

1 Article

## 2 Utilizing a Lightweight PKI Mechanism to Guarantee 3 a Secure Service in a Cloud Environment

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13 **Abstract:** Recently, cloud technology has become popular for smart societies. The Cloud technology  
14 has made dynamical network changes by enabling the construction of a logical network without  
15 building a physical network. Despite recent research on the cloud, it is necessary to study security  
16 functions for the identification of fake VNFs and the encryption of communication between entities.  
17 In this paper, we proposed an LW\_PKI mechanism that detects a fake VNF and guarantees data  
18 security through mutual authentication between VNFs. To evaluate the LW\_PKI, we built a MANO  
19 environment to test the performance of authentication and key generation for data security. In  
20 addition, we applied the artificial intelligence algorithm to detect abnormal behavior by using real  
21 attack data in the MANO environment. The LW\_PKI guaranteed the reliability of a smart service by  
22 enhancing the security of the cloud environment.

23 **Keywords:** Energy-efficient communications; Green and cloud computing; Network Function  
24 Virtualization; Lightweight PKI; Authentication; DDOS; Artificial Intelligence  
25

### 26 1. Introduction

27 Recently, cloud technology has been used to solve energy shortage problems caused by climate  
28 change and population growth because cloud technology reduces CAPEX and OPEX by building a  
29 logical network without building a physical network. In particular, cloud technology has increased  
30 interest in using virtualization technology to provide effective control of services and escape  
31 hardware constraints. Because virtualization technology creates a logical network without building  
32 a physical network, changing service environments can be rapidly adapted to. The interest in  
33 virtualization technology has led to a lot of research on NFV (Network Functions Virtualization) and  
34 MANO (Management and Orchestration). In particular, NFV is a core technology for next generation  
35 networks and 5G. NFV is a technology that separates software functions from hardware-dependent  
36 network devices and provides services through infrastructure based on a general-purpose server. On  
37 the other hand, MANO is a core module of NFV that manages different platform layers and  
38 configures network services [1-2]. With the spread of cloud computing-based virtual service  
39 platforms, various services are increasing. Besides, new application services are emerging to satisfy  
40 user requirements. Despite recent research, it is necessary to study security mechanisms against fake  
41 VNFs and data leakages, and abnormal behavior. That is, mutual authentication between entities and  
42 encryption of communication are not guaranteed in the cloud environment. Through the threats,  
43 attackers can access shared resources, and services can be disabled through an attacker's abnormal  
44 behavior. Thus, a security mechanism to ensure reliability in a cloud environment is essential.

45 There are three main security threats in an NFV environment. The first security threat is that  
46 there is no mutual authentication between VNFs or a VNF and an EM(Element Management). Mutual

47 authentication guarantees secure communication between a VNF and a VNF, and between a VNF  
48 and an EM against a man-in-the middle attack in a multi-tenant environment. The second security  
49 threat is VNF services data leakages. Data security between VNFs can prevent data theft by fake  
50 VNFs and contaminated VNFs. The last security threat is a resource consumption attack due to the  
51 contamination of a VNF. The abnormal behavior of contaminated VNFs affects the overall service in  
52 a virtualized network. In this paper, we propose a lightweight PKI (LW\_PKI) that performs mutual  
53 authentication between VNFs in a virtual environment and generates secure communication by using  
54 a security key for data security. The LW\_PKI blocks fake VNFs through the mutual authentication  
55 and data security between VNFs.

56 In addition, in this paper, the performance of various AI (Artificial Intelligence) algorithms used  
57 for abnormal behavior detection is measured. To test abnormal behavior detection by the AI  
58 algorithms, we used 7.7 DDoS attack data which occurred in 2009 [3].

59 The subsequent sections of this paper are organized as follows: In Section II, we discuss the  
60 concept of PKI, abnormal behavior detection, and various artificial intelligence techniques. In Section  
61 III, we describe the LW\_PKI developed in this study, and in Section IV, the LW\_PKI is tested for  
62 performance of mutual authentication, and security key sharing and abnormal behavior detection.  
63 Finally, this paper is concluded in Section V.

## 64 2. Related Work

### 65 2.1. PKI : Public Key Infrastructure

66 PKI is the framework that guarantees secure data exchanges using a private key and a public  
67 key which users receive from a trusted authority in an insecure public network [4]. A PKI is  
68 constructed with a CA (Certificate Authority), an RA (Registration Authority) and a VA (Validation  
69 Authority) [5]. Each entity in a PKI has a public key for CA and a certificate which includes its private  
70 key and public key. The authentication begins when an initiator requests authentication by  
71 transmitting a certificate signed with its own private key. A CA that receives a certificate signed with  
72 a private key can decrypt the certificate with its own public key, and authenticate the initiator using  
73 the received public key from an authentication request message. Besides CAs, PKIs have RAs that  
74 carry out registration procedures, and a VA that validates certificates. Finally, the other party's public  
75 key, obtained in the authentication process of the entity, is used as an encryption key in data  
76 communication because data encrypted by a public key can be decrypted using a private key by the  
77 other party [6]. Even if a PKI authenticates with the other party via the trusted certification authority,  
78 and guarantees secure communication with the other party, when the PKI components RA, CA, and  
79 VA install in a virtual environment, a large amount of resource is required, and overhead occurs [7].  
80 Therefore, the LW\_PKI is considered with the overhead of a PKI in a virtual environment. In this  
81 paper, we propose an LW\_PKI (Lightweight PKI) which is suitable for a MANO based virtual  
82 environment. The LW\_PKI can guarantee mutual authentication and encrypted data communication  
83 without changing existing MANO functions.

### 84 2.2. Abnormal Behavior

85 DoS (denial of service) affects services because system resources are exhausted by an attack. In  
86 other words, a DDoS (distributed DoS) attack against internet services is difficult to prevent due to  
87 the vulnerability of protocols. In addition, The smart service is more vulnerable to DDoS attacks  
88 because they are located in distributed locations and attack targets at the same time [8-9].  
89 Furthermore a DDoS attack uses multiple botnets to attack the cloud system, consuming shared  
90 resources more rapidly than a DoS attack, and lowering the efficiency of computing energy.

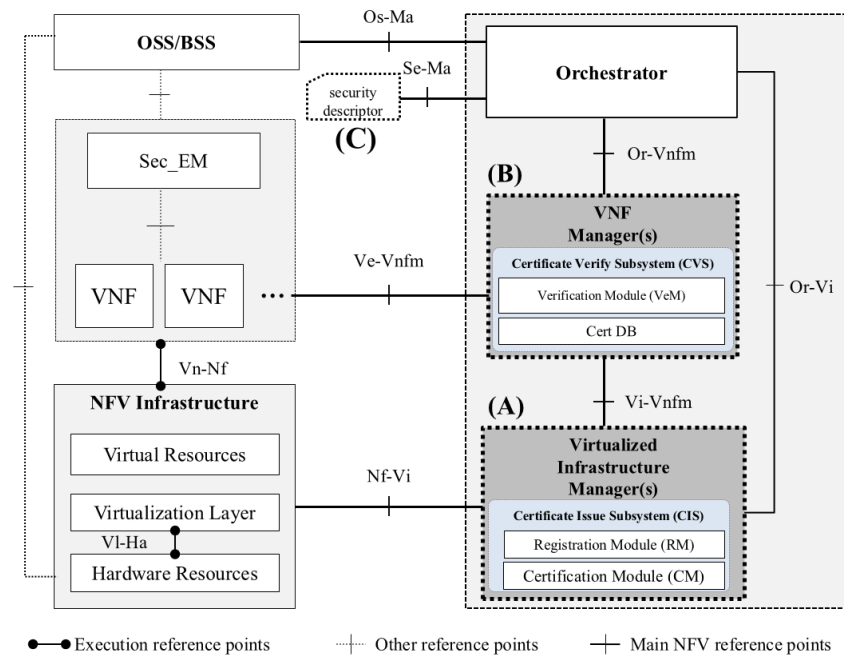
91 Bandwidth consuming attacks, resource consuming attacks, and application attacks are  
92 representative DDoS attacks [10]. In a bandwidth consuming attack, an attacker controls many  
93 zombies to generate a large number of packets to exceed the network bandwidth capacity. In  
94 particular, a bandwidth consuming attack can cause a connection failure to other systems in the same  
95 network. UDP flooding, which transmits a large number of UDP packets, and ICMP flooding, which

96 uses a large number of ICMP packets, are examples of bandwidth consuming attacks [11]. In a  
97 resource consuming attack, an attacker increases the CPU load of a system by increasing the packet  
98 throughput using TCP. Although a resource consuming attack does not increase the bps, it generates  
99 system overhead due to an increase in pps (packets per second). SYN flooding attack using a SYN  
100 packet is an example of a resource consuming attack [12]. Finally, in an application attack, an attacker  
101 generates a disorder of system services through excessive application access. The Slowloris DDoS  
102 attack, incidents of which have recently increased, is an application attack. In the Slowloris DDoS  
103 attack, an attacker uses two methods. One is the HCCP CC method through which an attacker  
104 interrupts the use of cache by a system, and the other is HTTP GET flooding through which an  
105 attacker uses an abundance of HTTP GET messages for attacks [13]. Since the NFV environment is a  
106 virtual environment, an attacker can load multiple VNFs in a tenant. Therefore, an attacker can cause  
107 a bandwidth exhaustion attack that depletes a virtual network bandwidth using a large number of  
108 packets in the network, resulting in great damage that paralyzes a whole network. In other words, if  
109 an attacker makes a botnet with a VNF in a tenant, the botnet can infect all VNFs in the tenant, and  
110 cause the paralysis of services. However, DDoS attacks can be prevented by communication after  
111 verifying the identity of a VNF using a PKI certificate. Therefore, it is possible to block abnormal  
112 behavior through authentication of the traffic sender and white list-based communication.

### 113 2.3. Artificial Intelligence

114 AI (Artificial intelligence) requires a long learning time; however, we can determine whether  
115 various input traffic is an attack or not. Among AI techniques, a clustering algorithm can be used for  
116 abnormal behavior detection [14] because a clustering algorithm can detect a pattern in a large  
117 amount of data and identify an attack by the pattern. Representative clustering algorithms are  
118 Farthest First, Hierarchical Cluster, and LVQ [15]. Using the Farthest First algorithm, observed data  
119 is clustered by selecting specific data and classified the data while searching for data in order of data  
120 having a large difference from the designated data. The Farthest First algorithm uses a method for  
121 discriminating the similarity of data by using differences between the data [16]. Using the  
122 Hierarchical algorithm, observed data can be clustered into groups without specifying the number of  
123 groups. The Hierarchical cluster algorithm uses an agglomerative method which specifies data and  
124 merges the data with the closest group, and a division method which divides a large group into  
125 smaller groups according to criteria [17]. The LVQ algorithm is a supervised learning algorithm for  
126 clustering input vectors according to initial weights using a competitive learning method. The  
127 similarity between the data on input layers and the data on output layers is calculated, and the  
128 reference data is updated according to the similarity. The observed data is clustered while repeating  
129 the process of calculation and updating [18]. Using these clustering algorithms, we can determine  
130 whether traffic between VNFs in a virtual environment is abnormal or not. Therefore, if a VNF  
131 infected by an attacker performs an abnormal behavior, we can detect the DDoS attack using an AI  
132 algorithm, and protect VNFs by blocking traffic from the source.

### 133 3. The Lightweight PKI



134 **Figure 1.** The architecture of the LW\_PKI.

135 The LW\_PKI consisted of a CIS (Certificate Issue Subsystem) and a CVS (Certificate Verify  
 136 Subsystem). (A) was a CIS for registering a certificate and issuing a certificate in the VIM, and (B) was  
 137 a CVS for verifying a VNF issued certificate. (C) was a security descriptor that contained information  
 138 for generating a certificate. A certificate was issued by the LW\_PKI when a VNF or an EM was  
 139 installed in the virtual machine. Each VNF and EM use issued certificates for mutual authentication  
 140 and data security.

### 141 3.1. LW\_PKI: Lightweight Public Key Infrastructure

142 The CIS of the LW\_PKI consisted of an RM (Registration Module), which was a certificate  
 143 registration module, and a CM (Certificate Module), which was a certificate issue module. In  
 144 addition, the CVS was composed of a VeM (Verification Module) for verifying certificates, and a  
 145 CertDB for storing certificates. The SeC\_EM included its own certificate when a tenant was created,  
 146 and a VNF certificate was issued from the CM in the CIS during a VNF instantiation process. We  
 147 defined a security descriptor for information about issuing certificates. Table 1 shows the contents of  
 148 the security descriptor.

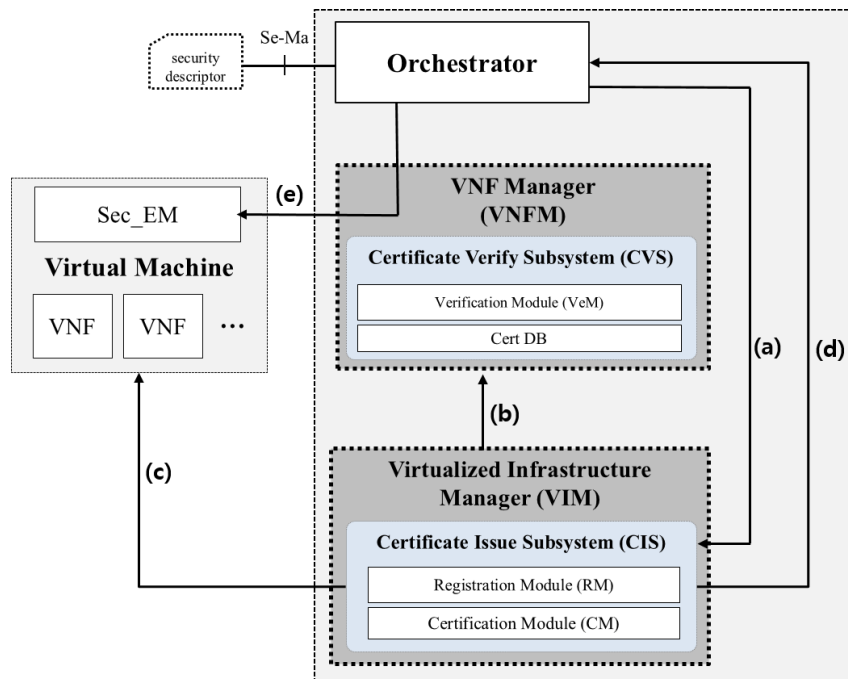
149 **Table 1.** Contents of the security descriptor.

Field	Contents
Serial	Unique ID for certificate
Signature Algorithm	Algorithm for digital signature
Validity Period	Certificate validity period
Subject Public Key Info.	Information about public key subjects
Issuer Unique Identifier	ID for certificate issuer
Subject Unique Identifier	EM ID(or VNF ID) for Certificate owner
Extensions	Reserved fields

150

151 Serial was a serial number for identifying a certificate, and the signature algorithm was the  
 152 signature algorithm to be used for the certificate. Validity Period was the term of validity for a  
 153 certificate, and this value was input giving consideration to the security policy according to the

154 purpose of the Sec\_EM and VNF. Subject Public Key Info. was the information of the public key for  
 155 subjects, and Issuer Unique Identifier was an ID for the subject of a certificate such as Sec\_EM's ID  
 156 ( $ID_{Sec\_EM}$ ) and VNF's ID ( $ID_{VNF}$ ). Finally, the Subject Unique Identifier was the ID ( $ID_{VNF}$  or  $ID_{Sec\_EM}$ ) of  
 157 a certificate subject. Figure 2 shows the VNF instantiation process.  
 158



159 **Figure 2.** The VNF Instantiation process.

160 In process (a), the Orchestrator transmits the VNFD (VNF descriptor), the resource information,  
 161 and the security descriptor for issuing a certificate to the VIM. (b) is the process in which the VIM  
 162 generates a certificate based on security descriptor information, and stores it in the Cert\_DB. In  
 163 process (c), the VIM installs a certificate in the virtual machine where a VNF will be placed. In process  
 164 (d), the VIM transmits a VNF\_ID and a Tenant\_ID to the Orchestrator. In case of tenant creation,  
 165 instantiation of the Sec\_EM is required. The Sec\_EM starts with its own certificate in process (e). The  
 166 RM identifies the VNF requesting certificate issuance using information such as Tenant\_ID, VNF\_ID  
 167 or EM\_ID, and VNFD, and requests the CM to issue a certificate. Identification of a VNF is  
 168 implemented using equation:

$$Secret_{vnf} = Tenant\_ID \oplus VNF\_ID \quad (1)$$

169 The CM creates a key pair (Public key and Private Key) and issues a certificate, and stores the  
 170 certificate in the Cert DB.

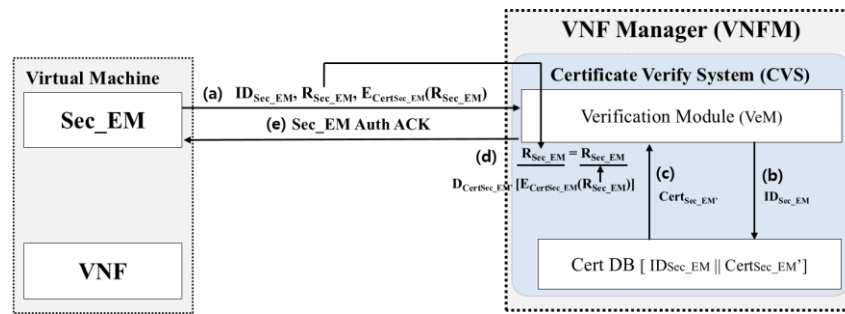
### 171 3.2. Mutual Authentication

172 In general, a VNF service is started by a VNFM or a Sec\_EM. To start a VNF, mutual  
 173 authentication was needed between a VNF and a Sec\_EM in the LW\_PKI. In Table 2, the parameters  
 174 for mutual authentication can be seen.

175 **Table 2.** Parameters in authentication between VNF and Sec\_EM.

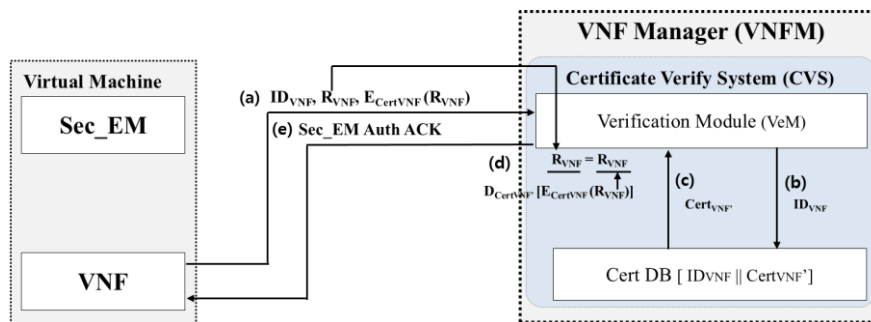
Parameter	Information
$R_{Sec\_EM}$ or $R_{VNF}$	Random Number for authentication about Sec_EM or VNF
$Cert_{Sec\_EM}$ or $Cert_{VNF}$	Sec_EM or VNF certificate
$Cert_{Sec\_EM}'$ or $Cert_{VNF}'$	Sec_EM or VNF certificate in Cert_DB

177 The mutual authentication process is shown in Figure 3.  
178



179 **Figure 3.** The authentication process between a Sec\_EM and a VNF.

180 (a) is the process through which the Sec\_EM requests authentication. During the authentication  
181 process, the Sec\_EM transmits its own ID ( $ID_{Sec\_EM}$ ), Random value  $R_{Sec\_EM}$ , and  $E_{CertSec\_EM}(R_{Sec\_EM})$   
182 which is encrypted with its own private key for digital signatures. In process (b), the VNFM searches  
183 the  $Cert_{Sec\_EM}'$  with a received  $ID_{Sec\_EM}$  in the Cert DB to decrypt a received  $E_{CertSec\_EM}(R_{Sec\_EM})$ . (c) is the  
184 process of searching the  $Cert_{Sec\_EM}'$  corresponding to the  $ID_{Sec\_EM}$ . In process (d), the VeM compares  
185 the  $R_{Sec\_EM}$  with  $R_{Sec\_EM}'$  after the decryption of the  $E_{CertSec\_EM}(R_{Sec\_EM})$  by the  $Cert_{Sec\_EM}$  to authenticate  
186 the Sec\_EM and verify the integrity of the  $R_{Sec\_EM}$ . In process (e), the VNFM transmits the VNF Auth  
187 ACK message to the Sec\_EM. Similarly, the VNF to VNF authentication process is shown in Figure  
188 4.  
189



190 **Figure 4.** The authentication process between VNFs.

191 In process (a), the VNF transmits an  $ID_{VNF}$ , an  $R_{VNF}$ , and an  $E_{CertVNF}(R_{VNF})$  to the CVS in the VNFM.  
192 In process (b), the VNFM transmits the  $ID_{VNF}$  to the Cert DB for comparing the  $Cert_{VNF}$  with the  
193  $Cert_{VNF}'$  in the Cert DB. In process (c), the Cert DB relays the  $Cert_{VNF}'$  corresponding  $ID_{VNF}$  to the VeM.  
194 In process (d), the VeM compares the  $R_{VNF}$  with the  $R_{VNF}'$  after decrypting the  $E_{CertSec\_EM}(R_{VNF})$  to  
195 authenticate the VNF and verify the integrity of the  $R_{VNF}$ . In process (e), the VNFM transmits a VNF  
196 ACK message to complete the mutual authentication between the Sec\_EM and VNFs. Authentication  
197 between VNFs is performed by a CVS in a VNFM like the above process.

### 198 3.3. Secure Communication

199 The process of achieving secure communication between VNFs in the same tenant is as follows.  
200 In Table 3, the parameters to create the data encryption key are shown.

201 **Table 3.** Parameters in secure communication between VNFs.

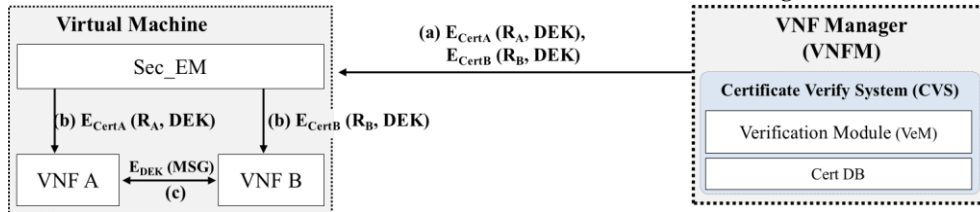
Parameter	Information
$R_{A\ or\ B}$	Random Number for authentication about VNF
$Cert_{A\ or\ B}$	VNF certificate
$Cert_{A'\ or\ B}$	VNF certificate in Cert_DB

DEK

Data Encryption Key

202  
203  
204  
205

After the authentication between a Sec\_EM and a VNF, or between a VNF and a VNF, a symmetric key DEK (data encryption key) for encrypting a communication is generated using  $ID_{VNF}$ ,  $ID_{Sec\_EM}$ , and Nonce. The VNFM transmits a DEK to a VNF, as shown in Figure 5.

206  
207

**Figure 5.** The secure communication between VNFs.

The generation process for a DEK is shown in equation:

$$DEK = ID_{VNF} \oplus ID_{Sec\_EM} \oplus Nonce \quad (2)$$

208  
209  
210  
211  
212

The VNFM encrypts a generated DEK with a  $Cert_A$  or a  $Cert_B$  stored in the Cert DB, and transmits it with parameters to all VNFs. Each VNF obtains a DEK after decrypting an  $E_{CertA}(R_A, DEK)$  and  $E_{CertB}(R_B, DEK)$  using the private key of the certificate. In other words, a VNF A and B encrypt messages and communicate securely with each other.

## 213 4. Implementation and Performance

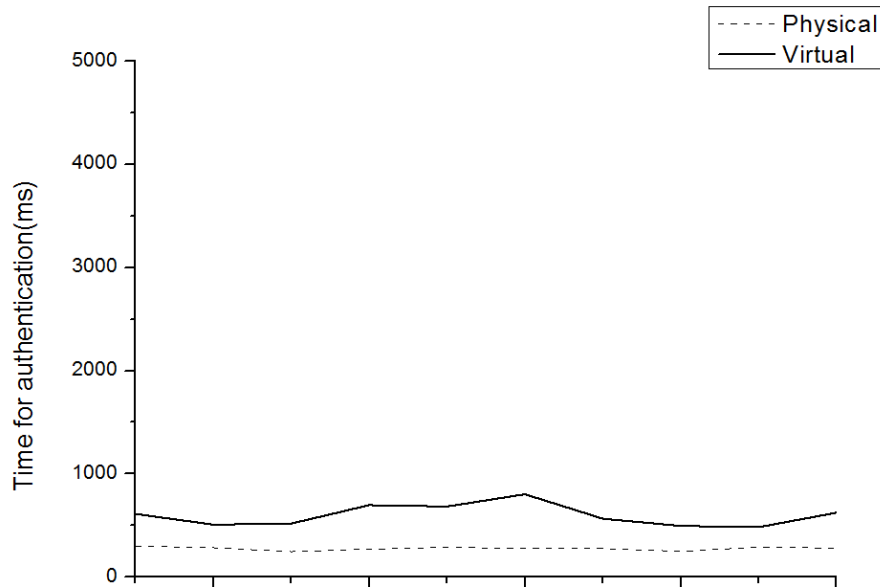
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In this chapter, we analyze the performance of the LW\_PKI. Regarding the performance of the LW\_PKI, we performed two tests. The first test analyzed the time and system resources required for VNF authentication when the LW\_PKI was applied in an NFV environment. The second test compared the detection rate of a DDoS using various artificial intelligence algorithms in a virtual environment. There were three tenants used in the test, and there were ten VMs in each tenant. We set one VNF for each VM, and allocated 1 CPU and 2 GB of memory.

### 220 4.1. Implementation and Performance

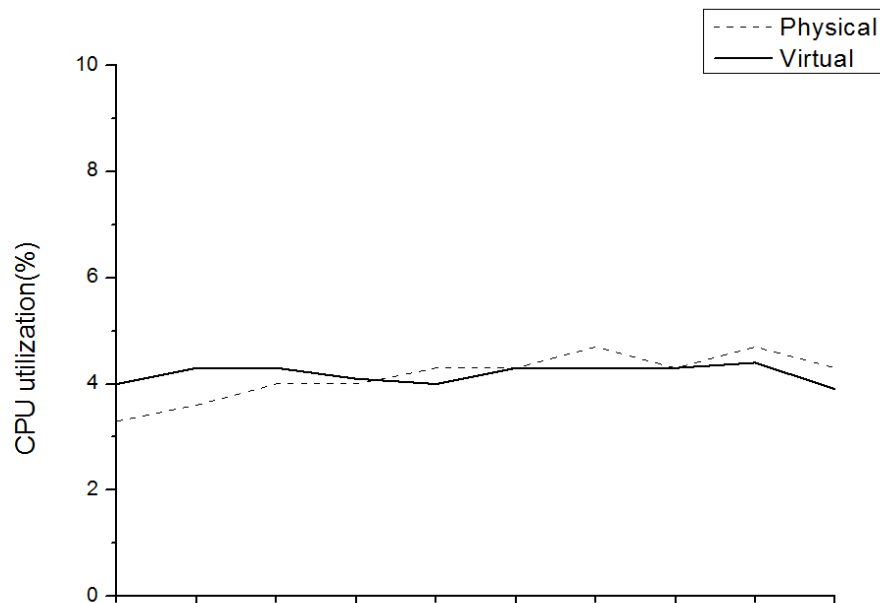
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222  
223  
224

In a tenant, mutual authentication was performed between a Sec\_EM and a VNF, or between VNFs. We used PKI certificate based authentication, and the time required for authentication is shown in Figure 6.



225 **Figure 6.** Authentication time in LW\_PKI.

226 Figure 6 shows that the average authentication in the physical environment is 0.28 seconds and  
 227 0.59 seconds is required in the virtual environment. The average authentication time in the virtual  
 228 environment takes about 47% more time than the physical environment. Figure 7 shows the system  
 229 resource requirements for certificate-based authentication.



230 **Figure 7.** CPU utilization for authentication.

231 We compared the CPU utilization when the LW-PKI was operating in an actual and a virtual  
 232 environment. On average, the CPU utilization on the physical machine was 4.2%, and also 4.2% on  
 233 the virtual machine. The system resource showed that the virtual environment and the physical  
 234 environment used the same amount of resources. Therefore, the LW-PKI in a virtual environment  
 235 took 0.31 seconds longer than in a physical environment, and system resource had no overhead.

236 4.2. DDoS Attack Detection Using AIs



237 To test for abnormal behavior contaminating VNFs in the same tenant, various artificial  
 238 intelligence algorithms were used. We used ICMP flooding, SYN flooding, and UDP flooding for  
 239 DDoS attacks, and compared the performance of each algorithm. The AI algorithms used in the test  
 240 were Farthest First, Hierarchical Cluster and LVQ (Learning Vector Quantization). The attack traffic  
 241 used in the test is shown in Table 4.

242

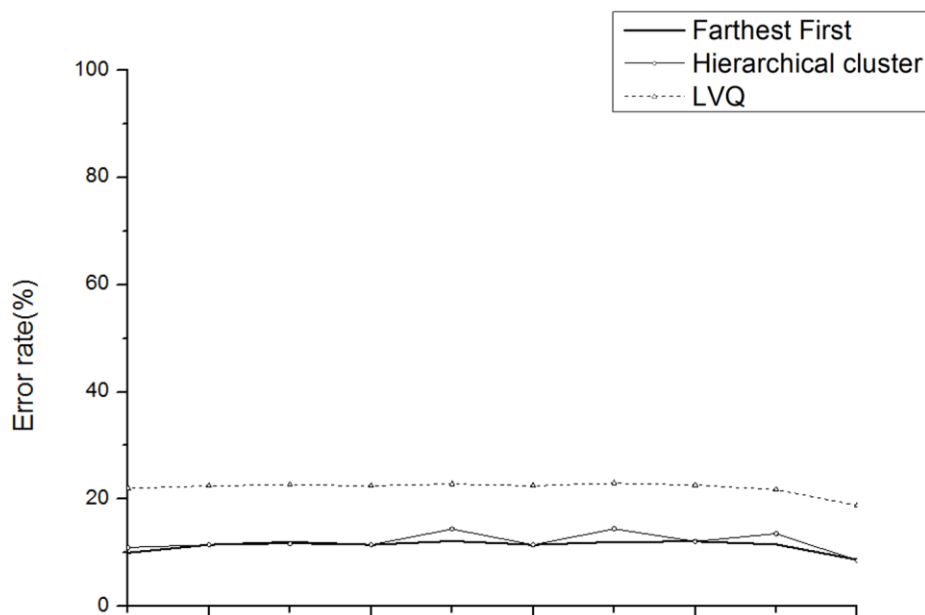
Table 4. Input Traffic.

ICMP Traffic	SYN Traffic	UDP Traffic
74 byte – 1000 byte	1500 byte	74 byte – 1000 byte

243

244 On July 4, 2009, important sites in the world such as the White House and the NASDAQ in the  
 245 USA, and in South Korea, the Blue House and the Ministry of National Defense on July 7 of the same  
 246 year were targets for attack. These attacks have been called the 7.7 DDoS attacks. The attack traffic  
 247 for the tests in this study was obtained from the 7.7 DDoS attacks [3]. The protocols of the attack  
 248 traffic were ICMP, SYN, and UDP, and bps (bits per second) was up to 200Kbps, and pps (packets  
 249 per second) was up to 3Kpps. The detection rates of the DDoS attacks were calculated by comparing  
 250 whether the test results were the same as the actual results or not. Increasing the number of datasets,  
 251 we compared the detection rate and the actual attack rate for each algorithm. The detection rate for  
 252 each algorithm is shown in Figure 8.

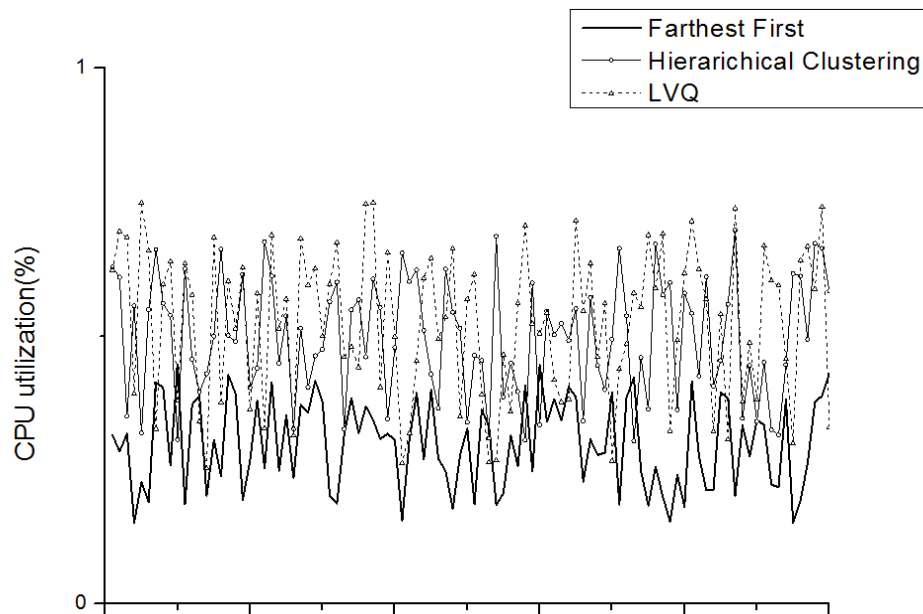
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254

Figure 8. Error rate for AI algorithms.

255 When the number of datasets was 100, the false positive was 10%. When the number of datasets  
 256 was 1000, the false positive was 8%. As the number of datasets increased, the detection error  
 257 decreased. The average detection error rates for each algorithm were as follows: For the Farthest First  
 258 algorithm, it was 11.3%, 12.0% for the Hierarchical cluster algorithm, and 22.1% for the LVQ  
 259 algorithm. We discovered that the detection rate of the Farthest First algorithm was 0.7% better than  
 260 the Hierarchical cluster algorithm, and 10.8% better than the LVQ algorithm. The resource  
 261 requirements for operating each algorithm were as follows.  
 262



263 **Figure 9.** CPU utilization for AI algorithms

264 All algorithms consumed 1% or less of the CPU resources during operation, respectively. The  
 265 CPU utilization used for each algorithm was 0.30% for the Farthest First algorithm, 0.49% for the  
 266 Hierarchical cluster algorithm, and 0.52% for the LVQ algorithm. In other words, the Farthest First  
 267 algorithm consumed 0.19% less than the Hierarchical cluster algorithm, and 0.22% less system  
 268 resources than the LVQ algorithm. Therefore, the Farthest First algorithm had a higher DDoS attack  
 269 detection rate than the Hierarchical algorithm and the LVQ algorithm, and consumed less system  
 270 resources.

## 271 5. Conclusion

272 Since NFV is employed by organizations in order to reduce management costs, and to manage  
 273 network environments efficiently, research on NFV is being undertaken. Despite the popularity of  
 274 NFV, there is still a lack of research on the security threats between VNFs.

275 In this paper, we proposed an LW\_PKI for VNF authentication and as a security mechanism to  
 276 guarantee a secure NFV environment. The LW\_PKI is a PKI for virtual environments that performs  
 277 certificate-based mutual authentication and prevents data leakages by using security keys. We  
 278 compared the performances of various AI algorithms detecting abnormal behavior of contaminated  
 279 VNFs in NFV. When the LW\_PKI was enabled in a virtual environment, it took 0.31 seconds longer  
 280 to operate than in a physical environment. Therefore, the LW\_PKI is an efficient secure mechanism  
 281 in a virtual environment, and authentication can be performed without overhead affecting system  
 282 performance. In addition, we confirmed that DDoS attacks can be detected by executing the Farthest  
 283 First algorithm in a virtual environment. The proposals for the mutual authentication between  
 284 entities and encryption of communication can be used to verify the stability of the cloud environment,  
 285 and improve energy efficiency.

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 288 protection technology using white list and context-aware).

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 290 and wrote the paper, Hyunjin Kim analyzed the data and improved the system simulations; and Jaehyung Park  
 291 made suggestions for this research. Jaecheol Ryou supervised the paperwork, review, comments, and  
 292 assessment. All authors have read and approved the final manuscript.

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