Tudor Mihai Avram

Machine learning graph filtering

Computer Science Tripos – Part II

Homerton College

March 6, 2018

Proforma

Name: Tudor Mihai Avram

College: Homerton College

Project Title: Machine learning graph filtering

Examination: Computer Science Tripos – Part II, July 2018

Word Count: 1^1

Project Originator: Dr Ripduman Sohan

Supervisor: Dr Lucian Carata

Original aims of the project

Work completed

Special Difficulties

¹This word count was computed by detex dissertation.tex | tr -cd '0-9A-Za-z \n' | wc -w

Declaration

Contents

1	\mathbf{Intr}	oducti	ion	11						
	1.1	1 Aims & Motivation								
		1.1.1	Overview of CADETS UI	11						
		1.1.2	Aims of the project	12						
	1.2	1.2 Related work								
		1.2.1	$\operatorname{Clearcut}[1] \dots \dots$	12						
		1.2.2	Polonium	13						
	1.3	Licenc	e	13						

List of Figures

1.1	Snapshot of the CADETS	UI																									12	2
-----	------------------------	----	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	----	---

List of Tables

Chapter 1

Introduction

This dissertation proposes an extension of the CADETS user interface (see 1.1.1). It uses Machine Learning techniques in order to filter a graph describing OS-level abstractions (i.e. to decide which nodes should be displayed to the analyst for further review). In order to achieve this, I implemented a number of different algorithms, in order to decide which would be applicable in this context. I also implemented one extensions: a server infrastructure that facilitates communications between the classifier and the client.

1.1 Aims & Motivation

Analysing event logs of a distributed system in order to identify actionable security information and hence to act accordingly in order to improve a system's security has always been a desirable goal for both research and industry. The availability of cheap data storage has facilitated such large scale logs collection, in the order of several terabytes of data. This makes manual log review an unfeasible task.

1.1.1 Overview of CADETS UI

CADETS UI is a cybersecurity logs analysis tool developed as part of the CADETS and OPUS research projects. It displays logs as a network, emphasising the relationships between events. It is the analyst's task to explore this network in order to identify potentially malicious nodes.

In order to provide the analyst with comprehensive data from which he can infer useful information, the network will have a large number of nodes. This makes exploring the entire dataset a very difficult task for a human. For example, tracing two machines for 7 minutes can produce as many as 6000 nodes in the network. As the number of machines and the time interval we do tracing on increase, this number will become considerably larger, making analyst's job very difficult.

Machines Notifications Worksheets CADETS/OPUS ≡ >_ 16:20h sh 6 Jul 0 >_ 16:20h chown -R vagrant /tmp/vagrant-shell 6 Jul 0 >_ 16:20h sh-c 6 Jul >_ 16:20h sh -c scp -t /tmp/vagrant-shell 0 6 Jul >_ 16:20h scp-t/tmp/vagrant-shell 0 6 Jul >_ 16:20h sh-c 6 Jul >_ 16:20h sh-c sh 6 Jul >_ 16:20h sh 6 Jul >_ 16:20h sh 6 Jul 0 B P <

Figure 1.1: Snapshot of the CADETS UI

1.1.2Aims of the project

16:20h chmod +x /tmp/yagrant-shel

The aim of this project is to build a tool that would meliorate the analyst's experience by reducing the number of nodes he would have to cover. In order to achieve this, I will use a machine learning model that would classify nodes into nodes that are of interest and nodes that are not of interest, respectively. The training data used by this model is constructed based on a set of pre-defined ground-truths.

1.2 Related work

Cyber security has always been a major concern in Computer Science, both in industry and in research. With the recent interest shown in Artificial Intelligence and Machine Learning, there has been an increasing number of tools that use related methodologies to identify malicious behaviour. This section will address some of these tools.

Clearcut[1] 1.2.1

Clearcut[1] is an open source tool that uses Machine Learning techniques for incident detection. It takes HTTP proxy logs as input and filters them for manual review, in order to aid the analyst in reviewing them.

The algorithm used in this case is Random Forrest Classification, which essentially means having multiple decision trees in training and returning the class corresponding to the mode of the classes returned by them.

¹https://github.com/DavidJBianco/Clearcut

1.2.2 Polonium

Polonium is a scalable and effective technology that uses graph mining for malware detection. The tool uses a bipartite graph that consists of machines and files as its training data. It uses the Belief Propagation algorithm, which, at a high level, infers the label of a node from some prior knowledge about the node and from the node's neighbours. This is done through iterative message passing between all pairs of nodes (u, v) in the graph.

Although the problem statement is similar to that my project tries to address, the algorithm used here is not applicable in my case, because it requires a very large dataset (Polonium uses a graph with 1 billion nodes). It also requires a pre-computed machine reputation score that in this case is calculated using a proprietary formula of Symantec[1], the company that produced the tool.

1.3 Licence

The code is publicly available as an open-source project on GitHub[2], under an APACHE 2.0 licence[3].

¹https://www.symantec.com/

²https://github.com/a96tudor/Part2Project

³https://www.apache.org/licenses/LICENSE-2.0