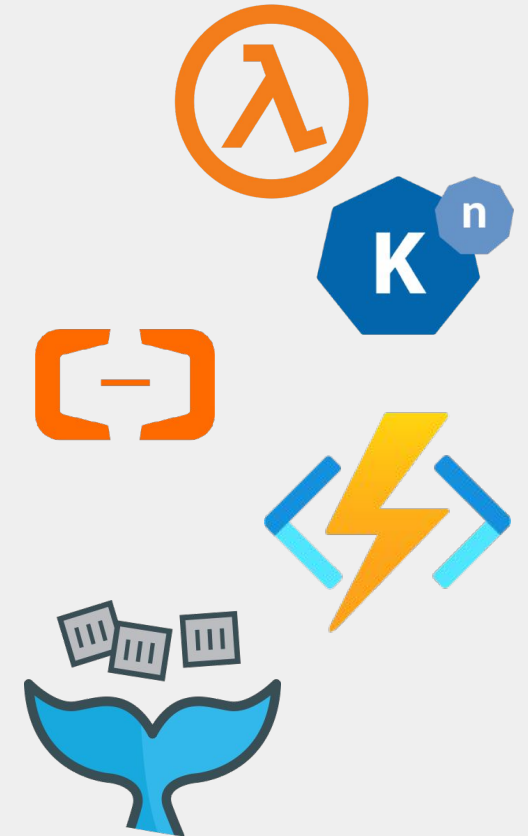
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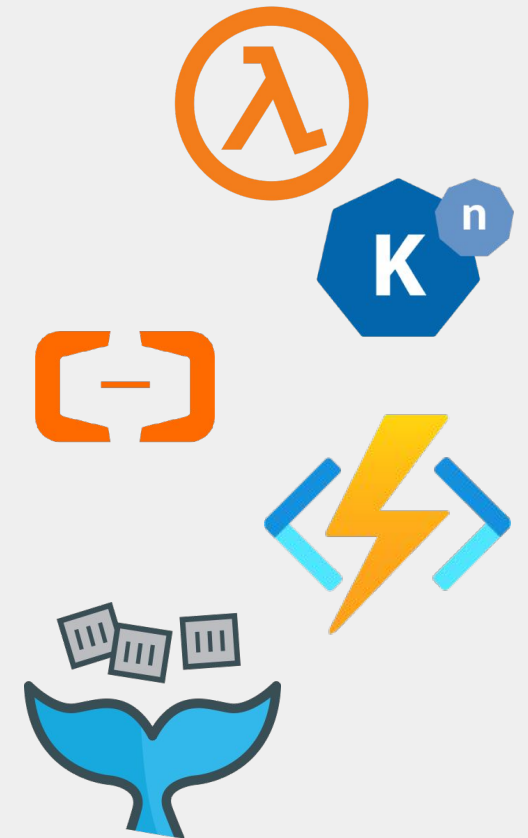
Serverless Computing - sandboxed containers

- overhead associated with VM sandboxing:
 - boot time (cold boot) vs warm boot / invocation (checkpointing)
 - memory footprint (Edge devices)
 - VM lifecycle / state (VMM, dependencies)
- complicated stack:
 - VMM, kernel/ramdisk/rootfs/libcontainerd etc.



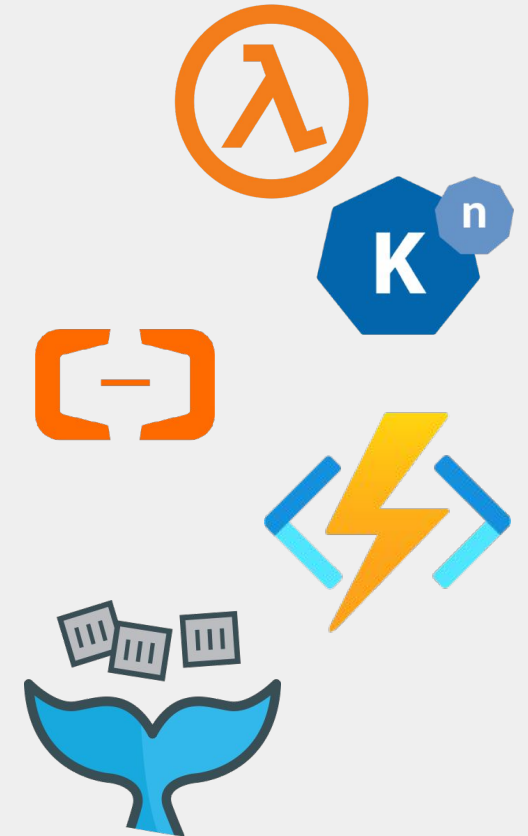
Serverless Computing - unikernels

- how about we try something more elegant as the basis for serverless execution: **unikernels**!
- unikernels offer:
 - fast boot (inherently, serverless functions have no state)
 - low mem/mgt footprint
 - increased security (sandbox with hardware extensions + minimal attack surface)
- but unikernels lack:
 - function/code compatibility (interoperability)
 - runtime support (orchestration/process spawning)



Serverless Computing - unikernels

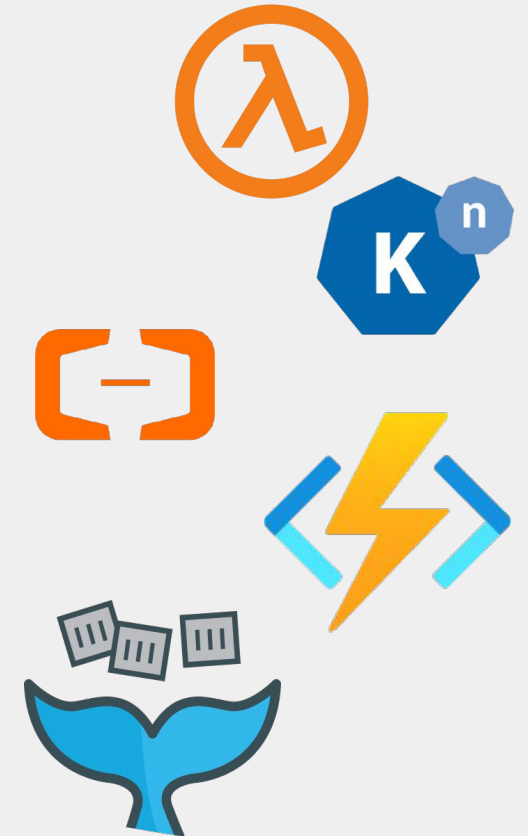
- Serverless frameworks are designed for containers:
 - based on container runtimes/operators
- Unikernels are not containers:
 - their management interface (+ I/O) resembles the one of VMs
 - the application is bundled in a single bootable binary
 - there is limited orchestration support



Serverless Computing - unikernels

unikernels for Serverless:

- container image & runtime flows:
 - bundle the unikernel binary & dependencies in a container image
 - tweak a container runtime to spawn a unikernel along with its monitor/sandbox
- invocation triggers
 - endpoint setup
 - interface with the serverless gateway

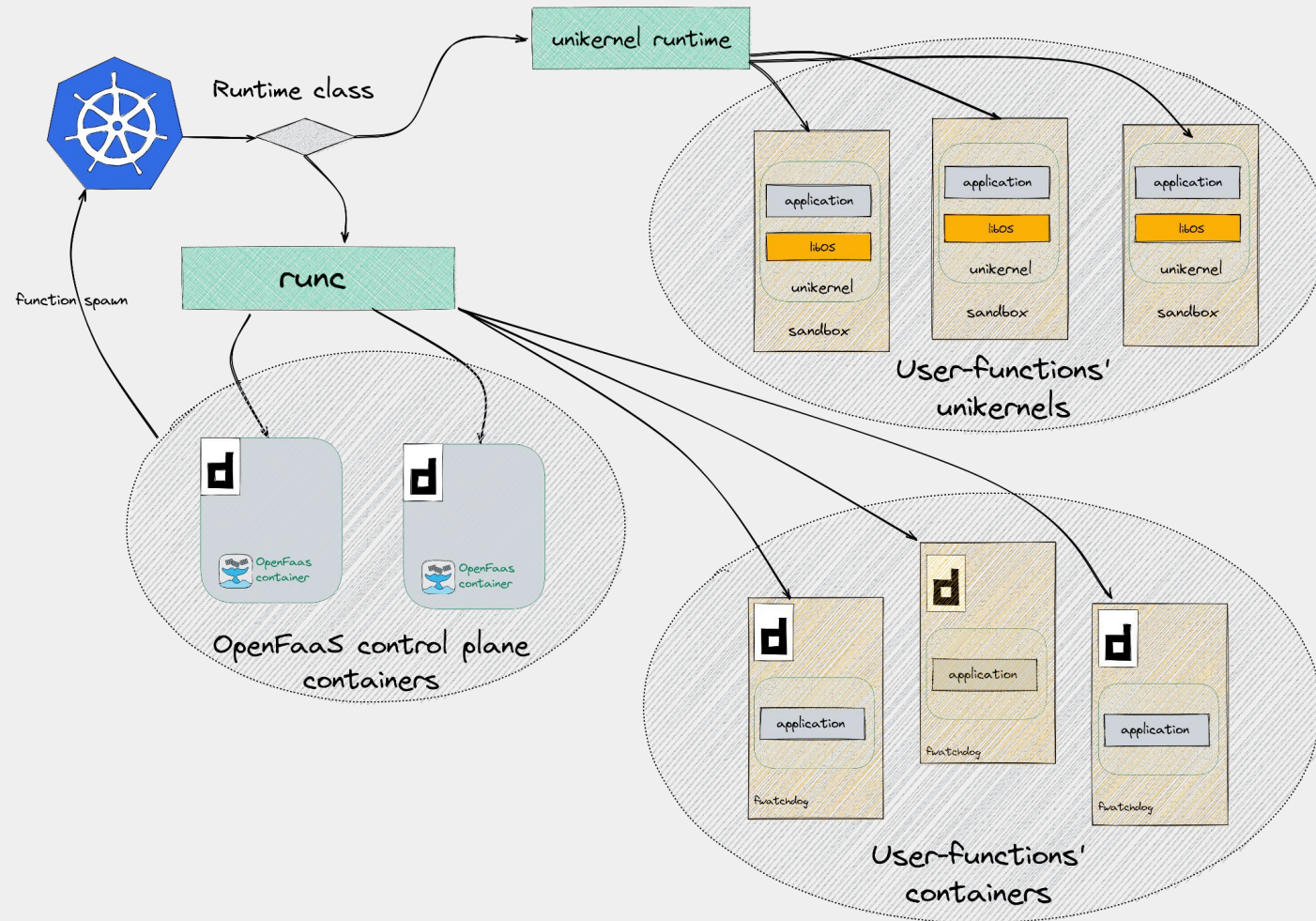


Serverless Computing - unikernels

- integrate unikernels in modern orchestrators:
 - build a compatible runtime able to spawn a unikernel (WiP)
- using the above runtime on a Serverless Framework is straightforward:
 - instead of spawning a container on function invocation, the system will spawn a unikernel -> no change needed on the serverless workflow.

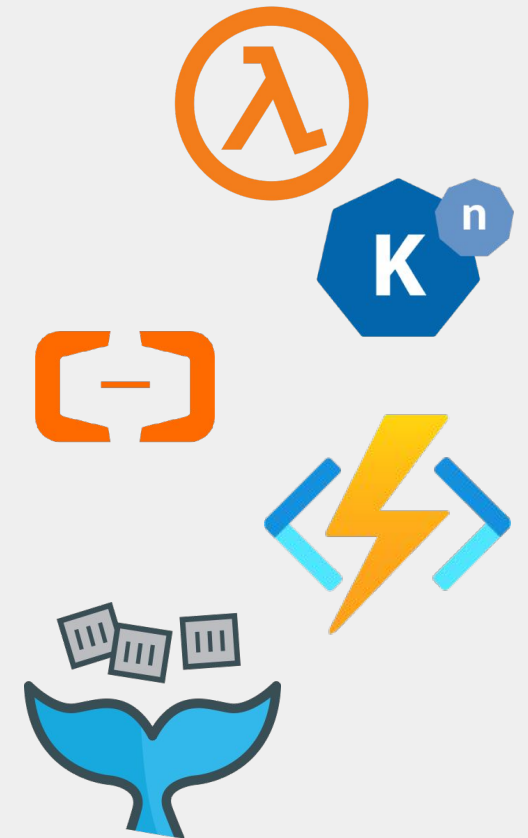


Serverless Computing - OpenFaaS & unikernels

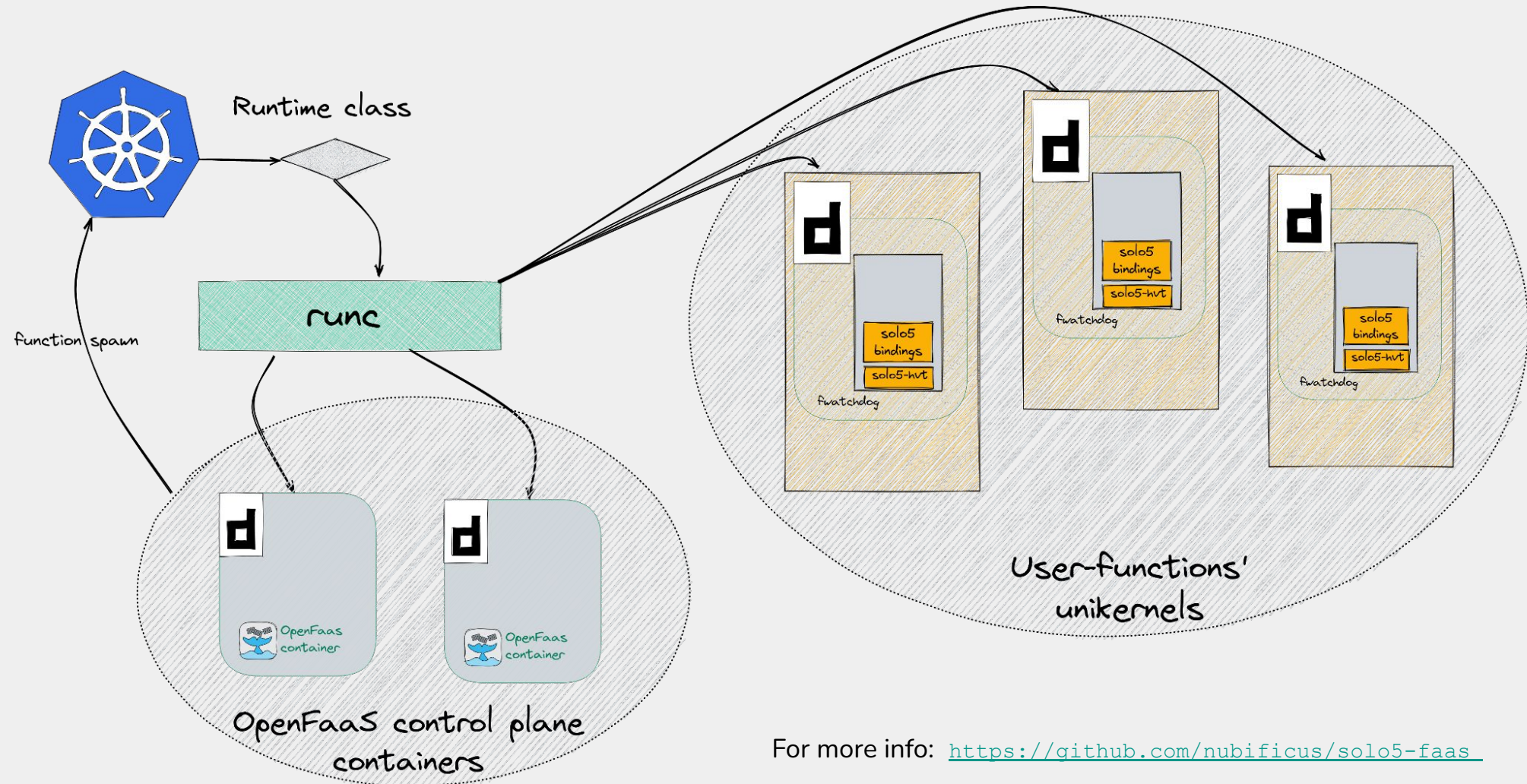


Serverless Computing - unikernels

- as a first step, we take a hybrid approach where:
 - we keep the container for the interface & the endpoint setup and
 - spawn the unikernel for the actual code execution
- we use OpenFaaS as the serverless framework, on a generic k8s cluster:
 - `faas-netes` & gateway (control plane)
 - function pods -> generic containers with `fwatchdog` to exec user function
- we use solo5 as the unikernel example



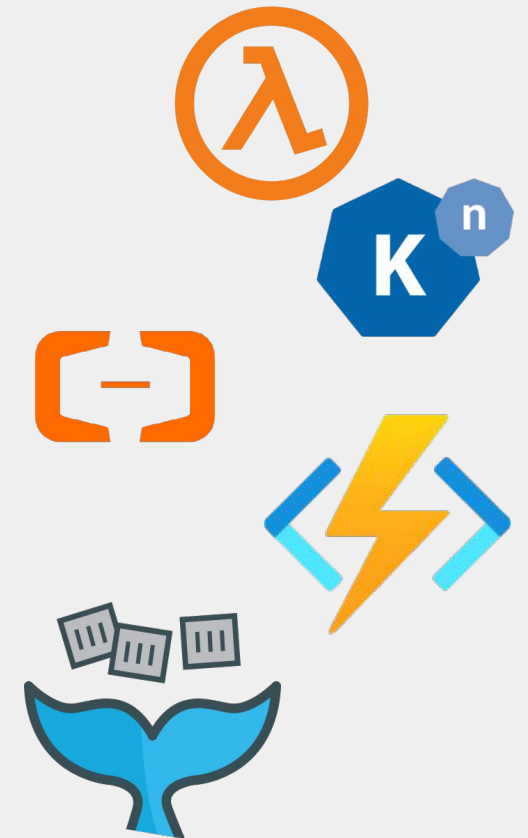
Deploy an echo function with solo5 & OpenFaaS



For more info: <https://github.com/nubificus/solo5-faas>

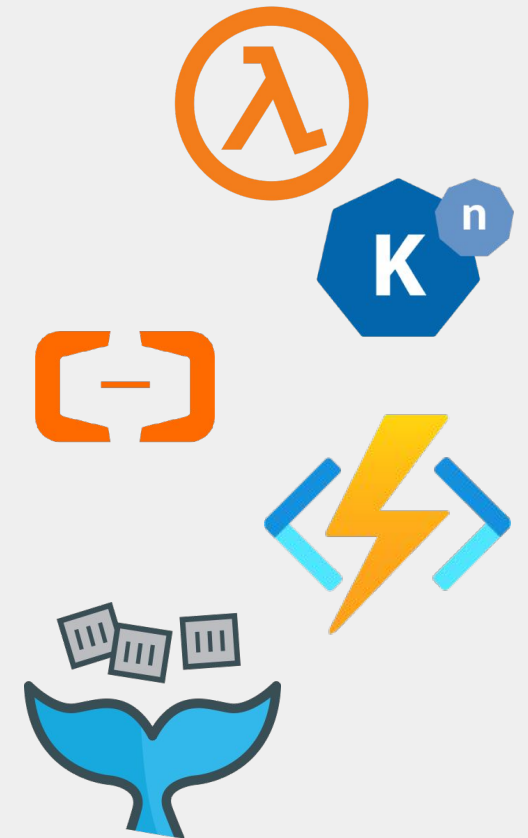
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Serverless Computing - ML/AI

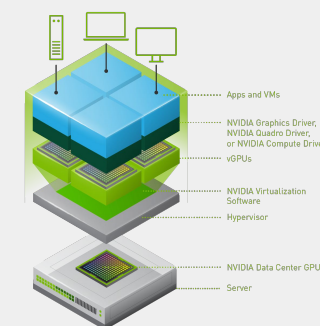
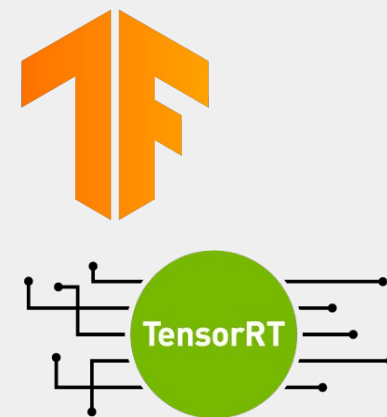
- workloads that need device access in serverless execution are ML/AI applications
 - Edge instant decision making based on sensor data
 - Image processing, information extraction based on specific models
- how do we combine unikernel execution with hardware device access ?



Unikernels for ML/AI

Unikernels are not a good fit for ML/AI workloads (at least not yet..)

- ML frameworks come in contrast with Unikernel architecture
 - ML frameworks dynamically link dependent libraries
 - ML frameworks have a lot of dependencies
 - Porting such a framework on a unikernel requires huge engineering effort
- No support for accelerated devices
 - hardware passthrough requires porting device drivers – not a good idea
 - the generic paravirtualization solution is almost non-existent



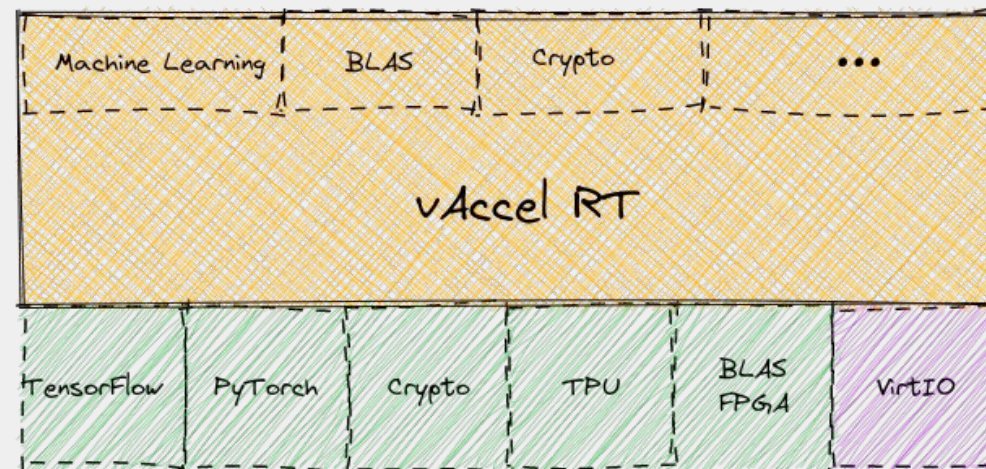
Proposed solution: vAccel

Components:

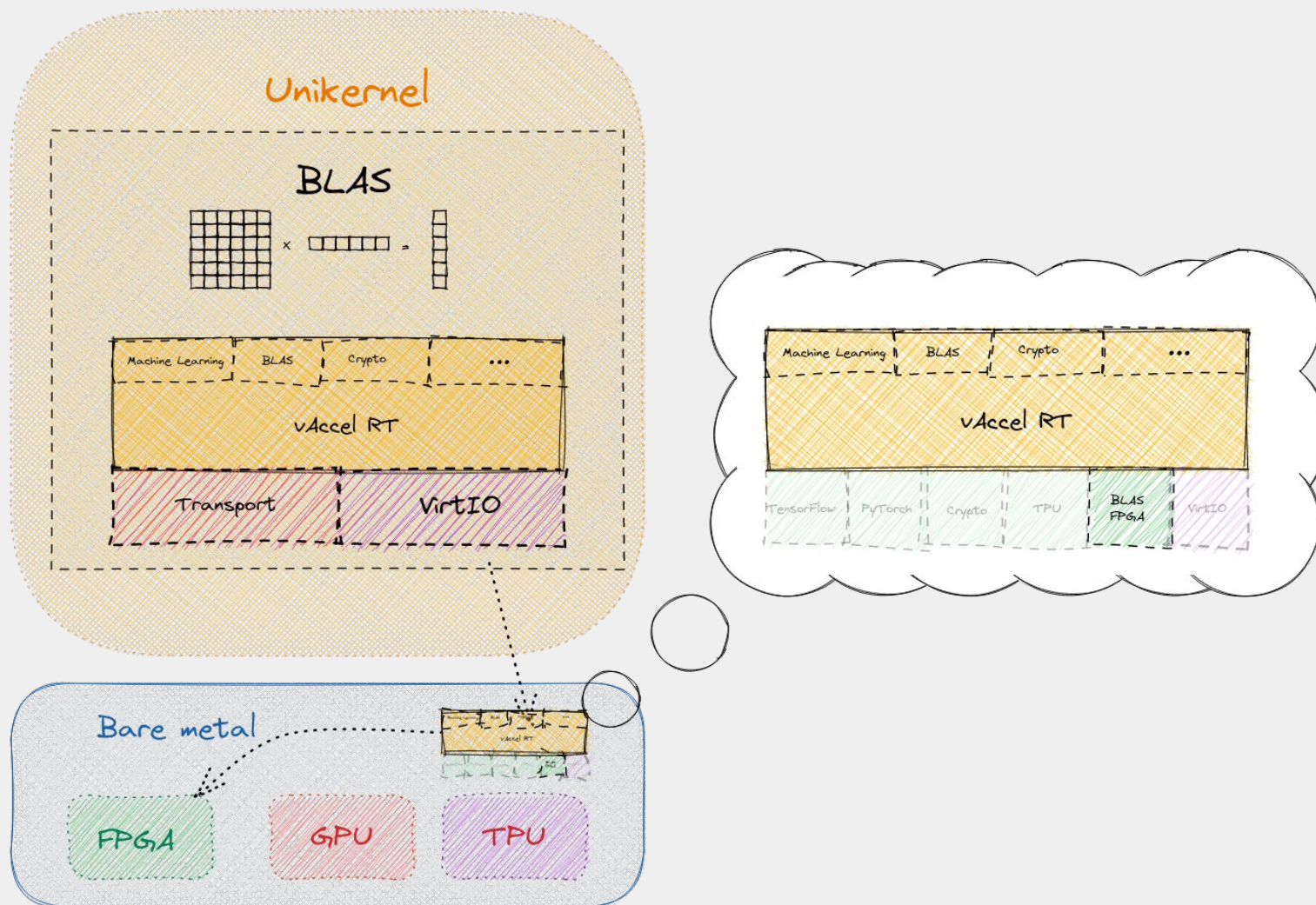
- user-facing API (accelerate-able functions)
- vAccelRT (dispatch)
- plugins (hardware, acceleration frameworks & transport)

Features:

- Hardware-agnostic API
 - Generic API at function granularity
 - Hardware-specific logic in vAccel, not in unikernel
- Portability
 - binary compatibility for functions
 - integration with high-level frameworks (Tensorflow, PyTorch, etc)
 - multiple execution environments (host/container, VMs, unikernels)
- Security:
 - User code does not access directly the (shared) accelerator
 - Support for execution in virtualized guests



vAccel on Unikernels



Unikernel

- One Transport (VirtIO) plugin
- Offload acceleration requests to host

Host

- vAccelRT linked with VMM or standalone handler (virtio-pci or vsock)
- Receives acceleration requests
- Hardware execution

vAccel: Current state

Unikernel frameworks

- Unikraft
- Rumprun

Programming interface

- C/C++ API
- Rust & Python

Framework integration

- Initial integration with TensorFlow
- Support for BLAS operations

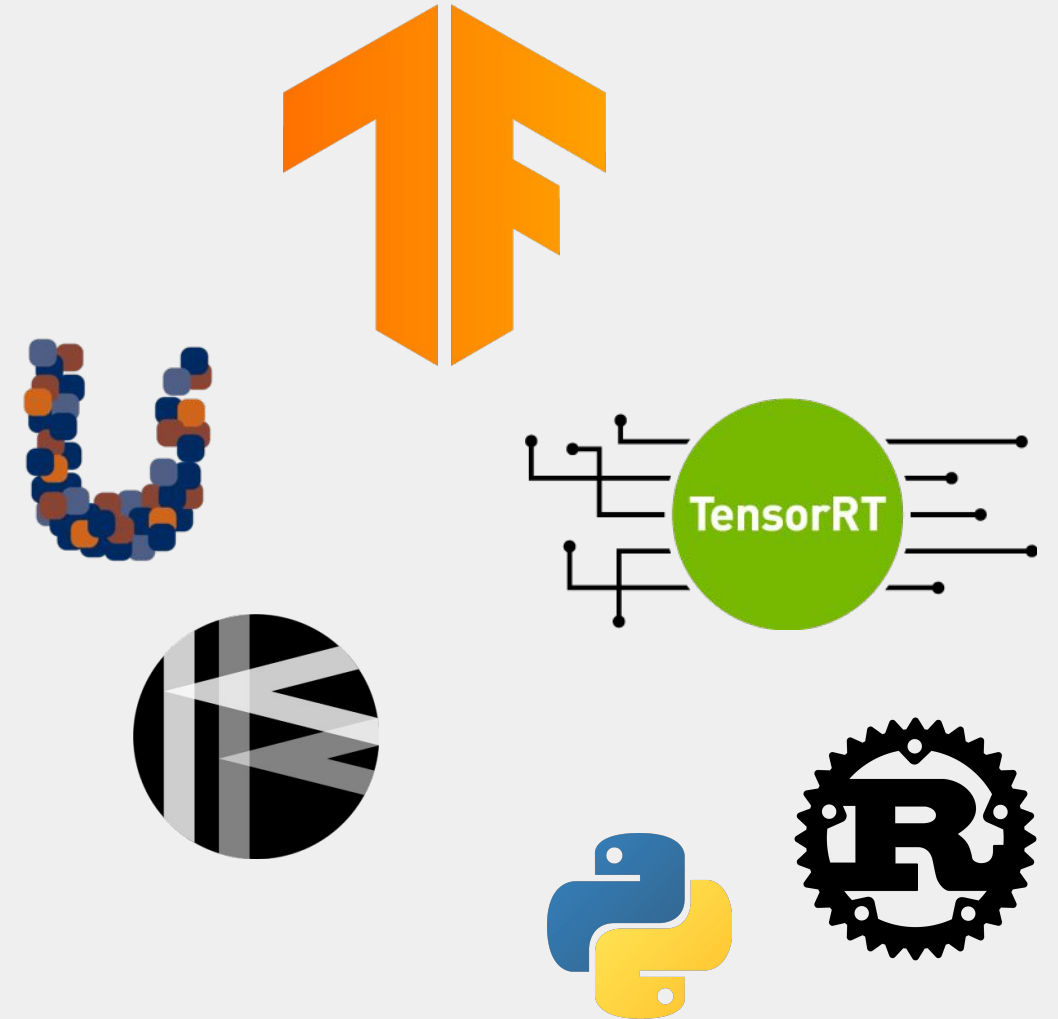
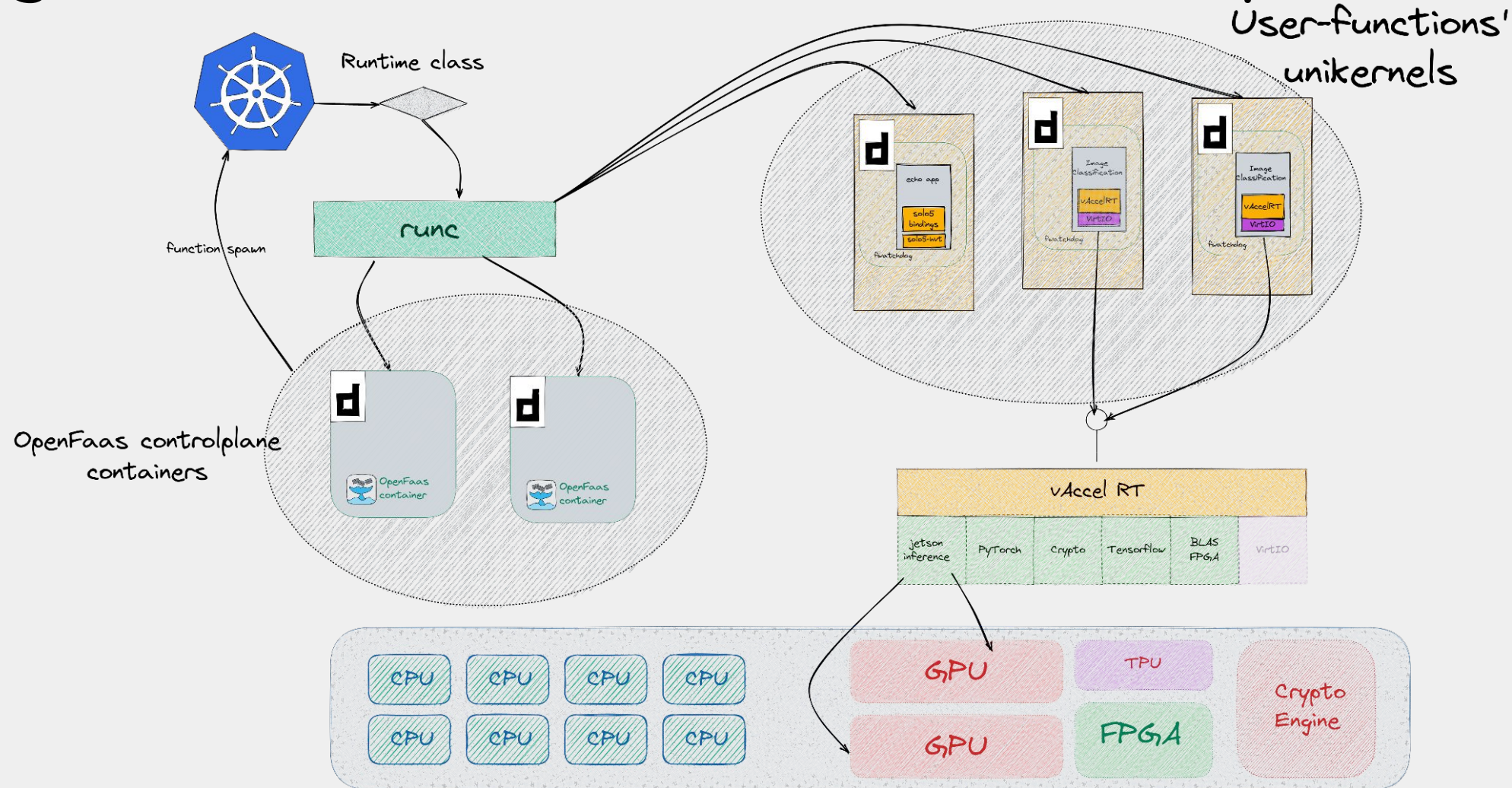


Image classification with Unikraft & OpenFaaS



Summary

- Serverless execution based on unikernels
 - reduce cold boot times
 - reduce attack surface
- we use vAccel to expose hardware acceleration semantics to unikernels
 - function-based hardware acceleration
 - multi-framework support
- next step: develop a pure unikernel runtime for upper-layer orchestrators





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Source Code & Demo info:

- vAccel: <https://vaccel.org> & <https://docs.vaccel.org>
- vAccelRT: <https://github.com/cloudkernels/vaccelrt>
- vAccel unikraft: <https://github.com/nubificus/unikraft-vaccel>
- openfaas-solo5: <https://github.com/nubificus/solo5-faas>
- openfaas-vaccel: <https://github.com/nubificus/unikraft-vaccel-faas>

Thanks!

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