CONCEAL: A Strategy Composition for Resilient Cyber Deception– Framework, Metrics and Deployment

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Abstract—Cyber deception is a key proactive cyber resilience technique to reverse the current asymmetry that favors adversaries in cyber warfare by creating a significant confusion in discovering and targeting cyber assets. One of the key objectives for cyber deception is to hide the true identity of the cyber assets in order to effectively deflect adversaries away from critical targets, and detect their activities early in the killchain.

Although many cyber deception techniques were proposed including using honeypots to represent fake targets, and mutating IP addresses to frequently change the ground truth of the network configuration [12], none of these deception techniques is resilient enough to provide high confidence of concealing the identity of the network assets, particularly against sophisticated attackers. In fact, in this paper our analytical and experimental work showed that highly resilient cyber deception is unlikely attainable using a single technique, but it requires an optimal composition of various concealment techniques to maximize the deception utility. We, therefore, present a new cyber deception framework, called CONCEAL, which is a composition of mutation, anonymity, and diversity to maximize key deception objectives, namely, concealability, detectability and deterrence, while constraining the overall deployment cost. We formally define the CONCEAL metrics for concealability, detectability, and deterrence to measure the effectiveness of CONCEAL. Finally, we present the deployment of CONCEAL as a service to achieve manageability and costeffectiveness by automatically generating the optimal deception proxy configuration based on existing host/network configuration, risk constraints of network services, and budget constraints. Our evaluation experiments measure both the deception effectiveness based on the above metrics, as well as the scalability of the CONCEAL framework.

I. INTRODUCTION AND MOTIVATION

Cyber deception is an act of intentional misrepresentation of facts in order to induce an incorrect perception of reality in adversaries mind. As a result, an adversary can be mislead about the true configuration of the system such that thier belief will be different from the reality. This false reality can assist in deflecting adversaries to a desired state of knowledge for invalidating their effort, slowing down their progress and/or learning about their goals and techniques, even when adversarys techniques are unknown.

We believe that an effective cyber deception technique requires at least these five criteria: (1) It should provide a resilient *concealment* of the identity of cyber assets (at least the critical ones) including the real and fake (e.g., honeypots

services), even if they are at some point discovered, (2) It should significantly increase the potential mistakes of the attackers (detectability), (3) It should significantly increase attackers' effort to achieve the target (deterrence); (4) It should provide automated configuration management that is highly transparent to users; (5) It should scalable to a large number of services and hosts, and (6) It can be tuned to provide costeffective configurations based on mission risk and deception cost. Most of the existing deception techniques fail to satisfy these criteria, thereby they provide very limited deception effectiveness. In specific, honeypots configuration are static and can be easily detected and blacklisted by skilled attackers. In addition, while IP mutation are effective in slowing down reconnaissance attackers proactively, they can not fully hide the identity of hosts and service against fingerprinting attackers. Moreover, deploying a large number of honeypots is expensive and unmanageable.

Since every deception technique has its own benefit and cost, and every asset may have its own risk based on exploitablity and impact, it is important to find a composition of multiple deception techniques to achieve superlinear effectiveness than applying them individually, while satisfying the budget, risk, and operation constraints. In this paper, we present a new deception framework called CONCEAL that composes m-mutation for address anonymization, k-anonymity for fingerprint anonymization and l-diversity for configuration diversification in order to satisfy the above objectives. Here mmutation means that for every 1/m seconds, the addresses of the hosts are mutated, k-anonymity means that for each network host a group of k-1 hosts with identical fingerprints (called shadow services) are placed in the network, and l-diversity means that for every service type (e.g., web service), at least l-1 fake (operationally unused) services of the same type but with different vendors, versions, or patch levels are placed in the network (e.g., Apache, IIS, etc for webservices).

To develop CONCEAL as a cloud service, the clients' requests will be directed to the CONCEAL gateway which will then translated and redirected based on the site configuration to the appropriate real or proxy (shadow or diversity service) hosts. To minimize the number of CONCEAL proxies, the gateway may redirect requests destined to many IP addresses

to a single physical proxy machine. Therefore, we model the problem of finding satisfiable composition of mutation, anonymization and diversity as a constraint satisfaction problem using Satisfiability Modulo Theories (SMT) [8] to find the appropriate values of $m,\,k,\,l$, and the gateway configurations that minimize the cost of physical proxies for shadow and diverse services.

Our implementation and evaluation validate the effectiveness and scalability of the CONCEAL framework. The main tool we use for CONCEAL constraints formalization is SMT. SMT is a powerful tool to solve constraint satisfaction problems arise in many diverse areas including software and hardware verification, type inference, extended static checking, test-case generation, scheduling, planning, graph problems, etc. [8]. An SMT instance is a formula in first-order logic, where some function and predicate symbols have additional interpretations.

II. THREAT MODEL AND OBJECTIVES

In this section, we first present threat model addressed by our approach, as well as generic defense objective against this threat model.

A. Threat Model

Reconnaissance is the primary and initial step of any advanced and persistent intrusion on enterprise networks [9]. At the network and host levels, reconnaissance refers to the process of (1) discovering and enumerating network hosts, (2) scanning these hosts at network- and transport-level (detecting OS and open ports), or application-level (identifying services names), and (4) discovering exploitable vulnerabilities for each host [15].

If attackers know the name of a host, they can obtain its IP address from DNS and using the IP to attack that host. However, adversaries usually avoid this to remain stealthy, as their frequent request to DNS can be detected. In addition, only public servers can exist in the public DNS, however, internal services will still need to be discovered through local reconnaissance. Due to these reasons, we believe that sophisticated attackers will only rely on stealthy host/service scanning to discover resources and propagate their attacks. Examples of network reconnaissance tools to scanning and fingerprinting include Nmap and Nessus [15].

As attackers need to probe hosts to scan the address space and compromise services, benign users usually reach their remote services after querying the server's IP address from the corresponding authoritative DNS. Some attackers may also issue a reverse-DNS query to obtain the domain name from the host's address after discovering an active IP address. However, in both cases, this can be used for analyzing and detecting malicious behavior due to reconnaissance.

While random host IP mutation (RHM) [12] is effective for automated worms and naive adversaries, skilled human adversaries can still use any available information such as a host's fingerprint to re-identify that host even if its addresses have been mutated. This is because a host identity can still be recognized and traced by its fingerprint in RHM. This means a skilled attacker can fingerprint a host and use that fingerprint in future to distinguish that host. This is the major motivation to apply a more sophisticated deception approach in this paper.

B. Defense Objectives

The defender has the following three ways to invalidate the attacker's knowledge gained from reconnaissance:

- Address mutation refers to the act of changing host addresses over time. With no address mutation, attacker can use a host IP address to identify it and avoid reprobing that host.
- Fingerprint anonymization: refers to the notion of hiding a host fingerprint in a pool of honeypots with identical fingerprints, thus preventing a skilled adversary to trace a host by its fingerprint. A skilled attacker can use the potentially unique fingerprint of a host to identify it later if host fingerprint anonymization is not applied.
- Configuration diversification refers to the act of diversifying fingerprints of network OS and services over time, thus making that any existing OSes or services will have a number of similar OSes and services in the same network.

III. TECHNICAL APPROACH

A. CONCEAL Framework Key Components

CONCEAL is a multi-strategy deception technique that combines three techniques, m-mutation, k-anonymization and l-diversity.

Strategy 1: m-Mutation for address anonymization. For every 1/m seconds, CONCEAL mutates addresses of hosts. The goal of mutation is to anonymize host IP addresses over time. Note that mutating with rate m IP/Sec means an IP address is only active for 1/m seconds. In other words, IP addresses are anonymized every 1/m seconds. Mutation rate is a trade-off between benefit and cost (for address translation, updates, etc). The limitation of mutation is that mutation is costly, and sometimes there is not enough available addresses. For a skilled attacker, host fingerprint may serve as a quasi-identifier, will means mutation may not be enough for deception.

Strategy 2: k-Anonymity for fingerprint anonymization. For each network host, CONCEAL places a group of k-1 hosts with identical fingerprints; the k-1 addresses are redirected to one physical honeypot representing a group of shadow hosts.

In data privacy, quasi-identifiers are anonymized by the concept of k-anonymity.

In our domain, k-anonymity is achieved by shadow hosts. That is, for each real host, k-1 honeypots are included in address space with same fingerprints. A shadow host exhibits an identical fingerprint of a real host.

By satisfying k-anonymity, we anonymize identity of an individual host. However the adversary can still figure out what platforms and services are running in the real network, and the number of real hosts and unique fingerprints in the network. Thus, attackers need to make exploits for these services only.

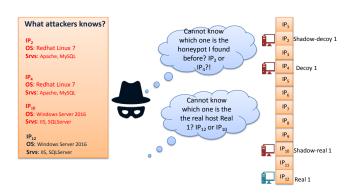


Fig. 1. An Example of 2-anonymity

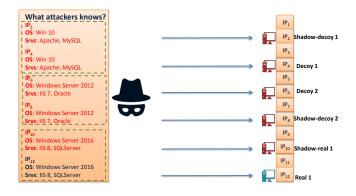


Fig. 2. An Example of 2-anonymity, 3-diversity

Fig. 1 shows an example of 2-anonymity. In the system there is one real host and one proxy (decoy) host. For both of them there is one shadow host which has a different IP but identical configuration. The attacker cannot differentiate the shadow hosts from real or proxy host.

Strategy 3: l-diversity for configuration anonymization. For every service type, CONCEAL places in the network at least l-1 fake services of the same type but with different vendors, versions, or patch levels. Here service types may include OS, HTTP Server, FTP Server, etc. Services of type HTTP may include IIS 8.0, IIS 7.0, Apache, etc.

Fig. 2 shows an example of 2-anonymity, 3-diversity. In the example, the network has one real host and two proxy (decoy) hosts, while every real host and proxy host have an identical shadow host. Here we have 3-diversity for OS, HTTP service, and Database service. 3-diversity for OS is achieved with Win Server 2016, Win Server 2012 and Win 10; for HTTP Services is achieved with IIS 7, IIS 8 and Apache; for database Services is achieved with SQL Server, MySQL and Oracle.

In order to find the satisfiable CONCEAL configuration, one needs to solve the following questions:

Question 1: What m, k, and l are good for a given network? How to quantify benefit and cost for a given (m, k, l) triple? Question 2: Given m, k, and l, what are the optimal decoy

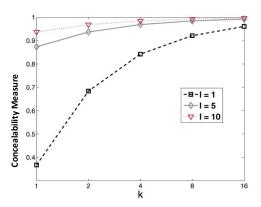


Fig. 3. Concealability Measure

services and configurations needed?

Note that these two questions are not independent. Both of them are related to budget and risk constraints. We will try to find the solution for both of them.

B. CONCEAL Effectiveness Metrics

We define the measurement for CONCEAL Effectiveness (CE) as the combination the following three metrics:

- (1) Concealability Measure (CM), that is the likelihood that the attacker will fail to identify the target despite his stealthiness.
- (2) Detectability Measure (DM), that is the likelihood that the attacker being detected despite his success.
- (3) Deterrence Measure (TM), that is the cost of deception on the adversary (e.g., number of probes).

CE is defined to be the combination of the three metrics:

$$CE = \alpha_1 \cdot CM + \alpha_2 \cdot DM + \alpha_3 \cdot TM \tag{1}$$

where α_1 , α_2 and α_3 are appropriate coefficients which can be determined by different system security requirements.

As the risk of an asset increases, CE must also increase to offer cost-effective and scalable deception.

The probability that attackers fail to identify/compromise a host (CM) is the probability that the host is not identified by scanning due to mutation plus the probability that a proxy (not a real host) is hit:

$$CM = e^{-1} + (1 - e^{-1})(1 - \frac{1}{kl})$$
 (2)

The quantity e^{-1} results from invisible hosts due to mutation [11], and the quantity $(1 - \frac{1}{kl})$ results from proxy or shadow hosts due to k-anonymity and l-diversity.

Fig. 3 shows the concealability measure of CONCEAL with different k and l.

Deterrence (TM) is defined as the number of round of scan attempts to make the probability of hit more than the desired

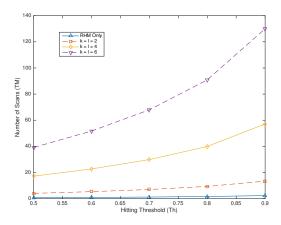


Fig. 4. Deterrence Measure

threshold. If one has only mutation, then the probability of hit (denoted as T) with n round of scans is known to be [11]:

$$T = 1 - (e^{-1})^n (3)$$

For example to guarantee T > 0.9 one needs to make n > 2.3 rounds of scanning.

In general T can be computed as:

$$T = 1 - (CM)^n \tag{4}$$

For example when k=2, l=4, to guarantee T>0.9, one needs make n>22 rounds of scanning.

Now we can calculate TM to be:

$$TM = log(1 - T_h)/logT \tag{5}$$

where T_h is the required hitting threshold. Note that here we assume every round of scan is an independent event.

Fig. 4 shows the T value of CONCEAL with different k, l and T_h . We can see that for RHM the number of required scans (TM) is very small but even for CONCEAL with relative small k and l (such as 6) TM can be very high (more than 100). This means that the composition of mutation, diversity and anonymity has much better effectiveness than applying only RHM.

Detectability (DM) is defined to be the probability that a compromise attempt is detected:

$$DM = (1 - \frac{1}{kl}) \cdot d_1 \cdot d_2 \tag{6}$$

Here $(1-\frac{1}{kl})$ is probability of hitting a shadow or proxy host, d_1 is probability of detecting the attack attempt at a shadow or proxy host (IDS true positive), and d_2 is the quality/robustness of deception (which means $(1-d_2)$ is the probability that the deception is detected by the attacker).

Fig. 5 shows the detectability measure of CONCEAL with $d_1=1,\ l=2,$ and different d_2 and k.

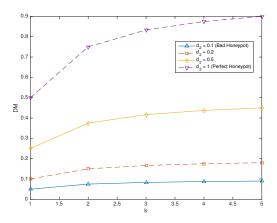


Fig. 5. Detectability Measure

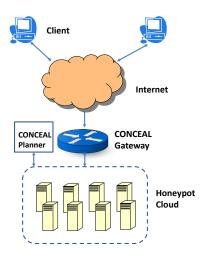


Fig. 6. CONCEAL Architecture

C. CONCEAL Architecture and Planner

Fig. 6 shows the overall CONCEAL architecture. In CONCEAL architecture, clients communicate with the target network through the CONCEAL gateway of the target network, which is located in front of the honeypot cloud which includes real and proxy (shadow) hosts. The configuration of real and proxy (shadow) hosts are mutable and adjusted by the CONCEAL planner which determines the satisfiable configuration for mutation, anonymity and diversity.

Fig. 7 shows the framework of CONCEAL planner. Here the CONCEAL engine takes user input of available address space, existing host configuration (number of hosts, OS, service type, vulnerabilities), cost of proxies and shadows, budge limit, vulnerability impact, risk bound, and operational input, which includes feasible configuration, mission/business-related configuration (such as context and consistency constraints). These inputs are converted into CONCEAL constraints and sent to the SMT solver. If the problem is solvable, the results is returned to CONCEAL engine, which will generate the detailed

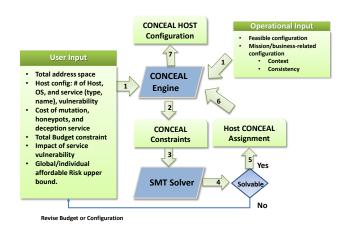


Fig. 7. CONCEAL Planner Framework

host configurations. If the problem is not solvable, then one needs to relax some of the inputs such as increasing budget or decreasing risk bound.

The following is the formal definition of the CONCEAL planning problem. The input of the problem includes the configuration of n real hosts C_1, \ldots, C_n , where

$$C_i = \langle OS_i, s_{i,1}, \dots, s_{i,k} \rangle \tag{7}$$

where $s_{i,j} \in T_j$, T_j is the service type, and set of vulnerabilities for every service, impact of vulnerabilities, cost of deploying mutation (C_m) , proxy (C_p) , diversity service (C_d) , anonymity (shadow) service (C_a) , budget (B) and risk bound (R). The output includes the appropriate m, k, l, number of required proxies (p), and configuration of the proxies.

D. Formalization of Constraints

We formalize the CONCEAL constraints as the input for SMT solver.

First, we have the Budget Constraint

$$C_p \cdot p + C_d \cdot l + C_a \cdot k + C_m \cdot m \le B \tag{8}$$

Next, we have the Risk Constraint

$$\sum_{i} S_i \cdot (1 - CE) \cdot I_i \le R \tag{9}$$

where S_i and I_i are the severity and impact of the vulnerability of service i respectively.

Diversity Constraint is formalized as

$$\forall i, \ dis(a_{ijk}) \ge l$$
 (10)

where a_{ijk} is the binary variable that denotes that service j with type i is deployed in proxy k, and $dis(a_{ijk})$ denotes the number of distinct services of type i in all possible proxies.

We also have the Unique Assignment Constraint

$$\forall i, k, \ \sum_{j} a_{ijk} \le 1 \tag{11}$$

Host	OS	Service/type	
H1	Win10	IIS/web	SQL Server/DB
H2	Win10	Azure/cloud	VM/platform
Н3	Linux	Amazon/cloud	Oracle/DB
H4	Mac	Apache/web	Macincloud/platform

Fig. 8. Original Host Configuration

which means that every proxy can only contain one service of a fixed type.

The Context Constraint can be formalized as

$$\forall i, j, v, k, \ (b_{vk} = 1) \to (a_{ijk} \neq 1)$$
 (12)

which means that OS type v should not contain service j of type i, where b_{vk} denotes that OS type v is deployed in proxy j. For example, OS Linux should not have any type of IIS services.

The Consistency Constraint can be formalized as

$$\forall k, \ (a_{i_1j_1k} + a_{i_2j_2k}) \le 1 \tag{13}$$

where j_1 and j_2 are incompatible or inconsistent services to co-exist in the same proxy.

As an example, suppose we have four real hosts in the system as shown in Fig. 8. The cost values of C_p , C_d , C_a , C_m are 4K, 2K, 1K, 20K respectively and budget limit B is 28K, risk bound R is 8K. We also have context constraint that any SQL server cannot be deployed in Linux OS.

The SMT solver returns that l=3, k=2, m=0.2. The solution has two proxy host H_5 with Linux OS, web service Nginx and DB service MySQL, and H_6 with Win 10 OS, platform service Zen, and cloud service Onedrive to achieve 3-diversity (for simplicity, we only consider service diversity here). Additional shadow hosts H_7 , H_8 , H_9 , H_{10} , H_{11} , H_{12} need to be created for hosts H_1 , H_2 , H_3 , H_4 , H_5 , H_6 to achieve 2-anonymity. Total cost is

$$(4 * 2 + 4 * 2 + 6 * 1 + 0.2 * 20)K = 26K < B = 28K$$

Fig. 9 shows details of the solution.

IV. EVALUATION

We evaluate the effectiveness and scalability of the CON-CEAL framework. The evaluation work is done in a machine of Intel Quad Core 3.4GHz machine with 16G memory. We use the Yices SMT solver [2] to find the solutions to the constraints.

CONCEAL Effectiveness: As we discussed, CE is the metric to measure the effectiveness of CONCEAL. Fig. 10, Fig. 11, and Fig. 12 show the Concealability Measurement (CM), Detectability Measurement (DM), Deterrence Measurement (TM) values for different number of services and budget bound B, respectively. For the TM value, the threshold T_h is set to be 0.9. For the DM value, d_1 and d_2 are set to be 0.95. We can see that all the CM, DM, and TM values increases with high values of B and high number of services. However

Host	os	Service/type	
H1 (original)	Win10	IIS/web	SQL Server/DB
H2 (original)	Win10	Azure/cloud	VM/platform
H3 (original)	Linux	Amazon/cloud	Oracle/DB
H4 (original)	Mac	Apache/web	Macincloud/platform
H5 (diversity)	Linux	Nginx/web	MySQL/DB
H6 (diversity)	Win10	Zen/platform	Onedrive/cloud
H7 (anonymity)	Win10	IIS/web	SQL Server/DB
H8 (anonymity)	Win10	Azure/cloud	VM/platform
H9 (anonymity)	Linux	Amazon/cloud	Oracle/DB
H10 (anonymity)	Mac	Apache/web	Macincloud/platform
H11 (anonymity)	Linux	Nginx/web	MySQL/DB
H12 (anonymity)	Win10	Zen/platform	Onedrive/cloud

Fig. 9. SMT Solution of CONCEAL Hosts

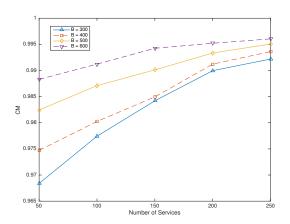


Fig. 10. Concealability Measurement

the increase of B has less significant impact when the number of services reaches some point.

Saving of Proxies for Different B: The CONCEAL framework can save the number of actual used proxies since multiple services can share the same proxy as long as they are compatible. Fig. 13 shows the percentage of saved proxies for with different B. We can see that as B decreases the percentage of saved proxies will increase. This is because smaller B will cause the SMT solver to find smaller value of p to reduce cost. However, smaller B may make the problem unsolvable and increase the solving time.

Saving of Proxies for Different Number of Correlation: Fig. 14 shows the percentage of saved proxies for with different number of correlations. The X-axis *cor* in the figure is the percentage of consistent services where consistent means the services cannot exist in the same host. We can see that as *cor* increases the percentage of saved proxies will decrease. This is because higher *cor* will cause the SMT solver to use higher

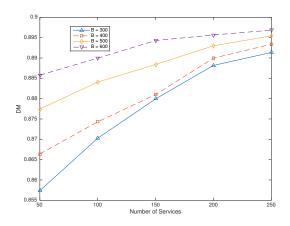


Fig. 11. Detectability Measurement

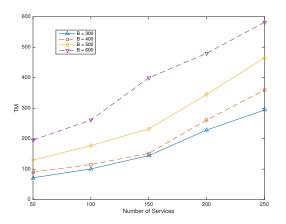


Fig. 12. Deterrence Measurement

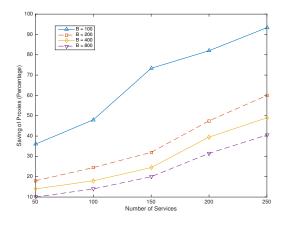


Fig. 13. Save of Proxies with different B

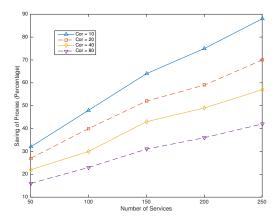


Fig. 14. Save of Proxies with different correlation

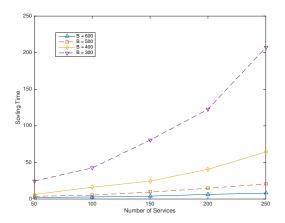


Fig. 15. Solving Time with different B

value of p to satisfy the constraints.

Solving Time for Different B: Fig. 15 shows the SMT solving time for different B. We can see that as B increases the solving time will decrease. This is because higher B means more resources and it will be easier for the SMT solver to find the solution to satisfy the constraints.

Solving Time for Different Number of Correlation: Fig. 16 shows the SMT solving time for different number of correlations *cor*. We can see that as *cor* increases the solving time will increase. This is because higher *cor* means more constraints for the SMT solver to find the satisfiable solution.

V. IMPLEMENTATION

We implemented CONCEAL as a deception of service that can be accessible through a web interface. The CONCEAL implementation mainly consist of three different components:

1) The Web Interface, 2) SMT Solver and 3) ActiveSDN; shown in figure 17. Each of these three services running in different process and can communicates witch each other through rest APIs. Although the API descriptions are out of the scope of this paper, however interested reader can look into our implementations [1].

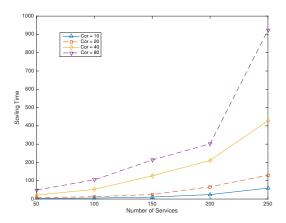


Fig. 16. Solving Time with different correlation

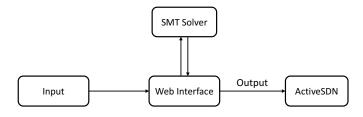


Fig. 17. CONCEAL Implementation

A. Web Interface

The web interface is divided into three section: 1) Costs, 2) Services and 3) Hosts. The user will provide all of the costs like mutation, anonymity, diversity and proxy costs along with total risk and budget costs. For the *services*, user can create as many services as she wants and those services will be added in the *hosts* section. After submitting, the constraints will be solved by the SMT solver which is running in a different process and

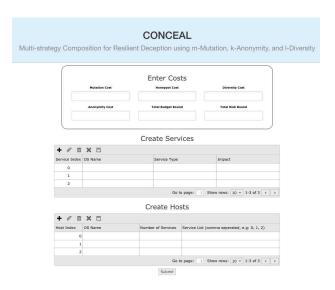


Fig. 18. CONCEAL Web Interface.

Defense Actions	Parameters	Descriptions
	<alp></alp>	List of available IPs, e.g. <192.168.10.20/32, 192.168.10.21/32, 192.168.55.99/32,> etc.
ipMutate()	when (m)	-1: Deactivate IP mutation.
		0: One time mutation.
		x: Time based mutation. Mutate IPs after x seconds. Hence, x = 1/m.
		other-mutation: For future use.
	how	specific vIP: User defined virtual IP (vIPs) which can be selected form <aip>, e.g. 192.168.10.20/32</aip>
		randomFunction(): A function which will provide random vIPs in a specific time window x.
Example	ipMutate(10.0.0.2/32, 5, uniform())	

Fig. 19. IP Mutation function.

Defense Actions	Parameters	Descriptions
	hostIP	IP address, e.g. 192.168.10.20/32
	fingerprints	OS: Operating system running in the hostIP
hostAnonymity()		<pre><openports>: List of open ports on each host.</openports></pre>
		<services>: List of services running on each host.</services>
	k	The number of host will be created for anonymization.
Example	hostAnonymity(10.0.0.2/32, fingerprints(), 5)	

Fig. 20. Host Anonymization function.

if there exist any solution it will be shown as output, else user need to relax the constrains and submit again. Fig. 18 shows the web interface.

B. SMT Solver

We implement our Constraint Satisfaction Solver using Yices [2] in C++. All the constraints mentioned in the section III-C is implemented in our solver. The solver is running in a different process that can be accessible through a web interface.

C. ActiveSDN

ActiveSDN is a decision making Opendaylight controller[16] where we implement all the services required for CONCEAL, like mutation, anonymization and shadowing. After submitting the user inputs through Web Interface, the SMT solver will generate the output configuration, which will be used in ActiveSDN to deploy Conceal in a mininet network [21]. For Conceal, we have three services implemented in ActiveSDN: IP mutation, host anonymization, service diversity. Figure 19, 20 and 21 shows the IP mutation, Host Anonymization and Service Diversity functions in ActiveSDN respectively. For IP Mutation, aIP indicates the list of available IP addresses that will be mutated using vIPs mentioned in how. The mutation parameter when has an attribute x which indicates the mutation cycle (mutate aIPs after x seconds). The host anonymity function takes the IP address of a host as an argument hostIP and its corresponding fingerprints. For the hostIP, k new host with identical fingerprints will be created. The service diversity function architecture is similar to host anonymity function.

VI. RELATED WORKS

Proactive techniques for disrupting reconnaissance could be broadly divided into two categories: MTD-based and deception-based approaches. Moving target defense relies on randomizing static system parameters, to invalidate attacker's reconnaissance information.

Defense Actions	Parameters	Descriptions	
	srcIP	IP address of the host which service will be diverse, e.g. 192.168.10.20/32.	
serviceDiversity()	services	Services running on srcIP. For example HTTP: IIS 8.0, IIS 7.0, Apache server etc.	
	I	The number of services will be created for diversity.	
Example	serviceDiversity(10.0.0.3/32, services(), 6)		

Fig. 21. Service Diversity function.

In this direction, several approaches have been proposed [11], [13], [12] for mutation of IP addresses, especially over time. NASR [6] relies on DHCP to randomize IP addresses over time. RHM [12] and OF-RHM [11] propose using DNS for address randomization without changing the actual IP address of network hosts, in order to prevent TCP/UDP sessions from being broken. RHM [12] identifies additional need for mutating MAC addresses to defeat LAN-level reconnaissance, and mutating domain names to counter reverse-DNS queries.

The notion of mutable networks as a frequently randomized changing of network addresses and responses was initially proposed in [3]. The idea was later extended as part of the MUTE network which implemented the moving target through random address hopping and random fingerprinting [4].

Existing IP mutation techniques include Dynamic Network Address Translation (DYNAT) [14], [18], [17], Random Host IP Mutation (RHM) [12], OpenFlow Random Host IP Mutation (OF-RHM) [11] etc.

DYNAT is a technique developed to dynamically reassign IP addresses to confuse any would-be adversaries sniffing the network. They obfuscate the host identity information (IP and Port) in TCP/IP packet headers by translating the identity information with preestablished keys. Both BBN [14] and Sandia [17], [18] have done research work on DYNAT. BBN ran series of red-team tests to test the effectiveness of DYNAT, while Sandia's DYNAT report [17], [18] examines many of the practical issues for DYNAT deployment.

RHM [12] and OF-RHM [11] use DNS for address randomization without changing the actual IP address of network hosts, and random mutate host IPs while satisfying mission, operational and cost constraints.

While these works are effective against automated scanners and worms, in our evaluation we show that they have limited effectiveness against human attackers.

On the other hand, deception-based technologies, trying to attract attackers to decoy hosts such as honeypots, can mislead the attacker and prolong reconnaissance and attack progress. The work in [19] shows that honeypots are highly effective in slowing down worm breakouts, and decreasing amount of attacks on production hosts

Dynamic honeypots was first proposed in by Budiarto [7]. Dynamic honeypots discover production systems on a network and uses this information to create honeypots that are similar to production hosts and mix in the surrounding network. *Shadow* honeypots wasproposed by Anagnostakis etc. [5], which is an identical copy of production hosts, and used as an strategy to deploy honeypots in a production environment.

The work in [20] correctly identifies the need of strengthening address mutation with decoy services against sophisticated adversaries, but their approach neglects important theoretical aspects of anonymization such as mutation and anonymization of host/honeypot fingerprints. Moreover, efficacy of their proposed model is not tested against real human attackers.

None of the above approaches recognizes the need and synergy of combining the multi-dimensional proactive defense for defeating adversarial reconnaissance performed by skilled adversaries.

Our preliminary work of proactive multi-dimensional deception technique in [10] tries defeating reconnaissance by skilled attackers, through mutating configuration (name, addresses, fingerprint) of network hosts, while populating address space with moving honeypots with strategically-designed but randomly-changing configurations. However it does not define the clear metric for multi-dimensional deception effectiveness and provide no synthesis to find the satisfiable combination of the multi-dimensional techniques.

VII. CONCLUSION

In this paper we present a new deception as a service paradigm called CONCEAL that combines m-mutation for address anonymization, k-anonymity for fingerprint anonymization and l-diversity for configuration diversification. We define three CONCEAL metrics concealability, deterrence, and detectability to measure the effectiveness of CONCEAL, and develop the framework to automatically generate the optimal CONCEAL configuration that satisfies related budget, risk and operation constraints. We evaluated the effectiveness and scalability of the CONCEAL framework, and implemented CONCEAL as a deception of service based on ActiveSDN. Our implementation and evaluation validates the effectiveness and scalability of the CONCEAL framework. The CONCEAL framework can solve problem instances up to 250 services and the save of proxies can reach as high as 90%.

In the future, we plan to carry out red-teaming evaluation to further validate the effectiveness and feasibility of the framework.

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