ChargePrint: A Framework for Internet-Scale Discovery and Security Analysis of EV Charging Management Systems

Network and Distributed System Security Symposium (NDSS)

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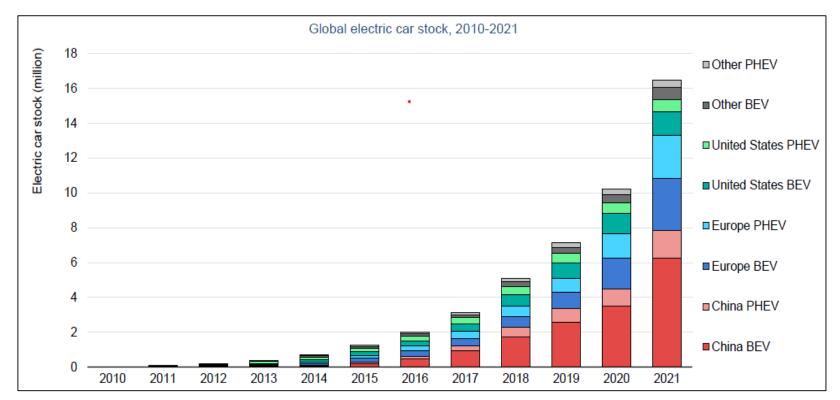






Increasing Number of Electric Vehicles (EVs)

- By 2021, number of EVs tripled as compared to the previous 3 years (16.5 M)
- 10.3 M electric cars were sold worldwide in 2022
- 13.6 M EVs expected to be sold globally by the end of 2023
- The rapid adoption of EVs has led to increased charging demands



Expansion of the EV Charging Infrastructure

- Expanding the EV charging infrastructure to keep up with the demand
- The USDOT and USDOE investing \$5 Billion to build 500,000 charging stations nationwide [1]
- Similar trends in Canada [1], Europe, and Asia



https://highways.dot.gov/newsroom/president-biden-usdot-and-usdoe-announce-5-billion-over-five-years-national-ev-charging
 https://www.nrcan.gc.ca/energy-efficiency/transportation-alternative-fuels/zero-emission-vehicle-infrastructure-program/21876

Problem

- The EV ecosystem is vulnerable to cyber attacks/exploitations
- Malware, default/weak credentials, vulnerable firmware/protocols
- Lack of knowledge about the security posture of existing EVCS against remote cyber attacks

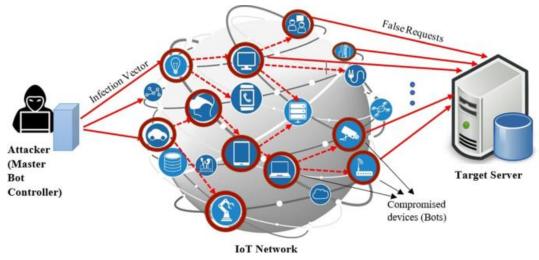




Why should we be concerned?

- Protect the devices/services
- Compromised IoT/CPS as attack enablers
- Increasing number of insecure EVCS
 - more complex software/firmware, computationally powerful systems
 - o connected to critical infrastructure
- Vulnerable EVCS as a new attack vector
 EV users, operators, and the power grid



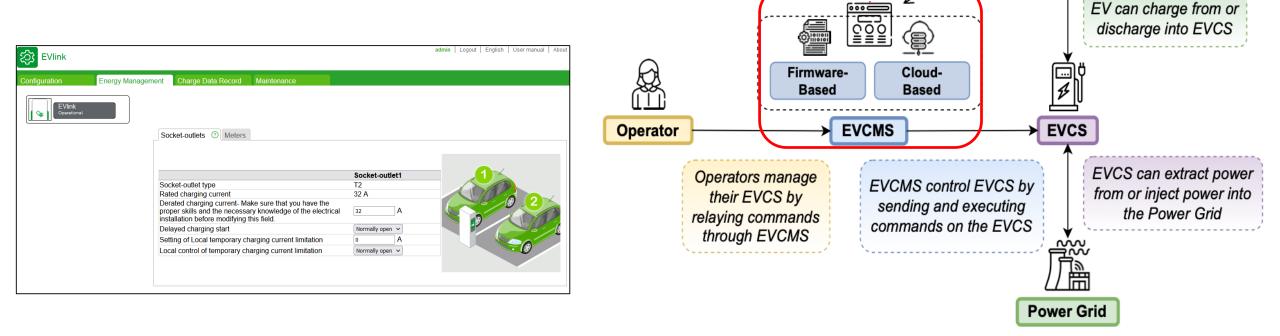




The EV Charging Ecosystem

- A CPS with various stakeholders
- EV charging management systems (EVCMS)

 A core component in the EV charging ecosystem
 Collection of software that instrument the EVCS
 Remote control/management capabilities (Internet)



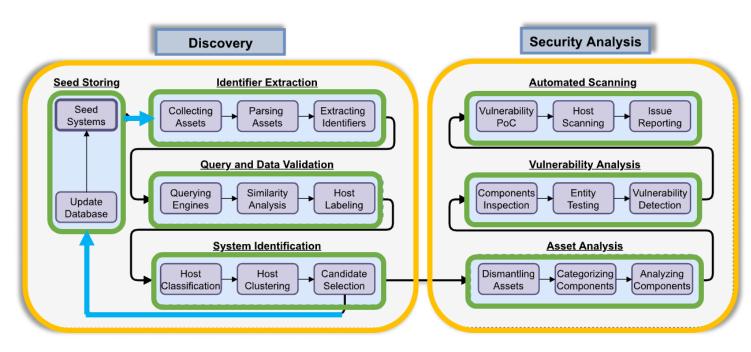
EV

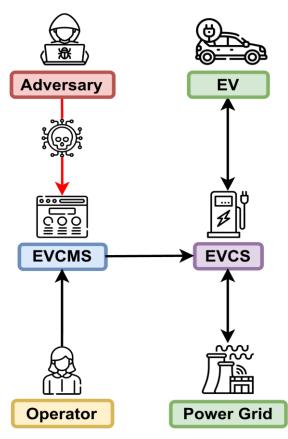
Consumers can

initiate/stop charging

Threat Model

- An adversary wants to exploit vulnerabilities of EVCMS
 Gains control over the EVCS and performs remote attacks against stakeholders
- Investigate the security posture of the deployed EVCMS in the wild
- Lack of empirical data about the deployed EVCS
- Approach: online EVCMS discovery and security analysis





Device Discovery Using Online Device Search Engines

- Device search engines (e.g., Shodan.io)
- Mainly rely on banner analysis

limited banner information associated with EVCMS
 lack of standardization in implementation of EVCMS

lack of EV-specific rules/tags/identifiers to use with search tools

Limited number of discovered EVCS

Question:

How can we leverage existing search engines to extend the EVCMS discovery/fingerprinting results ?





Seed Storing

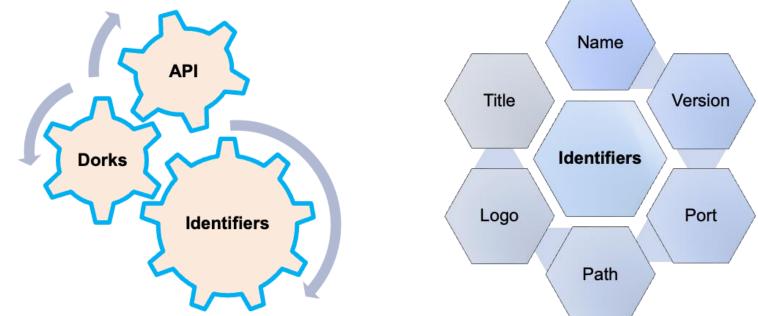


- Leverage 4 well-know device search engines (Shodan, Censys, Fofa, Zoomeye)
- Initial search and lookup using EV-related keywords
- Build a database of EVCMS seeds

Seed Storing

Identifier Extraction

- Collect/parse assets from firmware, web instances, and vendor websites
- Extract identifiers from filesystem items, DOM elements, and EVCS-related strings

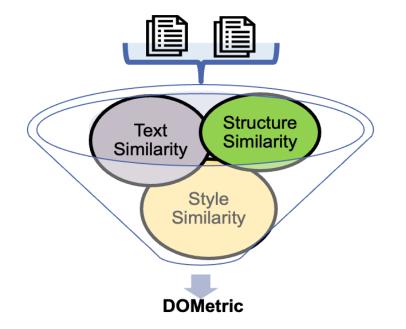


Seed Storing

Identifier Extraction

Query and Data Validation

- Query the search engines using the new identifiers \rightarrow new hosts
- Parsing the EVCMS portals' HTML page to extract their structure, style, and text content
- Introduce the DOMetric by calculating structure, text, and style similarities



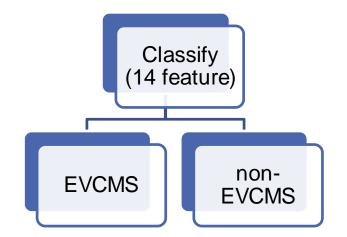
Seed Storing

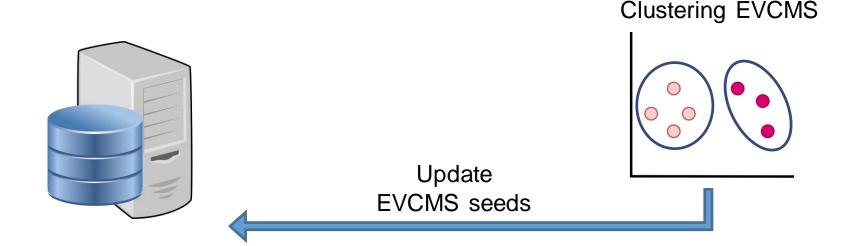
Identifier Extraction

Query and Data Validation

System Identification

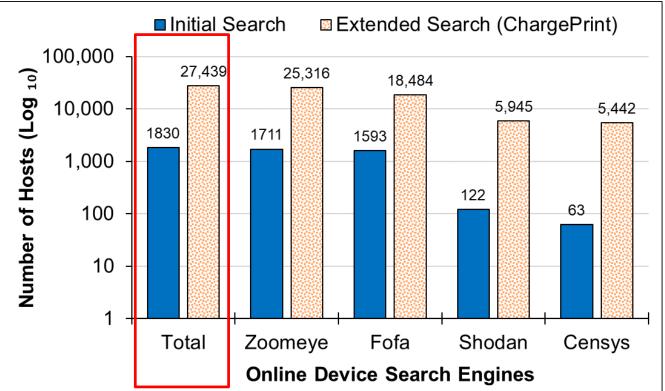
- Separate EVCMS hosts from generic hosts (Binary classifier with 14-EVCMS features)
- Cluster EVCMS hosts using DOMetric (threshold=0.9)
- Select candidate EVCMS (multiple version and more representative identifiers)





EVCSMS Discovery Results

- Initial Search (1,800 EVCMS hosts, 9 products)
- Zoomeye & Fofa produced more hosts
- Extended Search (ChargePrint)





C censys



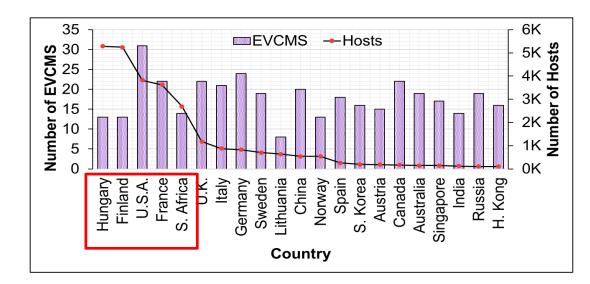
ZoomEy⊚

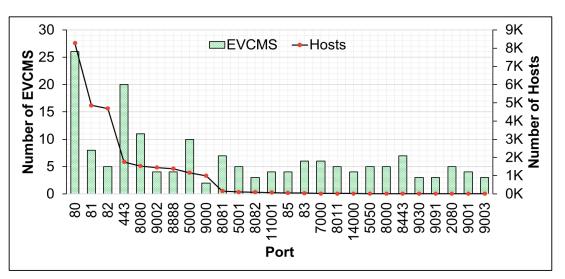
- Significantly improved results
 - Discovered 27,439 EVCMS hosts
 - 20x Zoomeye
 - 10x Fofa
 - 40x Shodan & Censys
- 44 EVCMS products (35 New)
 - initial seed of 9 EVCMS products

Observations

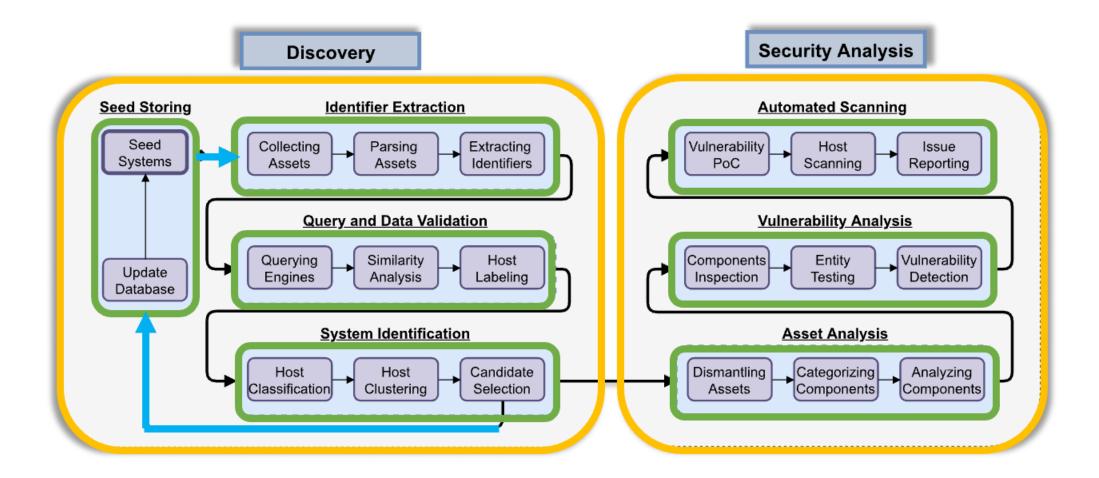
Geographical Distribution

- Host instances distributed across 21 countries
- o 78% were in 5 countries (due to initial seeds)
- Ports and Services
 - EVCMS hosts utilized 26 ports
 - Common ports for web services (e.g., 80 & 8080)
 - o Other services: SSH (22), alternative web (82)
- Some EVCMS products use specific port combinations that can be used for targeted discovery



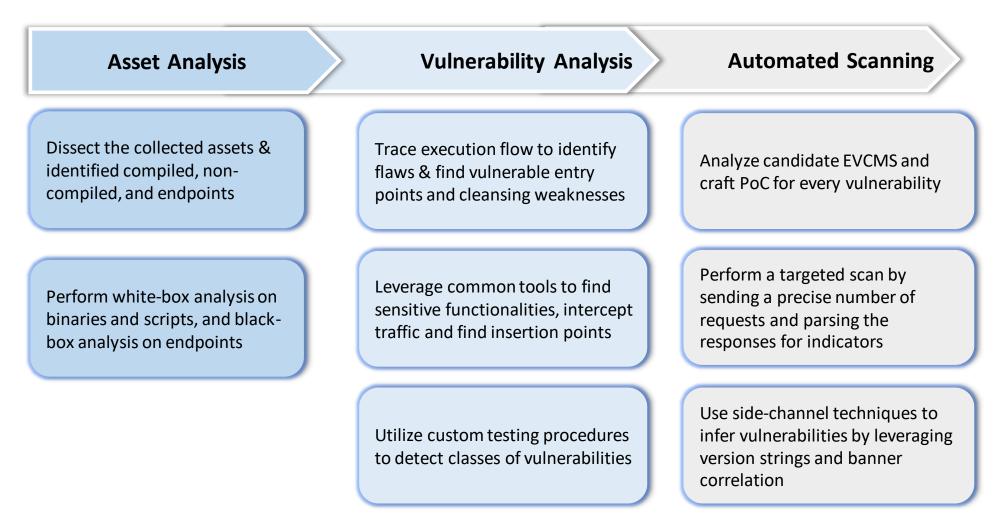


Proposed Approach: Security Analysis



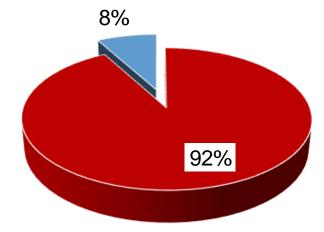
Proposed Approach: Security Analysis

Security analysis of the candidate EVCMS



Quantifying the Security Posture of EVCMS

- The majority (92%) of the EVCMS were vulnerable
- About 25,000 EVCMS host instances



Vulnerable EVCMS









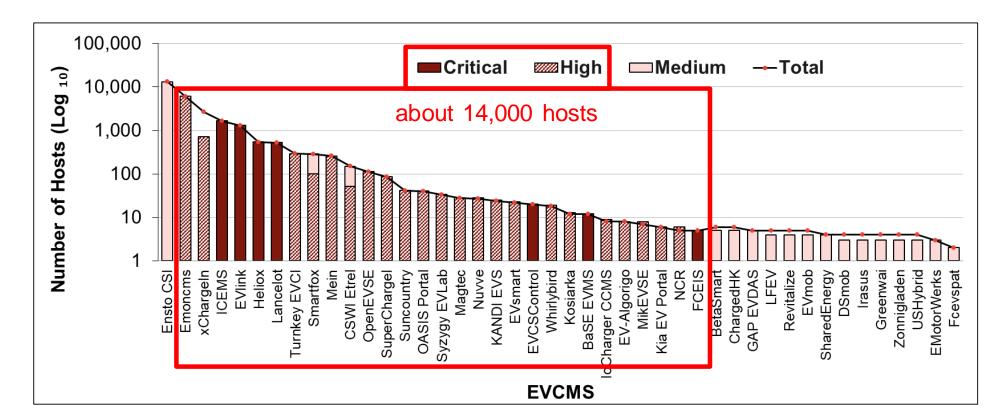






Quantifying the Security Posture of EVCMS

- 120 remotely exploitable vulnerabilities
- Some may lead to compromising and controlling the EVCS
- 13 classes of CWE vulnerabilities (critical, high, and medium severities)
- 29/44 EVCMS products are vulnerable to Critical/High Vulnerabilities



Quantifying the Security Posture of EVCMS

- 5 Critical-Severity vulnerabilities (e.g., SQLi):
 - Affect 7 EVCMS (4,431 host instances)

o extract databases, access configurations, ...

- 4 High-Severity vulnerabilities (e.g., XSS):
 Affect 22 EVCMS (9,750 host instances)
 hijack accounts, manipulate settings, ...
- 4 Medium-Severity vulnerabilities:

 Affect 30 EVCMS (17,831 host instances)
 view settings, access functionalities, ...

Severity	CWE	Vulnerability	# Issues	# EVCMS	# Hosts
	89	SQLi	4	4	1,684
al	611	XXE	5	5	1,290
Critical	798	Hard-Coded Cred.	6	6	900
G	918	SSRF	7	3	1,457
	1236	CSVi	1	1	1,203
	79	XSS	29	19	7,754
Ч	352	CSRF	12	9	7,789
High	942	CORS Misconfig.	2	2	3,731
	942	FCDP Misconfig.	2	$\overline{2}$	1,205
d	200	Info. Exposure	17	17	13,787
	306	Missing Auth.	3	3	1,005
Medium	425	Forced Browsing	2	2	1,402
Σ	799	No Rate Limit	30	30	17,500

Attack Implication

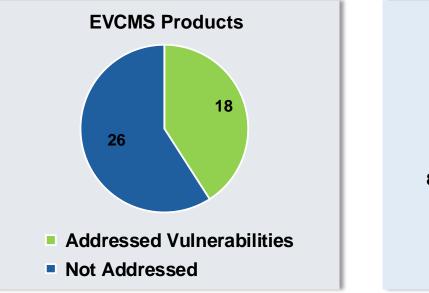
- Attacks Against the EVCS
 - Manipulate the charging process and configurations
 - o Downgrade or modify the firmware
 - Create botnet of EVCS as network proxies
 - Lock the EVCS or disable features
- Attacks Against the Users/Operators
 - Obtain personally identifiable information, charging records, and log data
 - o Leak electronic billing data
- Attacks Against the Power Grid
 - Control the charging process of a large number of EVCS
 - Conduct frequency instability attacks (cascading failures in the grid)

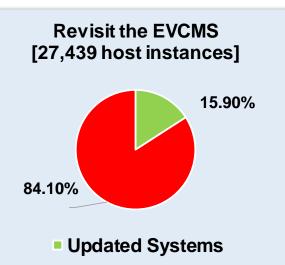
EVlink				admin Logout English I	User manual A
iguration	Energy Management	Charge Data Record Maintenance			
EVIInk Operationa					
	A	dvanced settings Socket-outlets ⑦ Meters			
	c	Charging station maximum current 40 A			
			Socket-outlet1	Socket-outlet2	2
	Pc	sition on the charging station	2 1	2 1	
	Sc	ocket-outlet type	T2 - TE	T2 - TE	
	Ra	ated charging current	32A (T2), 14A (TE)	32A (T2), 14A	(TE)
	sk	erated charging current- Make sure that you have the pro ills and the necessary knowledge of the electrical stallation before modifying this field.	32 A	32	A
	Fu	Inction In1	Load Shedding 🐱	Load Shedding	~
			Normally close 🐱	Normally close	~
	Lo	ad Shedding Set Point	0 A	0	A
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 specific value in the field above the bar. The charging current is limited by a maximum current value that can be charged from the tab. The current value of 'set maximum charging current' is 32A. I possible, schedule most charging during the night (reduced tarff - GREEN AREA) for cheaper and more sustainable charging. The reduced tarff of PPC S.A. valid in the winter season from 15:00-17:00 and from 02:00-08:00 The minimum charging current is 6A. If you have set a value lower than 6A (RED AREA) for some time, charging will be stopped during this time. Charging can be interrupted up to three times during a charging session. CURRENT SCHEDULE SETTINGS: Maximum Scheduled Energy Per Day - Single Phase Charge: 176.6kWh, Three-phase charging: 529.9kWh Rate of scheduled energy on a reduced tariff: 33.3%. 32 32 32 32 32 32 32 32 32 32 32 32 32 3	Manual charging schedule			eturn to main menu		
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	Three-phase charging: 529.9kWh					
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Vulnerability Disclosure and Mitigation

- Established a Coordinated Vulnerability Disclosure (CVD) process [1]
 - Communicated the vulnerabilities to the developers
 - Provided over 6 months prior to publishing to allow patching
- Acknowledged Zero-Days by several manufacturers
 o more than 20 assigned CVE-IDs
- Patch Follow-Up:





Not Updated

CVE-2021-22706	CVE-2021-22730
CVE-2021-22721	CVE-2021-22773
CVE-2021-22722	CVE-2021-22774
CVE-2021-22723	CVE-2021-22818
CVE-2021-22724	CVE-2021-22819
CVE-2021-22725	CVE-2021-22820
CVE-2021-22726	CVE-2021-22821
CVE-2021-22727	CVE-2021-22822
CVE-2021-22728	CVE-2022-22807
CVE-2021-22729	CVE-2022-22808

[1] https://www.cisa.gov/coordinated-vulnerability-disclosure-process

Main Takeaways

- Explored the security posture of EV charging ecosystem by introducing the EVCMS as a new attack surface
- Proposed an effective approach to address the limitations of existing device search engines and significantly improved EVCMS discovery/fingerprinting
- Shed light on the insecurity of EVCMS at scale (uncovering 120 zero-days)
- Contributed to the security of the EV charging ecosystem by communicating our findings to system developers (successful patching of products)
- Future Work:
 - Improve the accuracy and efficiency of the device discovery and security analysis
 Aim towards building a real-time EVCMS discovery and analysis platform

Thank You

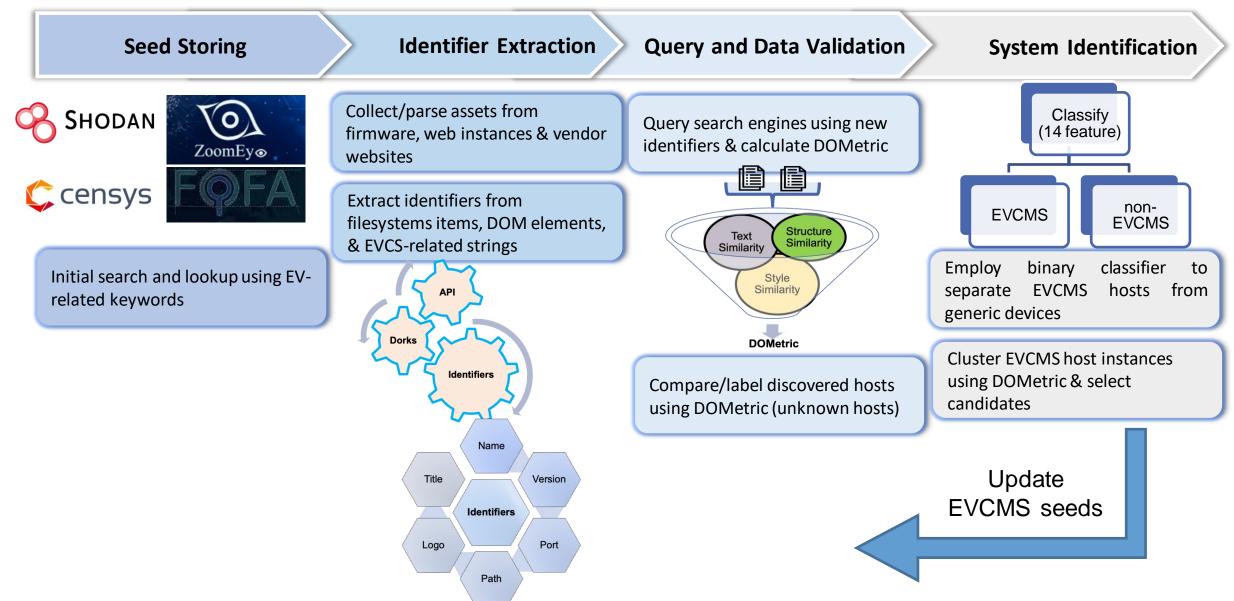
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DOMetric

For style similarity D2(H,C), we collect embedded style declaration blocks and selectors of common tags from documents' HTML and find the largest number of common declarations between the two documents using Jaccard's index

For **text similarities** (D3) by vectorizing the enclosed text within the tags for the host and use cosine similarity

$$D_1(H,C) = \frac{2 \times \sum_{i=0}^{\max(|S_1|, |S_2|)} |LCS(s_{1i}, s_{2i})|}{|S_1| + |S_2|} \qquad (1$$

$$D_2(H,C) = \frac{\sum_{i=0}^{m} \frac{|a_i \cap b_i|}{|a_i \cup b_i|}}{m := \min(|A|, |B|)}$$
(2)

$$D_3(H,C) = \frac{\sum_{i=0}^{m} \frac{t_{1i} \cdot t_{2i}}{|t_{1i}| \times |t_{2i}|}}{m := \min(|T_1|, |T_2|)}$$
(3)

$$DOMetric(H,C) = \sum_{i=1}^{3} w.D_i(H,C)$$
(4)