



Mathematisch-Naturwissenschaftliche  
Fakultät

Prüfungsamt

Prof. Dr. Lars Grunske  
Lehrstuhl: Software Engineering

**Gutachten zur Masterarbeit von Frau Laura  
Wartschinski mit dem Thema „Detecting Software  
Vulnerabilities with Deep Learning“**

Datum:  
11. Dezember 2019

Bearbeiter/in:

Geschäftszeichen:

Sehr geehrtes Prüfungsamt,

Anbei mein englisches Gutachten für die Masterarbeit von Frau Laura Wartschinski mit dem Thema „Detecting Software Vulnerabilities with Deep Learning“

Postanschrift:  
Humboldt-Universität zu Berlin  
Unter den Linden 6  
10099 Berlin  
Telefon: +49 30 2093-3150  
Telefax: +49 30 2093-3067

**Summary**

In this work, Laura Wartschinski has explored the topic of automatic detection of software vulnerabilities in python code. In particular, she has trained a Long-Short-Term-Memory (LSTM) network for this task. The main goal of the work was to develop a new technique and provide tool support.

grunske@informatik.hu-berlin.de  
www.hu-berlin.de

In order to achieve these goals, Laura has collected a dataset of different code vulnerabilities from Github projects that contain Python code. This data set is a contribution by itself. Based on the large Python corpus a word2vec model was trained focusing on word embedding in a vector space. This is as far as I know also novel.

Sitz:  
Rudower Chaussee 25  
Raum 4.417  
12489 Berlin

The code files used in the Python corpus were also classified into normal files and files that contain a vulnerability. As a result a machine learning algorithm could be used to classify the files based on the vectors (word2vec) of individual code tokens and their context. Specifically, Laura has used a Long-Short-Term-Memory network and has trained it based on the samples for each type of vulnerability to recognize features of vulnerable code and then applied it to detect unknown vulnerabilities in source code.

The approach is implemented in a tool called VUDENC (Vulnerability Detection with Deep Learning on a Natural Codebase) and an evaluation of the tool showed exceptionally good precision and

Bankverbindung:  
Berliner Bank  
NL der Deutsche Bank PGK AG  
BLZ 100 708 48  
Konto 512 6206 01  
BIC/SWIFT DEUTDE33HAN  
IBAN DE95 1007 0848 0512 6206 01



recall metrics for the identification of the different code-based security vulnerabilities.

In the evaluation, one outstanding feature is the systematic analysis of the parameter of VUDENC. Based on this analysis the reader could understand why the approach has worked and what the specific tunings of the machine learning algorithms are. Consequently, this work is not just a pure black-box application of a ML technique to a software engineering problem. The thesis in contrary, provides the required understanding of the application of the ML techniques to solve the vulnerability detection problem.

## Evaluation

The research work is presented in a clear and professional matter, and the necessary concepts are explored completely and in a very organized manner. Laura Wartschinski explains in detail the underpinnings of the technique, and deftly explains why the ML building blocks are chosen and how they are interconnected to arrive to the final solution. The results found are positive and there is a good lookout section exploring possible future applications of the work, which shows good research forethought. The validation section of the work, especially the evaluation of the model in Section 6, shows great attention to detail both in the experimental setup as well as the results presentation. The thesis is clearly above the standard of what can be expected from a usual master thesis.

As a consequence of this analysis, I assign the following evaluation:

**1.0 Very Good**

HUMBOLDT-UNIVERSITÄT ZU BERLIN

Mathematisch-Naturwissenschaftliche Fakultät

Institut für Informatik

Prof. Dr. Lars Grunske

Lars Grunske

Sitz: Rudower Chaussee 25

Unter den Linden 6

10099 Berlin