

VisiBot

Automated detection of IoT Botnets
using heuristic techniques

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1. Introduction

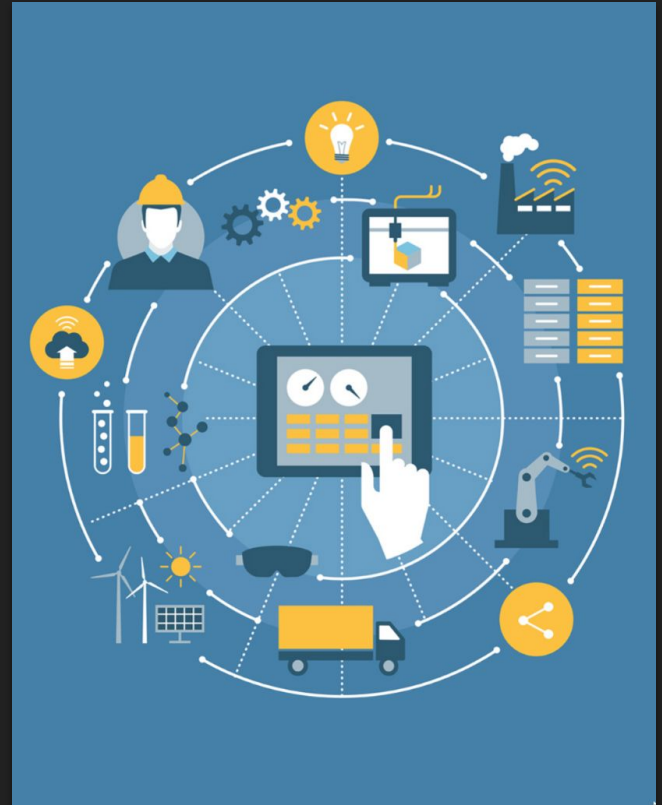
The 2016 Mirai Botnet Attack [1]

- Targeted DynDNS
- 1.2Tbps attack strength
- Comprised entirely of IoT devices

What is the The Internet of Things (IoT)?

“The interconnection via the internet of computing devices embedded in everyday objects, enabling them to send and receive data.” - Oxford Lexico [2]

<https://velocityglobal.com/blog/industry-news-how-the-internet-of-things-will-impact-global-business/>



1.1 The Problem

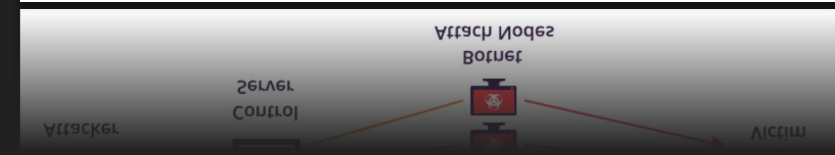
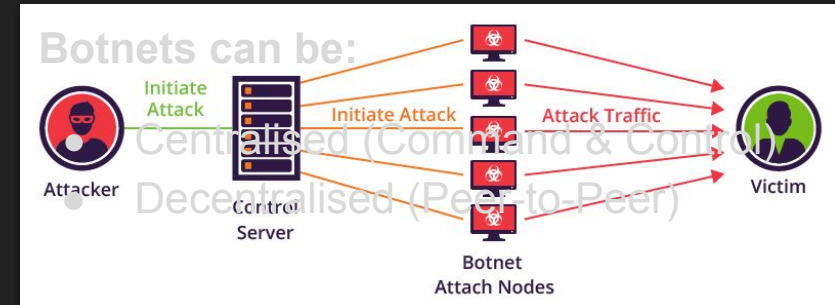
Definition of Botnet:

“A network of private computers infected with malicious software and controlled as a group without the owners' knowledge, e.g. to send spam.” - Oxford Lexico [3]

Botnets are often used for:

- Distributed Denial of Service (DDoS)
- Monetary gain (DDoS for hire)
- Mass spamming, Crypto-mining, Data theft

<https://www.imperva.com/blog/how-to-identify-a-mirai-style-ddos-attack/>



1.2 The Solution

Current Implementations:

- Often highly theoretical (Difficult to automate/deploy)
- May become outdated as botnets evolve
- Exclusively targets specific botnets / communication protocols

VisiBot - Aims and Objectives:

- **Automated** botnet detection for scalability, modularity, and distribution
- **Heuristic**-based botnet identification
- **Centralised** and **Peer-to-Peer** botnet detection
- Real-time geographic **visualisation**

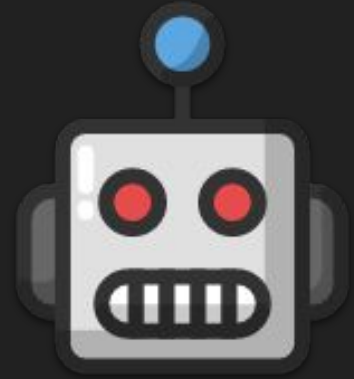
2. Background

- Preemptive botnet detection
 - Moon et al. (2012) [4]
- IoT Honeypot Systems
 - Pa Pa et al. (2016) and Antonakakis et al. (2017) [5, 6]
- Static & Dynamic Analysis of Centralised IoT Botnets
 - Bastos et al. (2019) and Ceron et al. (2019) [7, 8]
- DNS-based IoT Botnet Detection
 - Dwyer et al. (2019) [9]
- Peer-to-Peer IoT Botnet Detection
 - Herwig et al. (2019) [10]

3. Design Overview

VisiBot Processing System

- Message Broker Design Pattern
 - **Automation** and **parallelism** through worker-based task queue
- Honeypot Packet Processing
 - **Malware extraction** and **Packet Classification**
- IoT Malware Sandbox Analysis
 - Static, Dynamic, and Network analysis
- C2 and P2P Identification
 - Through four simple **heuristics**



3.1 Design Overview: Heuristic Analysis

Malware Analysis Heuristics:

1. Infected host performs P2P DNS Query during network analysis
2. infected host performs data transaction with foreign IP address
3. Interaction between infected host and hard-coded IP address
4. Interaction between infected host and blacklisted C2 Server



3.2 Design Overview: Web Application

- MVC Design Pattern
 - Model, View, Controller
- Interactive Visualisation
 - Map-based User Interface
- Geographic Clustering
 - Groups markers based on distance
- Network Visualisation
 - Shows IP address interactions as a graph



4. Implementation

- Docker, Celery, and Redis
 - Containerised applications and deployment
 - Scalable Celery workers which consume tasks from Redis broker
- Bad Packets Honeypot Service
 - Accessible via REST API
- LiSa Sandbox Analysis
 - Automated linux malware analysis
- Additional services
 - Sources: **MaxMind GeoIP2**, **VirusTotal**, **IPWHOIS**, and **IPInfo.io**
 - Blacklists: **Spamhaus**, **Barracuda**, **Abuse.ch**, **Spamrats** and **DNSBL**

4.1 LiSa Sandbox

- Created by Daniel Uhříček [11]
- Docker + Celery + RabbitMQ
- Supports x86_64, i386, arm, mips, and aarch64
- QEMU emulation
 - Static analysis: Radare2
 - Dynamic analysis: SystemTap
- VirusTotal Integration
- REST API



4.2 VisiBot Web Application

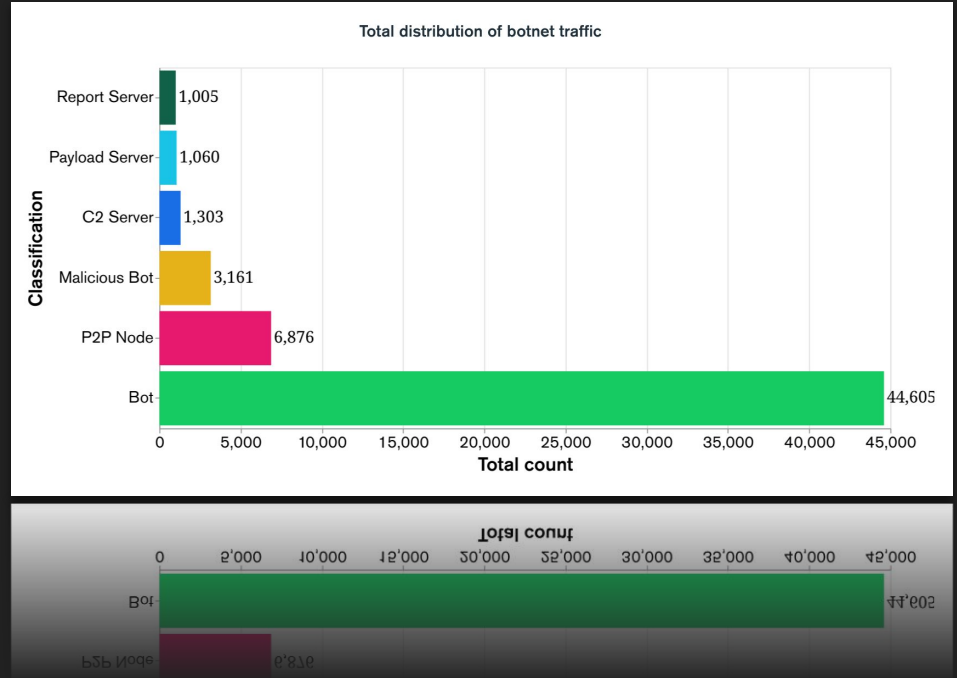
- Frontend: NuxtJS
- Backend: ExpressJS
- Database: MongoDB
- Interactive Map: LeafletJS
- User Interface: BootstrapVue



5.1 Results - Data Collection

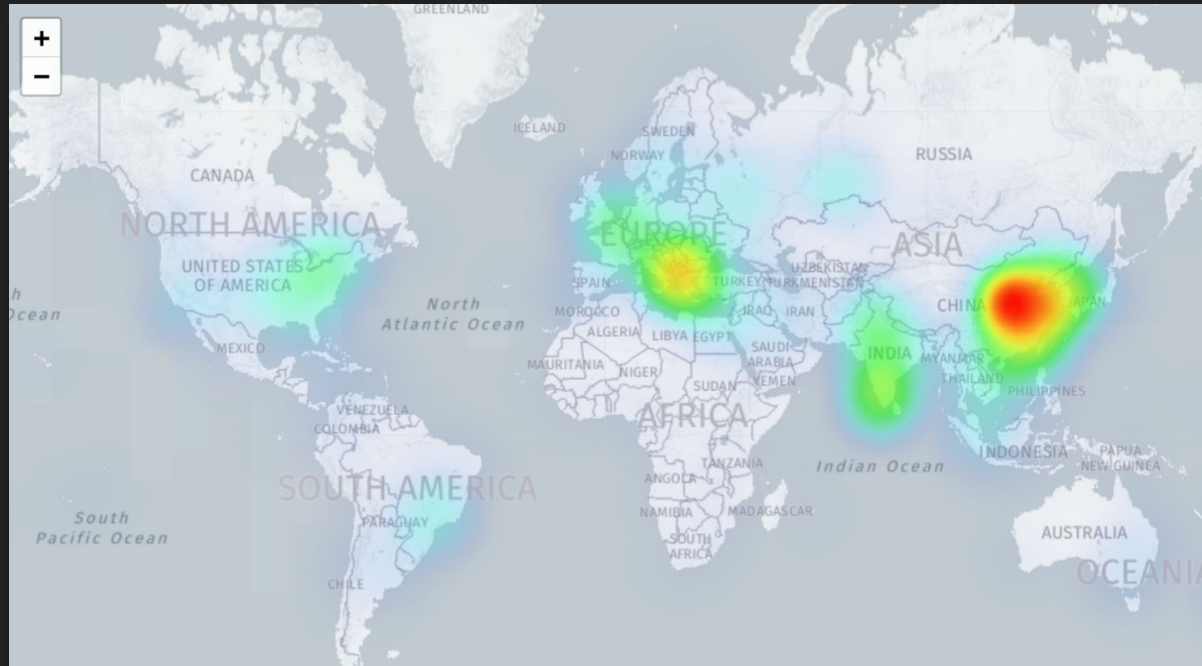
Over a 35-day data collection period:

- 58,010 Unique IP Addresses
- 82,050 Botnet Events
- 4,000 Autonomous Systems
- 1,654 Malware Samples

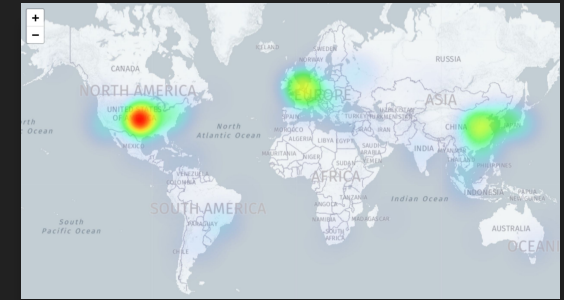


5.2 Results - Geographic Density

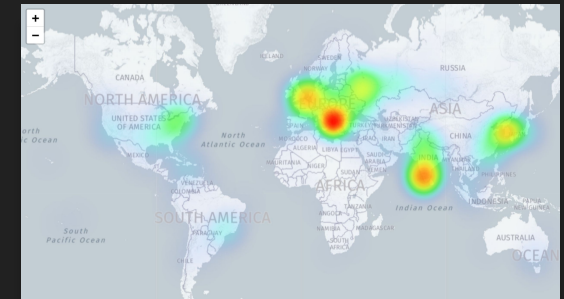
Overall Traffic Density



C2 Traffic Density



P2P Traffic Density



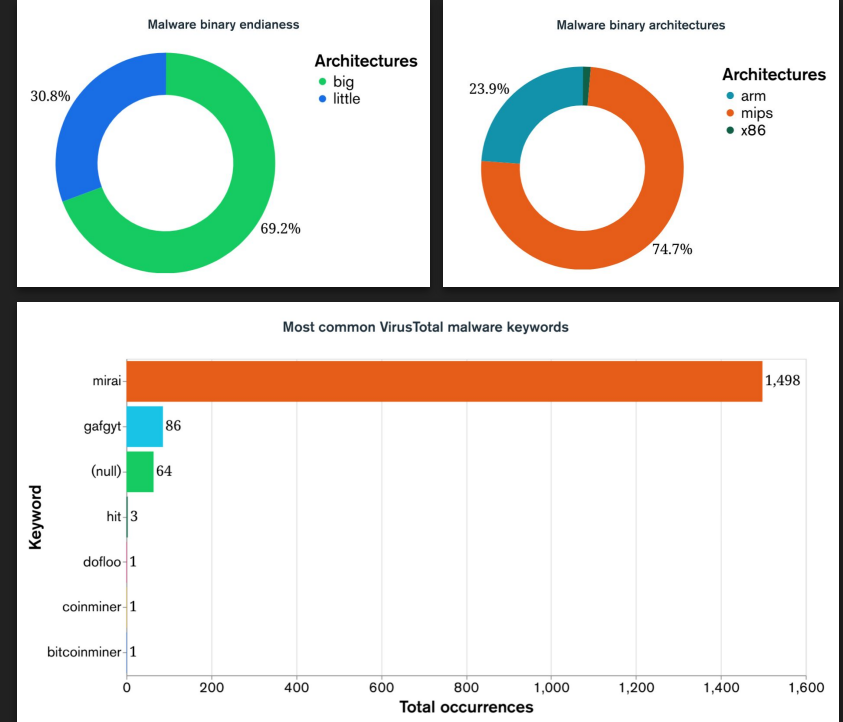
5.3 Results - Malware Analysis

Primarily **Mozi.a** and **Mozi.m** binaries

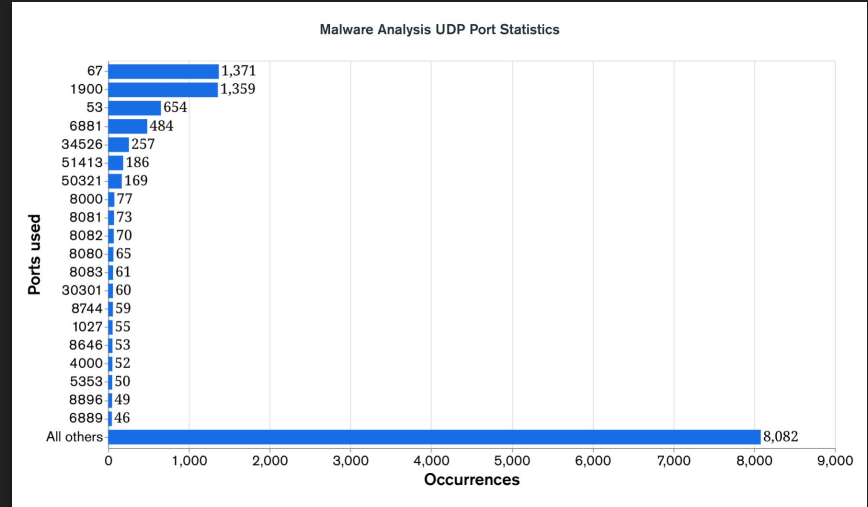
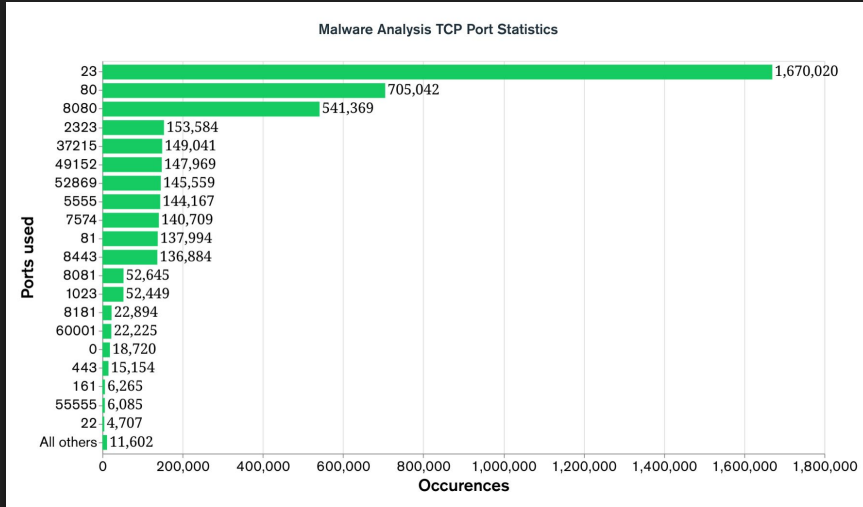
- Peer-to-Peer Mirai Botnet Variant

Other sample types:

- Bashlite aka gafgyt
- Coin miners
- Unknown variants

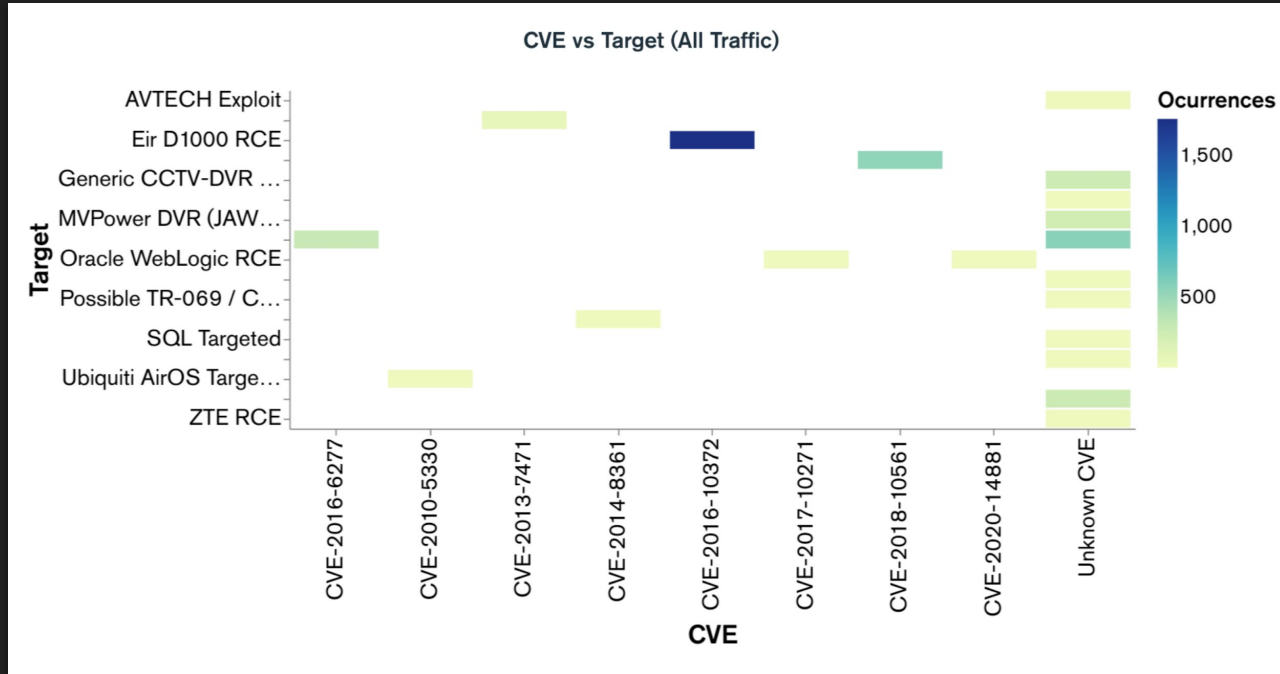


5.4 Results - Port Statistics (TCP vs UDP)



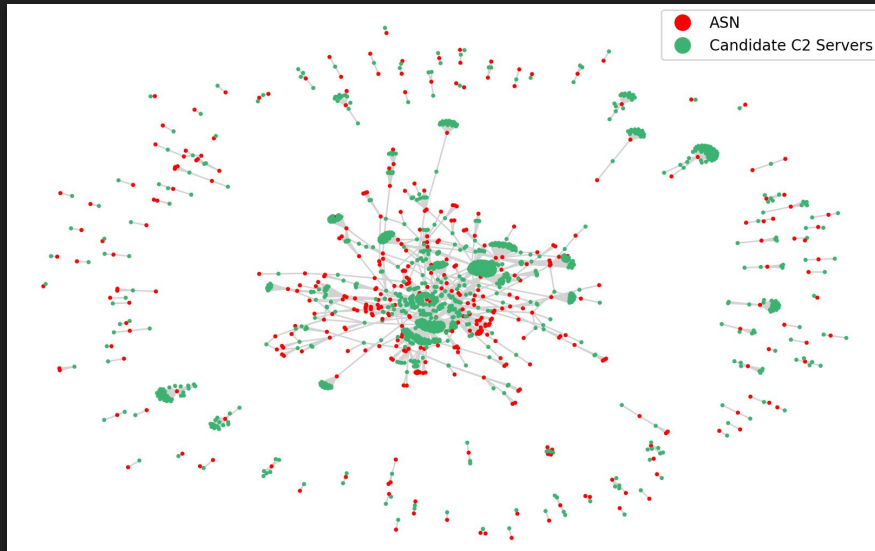
- Mostly randomly accessed ports via UDP protocol
- Telnet Port Scanning Activity: TCP Ports 23 and 2323
- Common Vulnerability Exploits (Ports 49152, 8080, 7574, etc.)

5.5 Results - Common Vulnerability Exploits (CVE)

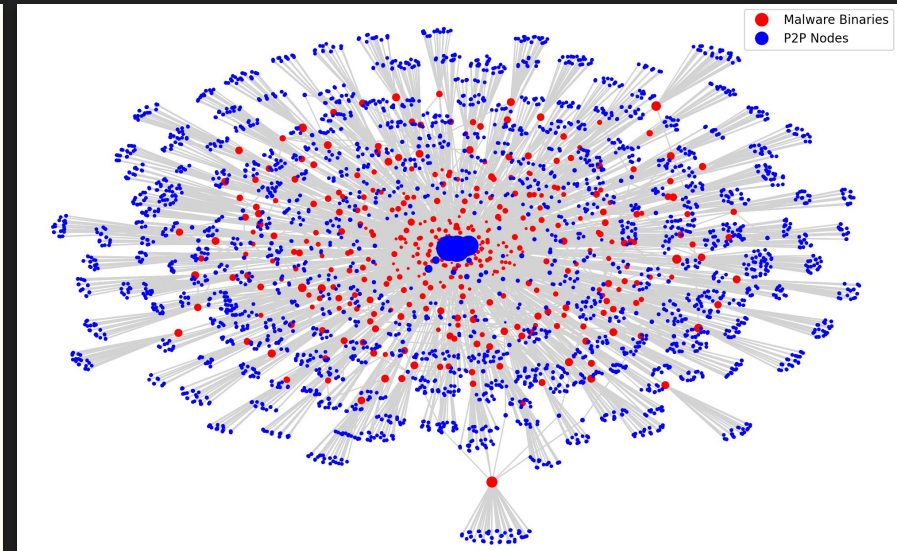


5.6 Results - Interaction Visualisations

NetworkX **K-Components** approximation algorithm [11]



Historical Interactions between candidate C2s and Autonomous Systems (AS).



Network interactions between analysed malware samples and Identified Peer-to-Peer nodes.

6. Evaluation and Conclusion

Benefits:

- Simple yet effective heuristics
- Extendable, Scalable and distributable
- Real-time visualisation of botnets and ASN activity
- Identification of centralised and Peer-to-Peer IoT botnets

Issues:

- Malware unpacking
- Candidate validation
- Sample extraction limitations

7. Future Work

- Stream-based Honeypot collection
- Improved malware sample unpacking
- Supplementary heuristics using captured packet information (PCAP)
- Candidate C2 and P2P validation procedures

Thank you!

8.1 References

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