CIRICAL INFRASTRUCTURE RESILIENCE INSTITUTE A DEPARTMENT OF HOMELAND SECURITY CENTER OF EXCELLENCE

Homeland Security Challenge

Strengthen the overall security posture of the nation by better preparing the current and future cybersecurity workforce.

Motivation & Goal

Inconsistencies related to job posting requirements have made it difficult to identify specific skills necessary to fulfill the needs across the cybersecurity domain. Additionally, a recent revision to the NICE Framework has prompted a need to map new knowledge, skills, abilities, and tasks (KSATs) to current job posting requirements. Finally, recent national security issues has potentially revealed a gap between what KSATs have been identified by the government and what is currently needed.

The major research questions are what are the new KSATs required for current and future cybersecurity professionals and how can we identify them?

Approach / Methodology

Utilizing the Python programming language (specifically the libraries: BeautifulSoup (bs4), nltk, pandas, requests, scikit-learn, sqlite3, and TextBlob (textblob)), this project was able to collect and conduct initial text analysis on a large collection of postings and related metadata. This analysis allows us to identify prevalent topics in the job descriptions, as well as collect requirements, education, certification, and company profiles and extract parallel KSATs from these areas.

```
Topic 3
ability work, experience cif, forensic examinations digital media, skills required, possess ability
Topic 4
types attack, fusion technology, enterprise systems, incident handler, secret clearance
Topic 5
cyber defense, design information cnwdi, dept energy, cnwdi required, information cnwdi required
Topic 6
lockheed martin, operational users, industry recognized, similar industry, appropriate provi
                                                                        •
Topic 7
security security, response containment, security technologies, experien
                                                                     Collect
```

Enhancing Cybersecurity KSATs from Cybersecurity Job **Posting Data through NLP techniques** Authors: Max Douglas & Jordan Bernot

Outcomes / Results

Using exploratory and text analytics techniques, this project identified key KSATs for each job title, as defined by the NICE Framework. Additionally, utilizing Negative Matrix Factorization (NMF) topic extraction techniques allowed this project to identify possible unidentified KSATs, as well as common topics that may exist amongst the variety of job descriptions they were drawn from.

Further, the outcomes of the project will provide opportunities for additional workforce studies in other interdisciplinary fields. In the case of the NMF extraction techniques, this will allow future projects to potentially identify new and/or critical skills for training and/or cybersecurity strategy.

Below is an example of the output for the aggregated Security Analyst job postings data, after it had been cleaned, processed, and analyzed.

Des	cription:
- d	esign, test, configure, and monitor security of
- d	efend systems against unauthorized access, i
- p	erform vulnerability testing, risk analyses, a
- 10	lentified system and network abnormalities
- 16	espond immediately to security incidents and
Rela	ated job titles: Information Security Speciali
Tecl	nnician, Network Security Specialist, Securi
Spec	cialist, Security Operations Specialist, Secur
NIC	E relevant factors:
- Ca	tegory: Operation and Maintenance
Sp	ecialty Areas: installs, configures, troublesh
res	sponse to customer requirements or inquiries
pre	ovides initial incident information to the Inc
Desi	red Knowledge/ Skills/Abilities:
- T	CP/IP, computer networking, routing, and s
- V	Vindows, Unix, and Linux operating systems
- II	OS/IPS, penetration and vulnerability testing
- U	inderstanding of ISO 27001/27002, ITIL, an
- F	amiliarity with PCI, HIPAA, GLBA, and SC
Dest	red Certifications: CompTIA A+, Network-
(GS	EC, GCIH, and GCIA), CISSP
Rela	ted Degree:
- As	sociate: Computer Science
BS	: Security Engineering, System Managemer
Secu	urity
- MS	S/ MBA: IT Security Management, MIS, Co.
Othe	er Experiences: Cyber Security Analyst, Ass
Info	rmation Security Consultant, etc.

Faculty Advisor: Dan J. Kim



controls for systems and networks modification, and/or destruction ind security assessments and report violations d provide post incident analysis, etc. st, Cybersecurity Specialist, Computer Security ty Desk Specialist, IA Specialist, IT Security ity Specialist, System Security Specialist, etc.

noots, and provides maintenance and training in s (e.g., tiered-level customer support). Typically ident Response (IR) Specialty

witching , DLP, and anti-malware d COBIT frameworks OX compliance assessment , and Security+, CCNA, CEH, GIAC certifications

nt, Computer Engineering, MIS And Cyber

mputer Science, Digital Forensic, Cyber Security surance Engineer, Communications Engineer,

This project attempts to predict future workforce needs and fill the shortage of qualified cybersecurity professionals through the alignment of cybersecurity job demands with workforce supply. Additionally, it will provide important tools that continuously update the structure and common understanding of cybersecurity job components, their relationships, and career pathways.

This project provides broad impacts in several ways at different levels. For job candidates and professionals expanding their career paths, it gives a better understanding of the emerging KSATs needed for continued development. For individuals wanting to enter the field it outlines the KSATs necessary for positions and allows for better preparation regarding education and training.

39 – Article 7 clouds-in-python)

This research was performed under an appointment to the U.S. Department of Homeland Security (DHS) Science & Technology (S&T) Directorate Office of University Programs Summer Research Team Program for Minority Serving Institutions, administered by the Oak Ridge Institute for Science and Education (ORISE) through an interagency agreement between the U.S. Department of Energy (DOE) and DHS. ORISE is managed by ORAU under DOE contract number DE-SC0014664. All opinions expressed in this paper are the author's and do not necessarily reflect the policies and views of DHS, DOE or ORAU/ORISE.



Discussions

Selected References

Debortoli, S., Müller, O., Junglas, I., vom Brocke, J. (2016, July) Text Mining For Information Systems Researchers: An Annotated Topic Modeling Tutorial 7-2016, Volume

Lovejoy, C. (2020, May) job-scraper (<u>https://github.com/chris-lovejoy/job-scraper</u>) Elliot (2021, May) Word Clouds in Python (<u>https://onebyzero.org.in/2021/05/17/word-</u>

Acknowledgements

