# Leveraging the Serverless Architecture for Securing Linux Containers

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Abstract— Linux containers present a lightweight solution to package applications into images and instantiate them in isolated environments. Such images may include vulnerabilities that can be exploited at runtime. A vulnerability scanning service can detect these vulnerabilities by periodically scanning the containers and their images for potential threats. When a threat is detected, an event may be generated to (1) quarantine or remove the compromised container(s) and optionally (2) remedy the vulnerability by rebuilding a secure image. We believe that such event-driven process is a great fit to be implemented in a serverless architecture. In this paper we present our design and implementation of a serverless security analytics service based on OpenWhisk and Kubernetes.

Keywords—Linux containers, serverless architecture, Kubernetes, OpenWhisk, Docker, security analysis.

#### I. INTRODUCTION

With the wide spread adoption of Cloud technologies, workloads that were once served from on-premise servers, are now shifting to Cloud-based execution environments [1]. Linux containers are accelerating this shift by presenting a compelling model for simplified packaging and deployment of applications. Linux containers sandbox the applications based on built-in kernel mechanisms (namely cgroups and namespaces). This allows for a fast start-up time of containerized applications without penalizing the system performance by adding a virtualization layer. Containers are instantiated based on lightweight images that include mainly the files and libraries constituting the containerized application [2]. While removing the virtual machine abstraction layer improves performances, it leaves the system more exposed to security threats due to sharing the operating system kernel among containers on the same host. As a result, container security is a major concern that has been the focus of many recent studies [3][4]. Containers can have built-in vulnerabilities based on their configuration (e.g. insecure remote shells enabled), or by including executable binaries with known security flaws. Such vulnerabilities can be discovered by a vulnerability detection tool scanning container images at image build or ingestion to registry time. While DevOps best practices lean towards immutable containers, the reality is that many container owners apply updates to their running containers, which lead to introducing vulnerabilities, even when none where there initially. Moreover, the vulnerability detection tool database of known threats can be updated with new information, therefore, monitoring and introspecting containers, at runtime, can reveal any newly introduced vulnerabilities.

The state of the art containers vulnerability scanning services, upon discovering a vulnerable container, notify devops professionals in order to take appropriate actions. This manual reaction may take a long time giving an ample opportunity for exploitation of the detected vulnerability. In large clusters, container clustering and management solutions such as Kubernetes [6] are used to manage the scheduling and life-cycle of containers. In fact, major cloud providers such as IBM, Microsoft and Google offer the users the ability to automatically deploy their own Kubernetes clusters on their clouds. However, Kubernetes, as well as the other existing implementations of container clustering solutions (e.g. Docker Swarm [5]) does not support the mechanisms needed to deal with compromised containers. In this work, we seek to address this issue. We believe that the users should have control over how the security management is enforced on their containers, without requiring the users to maintain their own service to achieve this. We propose exposing a serveless archtiecture in the container Cloud that allows the users to create their own security policies in a generic way. Those policies can be enforced by the serverless framework when a threat alert is triggered. This would alleviate the burden on the users of implementing a security policy manager. Another advantage of using the serverless archtiecture is that it maintains consistency by providing a centralized policy manager, across multiple Kubernetes clusters. Hence by maintaining the policy outside of the Kubernetes clusters, adding or removing clusters at runtime does not affect the existing user policies.

Our contributions for this work are as follows: first, we introduce API extensions to a Kubernetes based container runtime platform, which enables quarantining of offending containers, and isolating them from the network, while preserving their state for future forensics. Second, we introduce a lightweight policy manager, based on a serverless framework, namely OpenWhisk [7], which enables devops and security professionals to rapidly develop ad hoc policies that enforce compliance and isolation of offending containers, by reacting to events from a security analytics engine and triggering actions that exercise the API extensions introduced above. And third, we extend a vulnerability scanning service to generate event feeds that trigger OpenWhisk policy execution. In this system, the serverless event listener, acting as a policy manager, links the event (vulnerability) generated by the vulnerability scanner to the action (quarantine API) using a quickly rigged policy that can be easily modified or augmented to support new unforeseen security scenarios.

## II. BACKGROUND

Serverless architecture is a computing paradigm that replaces always-on servers with ephmeral computing environments that are created in response to events, and removed after executing their tasks. Linux containers are a key enabler for this architecture due to their lighweight images, and fast startup time. Amazon AWS Lambda is well known example of a commercial implementation of the serverless architecture [8]. However Lambda is proprietary and platform specific. OpenWhisk on the other hand provides an opensource platform for implementing serverless services. In fact, OpenWhisk is an open source framework that implements a distributed, event-driven compute service. OpenWhisk runs application logic (actions) in response to events. Actions can be small custom binary code embedded in a Linux container. Application owners write stateless programs (called actions) and register these for invocation on specific event triggers. Event triggers are generated from feeds such as database writes or object store updates or through Web API invocation. Whenever an event is triggered, OpenWhisk instantly deploys and executes the appropriate actions. Each action runs in its own container. Once the action is completed the container is removed.

Kubernetes manages its containers<sup>1</sup> by using a masterworker architecture, where a kubernetes agent runs on each cluster node (worker) and reports back to the kubernetes master. The master exposes a management API that can be leveraged by OpenWhisk to execute the remediation actions.

#### III. ARCHITECTURE

We aim to introduce functionality to kubernetes that enables the system to react to threats in an automated manner based on user-defined policies. OpenWhisk is a key enabler for this functionality since it allows the users to create their own policies in a generic way. In the context of securing a compromised container, the security enforcement service should support abrupt termination, graceful termination, or a quarantine for containers. A graceful termination differs from the abrupt one in that it maintains the container logs, and the state of the container filesystem for future investigation before terminating the container. A quarantine is enforced by blocking any communication into and out from the compromised container.

## A. Overall Architecture

Our architecture is composed of four main components. The vulnerability scanner (VS) is our threat detection component. When users deploy new kubernetes clusters, they register the clusters with the vulnerability scanner and install scanner agents in the clusters. When the scanner detects a threat, it posts a notification to the users' registered OpenWhisk action which will determine the appropriate actions to take in order to mitigate the threat. The notification contains the identity of the container group (or pod in kubernetes terminology) impacted by the threat and the time of the scan. The OpenWhisk policy action invokes the appropriate

Kubernetes API extension which will relay the operation to the Security Enforcement Operator (SEO). Figure 1 shows the overall architecture of our security enforcement platform that leverages third party components like OpenWhisk, and the implementation of extension components like our SEO.

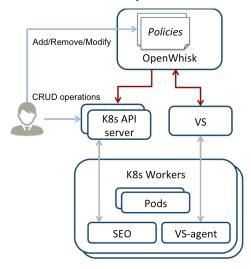


Figure 1. Overall Automated Threat Mitigation Architecture

## B. Vulnerability Scanning

Container vulnerability scanning tools such as Vulnerability Advisor [9], Docker Security Scanning [12] and CoreOS Clair [13] leverage online sources of vulnerabilities such as the Common Vulnerability Exposures database [14] and proprietary sources of threat intelligence to identify software vulnerabilities and insecure configurations. These knowledge bases evolve daily with new vulnerability discoveries which can lead containers that were previously deemed secure to become vulnerable.

Our vulnerability scanner leverages the capabilities of the Vulnerability Advisor to periodically scan running containers to discover vulnerabilities at creation time, new vulnerabilities disclosed during the containers life, and vulnerabilities introduced as a result of changes made to the running containers. This scan is performed by local vulnerability scanning agents that send container configuration information to the scanning service. Agents are deployed across all kubernetes cluster nodes. VS periodically ingests threat data from industry knowledge bases and evaluates them against the packages, files and configurations found in scanned containers. The scanner produces reports that identify specific software package versions in the container with disclosed vulnerabilities, and specific issues with the container configurations (e.g. ssh server is set up in the container.)

VS supports scans for multiple registered kubernetes clusters with installed agents and uses authentication tokens to restrict access to cluster data at the granularity of kubernetes namespaces. The scanner exposes RESTful APIs for access to vulerability reports for each container and implements a caller for OpenWhisk triggers implemented as Web APIs.

Scans produce new vulnerability findings and may trigger action invocations to the OpenWhisk API endpoints registered

<sup>&</sup>lt;sup>1</sup> In Kubernetes, pods abstract containers. A pod is a grouping of one or multiple containers that interact closely and share the same fate.

for the kubernetes cluster. Figure 2 illustrates an example sequence of interactions between the various components used by our automated threat mitigation framework.

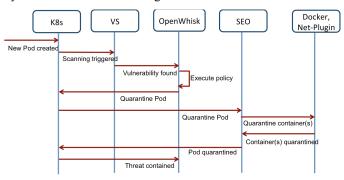


Figure 2. Example Flow for Threat Mitigation

### C. Serverless Policies

OpenWhisk provides a serverless platform for event-based programs. Application owners write stateless programs (called actions) and register these for invocation on specific event triggers. Event triggers are generated from feeds such as database writes or object store updates or through Web API invocation.

OpenWhisk provides a platform on which to implement adhoc policies that automate remediation of newly discovered vulnerabilities or security issues in containers.

To implement ad-hoc VS security policies in OpenWhisk, users start by installing the security notices package in their OpenWhisk namespace. The security notices package sets up a trigger that policy actions can subscribe to, and externalizes a Web API endpoint that acts as an event feed for the trigger. When VS scans a new container or image, it invokes the OpenWhisk Web API endpoint with the trigger belonging to the Kubernetes cluster owner. This invocation includes identity of the Kubernetes pod that has been scanned as well as the scan timestamp.

```
def main(params):
    findings = vs.get_findings(pod_id, timestamp)
    vulnerable_packages = findings['vulnerable_packages']
    insecure_configs = findings['insecure_configurations']

if len(vulnerable_packages) > 0:
        kubernetes.snapshot(pod_id)
        kubernetes.terminate(pod_id)
        return {'text': 'Deleted pod ' + pod_id }

if 'remote_shell_installed' in insecure_configs:
        kubernetes.quarantine(pod_id)
        return {'text': 'Quarantined pod ' + pod_id}

return {'text': 'Container was not modified ' + pod_id}
```

Figure 3. A security policy that terminates or quarantines pods according to the severity of security issues.

Figure 3 shows a policy that terminates a pod when software package vulnerabilities are found and quarantines the pod if the scan finding reveals that a remote shell server is installed. The action uses two modules for communication with the VS and the kubernetes cluster. The VS module invokes the get findings API of VS to obtain a list of vulnerabilities and

security findings for the pod. The Kubernetes module invokes the Kubernetes Web APIs to terminate or quarantine a pod.

## D. The Kubernetes Security Enforcement Operator

In order to enforce the security recommendations sepecfied in the OpenWhisk policies, we need an enforcement system with the ability to:

- communicate with every container engine in our cluster;
- isolate the containers beyond the scope of the container engine and Kubernetes;
- expose an API endpoint through which OpenWhisk can communicate its recommendations based on users' policies.

Presently, Kubernetes does not support any feature for container quarantine, or termination based on security recommendations. Therefore we had to introduce this feature through a security enforcement system that extends Kubernetes APIs. Kubernetes supports the notion of third party resources (TPR) to extend its API with endpoints that can be monitoried by external components refered to as Operators. We designed our Security Enforcement Operator (SEO) by leveraging Kubernetes TPR. SEO is deployed on each cluster node where it constantly monitors the TPR API extension for new events. When OpenWhisk invokes the extension APIs to create a security recommendation Kubernetes event, the Operator executes the actions specified in the event, and reports back the execution results. Our Operator can terminate (abruptly or gracefully), or quarantine any given container in the Kubernetes cluster.

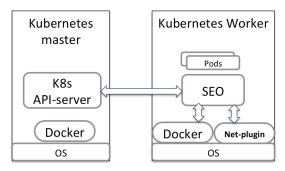


Figure 4. Security Enforcement Operator

We deploy our SEO as a Kuberntes daemonset. A daemonset deployment ensures that every node in the Kubernetes cluster has at least one instance of the Operator running. Our Operator implements three interfaces as shown in Figure 4. The first interface interacts with the Kubernetes API-server by listening to the third party resources endpoint events (creation, deletion, update) invoked by the policy actions (executed by OpenWhisk). The second interface interacts with our container engine (Docker) in order to commit the container filesystem (thus persisting its content) and abruptly terminate containers running in pods. The third interface interacts directly with the networking plugin used by Kubernetes to

manage the containers network configuration. Our SEO currently interacts with Calico, which isolates containers through a lower level mechanism (namely IP tables) in order to block any incoming/outgoing traffic related to an isolated environment.

## IV. RELATED WORK

The serverless architecture is still in its infancy, and therefore the related work on using serverless in the context of securing containers is rather scarce. However the research on securing containers is an actively growing area. The authors in [3] present a system protection tool, namely Starlight, that implements a kernel module that intercepts local operations on each host and passes them to a local agent which in turn passes them to an event processor that analyzes the event and determines whether or not to alert the admin. Similar to our approach, this work uses a centralized approach for threat analysis, and can learn with time what rules to enforce. It targets applications like the container engine to detect hostescape attacks. However, this work does not perform container scanning to detect threats, hence a dormant threat will remain unnoticed until it is activated, moreover that work does not leverage the use of serverless architecture to enhance efficiency, nor does it implement actions to quarantine compromised containers. In [4], the authors present LiCShield which generates AppArmor profiles by tracing the container engine (Docker daemon) during the build and the execution of the containers. The profile generation process, starts with a tracing phase by creating the container and tracing the kernel operations. The second phase consists of compiling the traces into AppArmor profiles for the container engine and the containers based on their images. LiCShield relates to our work from the aspect of targeting the same problem of securing Linux containers and the container engine. Nevertheless, LiCShield has the same limitations as Starlight, where it does not scan the containers for vulnerabilities, and therefore dormant threats will not be shielded against during the tracing phase. In fact we consider LiCShield and Starlight to be complementary to our work, since they also create security profiles for the container engine itself. We also believe that both works can leverage the serverless architecture to reduce their resource utilization. The authors in [10] present two models for defining the security properties of container-based systems, and argue that the two models are equivalent from the point of view of security threats. The authors also reached a conclusion that the security model adopted in Docker, if fully implemented, is adequate according to the criteria defined in the Common Criteria security certification. This work addresses broadly the criteria to secure containerized systems, which should be followed to ensure that the container host and docker engine are properly secured. The models compared in this paper provide a set of criteria to evaluate the security of a containerized system, however, these models provide general guidelines for configuring the system but they do not address services to detect and react to security vulnerabilities at runtime, which is the focus of our work.

In terms of using serverless-like architecture to introduce new functionalities in the cloud, the authors in [11] present two cloud event applications: one applying Lambdefy framework to demonstrate the differing requirements between applications deployed to IaaS and applications deployed as a cloud event, and Media Management System for showing high scalability of image resizing tasks on Lambda. Similar to our work, this paper addresses use of cloud event technology. However the focus of this paper is performance metrics and optimization aspect of cloud event application using Lambda, and its target is high-performance media management system. It does not address cloud event application to security vulnerability detection nor security for container-based systems.

#### V. CONCLUSION AND FUTURE WORK

In this work we presented our serverless architecture for securing Linux containers. Our approach provides continous scanning for containers. Upon the detection of vulnerabilities, our automated threat mitigation framework analyzes the vulnerability reports, and based on user defined polycies, triggers the proper action needed to mitigate and contain the threat within the compromised container. In our future work we will investigate the use of artificial intelligence (e.g. machine learning) to automatically generate the security policies based on the severity of the detected threats.

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