An efficient deception architecture for cloud-based virtual networks

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Abstract

Emerging deceptive systems present a new promise for the uprising security problems in cloud-based virtual networks, especially those operated by small and medium enterprises. The main goal of deceptive systems is to form a layer of defensive nodes in an Internet-accessible cloud-based virtual network to distract and deceive malicious clients. While numerous approaches provide distinct models for developing decisive systems, misery digraphs present a promising decisive model for distracting powerful remote intrusions. Misery digraphs can delay access to targets deep in a cloud-based virtual network. A central challenge to the theory of misery digraphs is verifying their applicability in prominent cloud computing platforms as well as measuring the efficiency of networks that adapt them. Thus, an architecture is needed that can be realized with long-term support technologies and can be deployed for large networks. This work presents and analyzes a high-throughput architecture for misery digraphs, embarking on implementation details and a performance analysis. A full implementation of the architecture in Amazon Web Services imposes modest performance delays in request processing, while highly delaying stealth intrusions in the network.

Keywords: Architecture; cloud security; intrusion prevention; web application security; web services

1. Introduction

Cloud-based virtual networks enable small and medium enterprises to rapidly and efficiently initialize, deploy, maintain, and evolve networks of virtual machines. For example, a startup company can utilize a virtual network for connecting a user-end client application to the company's services by launching virtual machine instances that could be conveniently connected to Internet gateways, subject to firewall and access control rules. Prominent cloud computing platforms such as Amazon Web Services and Google Compute Engine provide both programmable interfaces to manage virtual machine instances and modify their ac-

cess control rules. While solutions have assisted small and medium enterprises in achieving their rapid growth, security challenges continue to threaten these networks, causing unprecedented costs as a result of attacks, which can lead to disastrous consequences.

Among the many security problems, remote vulnerabilities are of critical importance. A remote vulnerability in an Internet service can potentially allow intrusion into hosts that constitute a network's surface. These hosts are connected to the Internet, receive requests from clients, and communicate them to isolated databases, application servers, and other services within the network. The intrusion's goal is to gain remote execution access on the

victim host, for example through opening a remote shell, or by hijacking a vulnerable application to divert the execution, ultimately creating malicious user accounts on the target. When under control of the intruder, the victim host in the network's surface would allow the attacker to further exploit vulnerabilities within the network by investigating hosts that are accessible from the compromised one.

Network deception is a potential solution for slowing the rapid progress of intrusion in a virtual network. To this extend, in a previous work, the concept of misery digraphs was introduced, which provided a dynamic structure within a network of web services, distracting and confusing the attacker who wishes to compromise a specific target deep in the network (Almohri et al. 2018). In the proposed solution, a cloud-based virtual network is modeled as a connectivity digraph representing the network's accessibility structure. The connectivity digraph is then converted into an expanded structure of decoy nodes that are dynamically modified over time, consistently losing an intruder's effort towards a target. Misery digraph is a powerful concept that requires intensive implementation and testing.

The present work investigates an architecture of the misery digraphs that enables a dynamic network structure within Amazon Web Services. The architecture includes several components that, given an initial network setup, transform an existing cloud-based virtual network into one that includes misery digraphs, implementing a full misery digraph defense system. This requires a careful design of a transformation process, a realistic implementation of misery digraphs using a service-oriented network, and an analysis of feasibility of the proposed system.

1.1 Problem statement

This work investigates the problem of efficient transformation of web services in cloud-based virtual networks into deceiving networks containing misery digraphs. The focus is on networks that are created on Amazon Web Services (AWS) with complex struc-

tures, containing multiple web servers, application servers, and database servers. The assumption is that the web servers, which form the network's surface, are vulnerable to remote attacks and the attacker does not have prior access to servers. The attacker's target is a critical asset, such as a database server in the network.

1.2 Approach and results

The approach is to design an architecture that realizes misery digraphs in AWS. Since misery digraphs complicate an attack path (by enlarging the path to target, adding decoys that are continuously relocated), the challenge is to minimize the performance penalty facing benign network requests. Thus, we designed a transformation process that aids network managers to implement misery digraphs according to the specifications in (Almohri et al. 2018). The transformation process receives a conventional (and vulnerable) virtual network and produces a network of misery digraphs, including the network paths of the original conventional network while adding decoy paths. Increasing the entropy for attackers, misery digraphs evolve and change their structures over time. This dynamic nature of misery digraphs requires a special proxy system for forwarding network requests from the network's entry points towards the target. We developed the proxy system for misery digraphs based on Apache's reverse proxy module. The efficiency of the approach was measured by constructing two networks that perform identical functions, one using misery digraphs as the underlying topology, and one that uses a minimal connectivity digraph. The results show that misery digraphs impose modest performance penalty when processing HTTP requests when compared to networks that do not implement misery digraphs.

2. Background

While no prior work has proposed a practical and efficient architecture for deceiving systems for the cloud, the literature includes a wide spectrum of deception and moving target defense techniques for combating power-

ful network attacks. Some of the earlier pioneering works in deception focused on the use of overlay networks as the core idea of deceiving, distracting, and slowing denial of service attackers targeting specific hosts within a network. Secure Overlay Services (SOS) (Keromytis et al. 2004), and later Web-SOS (Morein et al. 2003), utilize an overlay network and enforce strict verification of the sources of incoming requests when communicating with a host. If a source passed verification, a subset of hosts act as proxies that forward the traffic towards hidden servers (often serving applications) within the network. The proxies are secret and their identities are not exposed. The assumption in SOS and Web-SOS is that both parts of the communication are known a priori.

Network overlays, the use of proxy servers, and the assumption of known clients was the underlying approach for many other related work. Within this context, Migrating OVErlay (MOVE) (Stavrou et al. 2005) was introduced, advocating the idea of client filtration via authentication, and used client migration as a policy for maintaining service availability as well as detecting abusing clients (also called insiders). MOVE, similar to others, built on ideas from moving target defenses (Hong and Kim 2016; Evans et al. 2011). The idea behind MOTAG (Jia et al. 2013) was to provide a hidden contact point to each legitimate client, when the client is registered and authorized to use the service. MOTAG uses these hidden contact points (or proxies) to filter clients and control access to application servers. Later, address shuffling and client migration are also used in MOTAG to bypass attacks. Moving target defenses do not necessarily aim to deceive attackers, but to keep attackers in the dark, random port hopping was proposed (Badishi et al. 2007), which distracts denial of service attackers while using packet filtration to recognize legitimate traffic. Similar to randomizing ports, redundant data routing paths (Lee et al. 2007; Shu et al. 2010) is a technique that can potentially distract attackers.

Defending against denial of service in clouds has has been the subject of some other recent studies. One proposed approach is to use elastic cloud features to guard against a growing distributed denial of service attack (Jia *et al.* 2014). Misery digraphs avoid the ever expanding networks due to denial of service vulnerabilities by modifying the existing network of machines, thus preventing overhead costs.

The idea of deception has also been widely studied in various other forms, including deceptive attack techniques (Spitzner 2003; Lisý et al. 2010; Alowibdi et al. 2014), defense techniques that use software defined networks to deceive attackers (Jafarian et al. 2012; Achleitner et al. 2016), defending against nonvolumetric distributed denial of service attacks (Pal et al. 2017), slowing down network scanners (Alt et al. 2014), occasional trap-setting to detect illegitimate insider activities (Bowen et al. 2010), and as virtualized honeypots atop the production network (Stoecklin et al. 2018; Han et al. 2017).

2.1 Misery Digraphs

Misery digraphs (Almohri *et al.* 2018) take a radical approach and form a theoretical basis for deception in cloud-based virtual networks. Similar to attack graphs (Hong and Kim 2016; Miehling *et al.* 2015; Almohri *et al.* 2016), misery digraphs model host access control rules in a cloud computing platform as a digraph. The resulting digraph is input to an algorithm to enlarge and stretch every path from an entry point to a target host. An entry point is a host that is accessible over the Internet without filtration based on origin's IP, while the target is a host that is only accessible through entry points.

The core elements of misery digraphs are: (1) multiple, identical, and enlarged paths to a target, and (2) a schedule of reseting and relocating hosts on randomly selected paths to target. For example, a simple path to target,

$$u_1 \rightarrow u_2 \rightarrow t_1$$

is converted into a digraph consisting of a k-

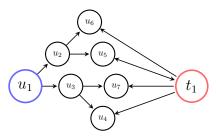


Fig. 1. A misery digraph generated for the attack path $u_1 \rightarrow u_2 \rightarrow t_1$, with an embedded binary tree. An edge $u_i \rightarrow u_j$ means u_i can directly access u_j via some network protocol. In reality, u_1 is a web server, u_2 and u_3 are application servers, t_1 is a database server, and the rest are reverse proxies.

ary tree, with a single *enabled* path towards t_1 , as depicted in 1.

A cloud-based virtual network implementing misery digraphs would need to replicate a network request to nodes directly accessible from an entry point. For example, in Figure 1, a request R_1 received at u_1 will be replicated and sent to u_2 and u_3 , which in turn replicate R_1 to the layer below. The nodes at the final layer u_4 , u_5 , u_6 , and u_7 attempt to forward R_1 to t_1 . Misery digraphs guarantee that R_1 will reach t_1 through one and only one path (through $t_1 \rightarrow u_7$ in the example digraph of Figure 1). The rationale is to confuse the attacker early on in the digraph about the true path towards the target.

Misery digraphs are also required to maintain freshness through a schedule of changes to the location of nodes. At fixed time intervals, a controller procedure inside the network selects two nodes at the same layer (for example, u_4 and u_6 in Figure 1) and switches their locations in the digraph. Next, the hosts representing the nodes are deleted from the network, and two fresh hosts are created and added in their location. The hosts will be created from images that contain the required software for processing requests.

While simulation is a useful method for assessing the effectiveness of misery digraphs and similar models, this work attempts to provide a realizable and practical architecture, addressing challenges facing system administra-

tors when adapting the model, including challenges concerning the required implementation and performance tuning.

3. Architecture

Our design of misery digraphs has two prime components. The first is a component to implement the continuous evolution of the digraph (Figure 2) resulting in a Moving Target Defense (MTD). The second component implements a deep traversal of the client's request through the Misery Digraph Cloud, sending the response back to the client. This process follows a multicasting method as described in Section 2.1. The focus of the architecture is on implementing two tasks:

- 1. Constructing a Misery Digraph Network using pre-existing cloud architecture and deploying the constructed network to the cloud as a set of instances and firewall rules (security groups rules in AWS terms).
- 2. Frequently selecting random instances of Misery Digraph Cloud to switch their parents and children and reset their images. This process is referred to as the *Transformation Process* (TP).

Throughout this work, *Misery Digraph Network* refers to the theoretical representation of the network as a graph data structure, and *Misery Digraph Cloud* refers to the realization of misery digraphs in the cloud as a set of instances and security groups. Also, a client is defined as an application that is served by the Misery Digraph Cloud.

Figure 2 shows the Moving Target Defense component of our architecture. As a first step, the administrator builds the architecture of the cloud and defines firewall rules, then *Cloud Constructor* creates a Misery Digraph Network using the same method as in (Almohri *et al.* 2018), filling the network with decoys and deploy this network to the cloud. Once the Misery Digraph Cloud is ready, *Movement Manager* selects two random instances from a layer in the misery digraph, which only contains sibling nodes. The first layer and the

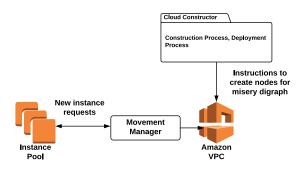


Fig. 2. Our architecture includes a cloud constructor, which examines the initial topology of the cloud-based virtual network, expands it to one with an embedded misery digraph of decoy nodes with a special access control setting, and automatically deploys the resulting topology in the network's Virtual Private Cloud (VPC). A movement manager uses a pool of initialized virtual machines to continuously evolve the resulting network by a systematic mutation of the misery digraph.

last layer (layer at depth d+1, containing the target node) are excluded from selection by the Movement Manager. Note that a misery digraph is created using two parameters: a branching factor k, and the number of layers d+1. Once the layer is selected, the Transformation Process is performed at the selected layer. This entire process of selection and transformation is repeated each period of time t.

Figure 3 shows the life cycle of client's request in the MDG cloud. In our architecture, the life cycle of a request starts by receiving it in an entry point node. Compared to a normal processing of a HTTP request, which is sent to an application server and finally to a database server, our architecture modifies this path by multicasting the request to a layer of decoy nodes. This multicasting continues until it reaches a Request Server instance from which a database request is created. The requests are cached in a database registry, awaiting responses from the database server. Once the response is received, it is propagated back up the tree until it reaches the entry point.

The entry point instance is the only instance of Misery Digraph Cloud that is publicly ac-

cessible. A client sends a request to the entry point which runs the Misery Multicaster that multicasts the requests received from parent nodes in the previous layer to all children in the next layer. Once the request reaches layer d, a request to the target is stored by the *Requests* Server. The RS will then wait for the PS to ask about the request. The Polling Server runs on the target itself and connects to Requests Servers on layer d to query them if there is any new request for the database. If so, the requests will be processed and the response will be sent to the Requests Servers. A response travels backwards (in the opposite direction of the leaves) until it reaches the client through the entry point.

Isolated Target refers to disallowing any instance of layer d to reach the target, letting the target to poll the requests instead. This is one of the differences from what is presented in the original work (Almohri et al. 2018).

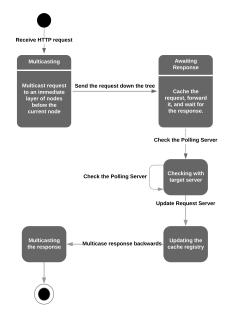


Fig. 3. Life cycle of a client's request in the Misery Digraph Cloud.

The presented architecture is intended for testing on Amazon Web Services (AWS). Despite this, the main ideas are applicable to competitors because the architecture was designed to be generic with the least dependency on the underlying technology specific to AWS. Throughout this work, references are made to AWS Elastic Compute Cloud (EC2) instances,

which are virtual machines that are computationally independent and are created using programming tools available to cloud users. A cloud refers to an account on a cloud computing platform containing a virtual network of EC2 instances.

3.1 Cloud constructor

In order to construct the Misery Digraph Cloud, the cloud administrator should set the preferred values of the parameters d and k, the parameter d+1 represents the number of the Misery Digraph Network's layers, while k represents the number of children for each node in the graph that belong to layer $1, \ldots, d$. After setting the parameters d and k, the Cloud Constructor uses the Amazon Web Services Application Programming Interface (API) to retrieve the current architecture of the cloud, including the instance information and security groups. In our architecture we defined a tag named instance_type with the value mdg for each instance the administrator would like to use in constructing Misery Digraph Cloud. Cloud Constructor identifies those instances and their security groups and leave other instances.

By analyzing the rules of security groups, the enabled services in the current cloud are identified (e.g. web server, ftp server, SSH, etc.). The Constructor creates connectivity digraphs for each available service. nectivity digraph represents the firewall rules that enable communications amongst two connected instances. Thus, an edge (u, v) entails that network communication is enabled from instance u to instance v. Based on the created connectivity digraphs, a misery digraph will be created for each service. In this step of creating misery digraphs, the network will be filled with decoys depending on the values of the parameters d and k. Once all misery digraphs of each service are constructed, a union operation will be performed on them to get the final misery digraph. The final misery digraph is referred to as the Misery Digraph Network. At this stage, Constructor deploys Misery Digraph Network to the cloud. Depending on the edges of Misery Digraph Network, security

groups and their rules will be created to facilitate routing network requests across decoy machines in the network. As the new digraph requires redundant decoy nodes, the corresponding EC2 instances will be created, resulting in a *Misery Digraph Cloud*.

To enhance the performance, the operating system images of Misery Digraph Cloud should be ready and stored as Amazon Machine Images (AMIs) in the AWS cloud. Three types of images should be available: (1) A Misery Multicaster image which will run the entry point and all instances of all layers but layer d (the layer right before the target) and d+1 (target's layer). (2) Isolated Target Requests Server image, which runs the layer d, web application (that is, an application that connects to the target service) should reside in this image. (3) Isolated Target Polling Server image, which runs the target (layer d + 1), the database server (which is the attacker's target according to our assumption) resides in this image.

3.2 Evolving misery digraphs

As mentioned earlier in Section 2.1, a misery digraph prevents an intrusion from reaching a target machine by: (1) continuously interchanging two nodes, and (2) deleting and replacing a node with a new node. The goal behind these two properties of misery digraphs is to lose the effort of an attacker on an attack path towards the target. The Transformation Process of our architecture implements these two features. When creating new instances, the TP faces a challenge: AWS approximately requires five minutes of effort to create an regular EC2 instance. Since the Transformation Process involves replacing a running instance with a fresh instance, the five minutes delay causes a bottleneck. To mitigate the delays in creating instances, the Movement Manager (Figure 3) maintains an instances pool. The Movement Manager creates a set of s instances in the instances pool for future use. Depending on s and the number of running instances and their image types, the Movement Manager computes the minimum number of instances

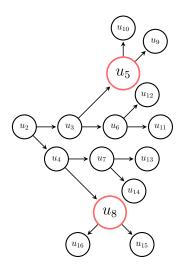


Fig. 4. In this network, the nodes u_5 and u_8 are randomly selected and switched such that in the new resulting network, u_8 's parent is u_3 , while u_5 's parent is u_4 .

needed in the pool while taking into consideration that creating a new instance during the reset process should occur as infrequently as possible. After initializing the instances pool, two random instances will be selected, at a layer a of the misery digraph, from a random layer but target and entry point's layers. In other words, the entry point and the target instances shall not be selected. The Transformation Process performs two functions:

• Switching ensures the disconnection of the attacker's session which connects him to a compromised instance from layer a +1. This compromised instances parent is also one of the selected instances. When this process is performed, the changes will be committed on both Misery Digraph Cloud in Misery Digraph Network, this process is implemented by switching the parents and children of the two selected instances. Technically, the security groups of the two instances will be switched. Figure 4 shows an example of the switching process. The network in this figure is a part of a complete MDG network, In (A) both u_5 and u_8 were selected for the switching process. In (B) the switching was performed, as we can see the parent and the children of u_5 and

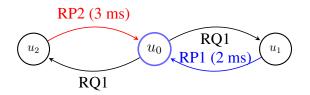


Fig. 5. When sending the request RQ1 to decoys u_1 and u_2 , the Multicaster awaits for the fastest response, RP1 in this case, and discards the slower ones.

 u_8 were swapped.

Resetting replaces those two selected instances with other pool instances that have the same image. It ensures that the other instances of the Misery Digraph Cloud can communicate these new instances. A new pool instance will be created for each consumed instance pool in the process with the same image type. An instance will be created on-demand on the case where no pool instance of the image is available. After finishing this process, the replaced instance will be terminated. This process helps when the attacker has installed a backdoor or turned the instance to a bot.

3.3 Multicasting requests

Misery Digraph requires an instance to multicast any request to the whole instances in the next layer. It ensures the integrity of the message and hides the true path to the target. The Misery Multicaster is a reverse proxy server with multiple targets instead of just one target. Misery Multicaster runs the entry point and all instances but layer d instances and the target.

The first step of a client's communication starts with the Misery Multicaster. We have implemented this component by using an open source project MapProxy, which uses the Tornado network framework. As shown in Figure 5, when a new request is received by Misery Multicaster, the same request is retransmitted to the instances of the next layer. Let ep be the entry point which resides in layer 1 and u_1 and u_2 be the instances of layer 2. In this case any new request will be sent to both u_1 and u_2

by ep. Subsequently, ep is going to wait for the response. Once the fastest instance sends the response back to the ep, the response will be sent directly to the client. The response of the slower instance(s) will be discarded. The same method is used with a larger number of instances in the next layer of Misery Multicaster instance.

3.4 Design of Isolated Target

The idea of Isolated Target is to isolate the target from any external or internal connections. Thus, no entity can connect to the target using any port. It is believed that by implementing IT, the security of the Misery Digraph Cloud will be improved. While Misery Multicaster is concerned with the client's HTTP request, Isolated Target addresses the web application's request to the database. As mentioned earlier, the Isolated Target consists of two components: (1) Requests Server (RS) and (2) Polling Server (PS). The details of both components will be examined in the next subsection.

3.4.1 Requests Server and Polling Server

In our design, the web application interacts with the *the database server* as the Requests Server. We developed the Requests Server as a MySQL server that runs on port 3306 in our setup. Note that the Requests Server is not a real database management system; it only behaves as one in the handshaking stage of the connection with the web application. This is completed with one goal: to get the request that should be sent to the real database and store those requests.

When a client requests a page from the web application, the request is transmitted through the network from the entry point by using the Misery Multicaster. Layer d of the Misery Digraph Cloud contains instances that run web servers (e.g. Apache HTTPd). The web servers process the request according to the web application's code. When the code needs to connect to the database (which is the target), it connects to the Requests Server instead.

In the beginning of the session between the web application's code and Requests Server,

the latter is going to behave as a MySQL server to get the request of the application (e.g. query some table). Once the application's request is received, it will be assigned with a unique identifier and then be stored in a location in the Requests Server. One such location can be the Requests Server's memory, but we have chosen to store those requests in the disk by using the SQLite3 database engine. Up to this point, the application is waiting for the response from what it believes is the database server (where it is actually the Requests Server), and the Requests Server is waiting for Polling Server.

The Polling Server runs on the target itself. The PS in the same machine the real database server exists. For each short time interval m, Polling Server asks all Requests Servers of layer d if there is any new request for the database that has not been handled. If so, those requests will be consumed by PS and sent to the real database. Once the response arrives, it will be send back the Requests Server that issued that request.

3.4.2 Handling dynamic IP addresses

Recall that Misery Digraph Cloud evolves over time. When two nodes u and v are interchanged, Misery Multicaster must update the IP addresses of u and v in the nodes of the next layer. Similarly, the Polling Server must be updated with the IP addresses of layer d instances to be able to query them about new requests. Thus, there is a need to dynamically and efficiently update IP addresses across the misery digraph. This dynamic updating is handled by the Address Server (Figure 6).

Figure 6 shows the communication between the Movement Manager and Address Server in both the Misery Multicater and the Polling Server. Initially, when a new instance of the Misery Multicaster and the Polling Server are started, a list of needed IP addresses will be stored in a list that will be maintained and used in the future. AWS APIs are be used to initialize this list. When interchanging two instances on any layer (except layer *d*), the Movement Manager connects to the instances' parent Address Server to update the Misery Multicaster

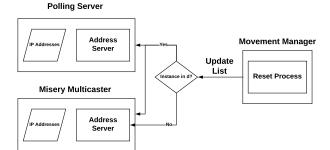


Fig. 6. The communication between Movement Manager and Address Server in both the Misery Multicaster and the Polling Server. When the selected instances are in layer d the Movement Manager communicates both the Polling Server's and the Misery Multicaster's Address Server. Otherwise, the Movement Manager only communicates with the Misery Multicaster's Address Server.

with the changes. This causes the Misery Multicaster to query AWS API again to receive the new list of next layer's IP addresses. Similarly, when an instance of layer d is reset. In addition, it tells its parent to update the IP addresses. The Address Server of the target will then be connected by the Movement Manager, and it will be updated with the new IP addresses of layer d.

4. Performance

The main goal of this work is to assess the feasibility of implementing misery digraphs in real-world networks in terms of the processed traffic in regular web applications. For this assessment, multiple rounds of tests were performed on a synthetic cloud-based virtual network created using an AWS account. The traffic processed by a normal cloud-based virtual network is compared with two variations of misery digraphs. The experiments reveal that while misery digraphs can incur performance penalties and request processing failures, the system's performance penalties are reasonable compared to the magnitude of confusion created for the attacker.

Experimental Setup. The experiments were performed on t2.nano and t2.micro instances with a single core processes and 500MB and

Comparison of performance in three cloud-based networks

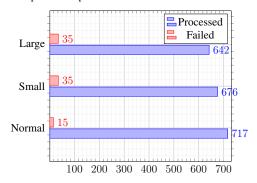


Fig. 7. An overview of the results of the experiments with a normal cloud, a small misery digraph with four layers, and a larger misery digraph with five layers.

1GB RAM, respectively. A Transformation Process ran on an EC2 instance, performing both switching and resetting of instances throughout the misery digraph. A request emulation tool was developed to send a new request to the entry point every few seconds awaiting the responses. When a response was received within a timeout window, the request will be considered a success, otherwise it will be considered a failure. Recall that d refers to the number of layers in the Misery Digraph Cloud, and k refers to the number of children for each instance in misery digraph network. Let j be the duration of an experiment, r the frequency of the Misery Process (the number of times the misery digraph changes), and u is the waiting time for a response.

The results of the experiments are depicted in Figure 7. Processed requests capture the number of requests processed by the web application during the course of an experiment. The failed requests captures the number of requests that could not be processed within the same period. The y-axis values refer to the type of network that was used in the test (cloud with a small misery digraph, cloud with a large misery digraph, normal cloud with no misery digraph).

A normal cloud is one that does not include a misery digraph. We conducted an experiment on a normal network which had three EC2 instances. The first one was an entry point which

works as a reverse proxy for the second instance which ran Apache HTTPd and a tiny PHP page that sent a query to the third instance which contains a MySQL server. The entry point instance ran Apache HTTPd with mod_proxy extension to behave as a reverse proxy server.

All of them were t2.nano but the database server was t2.micro. Each instance had 8GB of storage. The operating system images that were used for the instances were based on Amazon Linux AMI 64-bit. In this experiment d=0 and k=0 since it was a normal network and not a misery digraph cloud, j=10 minutes, r=100 seconds and u=1 seconds. The goal was to find the number of requests that normal network could handle and compare those numbers with networks that includes a Misery Digraph. Our normal cloud could handle an average of 716.5 requests with a maximum of 15 failed requests.

A Misery Digraph Cloud extends the architecture of the normal cloud by including a tree of redundant virtual machines that mediate the entry point and the target. We created two Misery Digraph Clouds, one with d = 3, and one with d = 4, with the branching parameter k = 2. We prepared two different operating system images to be used in the instances pool. The first one contained the Misery Multicaster based on Amazon Linux AMI, The second one contained the RS that implemented the Apache HTTPd and a PHP script that connected to a database for testing using a Ubuntu Server 16.04. Another image was built based on Amazon Linux AMI, which was used for the Network Constructor that created the Misery Digraph Cloud, which contained the Polling Server and the target database server (with a MySQL engine).

In both experiments, j=10 minutes, r=100 seconds and u=1.5 seconds. As one can see, the average of successful requests with d=3 was 675.8, with a performance penalty of 40.7 requests compared to the normal cloud. When the misery digraph was created using d=4, the average of successful requests was 642 with a performance penalty

of 74.5 requests from the normal network. The most failures were with the executions that performed the Misery Process on the second layer instances.

5. Discussion

Our architecture demonstrates techniques for realizing misery digraphs in cloud-based virtual networks running conventional web applications. Here, we consider both the security and the scalability issues and provide an analysis and a direction of future work.

The security of the presented architecture depends entirely on the security promises of misery digraphs. Attackers are assumed to be remote. The requests are assumed to be first attack attempts to exploit the target machines to prepare for malicious data requests to follow through the network. Our architecture does not distinguish between the two types of attack request and delays both types regardless of intents. However, attackers may attempt to mimic a normal request, taking advantage of the fair treatment of requests by misery digraphs as they travel through the network. This attack can be beneficial only when the initial attacking requests succeed in exploiting machines in the very first layer of misery digraphs. Consequently, the attacker must escalate privileges to initiate new requests from an exploited machine. This attempt can be prevented by modifying the web application and banning it from initiating new requests, unless the requests come from a remote and registered client.

A second possibility of attack is the threat from insiders, which are those users within the organization that have access to a subset of nodes in the expanded cloud-based virtual network with an enabled misery digraph. Given enough nodes en route to the target, the insider may attempt to create malicious requests or launch an attack on other machines. This is a vulnerability in the existing architecture and requires mitigation, which is left for a future work.

The scalability of the architecture depends on a fast processing and cache management of misery digraphs. As demonstrated in our work, given current web server performances, one can create highly scalable misery digraphs with low error rates. One may suggest creating even larger misery digraphs for better mitigation of the attack. However, as demonstrated in (Almohri $et\ al.\ 2018$), a misery digraph with d=4 with fast switching is confusing enough for attackers. It remains a question whether misery digraphs are effective against distributed attacks, another topic for future investigation.

6. Conclusion

Prior to this work, the practical and performance feasibility of misery digraphs were not systematically explored. This research contributes to the idea of misery digraphs by presenting an efficient and high throughput architecture that can be used in practice. The main constraints of this work were to use existing prominent cloud technologies and high request processing performance, which were achieved. In the future, this work will be expanded to explore the idea of adaptive changes to the underlying misery digraph as a real time response to detected attack incidents.

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