Securing heterogeneous embedded devices against XSS attack in intelligent IoT system

《Computers & Security》



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04 Conclusions



Introduction

XSS attack

"Why Cross-Site Scripting?

Cross-Site Scripting (XSS) is one such

commonly found and threatened web application vulnerability.

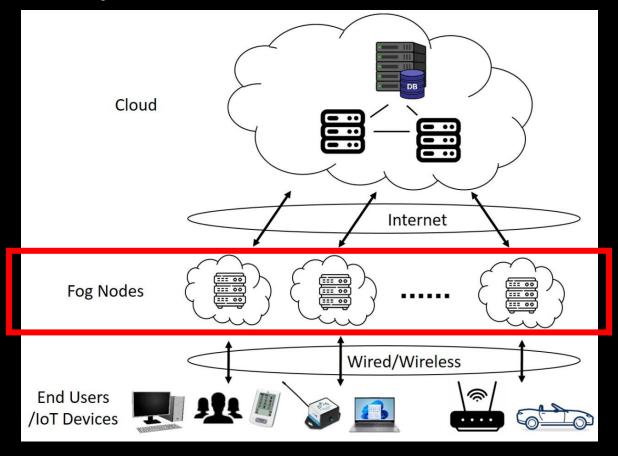
Massive scale:

- Unauthorized access to sensitive data.
- Redirecting the user to attacker control web site.
- Device exploitation in building botnet army for Distributed Denial of Service (DDoS)
- Reconfiguration of devices settings.



Fog-based IOT

IoT system



Fog Computing

- A distributed computing model that places computing resources and services between IoT devices and the cloud
- This model positions computing resources in proximity to the point of data generation, aiming to reduce latency in the data transmission process.
- Enables real-time processing and analysis of data at the device edge

Difference Between Edge Computing and Fog Computing

Fog Computing

- 在資料來源和中央雲端平台之間放置了一個分散的 企業運算層。與邊緣運算一樣,霧運算也能使處理能 力更接近資料擷取的位置。
- •雲端運算的延伸。當邊緣電腦向雲端發送大量資料時,霧節點接收資料並分析重要內容。然後霧節點將重要資料傳輸到雲端進行存儲,並刪除不重要的資料或保留它們以供進一步分析。

Reference: https://www.spiceworks.com/tech/cloud/articles/edge-vs-fog-computing/

Edge Computing

•邊緣運算讓處理和儲存系統盡可能靠近產生 和收集資料的應用程式、設備或元件。透過消 除將資料傳輸到中央處理系統並返回端點的需 要,有助於最大限度地減少處理時間



About Research

1. Purpose

The development of an approach to defend against XSS attack to safeguard embedded devices deployed in intelligent IoT system.

2. Method

Fog-enabled approach

- Comparing injected strings with the blacklisted
- Implementing filtering method

3. Demo environment

Digital IP Camera and wireless router
Hitron CODA 4582u router & Bosch Flexidome IP indoor 5000 HD camera.

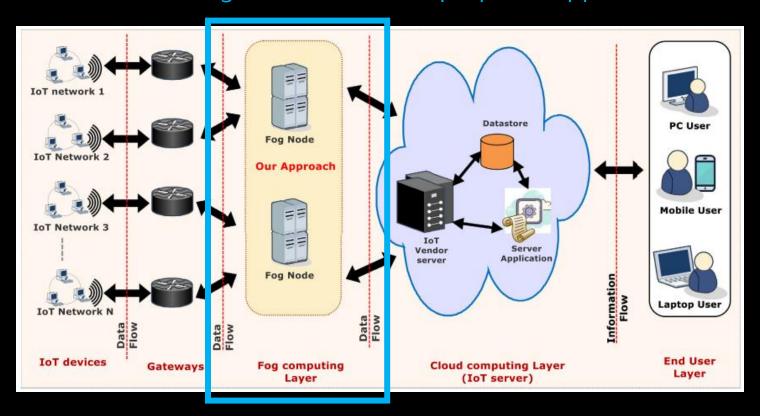
4. Experimental results Accuracy over 0.9



Proposed approach

Conceptual Design

Abstract Design Overview of the proposed approach.



Objective 1:

Identify reflected XSS attack.(parameter & class of attack string)yi ∈ Q and yi ⊆ AS

Objective 2:

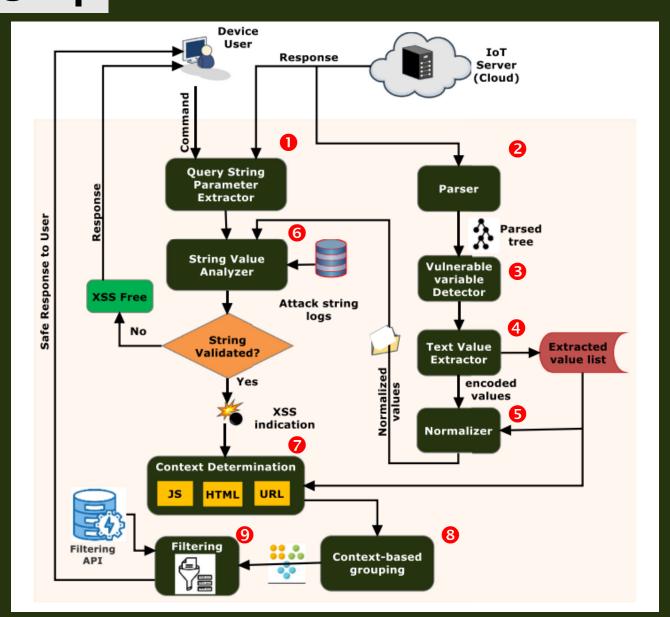
Identify stored XSS attack.

(injected input, HTTP response & class of attack string)

(wi ∈ I and xi ∈ L: wi present at xi) and (wi ⊆ AS)

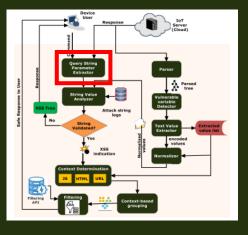
Objective 3:

Nullify the effects of XSS attack strings. Grouping (JS-based, HTML- based and their content)



Query string parameter extractor:

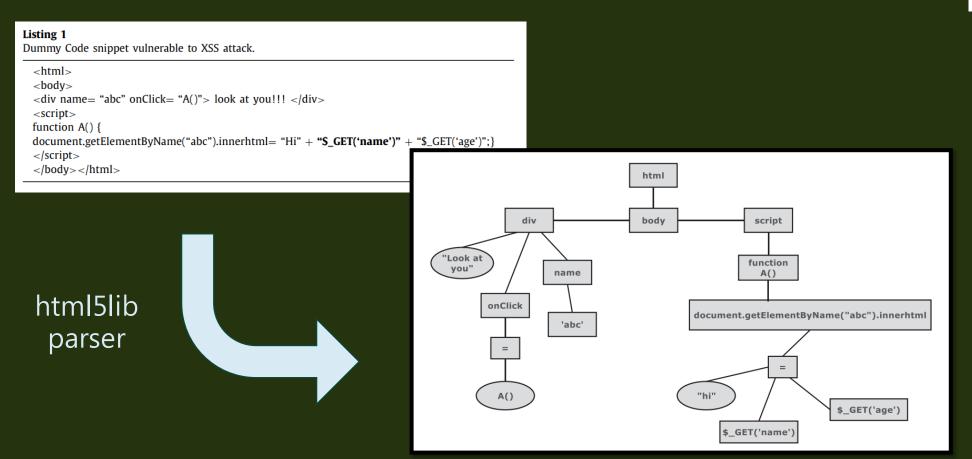
- Seizes each user's command i.e., HTTP request
- Correspondingly generated server's response i.e., HTTP response.
- Extracts the parameter values (query string)
- HTML decoding, URL decoding

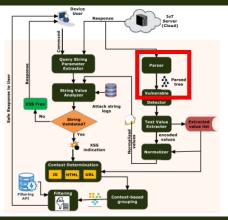


```
Request
                                                                                           Response
                        GraphQL
                                                                                                                   Render
1 GET /level1/frame?query=$3Cscript$3Ealert$28$29$3B$3C$2Fscript$3E HTTP/2
                                                                                           1 HTTP/2 200 OK
2 Host: xss-game.appspot.com
                                                                                          2 Content-Type: text/html; charset=utf-8
3 Sec-Ch-Ua: "Chromium"; v="121", "Not A(Brand"; v="99"
                                                                                          3 Cache-Control: no-cache
4 Sec-Ch-Ua-Mobile: 20
                                                                                          4 X-Xss-Protection: 0
5 Sec-Ch-Ua-Platform: "Windows"
                                                                                          5 X-Cloud-Trace-Context: 4cbe9fa9e6c0b1d84ec15f36cf23baf8;o=1
6 Upgrade-Insecure-Requests: 1
                                                                                          6 Vary: Accept-Encoding
7 User-Agent: Mozilla/5.0 (Windows NT 10.0; Win64; x64) AppleWebKit/537.36 (KHTML,
                                                                                          7 Date: Fri, 23 Feb 2024 07:06:31 GMT
  like Gecko) Chrome/121.0.6167.85 Safari/537.36
                                                                                          8 Server: Google Frontend
                                                                                          9 Content-Length: 421
8 Accept:
  text/html,application/xhtml+xml,application/xml;q=0.9,image/avif,image/webp,image/
                                                                                          10 Alt-Svc: h3=":443"; ma=2592000,h3-29=":443"; ma=2592000
                                                                                         11
  apng, */*; q=0.8, application/signed-exchange; v=b3; q=0.7
                                                                                         12
9 Sec-Fetch-Site: same-origin
10 Sec-Fetch-Mode: navigate
                                                                                         13 <!doctype html>
1 Sec-Fetch-User: 71
                                                                                         14 <html>
2 Sec-Fetch-Dest: iframe
                                                                                         16
13 Referer: https://xss-game.appspot.com/level1/frame
                                                                                                 <!-- Internal game scripts/styles, mostly boring stuff -->
4 Accept-Encoding: gzip, deflate, br
                                                                                         17
                                                                                                 <script src="/static/game-frame.js">
```

Parser:

- constructs parse tree of the received web page
- html5lib parser





Vulnerable variable detector & text value extractor:

• Identifies the vulnerable locations (1/2)

Each known vulnerable context of the HTML page

List of malicious contexts in HTML	page.
Elements	Context
	PCDATA
HTML	RCDATA
	CDATA
	Tag name
	Attribute name
	Attribute value: Quoted
	Attribute value: Unquoted
	Event attribute
	Tag text: String
	Attribute value: String
JavaScript	Method name
	Method value: REGEX
URL	Query: String

- ●PCDATA(Parsed Character Data): 可解析字元 Hello
- RCDATA (Replaceable Character Data):可替換的字元, < 代表 <
- CDATA (Character Data) :

CDATA 是字符數據,通常用於標記內容,例如 <script> 或 <style> 標記中的 JavaScript 或 CSS 代碼。

- Tag name: HTML元素的名稱,例如 標記中的 "p"。
- Attribute name: HTML元素的屬性的名稱 中的 "href"。
- Attribute value: HTML元素的屬性的值, 中的 "image.jpg"。
- Event attribute: HTML元素的屬性,應執行的JavaScript代碼 <button onclick="myFunction()"> 中的 "onclick"。
- Tag text: String :

標記文本是HTML元素內的純文本內容,不包含HTML標記。 例如,對於 This is a paragraph.,"This is a paragraph." 就是標記文本。



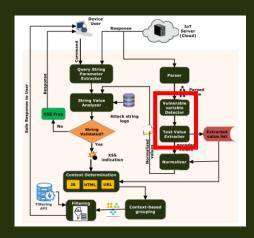
Vulnerable variable detector & text value extractor:

• Identifies the vulnerable locations (2/2)

```
H{} (HTML 標記、屬性)
JS{} (JavaScript 字串)
U{} (URL 屬性)
X<sub>PV</sub>{} (漏洞字串)
```

Vulnerable variable detection and value extraction.

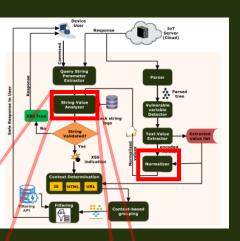
```
Input: parsed tree of response web page P(N, E)
Output: Vulnerable string payload vector (Xpv)
H_tag ← HTML vulnerable tags list
H_att ← HTML vulnerable attribute list
H_event ← HTML vulnerable event handler list
IS_{fun} \leftarrow IS vulnerable function list
JS_prop ← JS vulnerable properties list
URL_prop ← URL vulnerable properties list
Start
H{}← Ø;
IS{}← Ø;
U{}← Ø;
X_{PV}\{\} \leftarrow \emptyset;
//Extract every tag, attribute and event handler from parse tree
For each node n_i \in P(N, E) do
If (n<sub>i</sub>.matches(H_att)) then
H \leftarrow H \cup n_i.value;
elseif (ni.matches(H_event)) then
H \leftarrow H \cup n_i.value;
elseif (ni.matches(H_tag)) then
H \leftarrow H \cup n_i.value;
//collect JS string values from every possible place
If ((n_i.value \in JS\_prop) \&\& (n_i.value \in JS\_fun)) then
IS \leftarrow IS \cup n_i.value;
End if
elseif (ni.matches(URL_prop) then
U \leftarrow U \cup n_i.value;
End if
End for
X_{PV} \leftarrow H \cup JS \cup U;
Return vulnerable string payload vector X<sub>PV</sub>;
End
```



Normalizer:

- Normalizes the extracted vulnerable strings
- Performs decoding of these values

Relevant encodings category for ("<").					
Encoding name	code				
URL encoding	%3C				
HTML character entity	<				
HTML decimal character	<				
JS single escape character	\<				
JS hex escape sequence	\x3C				
HTML hexadecimal character	<				
JS Unicode escape sequence	\u003C				

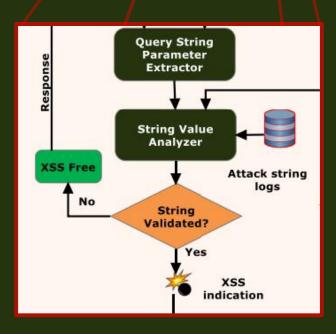


String value analyzer:

- Key task
- Extracted scripts from the HTTP request and response
- Vulnerable location
- Boyer-Moore algorithm

高效率的字串搜尋演算法,用於在一個主字符串中尋找特定模式的出現位置,是一種基於字符比對的算法。

• Found a match in blacklisted logs



Context determination:

- Recognize the context of the malicious attack string
- Execute correct attack filter APIs

Ex.

- HTML tag name
- Attribute value: quoted

Context-based determination:

- Grouping of such kind of scripts (p.15 Algo)
- Levenshtein distance measure the difference
- 萊文斯坦距離 Levenshtein distance

量化兩字串間差異的演算法。

<script>alert(48a\$bc);</script>

<script>alert(48xv&ez);</script>

S代表字母;N代表數字

<script>alert(48-S-);</script>

For each $C_i \in \text{Temp do}$

 $X_I \leftarrow extract \ value \ X \ from \ CT(X) \ for \ C_i;$

//X is the placeholder for variable.

If $(X_I \in STRING)$ then

 $\Gamma \mapsto \mathsf{CT}_{\mathsf{I}}$: String;

Else if $(X_I \in NUMERIC)$ then

 $\Gamma \mapsto \mathsf{CT}_{\mathsf{I}}$: Number;

Else if $(X_I \in REGEX)$ then

 $\Gamma \mapsto CT_I$: Regular expression;

Else if $(X_I \in Quoted Data)$ then

 $\Gamma \mapsto CT_I$: Quoted Data;

Else if $(X_I \in PCDATA)$ then

 $\Gamma \mapsto \mathsf{CT}_{\mathsf{I}}$: Parsed character data;

Else if $(X_I \in CDATA)$ then

 $\Gamma \mapsto \, CT_I \colon Character \; data;$

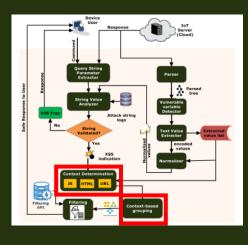
End If

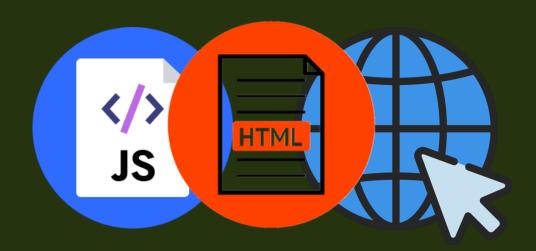
Temp \leftarrow modified(CT);

End for

Return Temp;

End





Filtering:

- Help of filtering APIs
- Produces safe response

```
Input: context information and extracted string value

Output: modified response (H<sub>M</sub>')

H ← extracted vulnerable HTML values;

JS ← extracted vulnerable JS values;

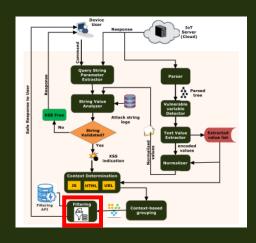
U ← extracted vulnerable URL values;

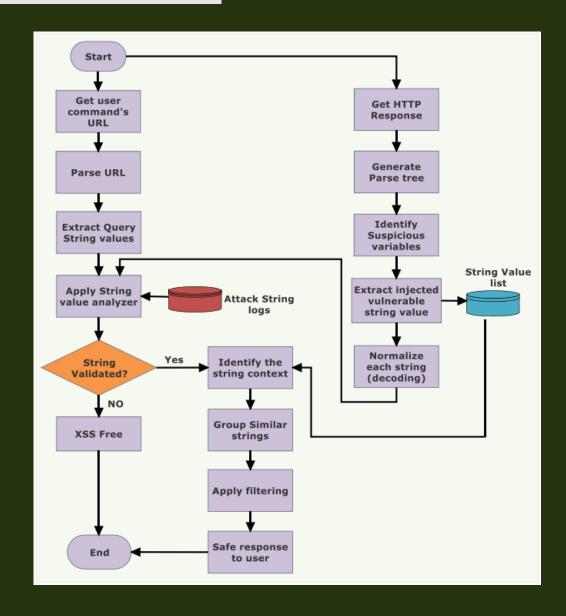
Temp ← context of each vulnerable string value;

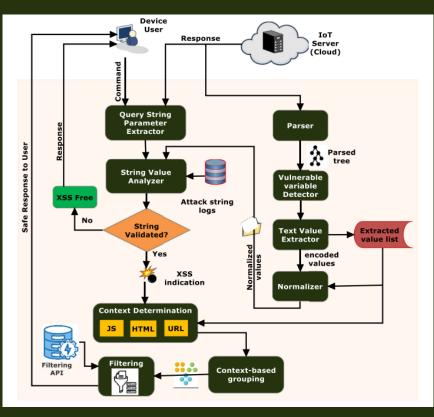
F_API ← Externally available Filtered APIs (F₁, F₂, F₃... FN);
```

- G TP (Grouped Templates): 儲存生成的分組模板
- m (Grouped Templates): 單個分組模板
- P (Levenshtein Distance): 儲存Levenshtein distance
- C (Context): 儲存上下文
- Hm' (Modified Response): 儲存修改後的網頁

```
Start
G TP \leftarrow \emptyset : m \leftarrow \emptyset :
P ← Ø:
C ← Ø:
//generate grouped template for each category of extracted string value
For each h_i \in H do
P \leftarrow Levenshtein-distance(h_i, h_{i+1});
If (P > \beta) then
Accept (h_i, h_{i+1});
m ← create grouped template (h<sub>i</sub>, h<sub>i+1</sub>);
G\_TP \leftarrow G\_TP \cup m:
else
Discard (h_i, h_{i+1});
Select other pair;
End for
For each |s_i| \in |S| do
P \leftarrow Levenshtein-distance (Js_i, Js_{i+1});
If (P > \beta) then
Accept (Js_i, Js_{i+1});
m ← create grouped template (Js<sub>i</sub>, Js<sub>i+1</sub>);
G\_TP \leftarrow G\_TP \cup m:
else
Discard (Js_i, Js_{i+1});
Select other pair;
End for
For each u_i \in Udo
P \leftarrow Levenshtein-distance(u_i, u_{i+1});
If (P > \beta) then
Accept (u_i, u_{i+1});
m \leftarrow \text{create grouped template } (u_i, u_{i+1});
G TP \leftarrow G TP \cup m:
else
Discard (u_i, u_{i+1});
Select other pair;
End for
// apply filtering API on each template
For each m_i \in G_TP do
C \leftarrow \text{context}(m(X_i)) \in \text{Temp}; //Xi \text{ is the placeholder for vulnerable value}
F_i \leftarrow (F_i \in F\_API) \&\& (F_i \in matches C);
Apply F<sub>i</sub> to X<sub>i</sub>:
H<sub>M</sub>' ← Modify X<sub>i</sub> in received response web page;
End for
Return HM':
End
```

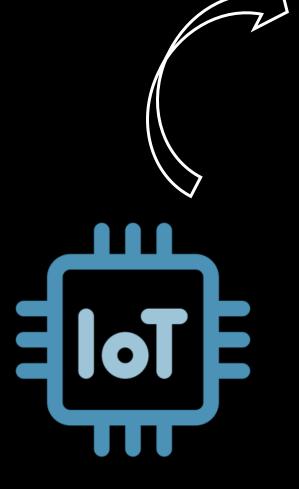








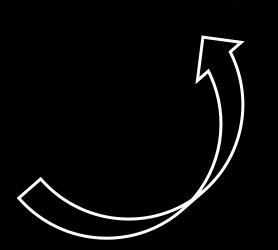
Environment



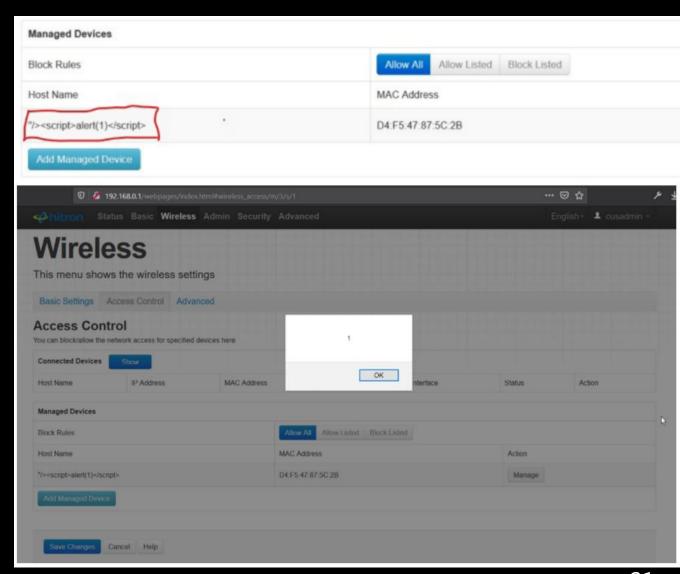


- Python programming language
- Intel® Core TM i5-6600k, 3.9GHz CPU
- 16 GB RAM, 1 TB HDD and 256 GB SSD
- html5lib parser
- BeautifulSoup python library (2022)
- Boyer-Moore algorithm





Device Name	Hitron CODA router	Bosch IP camera CPP4			
Model No.	4582u	Flexidome IP indoor 5000 HD			
Vulnerable firmware version	7.1.1.30	7.10			
XSS Vulnerability	CVE-2020-8824	CVE-2021-23848			
Type of XSS attack	Stored	Reflected			



- HTML tag
- Event
- JS method

No.	Attack Vector Categories	Example Patterns	
1.	Malicious HTML Tags (MHT)	<input src="javascript:alert('XSS');" type="IMAGE"/> <body background="javascript:alert('XSS')"> <body onload="alert('XSS')"> <bgsound src="javascript:alert('XSS');"/> <br size="&{alert('XSS')}"/> <table background="javascript:alert('XSS')"> <table><td background="javascript:alert('XSS')"></td></table></table></body></body>	
2.	Script Embedded Malicious Attributes (SEMA)	<a "="" href="javascript:document.location='http://www.google.com/">XSS XSS <video href="1" onerror="javascript:alert(1)" src="1"></video> <body href="1" onerror="javascript:alert(1)" src="1"></body> <image href="1" onerror="javascript:alert(1)" src="1"/>	
3.	Exploited HTML Event Method (EHEM)	<pre> <iframe onmouseover="alert(document.cookie)" src="#"></iframe> xxs link xxs link <imi html="" onmouseover="javascript:javascript:alert(1)"> onMouseEnter></imi></pre>	
4.	Malicious JS Variable (MJV)	<pre>SCRIPT =">" SRC="http://ha.ckers.org/xss.js"> <script "="" a=">" src="http://ha.ckers.org/xss.js"></script> <script "="" a=">" src="http://ha.ckers.org/xss.js"></script> <script "="" a=">" src="http://ha.ckers.org/xss.js"></script> <script a=">" src="http://ha.ckers.org/xss.js"></script> <script a=">'>" src="http://ha.ckers.org/xss.js"></script></pre>	
5.	Malicious JS Methods (MJM)	<pre> <script>({set/**/\$(\$){_/**/setter=\$,_=javascript:alert(1)}}}.\$=eval</script> <script>{0:#0=eval/#0#/#0#(javascript:alert(1))}</script> <scriptxoatype="text javascript"-javascript:alert(1);<="" script=""> ""><\x3Cscript>javascript:alert(1) ""><\x00script>javascript:alert(1) <a #09;&="" #11="" &="" -="" -#10;&="" href="data:application/x-x509-user-cert; base64 ,PHNjcmlwdD5hbGVydCgxKTwvc2NyaXB0Pg==">Xalert(document.location)</scriptxoatype="text></pre>	
6.	Obfuscated Script Embedded URLs (OSEU)	<pre>test test "/> <div style="list-style:url(http://foo.f)\20url(javascript:javascript:alert(1));">X <meta content="0;url=javascript:javascript:javascript:javascript:alert(1);" http-equiv="refresh"/></div></pre>	

 $TNR = \frac{TN}{TN + F}$

$$FPR = \frac{FP}{FP + TN}$$

$$FNR = \frac{FN}{FN + TP}$$

$$Accuracy = \frac{TP + TN}{TP + TN + FP + FN}$$

Injected 100 attack strings of each six categories

Observed experimental results of integrating the proposed approach on router's device web interface.

Attack Categories	Total	TP	FP	FN	TN	TNR	FPR	FNR	Accuracy
MHT	100	88	1	3	8	0.889	0.111	0.033	0.96
SEMA	100	85	2	3	10	0.833	0.167	0.034	0.95
EHEM	100	90	1	2	7	0.875	0.125	0.022	0.97
MJV	100	84	2	3	11	0.846	0.154	0.034	0.95
MJM	100	86	1	1	12	0.923	0.077	0.011	0.98
OSEU	100	88	2	5	5	0.714	0.286	0.054	0.93

Hitron CODA 4582u

ouseover="alert('xxs')"> er html onMouseOver="javascript:javascript:alert(1)"></html onMouseOv er html onMouseEnter="iavascript:parent.javascript:alert(1)"></html

="http://ha.ckers.org/xss.js"> </SCRIPT>
SRC="http://ha.ckers.org/xss.js"> </SCRIPT>

SCRIPT a='>' SRC="http://ha.ckers.org/xss.js"></scriPT>
SCRIPT a=">' SRC="http://ha.ckers.org/xss.js"></scriPT>
SCRIPT a=">'>" SRC="http://ha.ckers.org/xss.js"></scriPT>

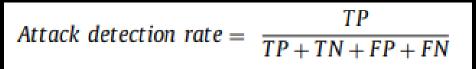
J5 method

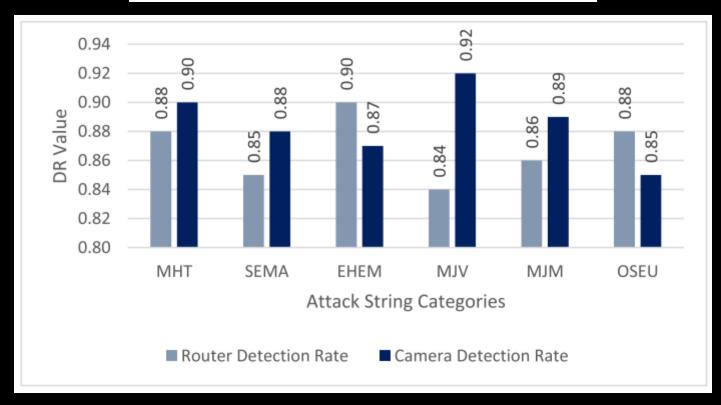
Malicious JS Methods (MJM

Bosch IP camera

Observed experimental results of integrating the proposed approach on Camera's device web interface.

Attack Categories	Total	TP	FP	FN	TN	TNR	FPR	FNR	Accuracy
МНТ	100	90	1	2	7	0.875	0.125	0.022	0.97
SEMA	100	88	2	2	8	0.800	0.200	0.022	0.96
ЕНЕМ	100	87	2	2	9	0.818	0.182	0.022	0.96
MJV	100	92	1	1	6	0.857	0.143	0.011	0.98
MIM	100	89	1	1	9	0.900	0.100	0.011	0.98
OSEU	100	85	3	11	11	0.786	0.214	0.012	0.96





All attack categories ranges: 0.8-0.9

Performance evaluation

F – measure

$$\begin{aligned} & \textit{Precision} = \ \frac{\textit{TP}}{\textit{TP} + \textit{FP}} \\ & \textit{Recall} = \ \frac{\textit{TP}}{\textit{TP} + \textit{FN}} \\ & \textit{F} - \textit{Measure} = \ \frac{2 * \textit{Precision} * \textit{Recall}}{\textit{Precision} + \textit{Recall}} \end{aligned}$$

Performance evaluation outcomes of the proposed approach.									
Attack Categories	Router Precision	Recall	F-measure	Camera Precision	Recall	F-measure			
MHT	0.989	0.967	0.978	0.989	0.978	0.983			
SEMA	0.977	0.966	0.971	0.978	0.978	0.978			
EHEM	0.989	0.978	0.983	0.978	0.978	0.978			
MJV	0.977	0.966	0.971	0.989	0.989	0.989			
MJM	0.989	0.989	0.989	0.989	0.989	0.989			
OSEU	0.978	0.946	0.962	0.966	0.988	0.977			

High value of F-measure > 0.9

F-test hypothesis

S1: malicious attack strings injected 數量

S2: malicious attack strings detected數量

• Null Hypothesis: S1=S2

Alternate Hypothesis: S1>S2

• Significance level ($\alpha = 0.05$)

Ftab=5.503

Router Fcal = **1.14345**

Camera Fcal = 1.12044

Fcal1 < Ftab and Fcal2 < Ftab

accept alternate hypothesis

Limitations

- ☑ Identifies attack string
- ☑ Resemblance between attack strings
- ☑ good results
- **☒** New features attack string
- → Automatically updating the available attack vector repository





Conclusions

Contributions

- 1. Design a fog-based intelligent IoT system infrastructure.
- 2. Boyer-Moore string matching algorithm, to detect reflected XSS.
- 3. Construct parse tree, compare with debarred attack strings using Boyer-Moore to identify stored XSS.
- 4. Attack demonstration exploiting known XSS vulnerability in Hitron CODA 4582u router and Bosch Flexidome IP indoor 5000 HD camera.
- 5. Examine the performance using prominent metrices comprising precision, recall, F-measure, and FPR.

Conclusion

- 1. First of its kind research study.
- 2. Fog computing environment to reduce the latency and bandwidth
- 3. Context-based grouping, highest accuracy of 0.98
- 4. (Future) Automatically updating the available attack vector



Q & A