



# Exploring Browser Fingerprinting

4 collaborators

# 00

## Overview

Analyzing the differences in fingerprinting techniques used by different browsers and industries



# 01

# FPMON Extension

A real-time fingerprinting  
monitor as a browser  
extension



# FPMON: Real-time Browser Fingerprinting Monitor



- Developed as part of a large-scale study in 2020
- Provides the user with real-time feedback on what browser fingerprinting method is being applied against them

# How does it work?

- FPMON monitors all JavaScript functions
- The fingerprinting techniques (FP) are then grouped and returned to the user
- By tracking the domain accessed and the FP techniques used, we can record this data and look into modeling the different domains and how user's data is accessed
- We will further look into the different industries behind each domain

<b>Domain</b>	www.amazon.com
<b>JS Attributes Tracked</b>	47% (54/115)
<b>Fingerprinting Features</b>	50% (20/40)
<b>Aggressive Features</b>	50% (9/18)
<b>Sensitive</b>	<b>Aggressive</b>
<ul style="list-style-type: none"><li>• Online status</li><li>• Storage</li><li>• User agent</li><li>• Platform</li><li>• Mobile</li><li>• Content language</li><li>• DoNotTrack</li><li>• Cookies enabled</li><li>• Vendor</li><li>• Timezone</li><li>• Flash</li></ul>	<ul style="list-style-type: none"><li>• Geolocation</li><li>• Connection</li><li>• CPU concurrency</li><li>• Device memory</li><li>• Webdriver</li><li>• List of plugins</li><li>• Audio and video formats</li><li>• WebGL</li><li>• Battery status</li></ul>

# FPMON Demo

FPMON can be used as an extension on both Chrome and Firefox, the two browsers we were looking at for the next step in this project.

## Firefox + Search Browser

Domain	www.google.com
JS Attributes Tracked	11% (12/115)
Fingerprinting Features	18% (7/40)
Aggressive Features	17% (3/18)
<b>Sensitive</b>	<b>Aggressive</b>
<ul style="list-style-type: none"><li>• User agent</li><li>• Mobile</li><li>• Storage</li><li>• Product</li></ul>	<ul style="list-style-type: none"><li>• Device memory</li><li>• Connection</li><li>• CPU concurrency</li></ul>

## Chrome + Search Browser

Domain	www.google.com
JS Attributes Tracked	13% (14/115)
Fingerprinting Features	15% (6/40)
Aggressive Features	17% (3/18)
<b>Sensitive</b>	<b>Aggressive</b>
<ul style="list-style-type: none"><li>• User agent</li><li>• Mobile</li><li>• Storage</li></ul>	<ul style="list-style-type: none"><li>• Device memory</li><li>• Connection</li><li>• CPU concurrency</li></ul>

## Firefox + Retail

Domain	www.target.com
JS Attributes Tracked	60% (69/115)
Fingerprinting Features	75% (30/40)
Aggressive Features	78% (14/18)
<b>Sensitive</b>	<b>Aggressive</b>
<ul style="list-style-type: none"><li>• User agent</li><li>• Storage</li><li>• App code name</li><li>• Browser vendor</li><li>• Build ID</li><li>• CPU class</li><li>• Mobile</li><li>• Platform</li><li>• Product</li><li>• Vendor</li><li>• Vendor sub</li><li>• DoNotTrack</li><li>• Cookies enabled</li><li>• Content language</li><li>• Timezone</li><li>• Online status</li></ul>	<ul style="list-style-type: none"><li>• Geolocation</li><li>• Connection</li><li>• List of plugins</li><li>• App version</li><li>• CPU concurrency</li><li>• Product sub</li><li>• Operating system</li><li>• Webdriver</li><li>• Device memory</li><li>• Canvas</li><li>• JS fonts</li><li>• Battery status</li><li>• WebGL</li><li>• Audio and video formats</li></ul>

## Chrome + Retail

Domain	www.target.com
JS Attributes Tracked	58% (66/115)
Fingerprinting Features	68% (27/40)
Aggressive Features	73% (13/18)
<b>Sensitive</b>	<b>Aggressive</b>
<ul style="list-style-type: none"><li>• User agent</li><li>• Storage</li><li>• App code name</li><li>• Browser vendor</li><li>• Build ID</li><li>• CPU class</li><li>• Mobile</li><li>• Platform</li><li>• Product</li><li>• Vendor</li><li>• Vendor sub</li><li>• DoNotTrack</li><li>• Cookies enabled</li><li>• Timezone</li></ul>	<ul style="list-style-type: none"><li>• Geolocation</li><li>• Connection</li><li>• List of plugins</li><li>• App version</li><li>• CPU concurrency</li><li>• Product sub</li><li>• Operating system</li><li>• Webdriver</li><li>• Audio and video formats</li><li>• JS fonts</li><li>• Canvas</li><li>• WebGL</li><li>• Battery status</li></ul>

# 02

## Predictive Machine Learning Models



# Dataset and Features

## Dataset Features

- Various Statistics
  - Max, min, sd, mean, median
- Packet
- Flow
- Packet Size
- Burst
- Duration
- Entropy
- Time Between Flows

## Notable Features

- Url
- Packets in downlink
- Packets in uplink

*Browser Fingerprinting: How to Protect Machine Learning Models and Data with Differential Privacy?*

By Dietz, Muhlhauser, Seufert, Gray, Hoßfeld, Herrmann

Column1	run_id	url	browser	total_packets_dl	mean_packets_per_flow_dl	median_packets_per_flow_dl	sd_packets_per_flow_dl
2684	2021-04-01T05_08_51.914-5NACKSXM	http://google.com	chrome	165	18.33333333	13	16.63997
2685	2021-04-01T05_09_03.980-YAN6Q4ZP	http://google.com	firefox	152	15.2	8	15.49064
2686	2021-04-01T05_09_15.396-WQE7ARBZ	http://facebook.com	chrome	279	31	7	46.60710
2687	2021-04-01T05_09_27.737-NKA5ST2Y	http://facebook.com	firefox	315	26.25	12	43.0854



# Data Processing



Y

- Browser
  - Chrome
  - Firefox

## Processing

- Removal of Null Values
- StandardScaler
- OneHotEncoding
- OrdinalEncoding

4495 x 146 (col x rows)

# Models



Model	RMSE
Linear Regression	63.419
Random Forest	0.128
Logistic Regression	0.192
Ridge Regressor	94.746
Random Bagging Regressor	0.242

03

# Future Works

What we hope to look  
more into



## ● End goal

---

**How do browser fingerprinting techniques differ  
across various industries?**

# Outline

## Categorize given data by industry

Separate both FPMON and networking dataset into industries in which the company in the url falls under

## Gather data on selected urls

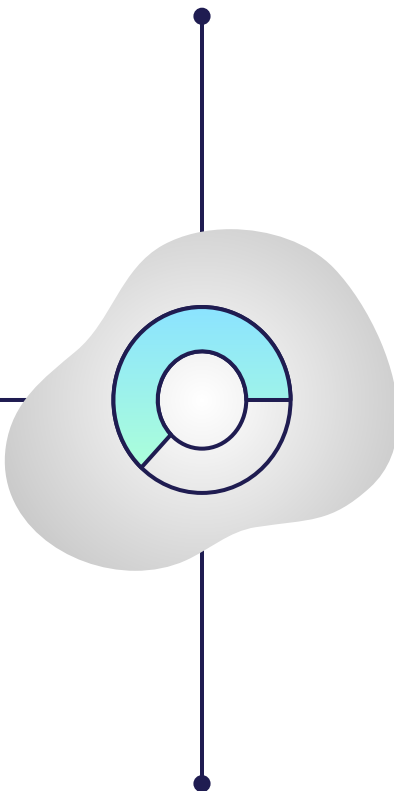
Choose a certain number of urls present in the dataset that falls under each industry and gather the relevant data

## Run ML models to on FPMON and networking datasets

Predict the industry based on fingerprinting techniques/data

## Analyze findings

Analyze how browser fingerprinting techniques differ among websites of different industries



04

**Thank you!**

Any questions?

