# Dataset Generation and Feature Extraction for High-**Traffic Environment Personal Tracker Identification** (Final)

15.07.2024

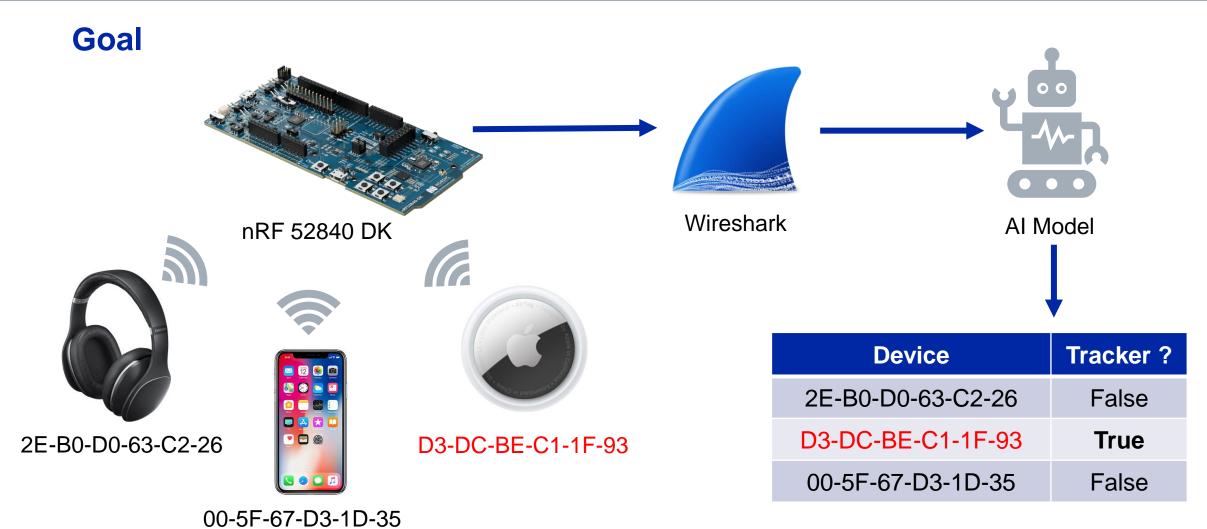
Stefan Richard Saxer

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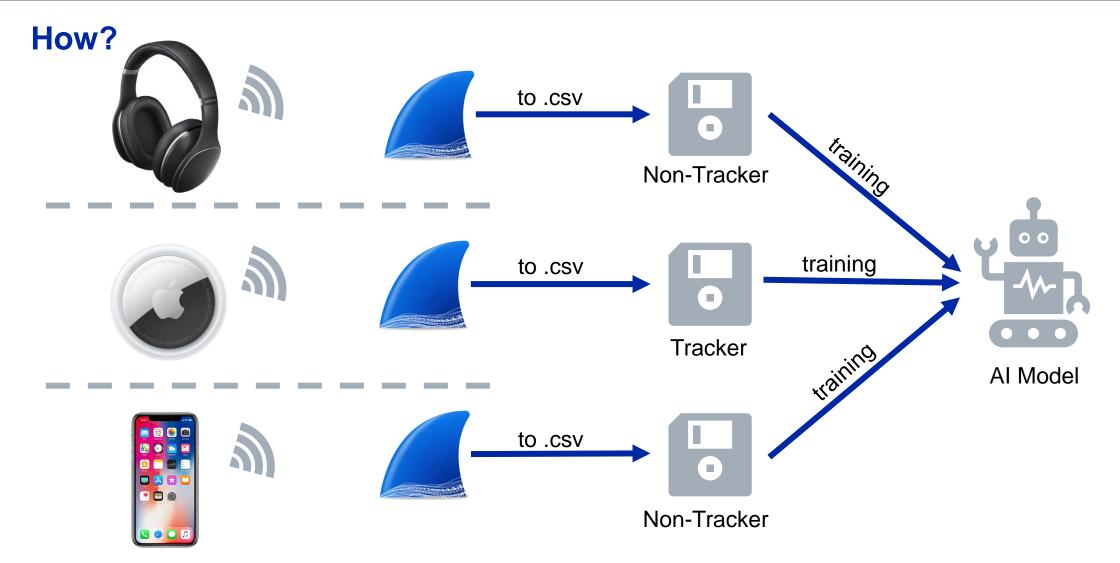


# **Recap from Midterm**











### **States of Trackers**



powerless



unpaired



nearby owner Device



High Threat

**Low Threat** 

15.07.2024

### **AirTag Example Packet**

→ Bluetooth Low Energy Link Layer

Access Address: 0x8e89bed6

> Packet Header: 0x2560 (PDU Type: ADV\_IND, ChSel: #2, TxAdd: Random)

Advertising Address: fd:e5:68:1f:9f:9c

- Advertising Data
  - Manufacturer Specific

Length: 30

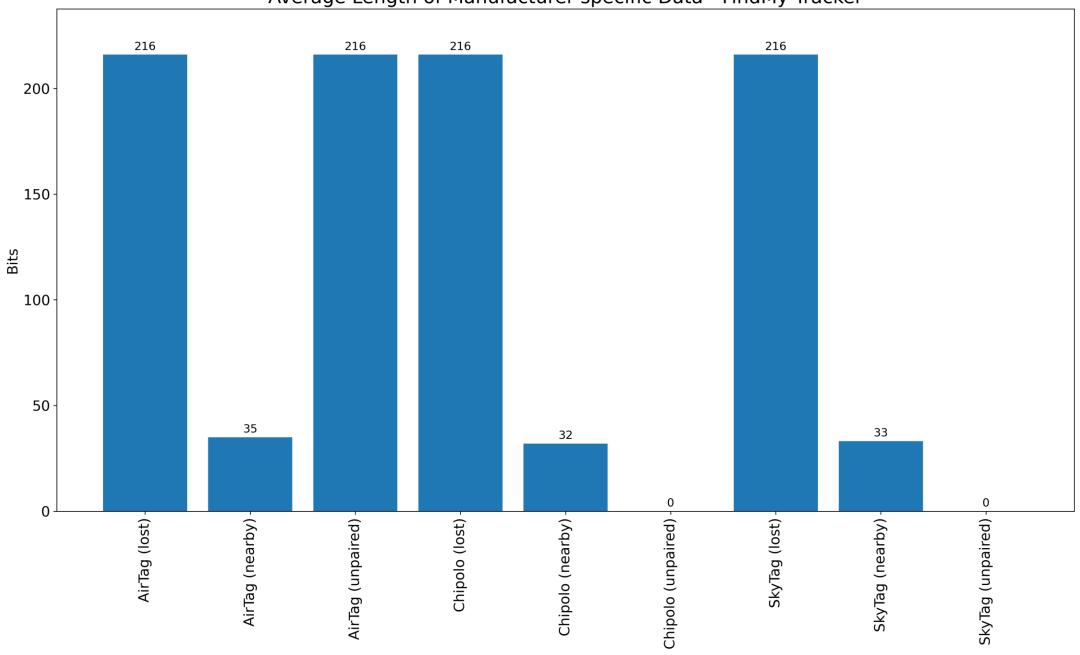
Type: Manufacturer Specific (0xff)

Company ID: Apple, Inc. (0x004c)

> Data: 121910bc3904307fa14c973cb6aefd08ba26426c0a15fb2a4c022c

CRC: 0x0f0801

Average Length of Manufacturer specific Data - FindMy Tracker





Modeling



### **Classes of BLE Trackers**



Air Tag (Apple)



ONE (Chipolo)



SkyTag (4Smarts)



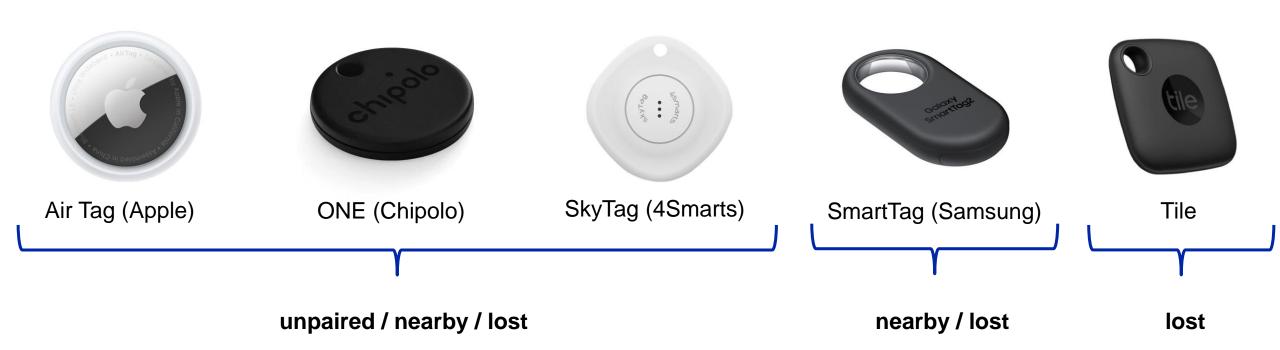
SmartTag (Samsung)



Tile



### **States of BLE Trackers**



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## **Apple iDevices**



# One app to find it all.



## iPhone Find My (offline) Example Packet

```
Bluetooth Low Energy Link Layer
   Access Address: 0x8e89bed6
 > Packet Header: 0x2542 (PDU Type: ADV_NONCONN_IND, TxAdd: Random)
   Advertising Address: ea:54:39:35:b4:52
 Advertising Data
   Manufacturer Specific
         Length: 30
         Type: Manufacturer Specific (0xff)
         Company ID: Apple, Inc. (0x004c)
      > Data: 121900f67e333bb0b4cb1b8d736af371736bb658f258e0a0070300
   CRC: 0x715c47
```



### iPhone Example Packet

```
Bluetooth Low Energy Link Layer
     Access Address: 0x8e89bed6
  > Packet Header: 0x1742 (PDU Type: ADV NONCONN IND, TxAdd: Random)
     Advertising Address: 4c:55:37:a4:37:d7
  Advertising Data

√ Flags

          Length: 2
          Type: Flags (0x01)
          000. .... = Reserved: 0x0
          ...1 .... = Simultaneous LE and BR/EDR to Same Device Capable (Host): true (0x1)
          .... 1... = Simultaneous LE and BR/EDR to Same Device Capable (Controller): true (0x1)
          .... .0.. = BR/EDR Not Supported: false (0x0)
           .... ..1. = LE General Discoverable Mode: true (0x1)
           .... 0 = LE Limited Discoverable Mode: false (0x0)
     Manufacturer Specific
          Length: 13
          Type: Manufacturer Specific (0xff)
          Company ID: Apple, Inc. (0x004c)
        > Data: 160800be40aecaa21edc
     CRC: 0x5da8f8
```



## **Class Labels for Apple Devices (iDevices)**







- iDevice FindMy (online)
- iDevice FindMy (offline)
- iDevice

## **Example: Class Labels for Apple Devices (iDevices)**

Packet Nr.	Source	Continuity Type	Label	
1	2E-B0-D0-63-C2-26	0x16	iDevice	
2	C9-2D-8B-7F-9B-A6	0x10	iDevice	
3	00-5F-67-D3-1D-35	0x12	iDevice FindMy (online)	
4	2E-B0-D0-63-C2-26	0x16	iDevice	
5	C9-2D-8B-7F-9B-A6	0x10	iDevice	
6	00-5F-67-D3-1D-35	0x12	iDevice FindMy (online)	
7	2E-B0-D0-63-C2-26	0x16	iDevice	
8	2E-B0-D0-63-C2-26	0x16	iDevice	
•••	•••		•••	



### **Other Devices**







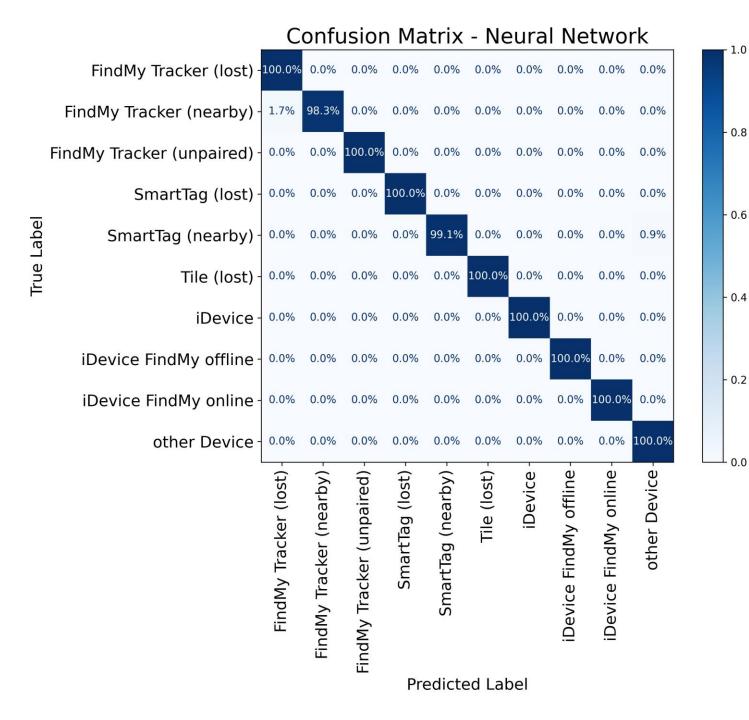












0.4

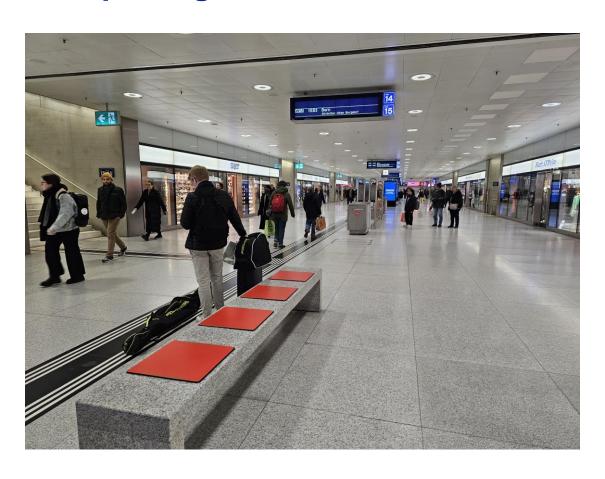
0.2



Inference



# **Capturing BLE Packets at Zürich HB**

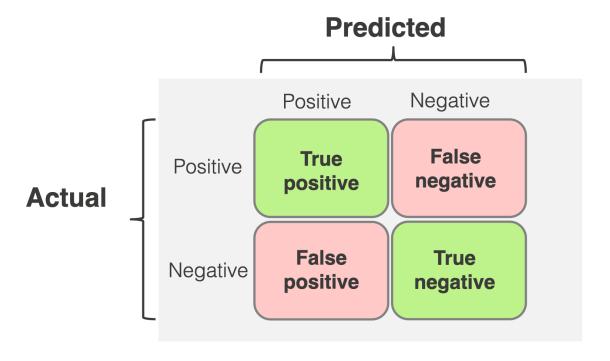




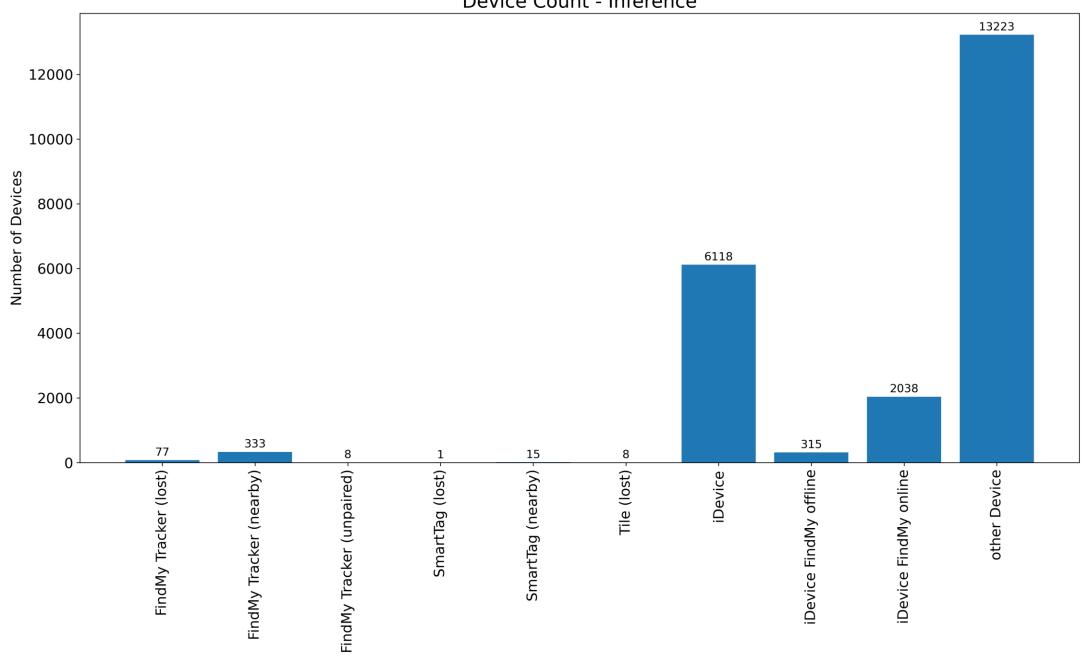
## One Source Address multiple Labels?

Packet Nr.	Source	Predicted Label	Soft Max Confidence	
1	2E-B0-D0-63-C2-26	SmartTag	36%	
2	2E-B0-D0-63-C2-26	AirTag	92%	
3	2E-B0-D0-63-C2-26	AirTag	100%	
4	2E-B0-D0-63-C2-26	SmartTag	42%	
5	2E-B0-D0-63-C2-26	AirTag	97%	<b>- /</b>
6	2E-B0-D0-63-C2-26	AirTag	100%	
7	2E-B0-D0-63-C2-26	AirTag	95%	
8	2E-B0-D0-63-C2-26	AirTag	98%	

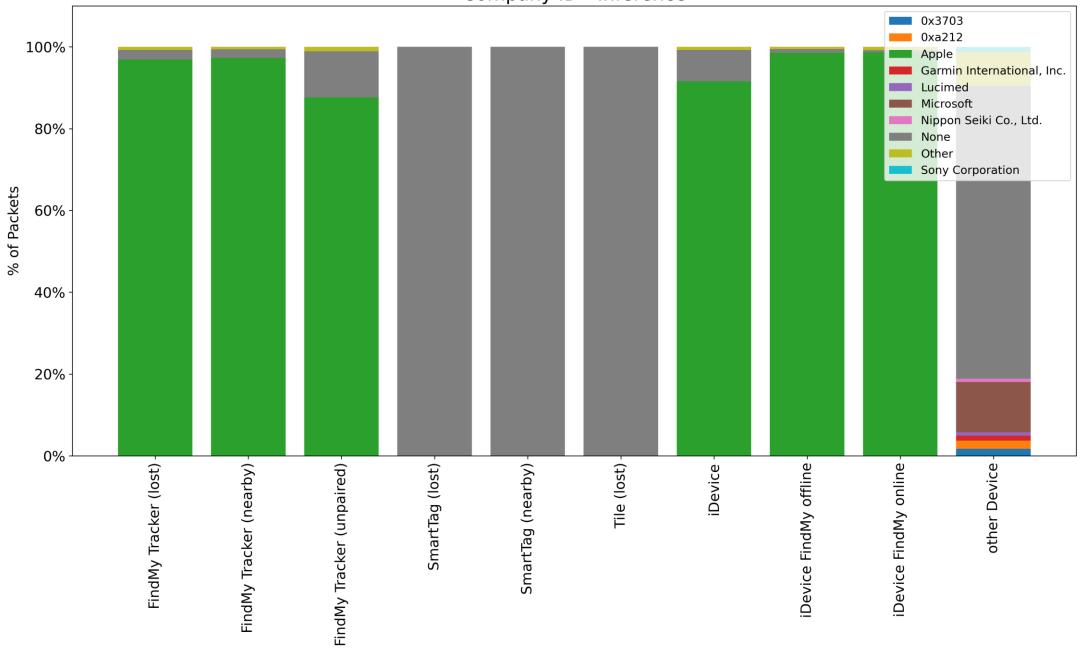
# **Evaluation?**

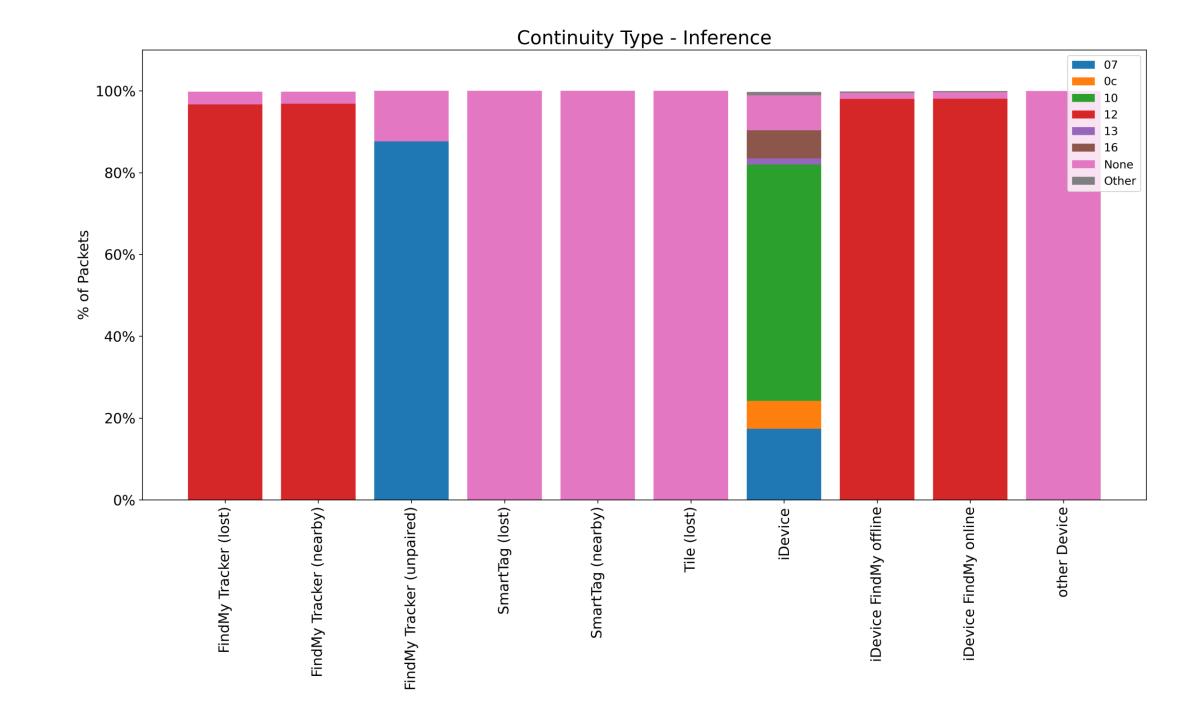


#### Device Count - Inference

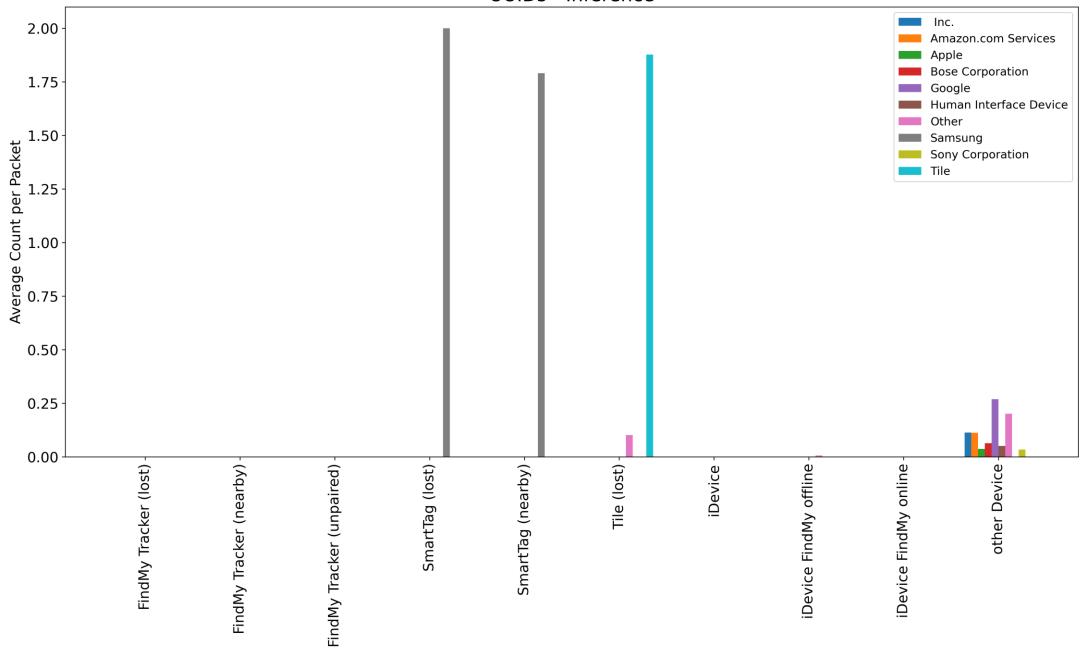


Company ID - Inference





UUIDs - Inference



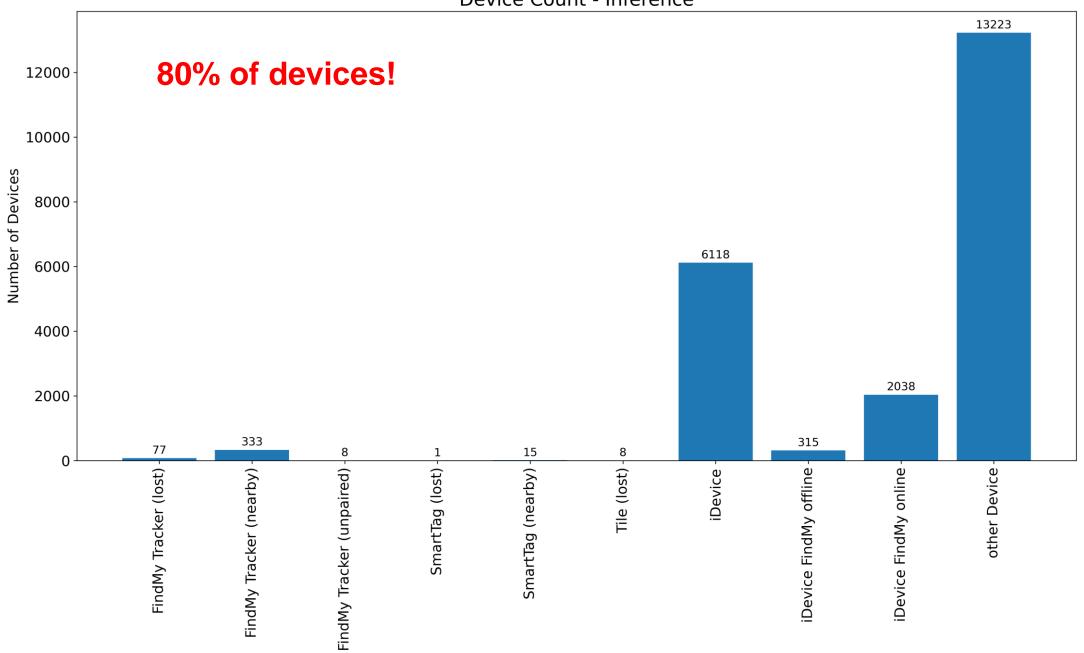


What's next?

## **One Source Address multiple Labels?**

Packet Nr.	Source	Predicted Label	Soft Max Confidence
1	2E-B0-D0-63-C2-26	SmartTag	36%
2	2E-B0-D0-63-C2-26	AirTag	92%
3	2E-B0-D0-63-C2-26	AirTag	100%
4	2E-B0-D0-63-C2-26	SmartTag	42%
5	2E-B0-D0-63-C2-26	AirTag	97%
6	2E-B0-D0-63-C2-26	AirTag	100%
7	2E-B0-D0-63-C2-26	AirTag	95%
8	2E-B0-D0-63-C2-26	AirTag	98%





**UUIDs** - Inference without Thresholding Inc. 2.00 0x83bb 0x85d5 Amazon.com Services 1.75 **Bose Corporation** Google Human Interface Device Average Count per Packet 1.50-1.00 1.00 1.75 Other Samsung Tile 0.50 0.25 0.00 iDevice other Device SmartTag (nearby) iDevice FindMy online FindMy Tracker (lost) FindMy Tracker (nearby) FindMy Tracker (unpaired) SmartTag (lost) Tile (lost) iDevice FindMy offline

# We need (a lot) more Training Data!



# **Capture more BLE Packets?**

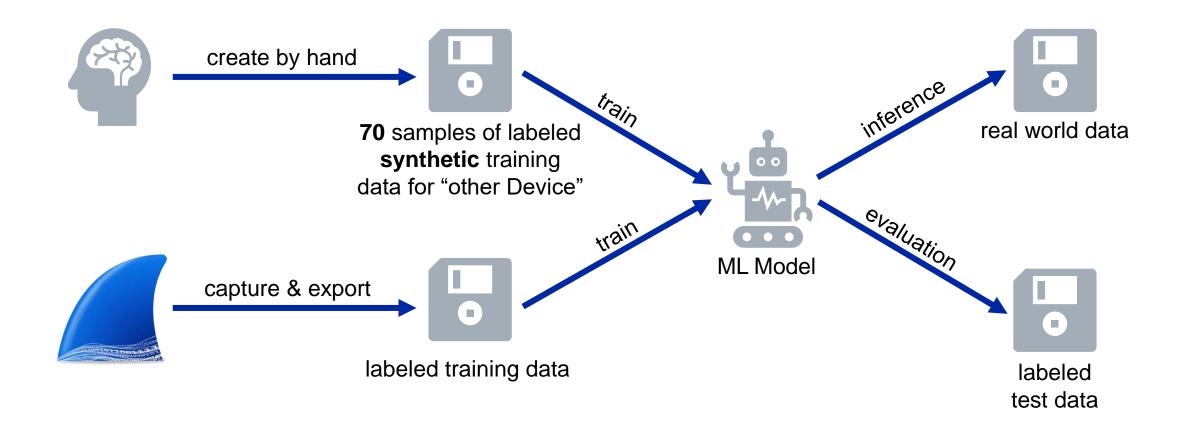






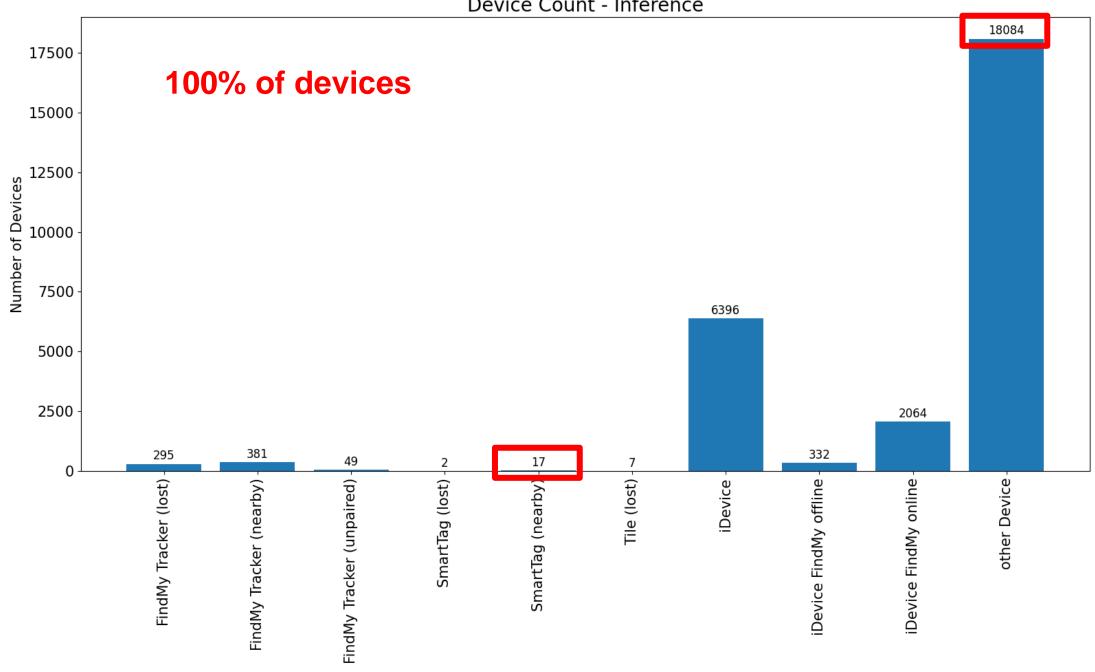
# **Synthetic Data Generation for BLE Packets**

## **Training Machine Learning Models with synthetic Data**



Confusion Matrix - Neural Network with synthetic Data FindMy Tracker (lost) -100.0% 0.0% 0.0% 0.0% FindMy Tracker (nearby) - 1.7% 98.3% 0.0% 0.0% 0.0% 0.0% 0.0% 0.0% 0.0% - 0.8 FindMy Tracker (unpaired) 0.0% 0.0% 100.0% 0.0% 0.0% 0.0% 0.0% 0.0% SmartTag (lost) -0.0% 0.0% 0.0% 100.0% 0.0% 0.0% 0.0% 0.0% 0.0% - 0.6 **True Label** 0.0% 0.0% 0.0% 0.0% 99.0% SmartTag (nearby) 0.0% 0.0% 0.0% 1.0% Tile (lost) 0.0% 0.0% 0.0% 0.0% 0.0% 100.0% 0.0% 0.0% 0.0% - 0.4 0.0% 0.0% 0.0% 0.0% 0.0% 100.0% 0.0% 0.0% 0.0% iDevice -0.0% 0.0% iDevice FindMy offline 0.0% 0.0% 0.0% 0.0% 0.0% 100.0% - 0.2 0.0% 100.0% 0.0% iDevice FindMy online 0.0% 0.0% 0.0% 0.0% other Device 0.0% 0.0% 0.0% 0.0% 0.0% 0.0% 0.0% 100.0% 0.0% 0.0 iDevice Tile (lost) iDevice FindMy offline iDevice FindMy online other Device SmartTag (lost) SmartTag (nearby) FindMy Tracker (lost) FindMy Tracker (nearby) FindMy Tracker (unpaired) Predicted Label



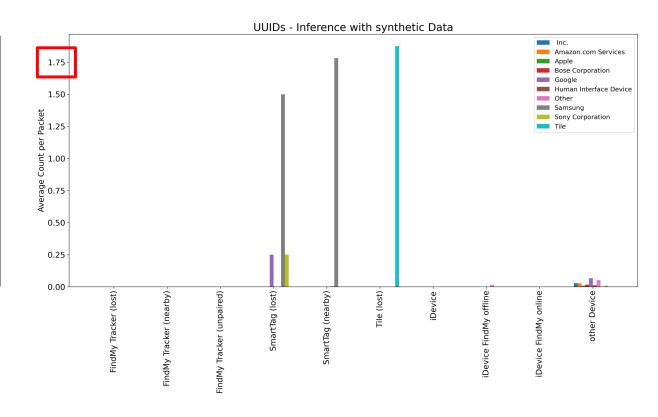


UUIDs - Inference with synthetic Data Inc. Amazon.com Services 1.75 Apple **Bose Corporation** Google Human Interface Device 1.50 Other Samsung Average Count per Packet - 52.1 Sony Corporation Tile 0.50 0.25 0.00 SmartTag (nearby) iDevice other Device SmartTag (lost) iDevice FindMy online FindMy Tracker (lost) FindMy Tracker (nearby) FindMy Tracker (unpaired) Tile (lost) iDevice FindMy offline

## Thresholding without synthetic Data

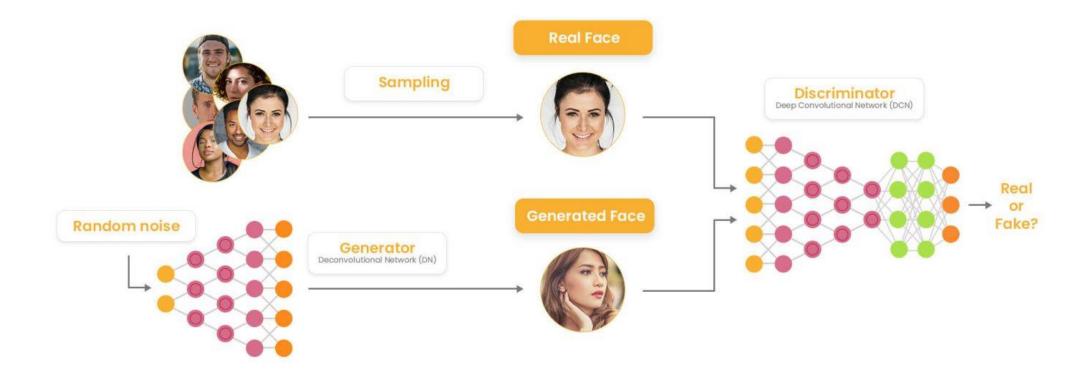
# UUIDs - Inference Inc. 2.00 -Amazon.com Services 1.75 Average Count per Packet 1.25 - 0.75 0.50 0.25 0.00

## 100% of devices with synthetic Data





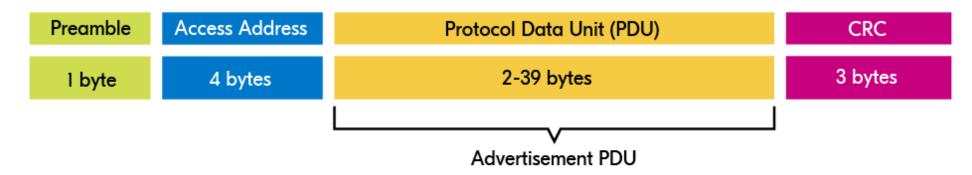
## Data Generation with Deep Neural Networks (GAN)?



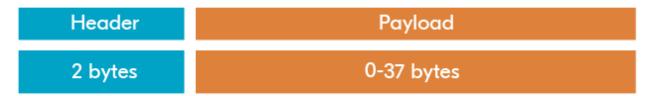


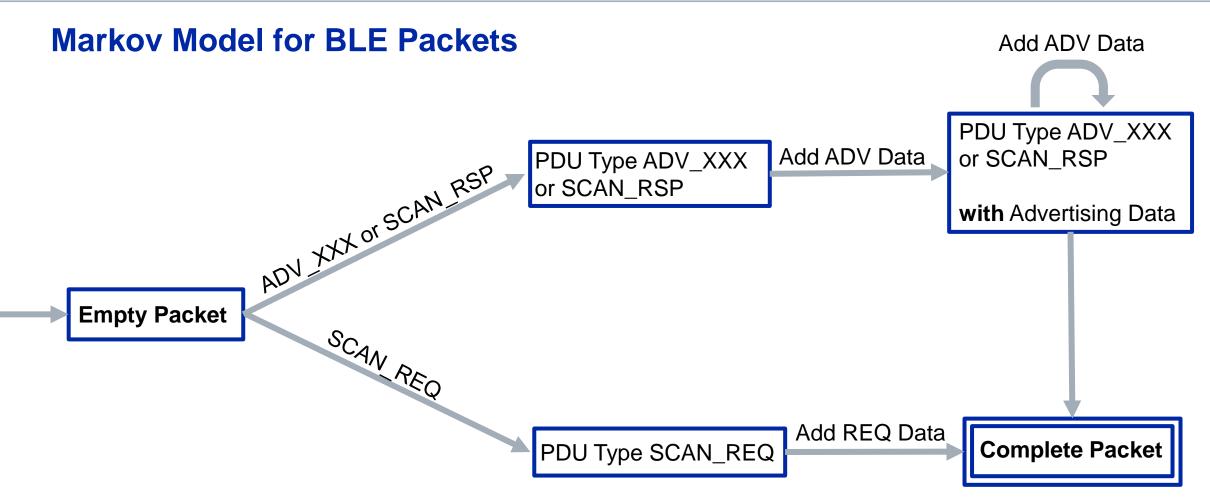
### **BLE Packet Format**

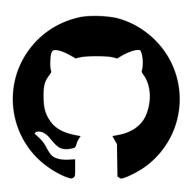
### Bluetooth LE Packet

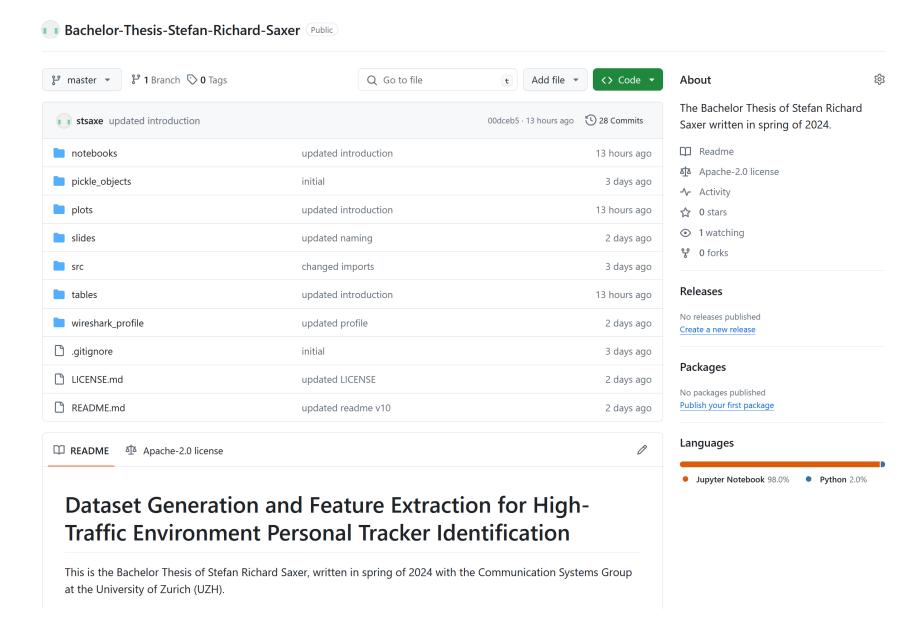


### **Advertisement PDU**









# **Questions?**

Thank you for your attention and good luck reviewing my thesis!