Interactive Visualization Dashboard for Common Attack Pattern Enumeration Classification

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Abstract— Attack patterns represent computer attackers' tools, methodologies, and perspective. The Common Attack Pattern Enumeration Classification (CAPEC) provides information about attack patterns which include descriptive textual fields, relationships between different attack patterns, execution flow, mitigations and related Common Weaknesses Enumeration (CWE) weakness and external Mapping. This paper describes an interactive visualization dashboard we developed for displaying the hierarchically structured CAPEC information. The dashboard includes a tree map and a network graph. The tree map visualization displays the hierarchy of CAPEC in a rectangular region in a space-filling manner. The network graph displays the parent child-taxonomy from the CAPEC using nodes and links between nodes. The visualization dashboard displays the external mapping of CAPEC to CWE, Adversarial tactics, techniques, and common knowledge (ATT&CK), The Open Web Application Security Project (OWASP) and Web Application Security Consortium (WASC) taxonomy. This visualization tool improves usability and provides a range of new capabilities for understanding and interacting with the rich content and relationships in CAPEC.

Keywords-Attack patternss; Common Attack Pattern Enumeration and Classification (CAPEC); visualization, Network graph, tree map.

I. INTRODUCTION

To understand the methods for hacking information systems, cyber security experts must consider the attacker's point of view. The Common Attack Pattern Enumeration and Classification (CAPEC) provides a publicly available catalog of common attack patterns that helps users understand how adversaries exploit weaknesses in applications and other cyber-enabled capabilities [1].

CAPEC provides descriptive textual fields, also called elements, for each attack pattern. The current CAPEC release includes a list of 572 specific attack patterns. Each attack pattern may include up to 30 elements to describe the attack Walter Smith Dept. of Computer Science North Carolina Agricultural and Technical State Univ. Greensboro, NC, USA xhyuan@ncat.edu

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details. While CAPEC has addressed the need to create a standard for representing and defining attacks from an attacker's perspective, issues of usability arise because CAPEC does not provide a consistent level of documentation for some elements among the attack patterns. In many cases, attack pattern elements are missing completely. The inconsistent use of elements makes it problematic to discern the relationship, if any, between the descriptive fields. The goal of this research is to improve usability and provide a range of new capabilities for understanding and interacting with the rich content and relationships in CAPEC. Effective visualization helps users analyze and reason about data and evidence. It makes complex data more accessible, understandable, and usable. The goal is to communicate information clearly and efficiently to users. Visualization helps developers to better comprehend large and complex systems [2].

Navigation of CAPEC web content relies on following parent-child hyperlinks in textual content. This makes it difficult to comprehend CAPEC's overall hierarchical structure. To address this, we introduce a new web-based interactive visualization dashboard for CAPEC attack patterns. The visualization includes tree maps consisting of rectangles that represent the hierarchy of a system, and network graph. We describe tree map and network graph visualizations to visualize the parent-child taxonomy of CAPEC. CAPEC attack patterns are mapped onto external databases such as CWE, ATT&CK, OWASP and WASC. We describe how external mappings are displayed in this dashboard. This dashboard can be used by software engineers and security engineers who make use of CAPEC attack patterns for secure software development or other security activities.

The rest of the paper is organized as follows. In Section 2, we discuss the background of CAPEC, visualization techniques and implementation platform. Section 3 describes the visualization dashboard, and Section 4 discusses related work. Section 5 concludes the paper.

II. BACKGROUND

This section provides background on CAPEC, tree map, network graph as well as Dash and Heroku we used to implement the visualization.

A. CAPEC

CAPEC attack patterns help people understand how weaknesses could be exploited and ways to defend against the weakness. CAPEC attack patterns are organized with parent and child hierarchy. For example, CAPEC 122 "Privilege Abuse" is a top level attack pattern with five child attack patterns: CAPEC-1 "Accessing Functionality Not Properly", "Using Malicious Files", CAPEC-180 CAPEC-17 "Exploiting Incorrectly Configured Access", CAPEC-221 "WebView Exposure", and CAPEC 503 "Data Serialization External Entities Blowup". Each of these attack patterns has several child attack patterns, for example, "CAPEC-58 Restful Privilege Elevation" is the child attack pattern of "CAPEC-1 Accessing Functionality Not Properly". Fig. 1 shows an example of the hierarchical parent child relationship in CAPEC attack patterns.

B. Tree Map

Trees maps are one of the most used structures to visualize relational information. Tree maps use a rectangular space-filling layout [3]. Space-filling techniques make maximal use of the display space. The two most common approaches to generating space-filling hierarchies are rectangular and radial layouts. In the basic tree map, a rectangle is recursively divided into slices, alternating horizontal and vertical slicing, based on the populations of

the subtrees at a given level. There are many variations of tree maps such as square tree maps [4], and nested tree maps which are used to emphasize the hierarchical structure. These methods are structured using horizontal and vertical divisions to convey the hierarchy. For these and other space-filling techniques, color can be used to convey any attributes, such as a value associated with the node (e.g., classification) or it may display the hierarchical relationships, e.g., siblings and parents may have similarities in color. Symbols and other markings may also be embedded in the rectangular or circular segments to communicate other data features.

In additional rectangular layout, one way to pack a tree display into a smaller space is to employ a radial layout [2]. Also, there is a class of visualization techniques that represents tree relationships implicitly [5], rather than explicitly drawing vertices and edges.

C. Network Graph

The most common representation used to visualize trees or hierarchical relationships is a node-link diagram. This is the most popular form of non-space filling layout. This type of visualization shows how things are interconnected using nodes / vertices and link lines to represent their connections and help illuminate the type of relationships between a group of entities. In network graphs, not all of the nodes and links are created equally: additional variables can be visualized, for example, by making the node size or link stroke weight proportion to an assigned value. By mapping out connected systems, network graphs can be used to interpret the structure of a network through looking for any clustering of the nodes, how densely nodes are connected or by how the diagram layout is arranged [3].



Fig. 1. The hierarchical parent-child relationship in CAPEC attack patterns

D. Dash

Plotly's dash library [6][7] provides a declarative Python interface for developing full-stack web applications ("Dash apps"). In addition to the main dash library, the dash-htmlcomponents and dash-core-components packages comprise the building blocks of a Dash app. dash-html-components provides an interface for building the layout of a Dash application that mimics the process of building the layout of a website; dash-core-components is a suite of common tools used for interactions with a Dash app (e.g., dropdowns, text inputs, and sliders) and includes Dash Core Components (DCC). Graph components for interactive graphs are made with plotly.py.

Interactivity is implemented with callbacks. These allow for reading the values of inputs in the Dash app (e.g., text inputs, dropdowns, and sliders), which can subsequently be used to compute the value of one or more "outputs", i.e., properties of other components in the app. The function that computes the outputs is wrapped in a decorator that specifies the aforementioned inputs and outputs; together, they form a callback. The callback is triggered whenever one of the specified inputs changes in value.

E. Heroku

Heroku is a container-based cloud Platform as a Service (PaaS) [8]. It is flexible, easy to use, and offers developers a simple path to getting their apps to market. Heroku is open and extensible, meaning that developers can build any language they desire to use such as: Nodejs, Ruby, PHP, Python, Java and so on. For this research, we use Heroku

because of its benefit of security and performance and the large quantity of add-ons available.

III. THE CAPEC VISUALIZATION DASHBOARD

This section describes the visualization dashboard for CAPEC attack patterns. The Visualization Dashboard presents different visualization techniques for navigating the CAPEC taxonomy. Our interactive visualization interfaces including tree maps and network graphs are implemented using Dash, Plotly, Heroku, and MongoDB. The data obtained from MITRE'S CAPEC website in the form of a CSV is hosted on a MongoDB database. The user can choose to visualize the CAPEC attack pattern data or CAPEC attack pattern external mapping.

A. Visualization of the CAPEC Data

Fig. 2 shows the visualization of CAPEC Data. There is a selection menu at the left top from which the user can choose what graph to display: CAPEC Data or External Mapping. The left top part of the visualization is a tree map created using Plotly. Given the data, a CSV is created with the columns parent, child, and severity, which refers to the parent attack pattern ID, the child attack pattern ID, and the severity of the parent attack pattern. The tree map shows the parent attack pattern ID with its child attack patterns within the rectangular space of the parent attack pattern. The colors in the tree map are chosen based on the severity with a key on the right of the graph showing the color scale for the severity. If a user hovers over them, they can get the exact numerical value for severity.

CAPEC Treemap reractive CAPEC Relation Treemap Selects which graphs to view.	- TreeMap showing CAPECs with their related CAPECS filter what show	e filters that allow you to vs up on the table and erity and CAPEC ID
CAPEC Data		X *
<u> </u>	Select	*
312 292 150 <mark>473 4</mark> 17 173 416 148 159 167 <mark>272</mark> 309 <mark>447</mark> 541	Select	*
	10 Name	Severity
ur ur ur ur ar = 12 592 542 616 176 427 545 117 122 126 153 186 189 203	80 Using UTF-8 Encoding to Bypass Validation Logic	Bigh
11 IN IN IN 444 444 554 562 601 603 68 77	81 Web Logs Tampering	High
	83 XPath Injection	High
8 14 24 44 47 25 17 - 250 97 175 182 184 188 195 196 9 44 44 47 - 22 593	84 XQuery Injection	Very High
9 41 42 47 10 41 47 7 300 212 22 593 98 207 384 386 390 438 440	85 AJAX Fingerprinting	Low
169 130 54 49 607 278 103 216 456 652 653 ¹⁰	86 XSS Through HTTP Headers	Very High
m m m m m 588 157 242 278	87 Forceful Browsing	High
za 17 HL 44 H = 10 17 220 137 1 BL 44 1 1 391 - 1 1 391 - 1 1 19 271 183 410 472	88 OS Command Injection	High
267 114 231 635 MI et al 14 13 63	89 Pharming	Very High
3 52 53 64 591 233 248 165 407	9 Buffer Overflow in Local Command-Line Utilities	Bigh
4 71 78 79 41 72 80 ⁽²³⁾ - 116 115 441 154 268 651 ⁽²⁴⁾ ⁽²⁷⁾ ⁽²⁷	90 Reflection Attack in Authentication Protocol	High
	92 Forced Integer Overflow	High
	93 Log Injection-Tampering-Forging	High
	95 WSDL Scanning	High
	96 Block Access to Libraries	Medium
ST	192 Protocol Analysis	Low
	Table that reflects what is currently on both graphs. Contains the CAPEC ID, name, and severity	
relationships.	showing all CAPEC Color graph shows how are related to each other.	« « J / J]

Fig. 2. Tree map and network graph to visualize CAPEC data

Below the tree map in Fig. 2 is a network graph showing how a CAPEC attack pattern is related to other CAPEC attack patterns. Each note represents an attack pattern. The link from one node to another node shows the parent/child relationship between the two nodes linked together. The color of the node indicates the number of nodes connected to this node. The color scale to the right side of the network graph shows a purple color, indicating higher number of connected nodes, and a red color indicating lower number of connected nodes.

The right side of Fig. 2 shows a table that lists all the CAPEC attack patterns shown on the tree map and the network graph. It displays the CAPEC ID, the name of the CAPEC attack pattern, and the severity of the attack pattern. On the top of the table, there are two drop down menus allowing users to select the CAPEC attack pattern IDs, and a severity value to filter out specific CAPEC attack patterns or attack patterns of a selected severity level to display in the tree map, network graph and the table.

From Fig. 2, we can see that tree map effectively utilizes the space it takes to display hierarchical relationship. In the network graph, there is a lot of empty space and a lot of clusters.

The Visualization dashboard allows users to select a CAPEC ID from the tree map to view detailed information of the CAPEC attack pattern. For example, in Fig. 3, if a user clicks on CAPEC-125 in the tree map, a window will pop up showing the description of CAPEC-125. The window also

includes buttons "taxonomy", "execution flow", and "mitigation flow". Clicking on each button will provide the corresponding information for CAPEC-125. The network graph changes correspondingly, showing only CAPEC-125 and all the child attack patterns connected to CAPEC-125.

B. Visualization of the CAPEC External Mapping

When users select external mapping from the dropdown menu on top of the tree map, the visualization dashboard will show the external mappings of CAPEC attack patterns. The CAPEC attack patterns are mapped to ATT&K [9], OWASP [10], WASC [11] and CWE weaknesses [12]. Fig. 4 shows the attack patterns that are mapped to these taxonomies. In Fig. 4, the left-top rectangle in blue color shows the CAPEC IDs that are mapped to the ATT&K taxonomy. The left-bottom rectangle in orange color shows the CAPEC IDs that are mapped to OWASP, and the right-bottom rectangle in green color shows the CAPEC IDs that are mapped to WASC. The right side of the dashboard is a table that shows the CAPEC ID and the related CWE weaknesses.

The user can select an CAPEC ID, and the dashboard will show the external mapping of the particular attack pattern. For example, in Fig. 5, CAPEC-168 is chosen. A popup window displays the CAPEC attack pattern ID:168, its related CWE weaknesses: 212, 69, and related ATT&CK. A hyperlink to the CAPEC page for this attack pattern is also given.



Fig. 3. Interaction between the tree map and network graph.







Fig. 5. Pop up window to display external mapping information of a CAPEC attack pattern

IV. RELATED WORK

Existing information visualization techniques are usually limited to the display of a few thousand items or avoid the problem of visualizing large number of items by using aggregation, sampling, and extracting, or by not managing occlusion and overlapping [13]. Among the popular techniques is the use of scatter plots connected to interactive controls such as in Dynamic Queries. We have used the tree visualization in our dashboard to show the parent child taxonomy in CAPEC.

Noel [14] visualized the overall hierarchical structure of CAPEC attack patterns using network graph, Sunburst visualization, Circular tree map, and Voronoi tree map. They also conducted text mining and computed hierarchical clusters and grouped related attack patterns through automated analysis. They used bipartite graph to visualize cross references from CAPEC attack patterns to CWE weaknesses. Our tool used rectangular tree map and network graph to visualize the hierarchical structure of CAPEC attack patterns and display external mapping information including CWE, ATT&CK, OWASP and WASC. The goal of our tool is to allow users to retrieve such information easily.

Regainia and Salva [15] proposed a methodology that takes as inputs CAPEC attack patterns, and infers relationships between attacks, weaknesses, security principles and patterns to generate the classification and Attack Defense Trees. Seehusen [16] proposed to use CAPEC for Risk-Based Security Testing. Vanamala et al. [17] and Vanamala et al. [18] have used software repositories like CVE (Common Vulnerabilities and Exposures) and CAPEC to help develop secure software. They have developed a recommender system that recommends attack patterns relevant to the system under development based on software requirements documents. A software developer can develop security requirements and secure design based on these attack patterns [19].

V. CONCLUSION AND FUTURE WORK

In this paper, we describe a web-based interactive visualization dashboard for the CAPEC attack patterns. This includes visualizing the overall hierarchical structure of CAPEC attack patterns using tree map and network graph. Our visualization techniques provide a range of new capabilities for understanding and interacting with the rich content and relationships in CAPEC. The goal is to be able to effectively communicate this information to a user in a userfriendly way. This tool will help users to make use of CAPEC attack patterns in developing secure software or conducting other security activities such as threat modeling, security testing, training, and education. Our future work is to conduct a user study for the dashboard to assess the effectiveness of the tool in helping users understand the structure of CAPEC and to make use of CAPEC attack patterns in their security tasks.

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