# **Characterization and Solution to A Stateful IDS Evasion**

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## Abstract

We identify a new type of stateful IDS evasion, named signature evasion. We formalize the signature evasion on those Stateful IDSs whose state can be modeled using Deterministic Finite State Automata (DFAs). We develop an efficient algorithm which operates on rule set DFAs and derives a minimal rectification of evasive paths. Finally, we evaluate our solution on Snort signatures, identify and rectify existing vulnerable flowbit rule sets <sup>1</sup>

# 1. Introduction

Stateful Intrusion Detection Systems (IDSs) use stateful signatures to simulate the behavior of the application protocol they are protecting and to identify malicious behavior. However, due to complexity and overhead reasons, it is difficult to fully simulate every session state in an IDS. This leads to a class of signature-based IDS evasion that exploits possible differences between the IDS session state and actual (application) session state making it susceptible to false negatives. This paper identifies this type of evasion, named *signature evasions*. The proposed evasion assumes knowledge of IDS rules. However, if rules are not available, reverse engineering of network signatures techniques [1] can always be used.

To illustrate how a signature evasion is carried out, we provide an example of such an evasion on the Snort [2] rule set in Table 1. The rule set follows an FTP session. It raises an alert if a non-admin user tries to do anything related to an important file which should only be accessed by the Admin. Rules  $r_1$  and  $r_2$  follow the login process of a non-admin user,  $r_3$  signals a denied login,  $r_4$  detects a successful login,  $r_5$  indicates that the user has logged out of the FTP session, and  $r_6$  raises an alert when a logged-in non-admin user tries to do anything with the restricted file. Rules  $r_7$ ,  $r_8$  and  $r_9$  handle the case of an admin user log in. In the right most column we give a symbol to each different signature used in the rule set.

Snort *flowbits* offer the stateful property to the rules and allow the detection engine to track state across multiple packets in a single session. A flowbit is a boolean flag that

can be set (1) or unset (0) by a rule. Rules without the "flowbits: noalert" option are alert rules  $(r_6)$ .

Deriving a DFA representation of a Snort flowbits rule set is relatively straightforward. Fig.1 shows the DFA of the FTP rule set of Table 1. The signature alphabet of the FTP rule set is  $\Sigma = \{a, b, c, d, e, f, g\}$ .

We define an *evasive signature* as a packet which triggers an IDS rule (Snort in our example) while in reality it has no effect on the actual session state at the server side. For each signature  $s^r$  of a rule r, it is ideally possible to divide it into two subsignatures  $s^r = s^r_+ + s^r_*$ , where  $s^r_*$  represents all evasive signatures and  $s^r_+$  the set of correct signatures.

Let  $p^s$  denote a packet that matches signature s.  $abde_*f$  is an example of a successful signature evasion sequence to the FTP rule set. The attacker can apply this evasion sequence to perform a real attack as follows: First, he logs in as a normal user (non admin) with a correct username and password. This action requires the sending of  $p^a$  and  $p^b$  from the attacker side and leads to the sending of  $p^d$  from the server to indicate that the user is successfully authorized. At this phase, the Snort DFA reaches state 3 (Fig.1). In the next step, the attacker tries to fabricate a  $p_{+}^{e}$  packet that triggers  $r_{5}$  at Snort taking it to state 0 but does not do so at the server side (which remains at state 3). In order to do this, the attacker sends a packet that matches  $r_5$  but actually does something else rather than exiting the session as Snort thinks. The attacker can do that, for example, by creating a directory named "QUIT". After that, he can perform the last step of the attack of accessing the restricted file at the server, *i.e.*, issues a  $p^f$  packet. This last action will not trigger the target rule  $r_6$  and hence successfully evades Snort. It can also be noticed that many other signature evasions are also possible, such as  $q_*abdf$  (evasion through state 5),  $abc_*q_*abdf$ , and  $ab_*cbde_*f.$ 

We formalize the signature evasion problem in Sec.2 and develop a formal characterization of evasive paths in Sec. 3. Sec. 4 provides an optimal rectification of signature evasions based on the direct manipulation of a rule set DFA. Signature evasion vulnerabilities are detected in a number of existing Snort flowbit rules and the results are presented in Sec.5. We then summarize related work and conclude.

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Table I. FIF login rule s	set	rule	login	ΓP	F٦	1.	Table
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$r_1$	msg: "FTP Normal User Login Attempt - Send username"; flow: established, to_server; content: "USER"; depth:5; nocase; content:!"admin"; within:5; content: " 0D0A "; flowbits: set, ULA; flowbits: noalert;	а
$r_2$	msg: "FTP Normal User Login Attempt - Send password"; flow: established, to_server; content: "PASS"; depth:5; flowbits: isset, ULA; flowbits: set, ULA2; flowbits: noalert;	b
$r_3$	msg: "FTP login denied"; flow: established, to_client; flags:A; flowbits: isnotset, UL; flowbits: isset, ULA; flowbits: isset, ULA2; flowbits: unset, ULA; flowbits: unset, Normal UserLoginAttempt2; flowbits: noalert;	c
$r_4$	msg: "FTP login granted"; flow: established, to_client; content: "230 Login successful. 0D0A "; nocase; flags: AP; flowbits: isset, NormalUserLoginAttept2; flowbits: set, UL; flowbits: noalert;	d
$r_5$	msg: "FTP user exits"; flow: established, to_server; content: " QUIT 0D0A "; nocase; flowbits: isset, UL; flowbits: unset, ULA; flowbits: unset, ULA; flowbits: unset, ULA; flowbits: noalert;	e
$r_6$	msg: "Normal User accesses important file"; flow:established, to_client; content: "Windows"; content: "system32"; content: "sam"; nocase; flowbits: isset, UL;	f
$r_7$	msg: "FTP Admin Login Attempt - Send username"; flow: established, to_server; content: "USER"; depth:5; nocase; content: 'admin"; within:5; content: " 0D0A "; flowbits: set, ALA; flowbits: noalert	g
$r_8$	msg: "FTP login denied"; flow:established, to_client; flags:A; flowbits: isset, ALA; flowbits: unset, ALA; flowbits: noalert;	c
$r_9$	msg: "FTP Admin exits"; flow:established, to_server; content: " QUIT 0D0A "; nocase; flowbits: isset, ALA;	e

## 2. Problem Definition

Let  $\mathcal{R}$  be a signature rule set. A rule of  $\mathcal{R}$  that generates an alert is referred to as a *target rule*. A rule is *evadable* if its signature can be triggered by a fake (fabricated) packet. The set of all target rules in a rule set is called the *target rules set*. A *target rule group* is a group of target rules that generate the same type of alert (these rules may possibly identify different signatures).

flowbits: unset, ALA; flowbits:noalert;

Let  $g_a$  be a target rule group of  $\mathcal{R}$  which detects attack a. An a-attack is a flow of packets which trigger an alert rule of  $g_a$ .

Definition 2.1 (Target Rule Group Evasion): A target rule evasion on  $g_a$ , or *a*-evasion, is an *a*-attack camouflaged by sequences of evasive signatures resulting in the non triggering of any of the rules of  $g_a$ .

A target rule evasion may be an evasion of the entire rule set if it does not trigger any other alert rule. However, this is not a mandatory requirement. Some target rule evasions fall within the general category of evasions which trigger a different set of alerts than those which the attack actually does. This type of evasion is tricky as it diverts the attention of the security administrator by providing a wrong diagnosis of the problem, hence giving more time to the attacker to accomplish his goal. The algorithm we provide in this paper is also able to stop these evasions.

Let  $D = (Q, \Sigma, \delta, n^0, F)$  be a DFA of  $\mathcal{R}$ , such as the one in Fig.1. Crossing a transition in D is equivalent to the triggering of a rule of  $\mathcal{R}$  which may change the DFA state as well as generate output (log, warning, alert). More accurately, D is a Mealey FSM (Finite State Automaton) since every rule is allowed to generate output. In addition, a

flow is accepted by D only if at least one target rule of  $\mathcal{R}$  is triggered, *i.e.*, one *target transition*, and it is not important after that in which state the last packet of the flow will bring the DFA in. We use a simple algorithm to convert each signature rule set DFA to a DFA where each target state accepts only transitions that generate alerts related to exactly one target rule group.

Definition 2.2  $(A_*/A_+ \text{ Notation})$ : Let  $A = \{s^1, \ldots, s^n\}$  be a set of signatures.  $A_*$  denotes the subset of A formed only by evasive signatures, i.e.  $A_* = \{s^i_* | s^i \in A \land s^i_* \neq \phi\}$ . Similarly,  $A_+ = \{s^i_+ | s^i \in A\}$ . This notation naturally extends to DFA paths.

Definition 2.3 ( $\oplus$  operator): Let *n* be a node of DFA *D* and *p* a string of signatures.  $n' = n \oplus_D p$  denotes the node of *D* reachable from *n* using *p*. The *D* subscript is omitted if it is known from the context.

Definition 2.4 ( $\ominus$  operator): Let p be a string of signatures belonging to signature alphabet  $\Sigma = A \cup B$ , where  $A \cap B = \phi$ . The string  $p' = p \ominus B$  is formed by systematically deleting every element of B appearing in p. We also write  $p = \ominus_B(p')$  or  $p' \in \ominus_B^{-1}(p)$ .

Corollary 1 (Characterization of Evasive attacks): Let  $p_+$  be an *r*-attack detectable by final states  $F_r$  of DFA D, i.e.  $n^0 \oplus p \in F_r$ . An evasion of p is an attack with path p' such that  $n^0 \oplus p' \notin F_r$  and  $p' \oplus \Sigma_* = p_+$ , where  $\Sigma$  is the alphabet of signatures of D.

Definition 2.5 ( $D^+$  Notation): The false positive closure  $D^+$  of a rule set DFA D is a DFA with the same detection capability of D without the negative effect of generating false positives.

Fig.2 shows the  $D^+$  of the FTP rule set (Table 1). For exam-



Figure 1. DFA of the FTP rule set

ple, this DFA does not consider the evasive path  $a_*b_*d_*f_*$  an attack while D does (Fig.1).  $D^+$  never generates false alarms due to evasive packets. Hence, it can be used to model the actual session state of the service that the rule set protects, so we will also refer to it as the actual session state DFA.

Definition 2.6 ( $D^{\circ}$  Notation):  $D^{\circ}$  denotes the NFA obtained from D by making its final states the new set of start states and all the states final (F = Q).

Let  $\mathcal{L}_{std}$  denote the usual function which returns the language recognized by a DFA (all input which ends at a final state).

Lemma 1 (Language of a rule set DFA): Let  $\mathcal{L}(D)$  denote the language of a rule set DFA D: *i.e.*, the set of all flows that trigger a target rule of  $\mathcal{R}$ . We have:

$$\mathcal{L}(D) = \mathcal{L}_{std}(DD^{\circ}) \tag{1}$$

Next, we identify the language of all signature evasions that can be applied on D.

Theorem 1 (DFA of all signature evasions): Let  $F_r$  be the set of target states of D related to target rule group  $g_r \subset \mathcal{R}$ . Let  $D_r = (Q, \Sigma, \delta, n^0, F_r)$  be the DFA obtained from Dby keeping only  $F_r$  as target states. Let  $D_r^+$  be the false positive closure of  $D_r$ . Let  $D_r^\circ = (Q, \Sigma, \delta, F_r, Q)$  be the NFA obtained by making  $F_r$  the new start states and all states in Q target states. Let  $\neg D_{-r} = (Q - F_r, \Sigma - r, \delta - r, n^0, Q - F_r)$ be the DFA obtained from  $D_r$  by removing all states  $\in F_r$ and making all the other states final. The DFA  $D_r^e$  which generates all successful r-evasions is then:

$$D_{r}^{e} = \neg D_{-r} \cap (D_{r}^{+} D_{r}^{+,\circ})$$
(2)

## 3. Characterization of Evasion Paths

This section characterizes the form of an evasion path. It also identifies a theorem which will be used in the next section to derive a polytime solution to the signature evasion problem.

Definition 3.1 (Trail DFA): It is a DFA of m nodes  $\{n_i | 0 \le i \le m\}$  ordered from  $n_0$  to  $n_m$  where: (1) There



Figure 2. False Positive Closure of the FTP DFA

is a trail which spans all the nodes of the DFA. That is,  $\forall i, n_{i+1} \in n_i^+$   $(n_{i+1} \text{ reachable from } n_i \text{ in one hop})$ , (2) All paths of D respect the initial ordering of the nodes. That is,  $\forall i, n_i^+ \subseteq \{n_j | m \ge j \ge i\}$ , and (3) All final nodes are articulations of the DFA (cut nodes). That is, if  $n_k \in F$ , then D has no transition  $(n_i, s, n_j)$  such that i < k < j.

Definition 3.2 (Disjoint-Hop Trail DFA): is a trail DFA with the additional condition that if  $\exists i, j | j > i + 1 \land (n_i, s, n_j) \in \delta$  then the DFA has no transition  $(n_k, s, n_l)$  where  $i \leq k < l < j$ .

Theorem 2: Disjoint-Hop Trails are unevadable.

Theorem 3 (Minimal Evadable Paths): If p is an evadable attack path of D then the attack simple path  $p_{min}$ derived from p is also evadable.

Corollary 2: To determine if an alert rule r is evadable, it is sufficient to consider only the simple paths to the set of its final nodes  $F_r$ .

This result tells us that if we manage to prove that no simple path to an alert node is evadable then any evasion to that node is impossible.

Lemma 2 (Fork Property of Evasion Paths): Let r be an evadable alert rule of  $\mathcal{R}$  and  $F_r$  the set of final states of D corresponding to r. Let p be a simple attack path which triggers r. If q is an evasion of p (hence of r) then q forks with p at a node a where the prefix sub-paths of p and q from the start state to a form a disjoint hop trail (e.g., Fig.5).

Theorem 4 (Characteristic Evasion Path): Let p be an evadable attack simple path. Let q be an evasion of p which forks with it at a node a with a transition t as specified by Lem.2, such that (Fig.3):  $p_+ = p_+^0 s_+ p_+^1$ ,  $q = q^0 t q^1$ ,  $t \neq n_0$ ,  $n_0 \oplus p_+^0 = n_0 \oplus q^0 = a$ ,  $a \oplus s = b$ ,  $a \neq b$ ,  $a \oplus t = c$ ,  $a \neq c$ ,  $b \neq c$ ,  $q \oplus \Sigma_* = p_+$ , then:

I – The transition in  $(d, s, e) \in q$  which corresponds to the  $s_+$  in (a, s, b) has to occur after node c, i.e.  $\in q^1$  (Fig.3, 4) where  $e \neq b$ .

2 – There exists another evasion q' of p, which starts by prefix  $p_+^0$ , crosses transition (a, t, c) with evasion  $t_*$  and proceeds with an all evasive input  $q_{1,*}^1$  until it reaches d, *i.e.*,  $q' = p_+^0 t_* q_{1,*}^1 s_+ q_2^1$  (Fig.5).



Figure 3. Possible evasion path

Applied to the DFA of Fig.6 where *a* corresponds to state 2 and *s* to transition *b*, it can be noticed that an evasion is possible through transition *e* since  $(5, b, 5) \in \delta$ . An example of such an evasion is  $ae_*bc$ .

In what follows the use of a, b, c, d, e, s will be based on their meaning as used in Thm.4.

The strength of the characteristic evasion path theorem lies in three aspects. First, it indicates that, to check for evadability, only fork nodes need investigation. Second, the prefix to a fork node can be ignored and the only concern is whether the transition at the fork node leading to a final state is also reachable from the other side of the fork. What is finally important to look at is whether from e it is possible to generate a path which evades the path from b to a target state. We will use this observation to identify a minimal rectification of a rule set DFA against signature evasions.

## 4. Resolution of Signature Evasions

Based on Thm.4, it can be determined that rule r which corresponds to the final nodes  $F_r$  of Fig.5 is evadable. To rectify this, a *patch* can be applied by adding transition (d, s, b) to D as shown in the figure. We name this procedure *stitching based on the characteristic evasion path theorem*. Using this stitching, any evasion q' (ref.Thm.4) becomes detectable as it now leads the stitched automaton to a state in  $F_r$ . Since any evasion path q implies the existence of a q' as indicated by the theorem, then the non existence of any successful q' in the stitched automaton implies that all the corresponding q evasions are no longer possible. By applying this on all cases where the stitching is feasible, it



Figure 5. Characteristic Evasion Path



Figure 4. Impossible evasion path

can be determined that all possible evasions are no longer possible.

As an example, the application of this stitching method on the automaton of Fig.6(a) results in the signature evasion safe automaton of Fig.6(c). It can be noticed that the (5, b, 3)stitching transition (Fig.6(b)) is able to stop evasion  $ae_*bc$ .

The stitching we employ is *minimal* in the number of stitching transitions to add to an automaton. This is because if the stitchings were to be carried beyond node e then usually more than one transition (and at least one) will be required.

When an alert is triggered by the stitched DFA, there is still a possibility of it being a false alarm. To explain that, let's consider the notation:

Definition 4.1 ( $\mathcal{E}(p)$  Notation): If  $p = s^1 s^2 \dots s^n$  is a signature string then

$$\mathcal{E}(p) = \{q^1 q^2 \dots q^n | q^i \in \{s^i_+, s^i_*\}\}$$

Note that, by definition, all flows in  $\mathcal{E}(p)$  are considered by the corresponding IDS rule set as the same flow since by definition it does not differentiate an  $s^i_+$  from an  $s^i_*$ . In this regard, if q is an evasion path detected by the stitched DFA, then any flow in  $\mathcal{E}(q)$  will also raise an alert even it is not actually an evasion. This in fact is also true for normal attacks that are detectable by the original rule set. This type of false positives is always inevitable.



Figure 6. Application of Minimal Stitching

Algorithm 1 edgeSet minStitch (DFA D, NFA safeD)

1:	Let $D = (Q, \Sigma, \delta, n^\circ, F) = \bigcup_{r \in R} F_r$ , and $D' =$
	$(Q, \Sigma, \delta^+, n^0, F)$ its positive closure.
2:	safeD = D.clone();
3:	<b>edgeSet</b> minStitch = $\phi$ ;
4:	for all target rule group $F_r$ do
5:	for all fork node $a \notin F_r$ do
6:	// $suc^*(b)$ =set of all nodes reachable from b
7:	for all $b \in suc(a) \mid suc^*(b) \cap F_r \neq \phi$ do
8:	Let (a, S, b) be the set of transitions from a to b
9:	for all fork tuple $(a, b, c)$ do
10:	// nodes(s) = {n s is outgoing from n}
11:	for all $(d, s, e) \in \delta   d \in ((nodes(s) - F_r - \{a\}) \cap$
	$suc^*(c)) \land (e \notin F_r \cap b)$ do
12:	// $\mathcal{E}_{r}^{b,e}$ defined in Thm.5
13:	if $\mathcal{E}_{r}^{b,e} \neq \Phi$ then
14:	// there is an evasion suffix from e
15:	minStitch $+ = \{(d, s, e)\}$
16:	safeD += $\{(d, s, e)\}$ ;
17:	end if
18:	end for
19:	end for
20:	end for
21.	end for
22.	end for
22.	return minStitch
25.	

The next step would be to find an efficient way to identify the states d to apply the stitching on. To do so, we will use Thm.5, which provides a straightforward procedure to identify if an evasion can successfully proceed from state e(Thm.4).

Theorem 5: Let  $\mathcal{E}_r^{b,e}$  be the set of all suffixes  $q_2^1$  of r-evasions q (ref. Thm.4). Let  $D_r^{+b}$  be the DFA formed from  $D^+$  by making b a start state and only  $F_r \subset F$  as final states. Let  $\neg D_{-r}^e$  be the DFA formed from  $D_r$  by making e a start state, then removing all final states  $F_r$ , then making all the other states final. We have:

$$\mathcal{E}_r^{b,e} = \neg D^e_{-r} \cap (D^{+b}_r D^{+\circ}_r) \tag{3}$$

At this point, we can present Alg.1 which applies minimal stitching using the result of Thm.5. For each target rule group  $F_r$  it does the following: For each fork tuple (a, b, c) where  $F_r$  is reachable from b, it checks whether there is a d reachable from c ( $d \in suc^*(c)$ ) where  $(d, s, e) \in \delta$  and  $\mathcal{E}_r^{b,e} \neq \Phi$ . If this is the case then a stitch is required at node d.

*Lemma 3:* Alg.1 generates a minimal rectification of signature evasions and has a polytime complexity.

## 5. Evaluation

We collected 400 publicly available flowbit rule sets (most of them from BleedingEdge [3] and SourceFire [4]). We implemented a parser that generates a rule set DFA and runs Alg.1. In case necessary stitches are found, a safe stitched NFA is generated as well as the corresponding safe (non vulnerable) DFA. 4.5% of the flowbit rule sets were found vulnerable to the proposed attack when all rules are considered evadable (for all signature  $s, s_* \neq \phi$ ). Because of its polytime complexity, the code runs in few minutes over all rule sets except for rule set 6 which took about two hours.

It can be noticed from Table 2 that most of the vulnerable rule sets require a digit number of stitches to become safe for the exception of four of them. This first indicates that most of the times our stitching method generates DFAs which can be easily converted to a safe rule set. For example, the DFA of the  $10^{th}$  flowbit rule set is shown in Fig.8. It has five states, an alphabet of three different signatures, one fork state, and only requires one stitch. The resulting NFA is given in Fig.8 and the corresponding safe DFA in Fig.9. The tool we developed automatically generates DFAs/NFAs in the standard DOT format [5] for easy visualization.

There are however four flowbit rule sets for which more than 10 stitches are required. For rule set 12, this is rather good as the overall stitching results in a reduced DFA size. Hence, only three rule sets pose problem: 6, 7, and 18. Rule set 7 has 12 fork nodes and requires 719 stitches resulting in a safe DFA of 2095 states. For rule set 18, the safe DFA has 21448 states and 671609 transitions. Finally, rule set 6 has a large DFA of 192 nodes, of which 142 are fork nodes. The number of stitches alone is 30142 and the resulting safe DFA could not fit within the 1.5 GB allocated by our code. This shows that there is a need for using a different resolution method for these three and similar rule sets. When the safe DFA size is reasonable, a new rule set can be readily generated by considering each state as a separate binary number. This implies  $\lceil log_2(|Q|) \rceil$  binary digits, then map

Table 2. Vulnerable Rule Sets

	Flowbit Rule Set DFA Saf			SafeNFA	Safe	DFA			
ID	Σ	Q	δ	Forks	Stitches	$Q_1$	$\delta 1$	$\frac{Q_1}{Q}$	$\frac{\delta_1}{\delta}$
1	6	5	30	2	3	7	20	1.40	0.67
2	5	17	85	13	7	37	160	2.18	1.88
3	6	2	12	1	4	5	21	2.50	1.75
4	3	5	15	2	1	6	17	1.20	1.13
5	3	3	9	1	2	4	10	1.33	1.11
6	34	194	6596	142	30142	Huge	Huge	Huge	Huge
7	13	21	273	12	719	2095	$2x10^{4}$	99.76	88.84
8	3	5	15	1	1	7	18	1.40	1.20
9	5	17	85	13	7	37	155	2.18	1.82
10	3	5	15	1	1	7	20	1.40	1.33
11	3	3	9	1	1	5	14	1.67	1.56
12	39	3	117	1	35	5	49	1.67	0.42
13	16	3	48	1	10	5	35	1.67	0.73
14	12	3	36	1	6	5	31	1.67	0.86
15	2	3	6	1	1	4	8	1.33	1.33
16	2	3	6	1	1	4	8	1.33	1.33
17	8	3	24	1	6	5	22	1.67	0.92
18	56	18	1008	8	1328	$2x10^{4}$	$7x10^{5}$	1191	666







Figure 7. DFA of rule set 10

Figure 8. Its Stitched NFA

Figure 9. Its Safe DFA

each digit to a flowbit label and use that in the condition and output of each transition, resulting in a number of  $\delta$  rules.

## 6. Related Work

Ptacek and Newsham [6] were the first to bring up a way to evade a NIDS by using TCP Segmentation and IP Fragmentation. FragRoute was the tool created to carry out these evasion techniques. A NIDS needs to carry out TCP segments and IP fragments reassembly to counter these evasion techniques. Handley and Paxson [7] [8] discussed evasion techniques based on inherent ambiguities of the TCP/IP protocol which lead to the difference between a NIDS and its protected system in performing TCP segments and IP fragments reassembly. Traffic normalization suggested by Handley et al. [7] tries to remove these ambiguities by patching the packet stream. Active Mapping is another solution proposed by Shankar and Paxson [9], which eliminates TCP/IP-based ambiguities in a NIDS analysis with minimal runtime cost. It is implemented in the Snort Stream5 preprocessor [10].

Besides NIDS evasion techniques, several attacks on IDSs have been identified in the literature. Wagner and Soto [11] revealed mimicry attacks on a HIDS. Snot [12], Stick [13], IDSWakeup [14] and Mucus [15] are stimulation tools that cause DOS attacks on Snort by overloading it with alerts from mutated packets constructed from Snort rules. The algorithmic complexity DOS is another NIDS attack identified in [16] [17].

Rubin et al. [18] created the AGNET tool which uses an inference engine to generate as well as detect attacks on a NIDS starting from an exemplary attack instance. Our signature attack is not an instance generated by AGENT, assuming that the rule set represents the original exemplary attack instance. Our attack is neither a TCP nor an application-level transformation. Existing evasion techniques can be used by our evasion. However, these techniques only apply to injected packets which are not part of the actual session. Automatically generated semantic-aware signatures [19] or session signatures [20] can also be vulnerable to our evasion. In order to avoid false positives, these generated signatures consider "innocent"paths (or sequences) which are not attack instances. Our signature evasion exploits these "innocent" paths and tries to convince the IDS that the session is following one of the "innocent" paths.

## 7. Conclusion

In this paper, we identified and formally specified a new type of evasion on IDS signature rule sets, named signature evasions. We provided an algorithm to patch a rule set against this type of evasion based on DFA manipulation. The algorithm runs in polytime and derives a minimal rectification to the rule set by identifying the smallest number of transitions (stitchings) to apply on the rule set DFA to render it safe.

We will develop a tool to assist in the design of signatureevasion safe rule sets as well as the patching of existing ones. We also intend to investigate the problem of optimal mapping from a stitched NFA to a signature rule set in order to solve the scalability problem inherent to using signatureevasion safe DFAs.

## References

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## Proofs

#### **Proof of Lem.1 (page 3)**

By definition, any flow  $p \in \mathcal{L}(D)$  triggers at least one alert rule of  $\mathcal{R}$ . p can be decomposed into two sub flows  $p_1p_2$ where the last packet of  $p_1$  triggers the first alert. Hence,  $p_1 \in \mathcal{L}_{std}D$  as it brings it to a target state by definition of how we construct a rule set DFA. The second sub-flow  $p_2$  is only required to continue taking D from one state to another (*i.e.*, no unexpected input). Since it starts doing so starting from a final state of D, hence  $p_2 \in \mathcal{L}_{std}(D^\circ)$ . We conclude that:

$$\mathcal{L}(D) = \mathcal{L}_{std}(D)\mathcal{L}_{std}(D^{\circ}) = \mathcal{L}_{std}(DD^{\circ})$$

### **Proof of Thm.1 (page 3)**

By definition, an *r*-evasion *q* is a sequence of signatures which never crosses a target state of  $D_r$ , *i.e.*,  $q \in \neg D_{-r}$ . In addition, an *r*-evasion is detectable by the actual session DFA. By Lem.1 this implies that  $q \in D_r^+ D_r^{+\circ}$ .



Figure 10. Disjoint-Hop Trail DFA

## Proof of Thm.2 (page 3)

Let  $D = (Q, \Sigma, \delta, n^0, F)$  be a trail DFA where  $Q = \{n^0, n^1, \ldots, n^m\}$  and  $D^+$  its false positive closure. Without limiting the generality of the proof we assume that  $n^m \in F$  (because of the articulation property of target states (Def.3.2)). Let  $S^i$  the disjunction of signature that link node  $n^{i-1}$  to  $n^i$ , *i.e.*,  $(n^{i-1}, S^i, n^i) \subset \delta$ . Transitions between nodes  $n^i, n^j | j > i + 1$  are denoted by  $S^i_j$ . In addition, since buckles are allowed in a trail DFA, we denote by  $B^i$  the buckle at state  $n^i$  (disjunction of all individual buckles at that state).

Let's assume that target state  $n^m$  is evadable. This implies that there exists a path  $p_m^1$  such that  $n^0 \oplus p_{m,+}^1 = n^m$  and another path  $p_m^2$  such that:  $p_{m,+}^1 = p_m^2 \oplus \Sigma_*, n^0 \oplus_D p_m^2 \neq n^m, n^0 \oplus_{D^+} p_m^2 = n^m$ .

We will prove by recurrence on m:

1) Case where m = 1: Since  $p_1^2$  cannot reach  $n^1$ , it can only be of the form  $(B^0)^*$ , which in turn cannot end with  $s^1$  because  $s^1 \notin B^0$  by definition of a DFA. Hence,  $p_1^2$  cannot exist  $\Rightarrow D$  is not evadable.

2) Case where  $m = N + 1, N \ge 1$  (Fig.10): Let's assume that disjoint-hop trail DFAs where  $1 \le m \le N$  are not evadable. Let D be a disjoint-hop trail DFA where  $m = N + 1, p_m^1$  is of the form:

$$p_m^1 = (B_+^0)^a s_{j,+}^0 p_{m-j,+}^1 \tag{4}$$

where  $a \ge 0$ ,  $s_1^0 \in S^1$ ,  $s_j^0 \in S_j^0$ , and  $n^j \oplus p_{m-j,+}^1 = n^m$ .  $n^j$  cannot be node  $n^0$  by definition of the DFA. If  $p_m^2$  exists, it has then to be of the form:

$$p_m^2 = q_k p_{m-k}^2 \tag{5}$$

where,  $n^0 \oplus q_k = n^k$ ,  $q_k \oplus \Sigma_* = (B^0_+)^a s^0_{j,+}$ ,  $n^k \oplus p^2_{m-k} \neq n^m$ . Since  $s^0_{j,+} \in q$ , k cannot be less than j because of the dijoint-hop property (Def.3.2) and the trail property of the DFA (once  $n^0$  is left it cannot be re-visited). Hence,  $k \ge j$ . We have  $n^0 \oplus p^2_m = n^0 \oplus (q_k p^2_{m-k}) = (n^0 \oplus q_k) \oplus p^2_{m-k} = n^k \oplus p^2_{m-k}$ . That  $p^2_m$  is an evasion of  $p^1_m$  implies that we need to have:  $n^j \oplus_D p^1_{m-j,+} = n^k \oplus_D p^2_{m-k}$ , and  $n^j \oplus_{D^+} p^1_{m-j,+} = n^j \oplus_D + p^2_{m-k}$ . The solution to this latter problem

if it exists implies a solution to the problem where  $n^j \oplus$  $p_{m-j,+}^1 = n^j \oplus q' \oplus p_{m-l}^2$  in D. Since by hypothesis of recursion this latter condition is impossible, it implies that  $p_{m-k}^2$  cannot exist, which in turn concludes the proof.

## **Proof of Thm.3 (page 3)**

Let  $p_{min} = s^1 s^2 \dots s^m$  be the simple path derived from p. By definition of a simple path,  $n^0 \oplus p = n^0 \oplus p_{min}$ ,  $p_{min}$ has no loops or cycles, and p is of the form:

 $p = p^1 s^1 p^2 s^2 \dots p^m s^m p^{m+1}$ 

where each  $p^i \in \Sigma^*$ . Since q evades p, then q is of the form:  $q = q^1 s_+^1 q^2 s_+^2 \dots q^m s_+^m q^{m+1}$ 

where  $q^{i} \oplus \Sigma_{*} = p_{+}^{i}$ . It implies that the path:  $q' = q_{*}^{1}s_{+}^{1}q_{*}^{2}s_{+}^{2}\dots q_{*}^{m}s_{+}^{m}q_{*}^{m+1}$ 

has the properties:  $q' \ominus \hat{\Sigma}_* = p_{min,+} \Rightarrow n^0 \oplus q' = n^0 \oplus p_{min,+}, \ n^0 \oplus q_{min,+}, \ n^0 \oplus q_{min,$  $n^0 \oplus q$ 

which by definition evades  $p_{min}$ .

### **Proof of Lem.2** (page 3)

By definition of a simple path, p and q cannot be on the same trail by virtue of Thm.2. Hence, q has to fork at least once with p. In addition, Thm.2 indicates that a disjointhop fork (Def.3.2) on a trail cannot lead to any successful evasions. Hence, q has at least one non disjoint-hop fork with p.

## **Proof of Thm.4 (page 3)**

## Case the $s_+$ of q belongs to $q^1$ .

1) Case where transition  $(a, t_*, c) \in q$ . This case fits perfectly with the condition of the theorem (Fig.5).

2) Case where transition  $(a, t_+, c) \in q$  (Fig.3): We look if it is possible to derive a new evasion path q' that evades pbut uses transition  $(a, t_*, c)$  instead of  $(a, t_+, c)$ . Let g be the node crossed by  $p^0$  such that:

 $p^0 = p_1^0 t p_2^0, \, n^0 \oplus p_1^0 = g,$  $q^0 = q_1^0 t' q_2^0, \ n^0 \oplus q_1^0 = g,$ t' is null (g = h) or any transition of  $\Sigma$  including t,  $g \oplus t = g \oplus t' = h,$  $t_+q_1^1s_+ \ominus \Sigma_* = t_+p_2^0s_+.$ It derives from  $t_+q_1^1s_+ \ominus \Sigma_* = t_+p_2^0s_+$  that  $q_1^1 \ominus \Sigma_* = p_2^0$ .

This implies that the path  $q' = (p_{1,+}^0 t_+ p_{2,+}^0) t_* (q_{1,*}^1 s_+ q_2^1)$ evades p, which also fulfills the conditions of the theorem.

# Case the $s_+$ is traversed by $p^0$ (Fig.4).

Let q be the node crossed by  $p^0$  such that:

 $p^0 = p_1^0 t p_2^0, \ n^0 \oplus p_1^0 = g,$  $q^0 = q_1^0 s' q_2^0, \ n^0 \oplus q_1^0 = g,$ s' may be null (g = h) or any signature  $\in \Sigma$ 

$$g \oplus s = g \oplus s' = h$$
, and  
 $q \oplus s_+ p_2^0 s_+ = b$ ,

 $g \oplus s_+ p_2 s_+ = o$ , We then have:  $p_+ = p_{1,+}^0 s_+ p_{2,+}^0 s_+ p_{1,+}^1 t_+ p_{2,+}^1$  and  $q_- = p_{1,+}^0 s_+ p_{2,+}^0 s_+ p_{2,$  $q_1^0 s_+ q_2^0 t_+ q^1$ . It derives that  $n^0 \oplus q_1^0 = n^0 \oplus p_{1,+}^0 s_+ p_{2,+}^0$ which by Thm.2 implies that  $q = h = \cdots = a$ . However, the latter condition is impossible by DFA definition because a has already a transition to  $b \neq a$ . Hence q cannot exist.

## **Proof of Thm.5 (page 5)**

Let q be an evasion path as identified in Thm.4. For qto be successful (1)  $q_2^1$  has to make  $D_r^+$  pass through a target state of  $F_r$  starting from state b and (2) from state e in  $D_r$  no target state in  $F_r$  is traversed through  $q_2^1$ . The first constraint implies that from state b in  $D_r^+$  a target state  $\in F_r$  is first reached then any other walk in  $D_r^+$  is acceptable  $\Leftrightarrow q_2^1 \in D_r^{+b} D_r^{b+\circ}$ . By definition it can be easily noticed that  $D_r^{b+\circ} = D_r^{+\circ} \Leftrightarrow q_2^1 \in D_r^{+b} D_r^{+\circ}$ . The second constraint implies that  $q_2^1 \in \neg D_{-r}^{e_1}$ . Hence  $\mathcal{E}_r^{b,e} = \neg D_{-r}^e \cap (D_r^{+b} D_r^{+\circ})$ .

## **Proof of Lem.3 (page 5)**

Since finding the set of all fork tuples (a, b, c) takes  $O(|Q||\delta|)$ , identifying  $suc^*(c)$  for all nodes is  $\simeq O(|Q|)$ , identifying the function nodes(s) giving the set of nodes with an outgoing transition s is  $O(|\delta|)$  we conclude that algorithm Alg.1 runs in polytime if only the test  $\mathcal{E}_r^{b,e} \neq \Phi$ is doable in polytime. In fact not only  $\mathcal{E}^{b,e}_r \neq \Phi$  can be done in polytime but also the construction of  $\mathcal{E}_r^{b,e}$ . The intersection needs to be made by traversing states of  $\neg D_{-r}^e$  and using a marker m initially unset. The traversal of  $\neg D^e_{-r}$  is done by making sure the corresponding transition is also feasible in  $D_r^{+b}$ . If in the process of doing so a target state of  $D_r^{+b}$  is encountered the marker m is set. At that point, all states of  $D_r^{+b}$  are set as final by the traversing process and the process of computing the intersection continues in the standard way. Hence, in essence constructing  $\mathcal{E}_r^{b,e}$  will take no longer than the time it takes to constructing  $\neg D^e_{-r} \cap D^{+b}_r$  twice.