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# CYBER DEFENSE AND ARTIFICIAL INTELLIGENCE

MASTER'S THESIS

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## **ABSTRACT (ENG)**

*(rezumat/adnotare)*

### **CYBER DEFENSE AND ARTIFICIAL INTELLIGENCE**

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The problem of the study is the application of artificial intelligence to automatically detect and deal with cyberattacks. The study's objectives are to analyze the current trends in applying artificial intelligence for cyber defense, provide examples of using artificial intelligence in cyber defense, and develop a tool to detect and mitigate cyberattacks. The final objective is the tool that would predict and detect network compromises by using machine learning. The hypothesis is that by using a transparent proxy server before a real application server, the proxy can analyze traffic, detect malicious requests and break the connection, thus protecting the real server. The author used observation and experiments to obtain the results. The thesis also describes the most significant attacks on incorrect RSA implementations that have occurred in practice and the software code on Python programming language to reproduce the attacks, such as the Coppersmith attack, the Boneh & Durfee attack, and Howgrave-Graham, and the ROCA attacks, all of them aim to decrypt a message and Bleichenbacher's signature forgery. The current thesis also provides real examples of avoiding these attacks by using RSA correctly to ensure secure data transmission and digital signatures. As a result, in the final section of the thesis, the author came up with two computer programs. The first program implements MonteCarlo simulation to get a good move for a computer player in a Hex Board Game, thus demonstrating an implementation of an artificial intelligence algorithm. The Monte-Carlo simulation is implemented very efficiently, so it takes just about a second to make a move from a million trials on an average notebook on a 7x7 field or about 5 seconds on an 11x11 field. The second program is a proxy stub to check incoming TCP connections in real-time and break malicious connections. It is the cyber-defense server-side (reverse) proxy server application which is presented by the author.

Keywords: cyberdefence, artificial intelligence, Monte-Carlo simulation, RSA, Python.

## **ABSTRACT (ROM)**

*(rezumat/adnotare)*

# **APĂRARE CIBERNETICĂ ȘI INTELIGENȚĂ ARTIFICIALĂ**

Autor: Masiutin Maxim

Problema studiului este aplicarea inteligenței artificiale (AI) pentru a detecta și a proteja împotriva atacurilor cibernetice în mod automat. Scopul este utilizarea AI pentru detectarea și gestionarea automată a atacurilor cibernetice. Obiectivele studiului sunt de a analiza tendințele actuale în aplicarea AI pentru apărarea cibernetică, de a oferi exemple de utilizare a AI în apărarea cibernetică și de a dezvolta un instrument pentru detectarea și atenuarea atacurilor cibernetice. Obiectivul final este instrumentul care ar prezice și detecta compromisurile rețelei prin utilizarea învățării automate. Ipoteza este că prin utilizarea unui server proxy transparent înaintea unui server de aplicații real, proxy-ul poate analiza traficul, detecta cererile rău intenționate și întrerupe conexiunea, protejând astfel serverul real. Autorul a folosit observația și experimentele pentru a obține rezultatele. De asemenea, în prezenta teza sunt descrise cele mai semnificative atacuri asupra implementărilor incorecte a criptosistemului RSA care au avut loc în practică și codul software pe limbajul de programare Python pentru a reproduce atacurile, cum ar fi atacul Coppersmith, atacul Boneh & Durfee și Howgrave-Graham și ROCA. Toate atacuri demonstrate au scopul de a decripta un mesaj și falsificarea semnăturii lui Bleichenbacher. Teza oferă, de asemenea, exemple reale de evitare a acestor atacuri prin utilizarea corectă a RSA pentru a asigura transmisia sigură a datelor și semnăturile digitale. Drept urmare, în secțiunea finală a tezei, autorul a venit cu două programe de calculator. Primul program implementează simularea Monte-Carlo pentru a obține o mișcare bună pentru un jucător de calculator într-un joc de masă Hex, demonstrând astfel o implementare a unui algoritm de AI. Simularea Monte Carlo este implementată foarte eficient, așa că durează aproximativ o secundă pentru a trece de la un milion de încercări pe un notebook mediu pe un câmp 7x7 sau aproximativ 5 secunde pe un câmp 11x11. Al doilea program este un proxy stub pentru a verifica conexiunile TCP de intrare în timp real și pentru a întrerupe conexiunile rău intenționate. Este aplicația server proxy de apărare cibernetică (reverse proxy) care este prezentată de autor.

Cuvintele-cheie: cyberdefence, artificial intelligence, Monte-Carlo simulation, RSA, Python.

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# **1. Analysis of the current trends**

## **1.1. Introduction**

Cyber defense and artificial intelligence is new, emerging study. Cyber attacks lead to unauthorized access to systems connected to Internet networks anywhere in the world. As a result, cyber attacks ultimately lead to controlling these systems. With the introduction of artificial intelligence technology, these attacks continue to increase exponentially, and artificial intelligence technology has been effectively applied in the fields of health care, computer science and mechanical engineering. However, artificial intelligence can be used as a defense measure as well. With the application of artificial intelligence in the network field, traditional network attacks have begun to appear in the form of intelligent network attacks. Software development using standard, traditional algorithms is not sufficient to defend against attacks. In the present master's thesis, the literature research on artificial intelligence methods in the field of network security is studied, reviewed, and the knowledge applied. For topics discussed from different perspectives, solutions for defense and attack, applications used, backgrounds between different disciplines, analysis, and country-based examples will be introduced.

Artificial Intelligence (AI) aims to mimic real human intelligence. Intelligence, in its turn, is based on imagination. The phenomenon of imagination contributed to the creation of humankind. What also contributed to the creation of humankind is the development of one's sense of invention combined with the impulses of competition, ambition, creativity, and curiosity. As a matter of fact, before somebody even knows how to do it, it is only imagined. Artificial intelligence, which was first the subject of movies and now causes one of the biggest transformations in the world, is one of them. This transformation, which begins with a dream, will be presented to the service of humanity it brings with it a relentless service. AI deals with complex problems by enabling machines to find solutions like humans. The system, people's decision to simulate the mechanism, modeling is made with some algorithms.

A sub-stage of AI is machine learning. Machine learning is the name given to methods that make inferences from existing data using mathematical and statistic methods and make predictions about the unknown with these inferences. In a sub-stage

of machine learning, there is a deep learning technique. This technique is based on learning data functions with an artificial neural network approach. In summary, Figure 1 shows the relationship between artificial intelligence, machine learning, and deep learning. Today, artificial intelligence techniques are actively used in many fields, from automation to machine translation, from medical images to sound synthesis. One of the areas where the most active research areas actually take place is artificial intelligence in cybersecurity.

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