

# Hold The Door! Fingerprinting Your Car Key to Prevent Keyless Entry Car Theft

Kyungho Joo\*

Wonsuk Choi\*

Dong Hoon Lee

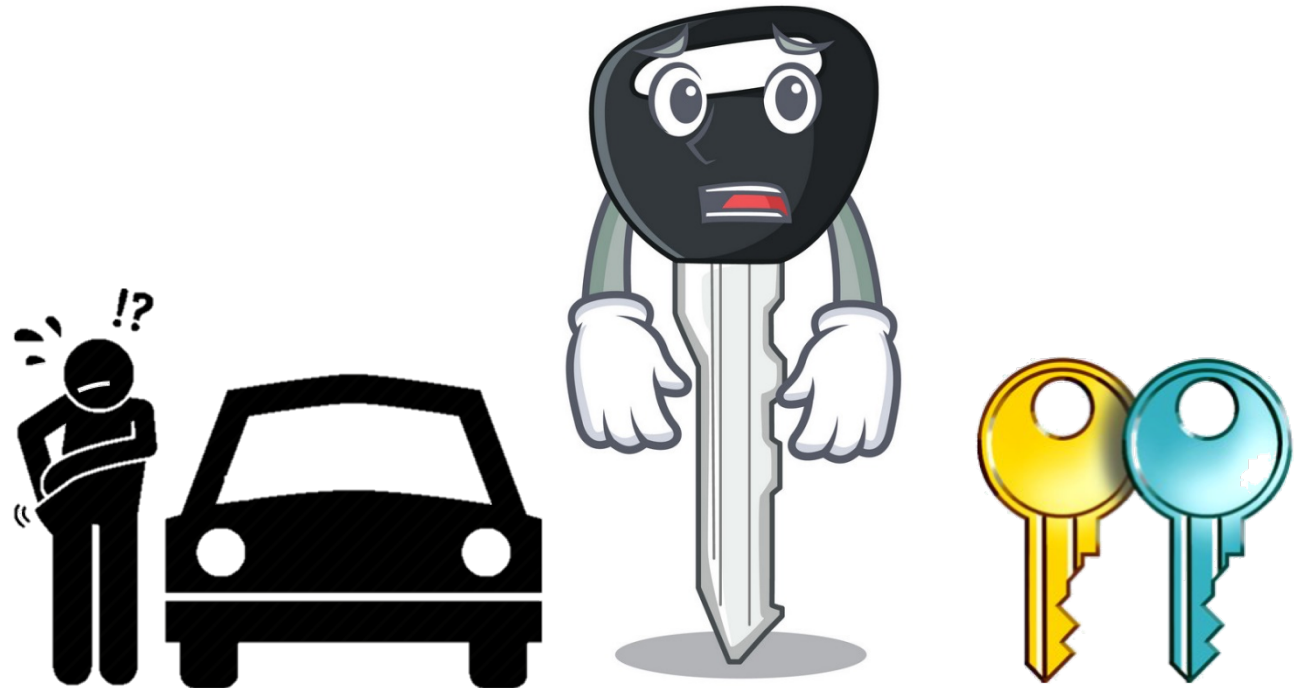
Korea University

# Outline

- Introduction
- Attack Model
- Our Method
- Evaluation
- Discussion
- Conclusion

# Introduction

- Traditional system
  - Physically insert a key into the keyhole
  - Inconvenient
  - Vulnerable to key copying



# Introduction

- Keyless Entry System
  - Remote Keyless Entry (RKE) System
  - Passive Keyless Entry and Start (PKES) System
- Attacks on Keyless Entry System
  - Cryptanalysis
  - Relay Attack
  - etc. (e.g., Roll-jam)





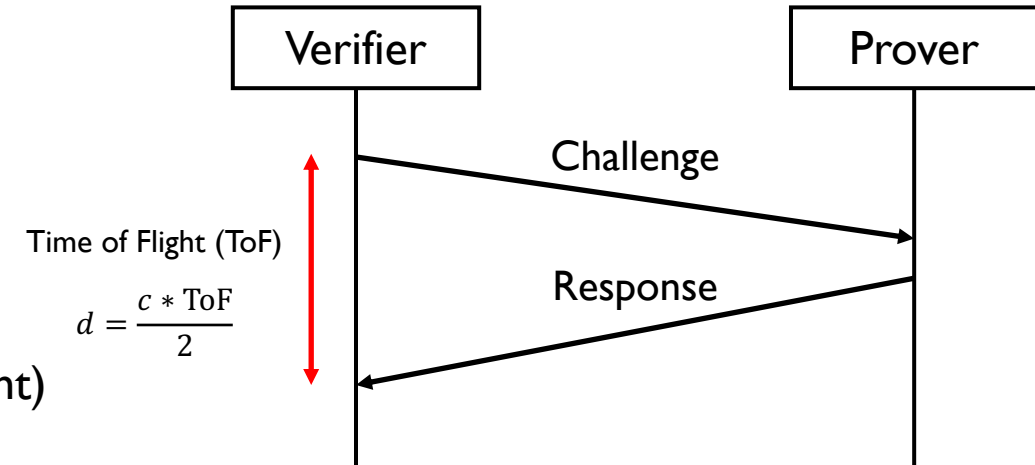
# Introduction

- Countermeasures

- Distance bounding protocol
  - Sensitive to timing error (Propagates at the speed of light)
- UWB-IR Ranging System
  - Efforts are underway (IEEE 802.15.4z Task Group) [1-3]
  - Requires an entirely new keyless entry system

- Motivation

- Device Fingerprint: Exploits hardware imperfection
- PHY-layer signal analysis



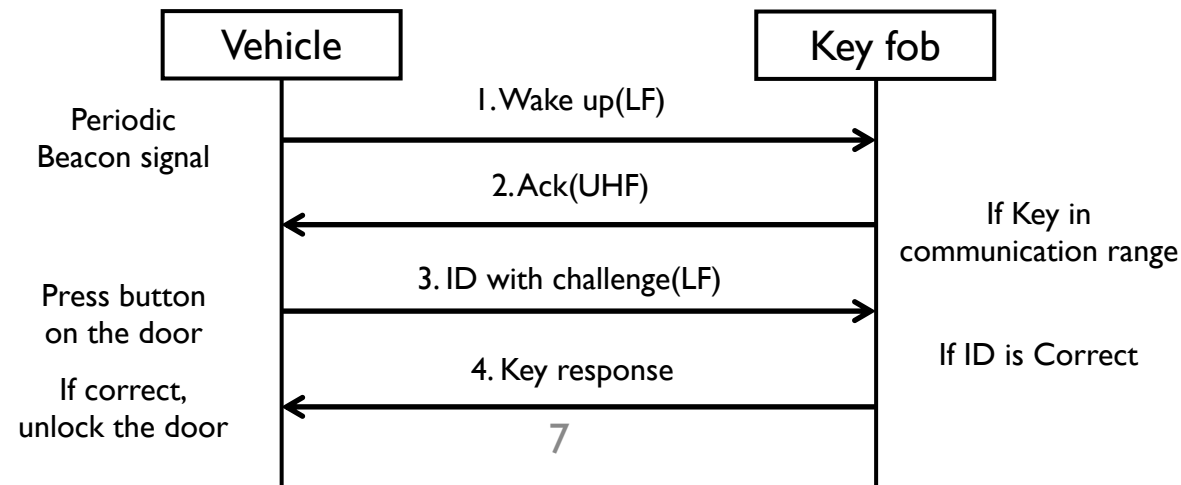
[1] UWB with Pulse Reordering: Securing Ranging against Relay and Physical Layer Attacks (M. Singh et al.)  
[2] UWB-ED: Distance Enlargement Attack Detection in Ultra-Wideband (M. Singh et al.)  
[3] Message Time of Arrival Codes: A Fundamental Primitive for Secure Distance Measurement (P. Leu et al.)

# Introduction

- Contributions
  - New attack model
    - Combines all known attack methods; our attack model covers both PKES and RKE systems
    - Single/Dual-band relay attack, Cryptographic attack
  - No alterations to the current system
    - Easily employed by adding a new device that captures and analyzes the ultra-high frequency (UHF) band RF signals emitted from a key fob
  - Evaluations under varying environmental factors
    - Temperature variations, NLoS conditions (e.g., a key fob placed in a pocket) and battery aging

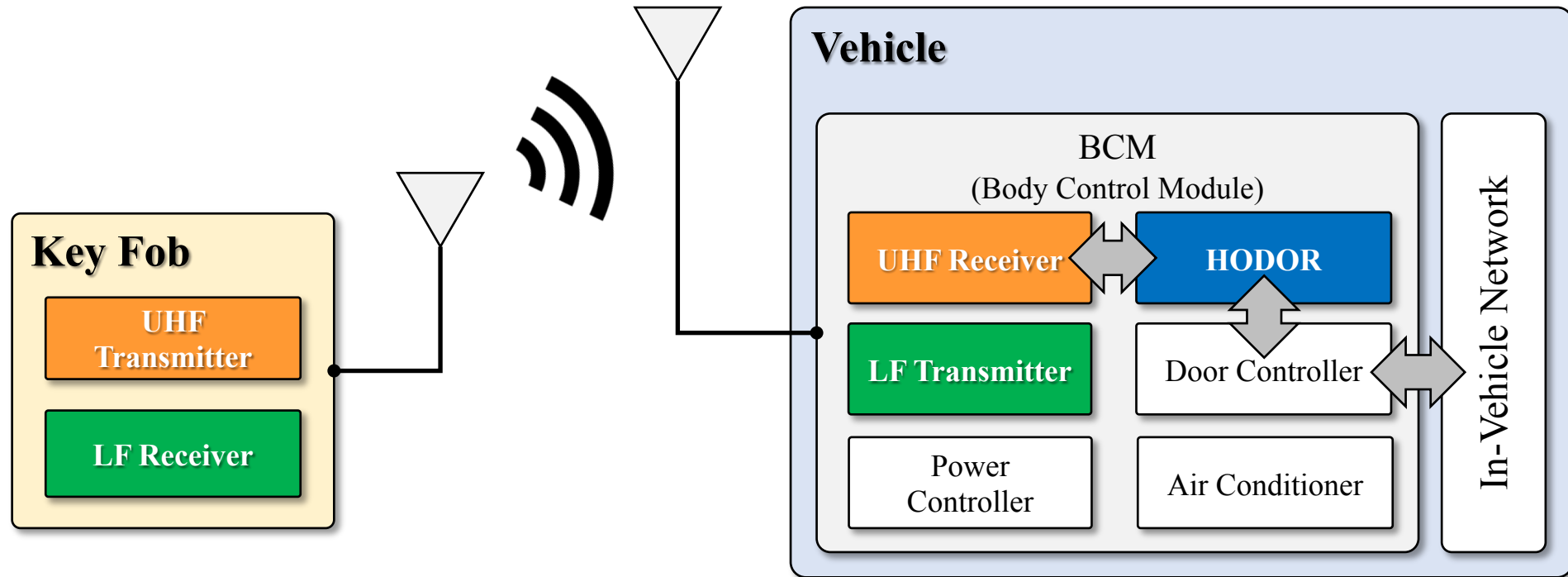
# Introduction

- Passive Keyless Entry and Start (PKES) System
  - LF band (125~135 kHz, Vehicle)
    - 1 ~ 2 meter communication range
  - UHF band (433, 858 MHz, Key fob)
    - ~100 meter communication range
  - Shared cryptographic key between the key and the vehicle



# Introduction

- System Model

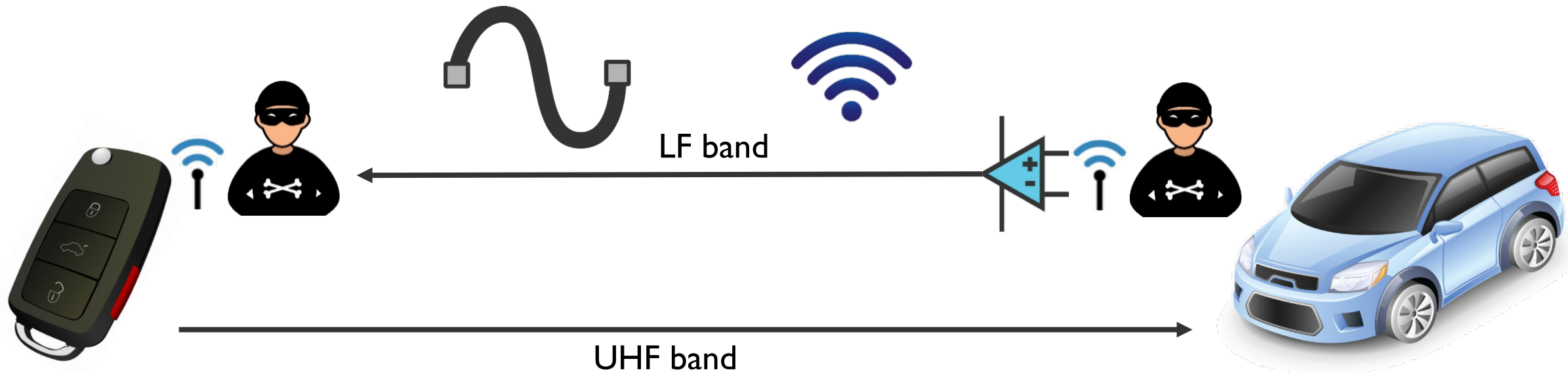


# Outline

- Introduction / Background
- **Attack Model**
- Our Method
- Evaluation
- Discussion
- Conclusion

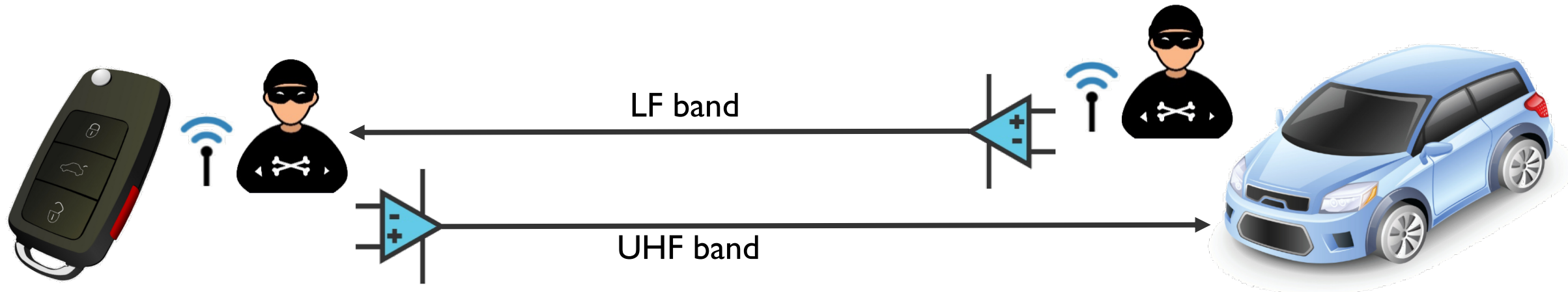
# Attack Model

- Single-band Relay Attack [\*]
  - Manipulate LF band signal only
  - Wired / Wireless Attack



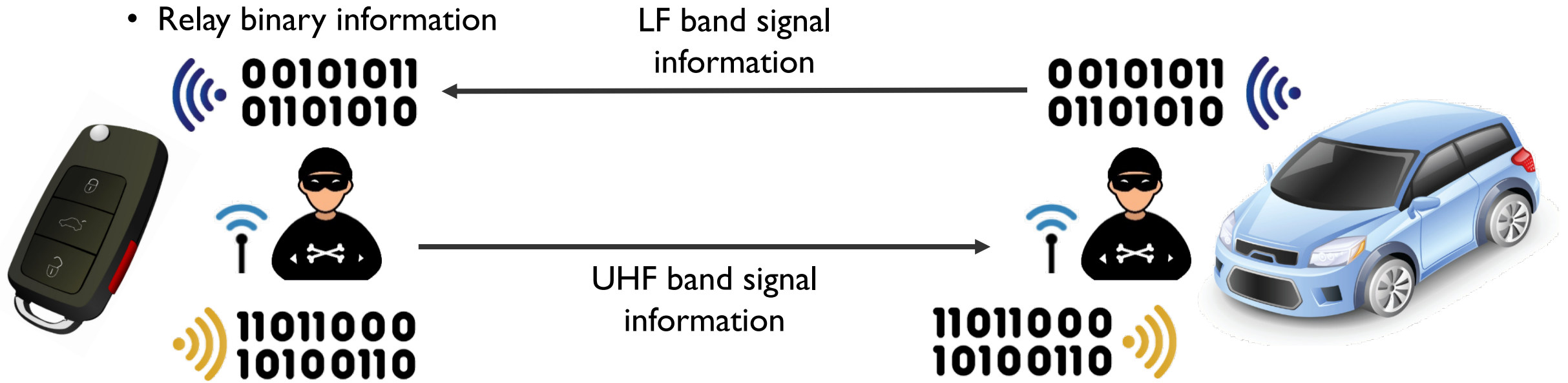
# Attack Model

- Dual-band Relay Attack ( I .Amplification Attack)
  - Manipulate both LF and UHF band signals
  - Amplifies UHF band signal and injects to the vehicle



# Attack Model

- Dual-band Relay Attack ( II . Digital Relay Attack) [\*]
  - Performs the whole process of digital communication
  - Demodulate LF/UHF band signal
  - Relay binary information

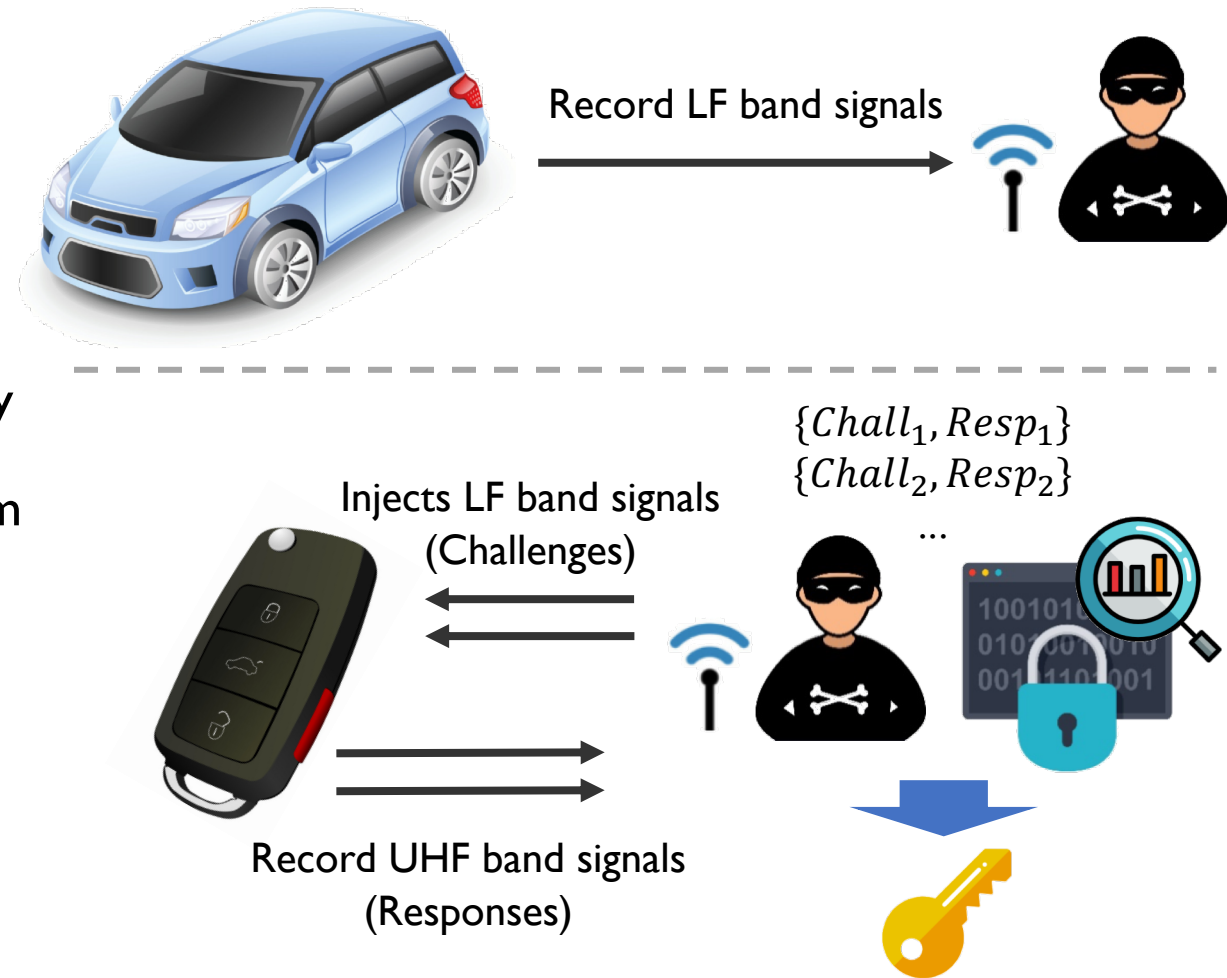


[\*] Car keyless entry system attack (Yingtao Zeng et al.)



# Attack Model

- Cryptographic Attack [\*]
  - Single attacker
  - Injects LF band signals to the key fob
  - Records valid responses and extract secret key
  - Exploits weaknesses of cryptographic algorithm

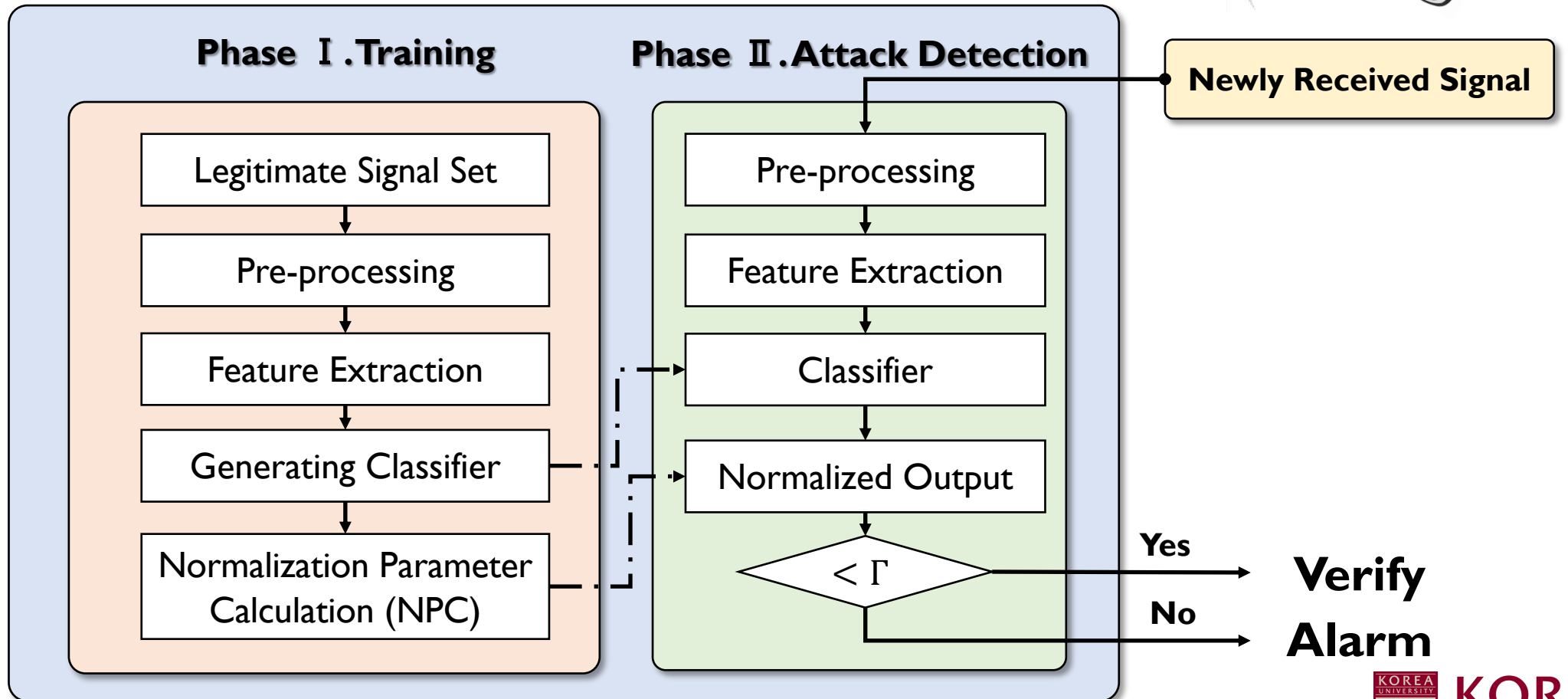


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- Attack Model
- **Our Method**
- Evaluation
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- Conclusion

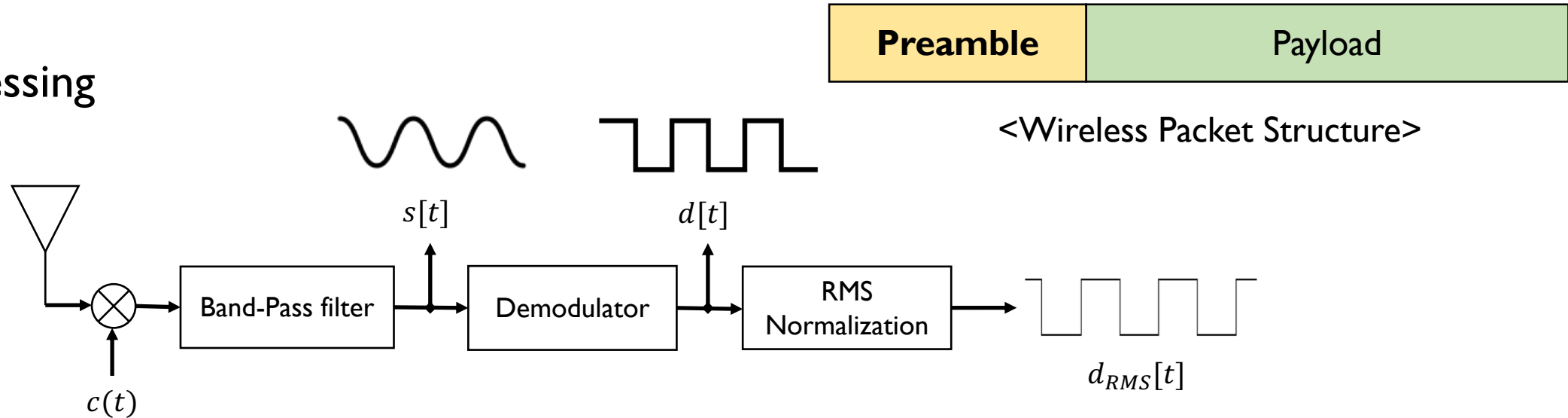
# Our Method

- Overview (HODOR)

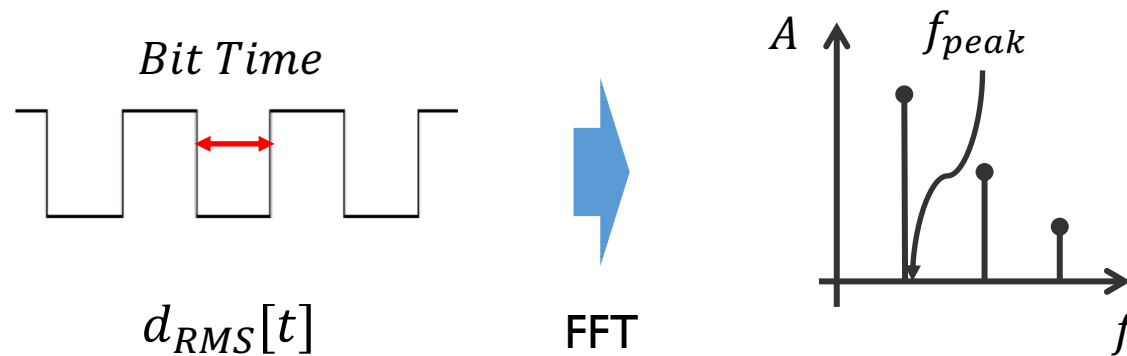


# Our Method

- Preprocessing

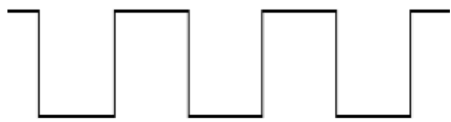


- Feature Extraction



# Our Method

- Feature Extraction (Continue)



$d_{RMS}[t]$

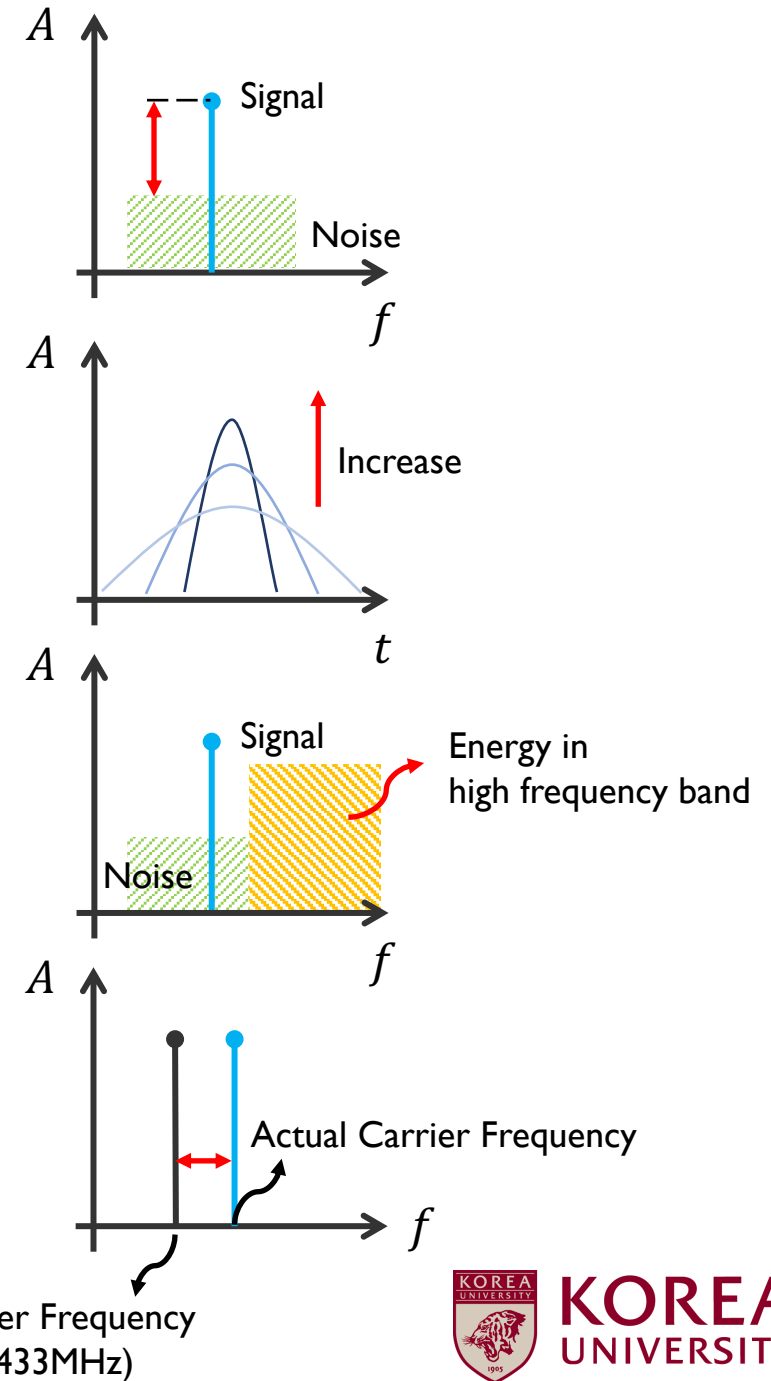


$s[t]$



$SNR_{dB}$   
Kurtosis  
Spectral Brightness

Carrier Frequency offset

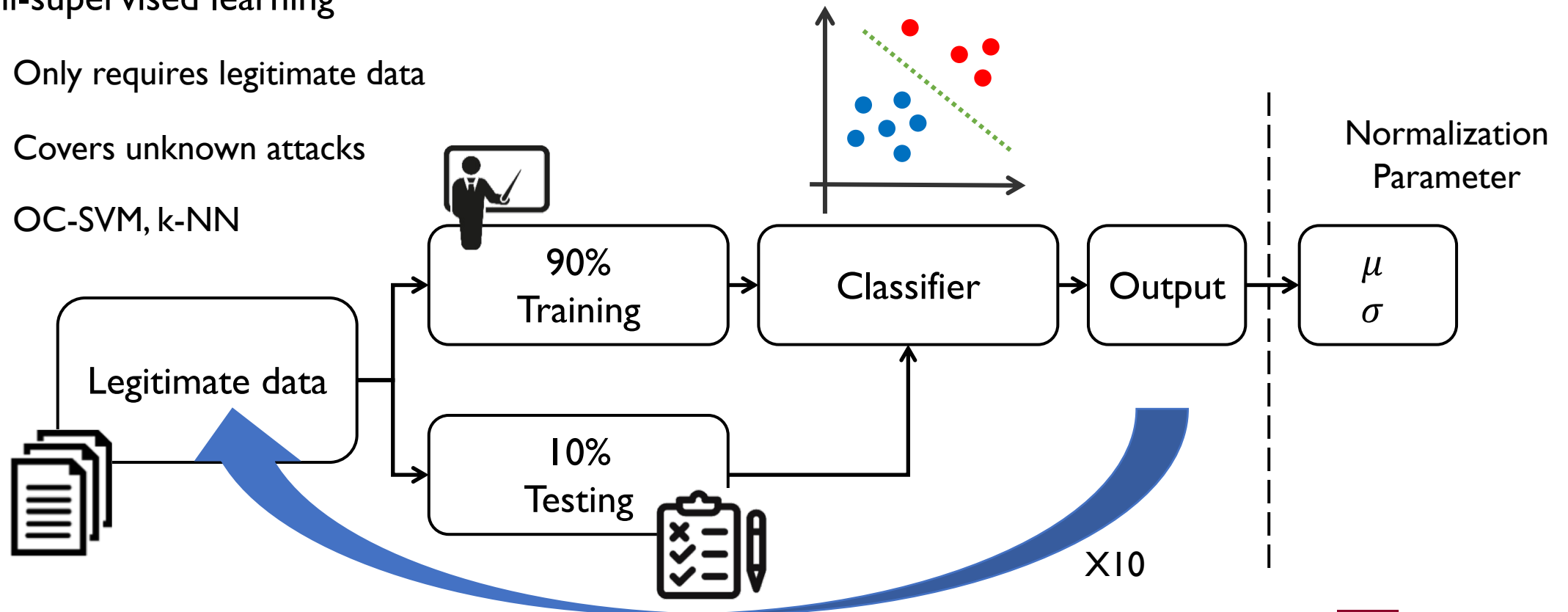


# Our Method

- Training

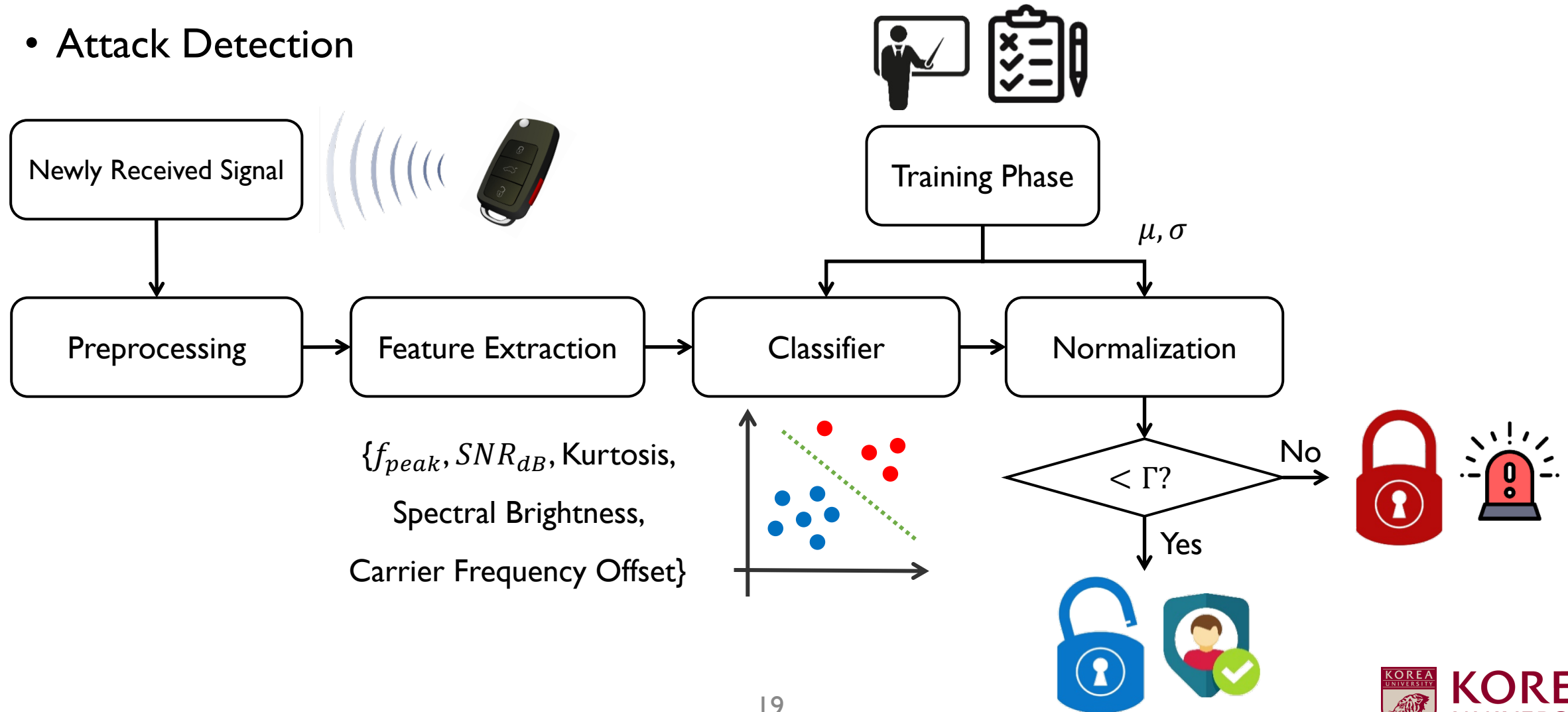
- Semi-supervised learning

- Only requires legitimate data
    - Covers unknown attacks
    - OC-SVM, k-NN



# Our Method

- Attack Detection



# Outline

- Introduction / Background
- Attack Model
- Our Method
- **Evaluation**
- Discussion
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# Evaluation

- Experimental Setup
  - Cars: KIA Soul, Volkswagen Tiguan
  - SDRs: HackRF One, USRP X310
  - SW: GNURadio
  - Loop Antenna, SMA Cable (Relay LF band signal)

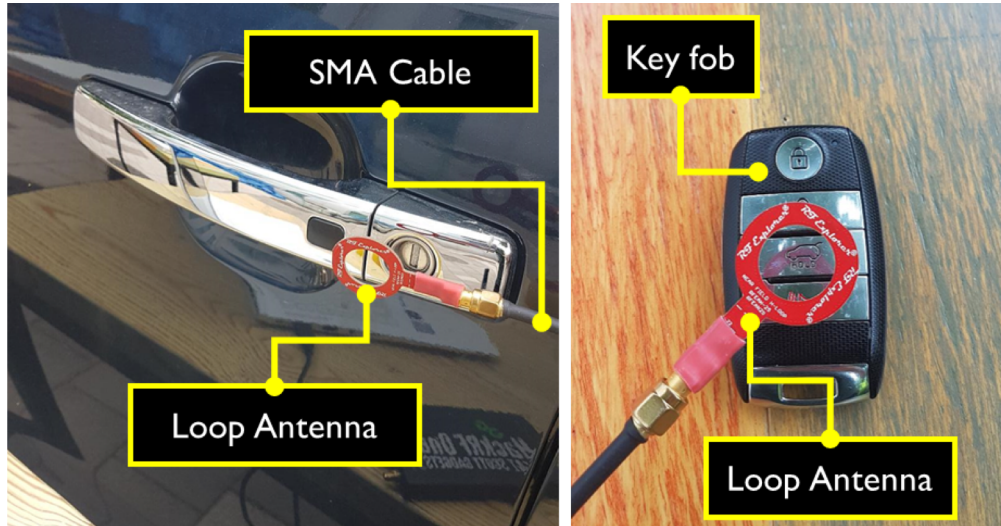
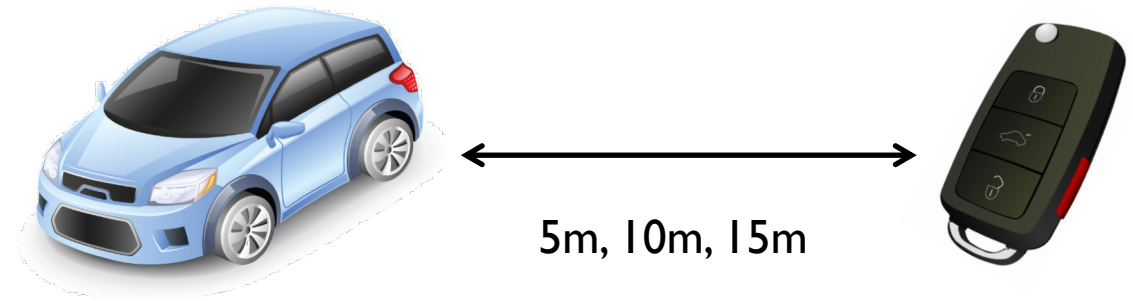


# Evaluation

- Selected Classification Algorithms
  - One-Class SVM (OC-SVM) with Radial Basis Function (RBF) kernel
  - k-NN with Standardized Euclidean Distance
  - MatLab implementation
- Performance Metric
  - Assume False Negative Rate (FNR) as 0%
  - Calculate False Positive Rate (FPR)

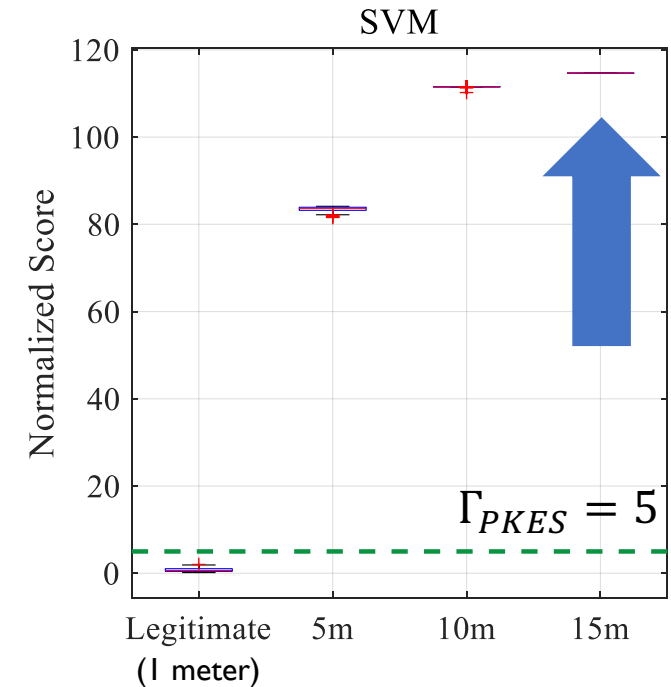
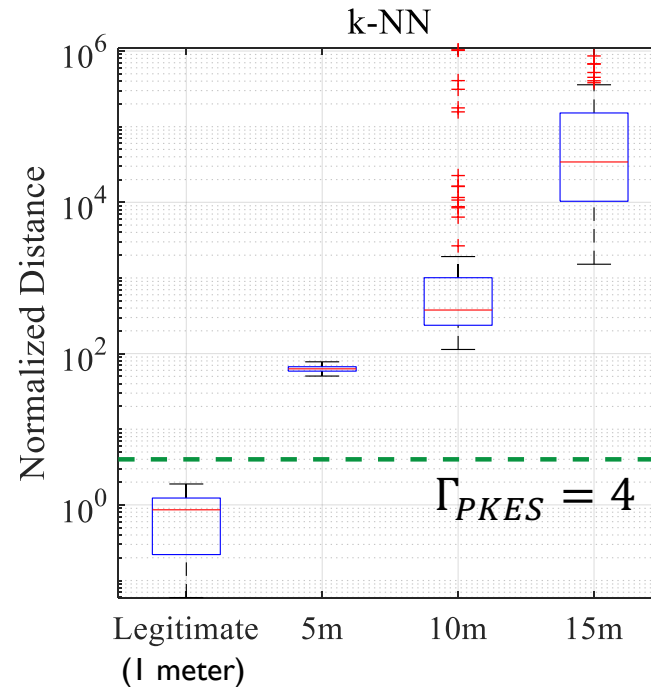
# Evaluation

- Single-Band Relay Attack Detection



## Experimental Setup

(LF band signal relay)

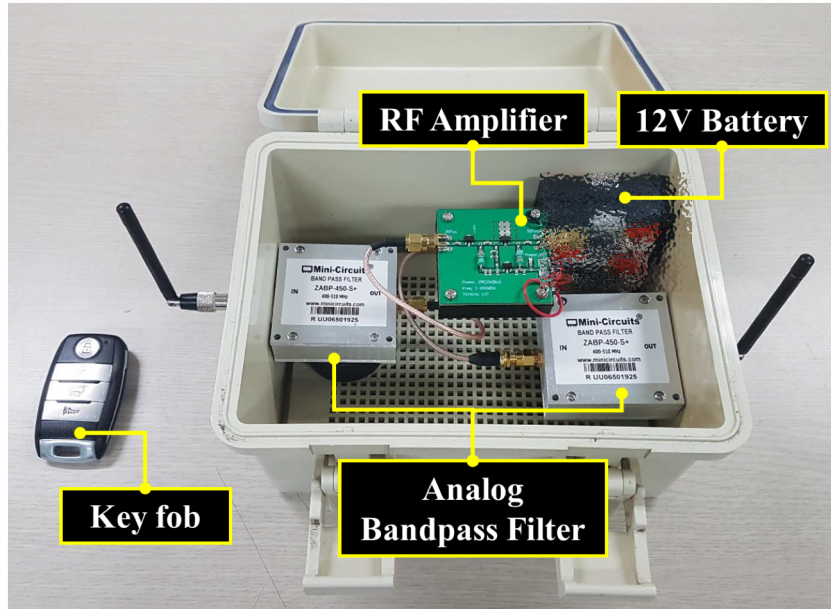
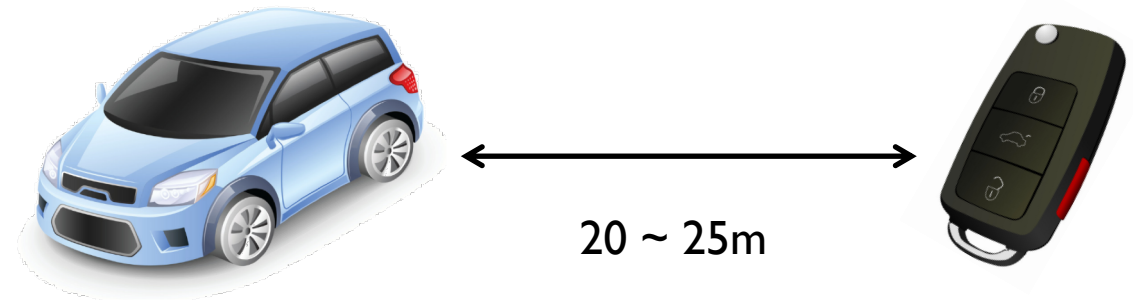


## Results

(0% FPR in both algorithms)

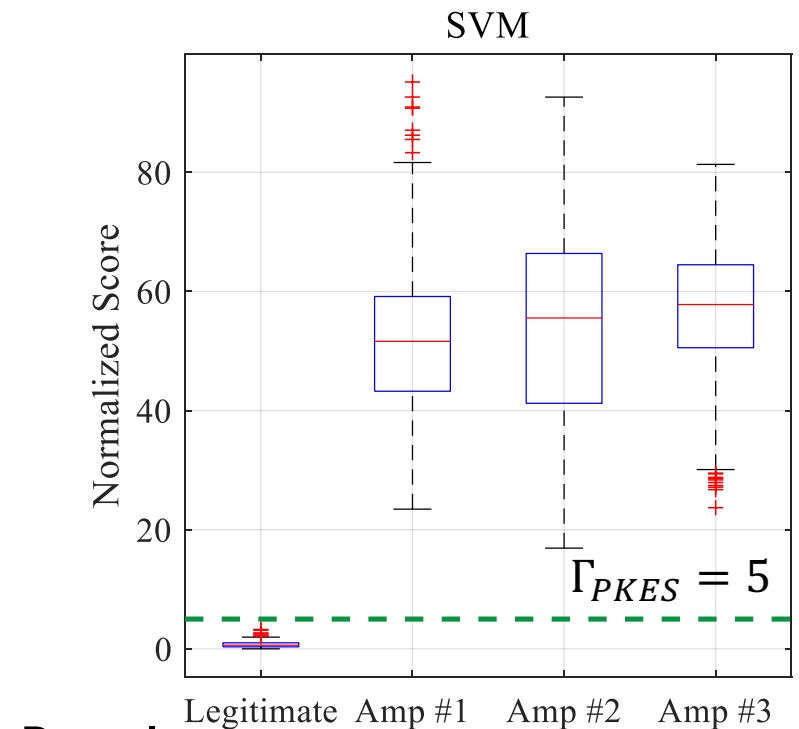
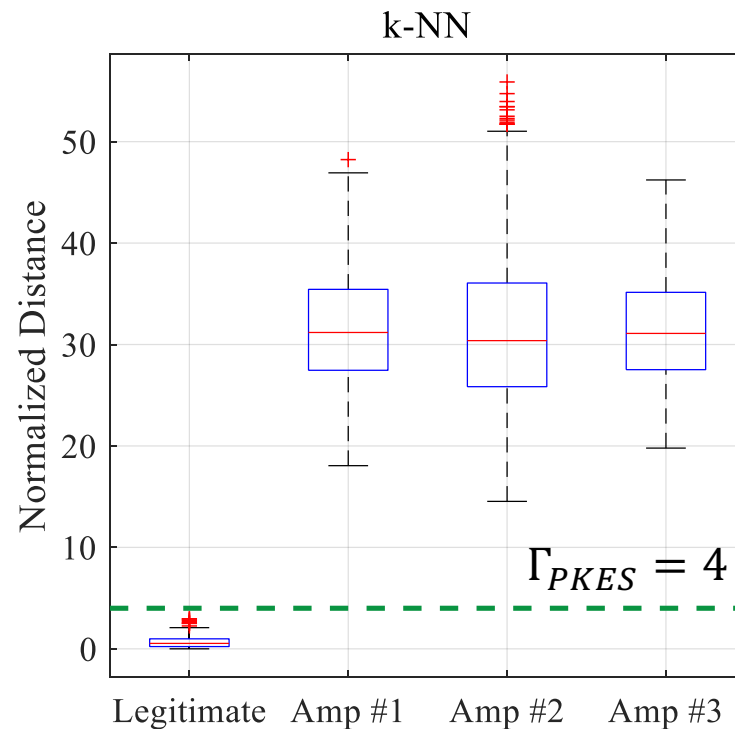
# Evaluation

- Dual-Band Relay Attack Detection
  - Amplification Attack



Experimental Setup

(UHF band amplification)



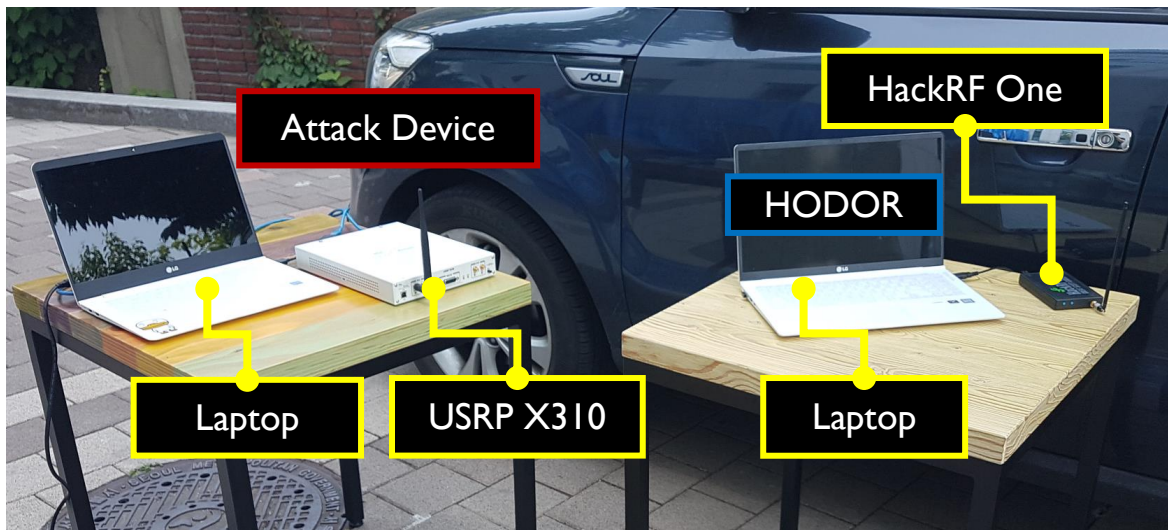
Results

(0% FPR in both algorithms)

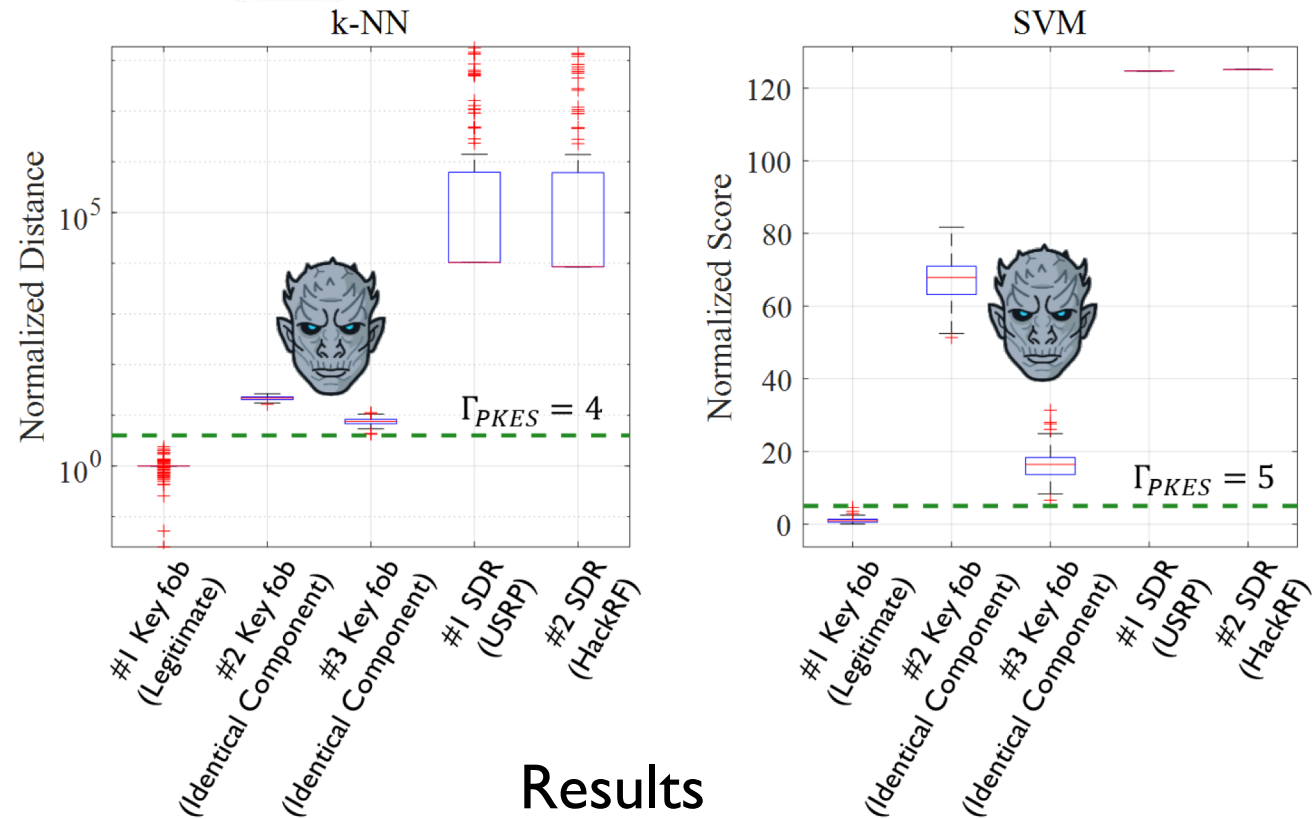


# Evaluation

- Dual-Band Relay Attack Detection
  - Digital Relay/ Cryptographic Attack



Experimental Setup  
(Cryptographic Attack)

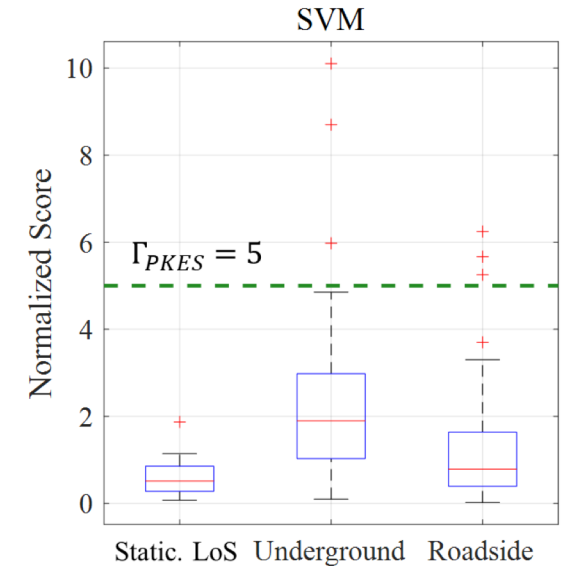
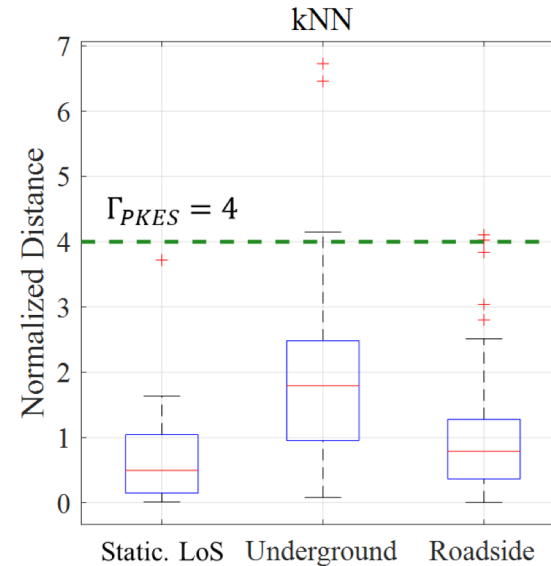
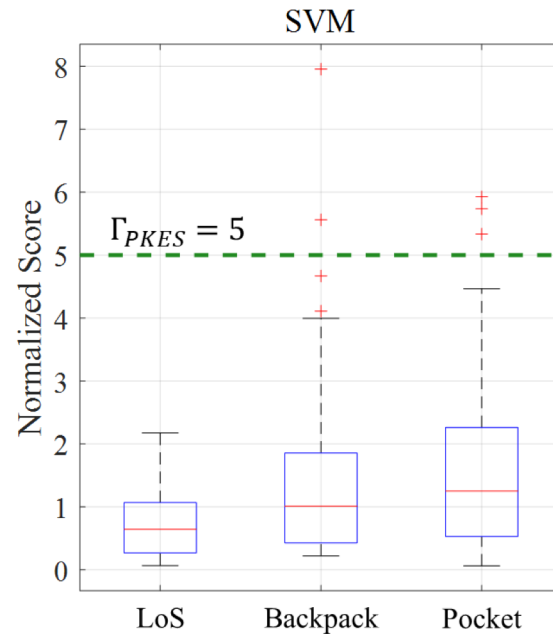
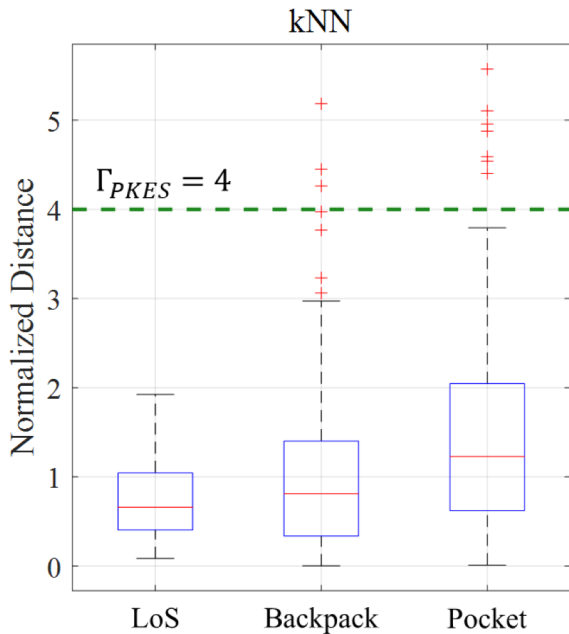


# Evaluation

- Environmental Factors



- Non-Line of Sight (NLoS) conditions, Dynamic Channel Conditions



Backpack: FPR k-NN: 1.32%, SVM:1.35%

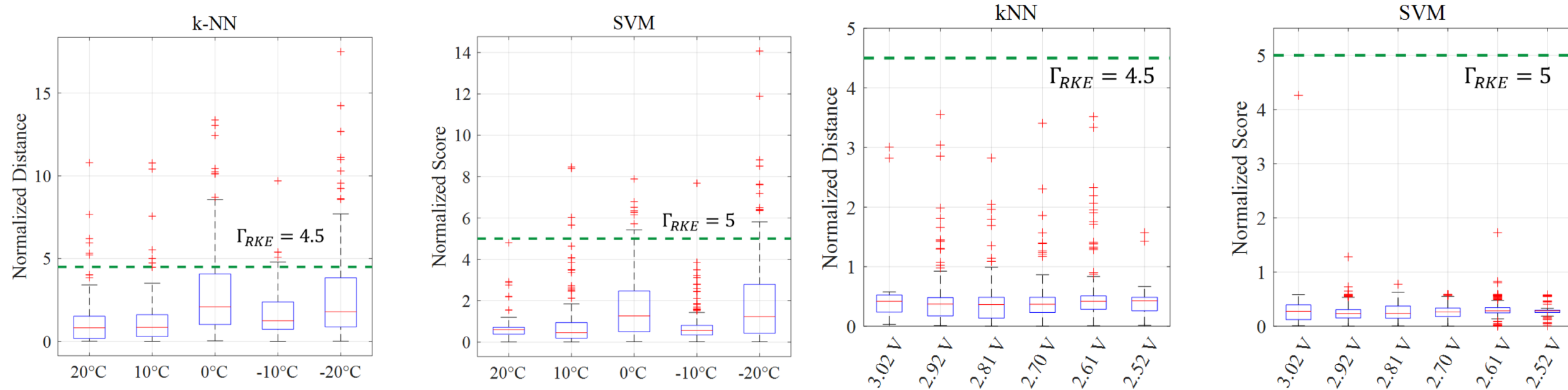
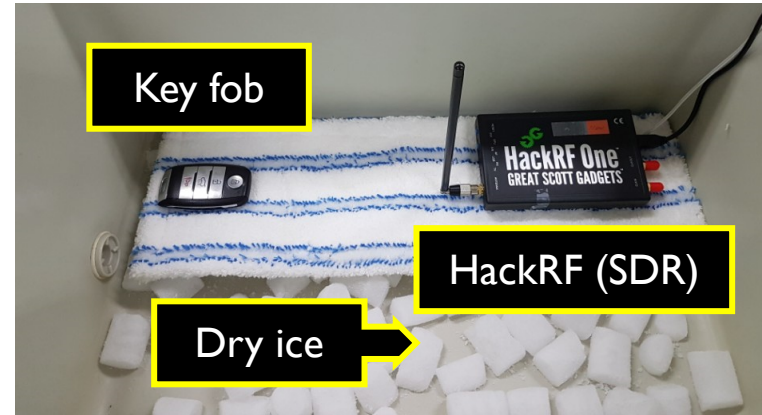
Pocket: FPR k-NN: 1.71%, SVM:1.67%

Underground: FPR k-NN: 5%, SVM:4%

Roadside: FPR k-NN: 2%, SVM:3%

# Appendix

- Environmental Factors
  - Signals from RKE system

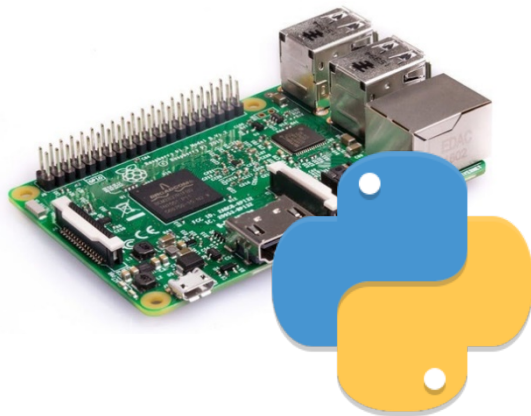


Average FPR k-NN: 6.36%, SVM:0.65%

Average FPR k-NN: 0%, SVM:0%

# Evaluation

- Execution time
  - Implementation on Raspberry Pi
    - 1.4Ghz Core, 1G RAM
  - Python Code



Phase		Algorithm	
		k-NN	SVM
Extraction (FSK / ASK)	$f_{peak}$	4ms / 3.85ms	
	$f_c^{offset}$	4ms / 3.55ms	
	$SNR_{dB}$	130ms / 94ms	
	<i>Kurtosis</i>	20ms / 16.2ms	
	<i>Spec.Brightness</i>	5ms / 3.73ms	
Attack Detection (FSK / ASK)	$C_{PKES}$	4.8ms / 4.94ms	.038ms / .04ms
	$C_{RKE}$	3.8ms / 4ms	.04ms / .07ms

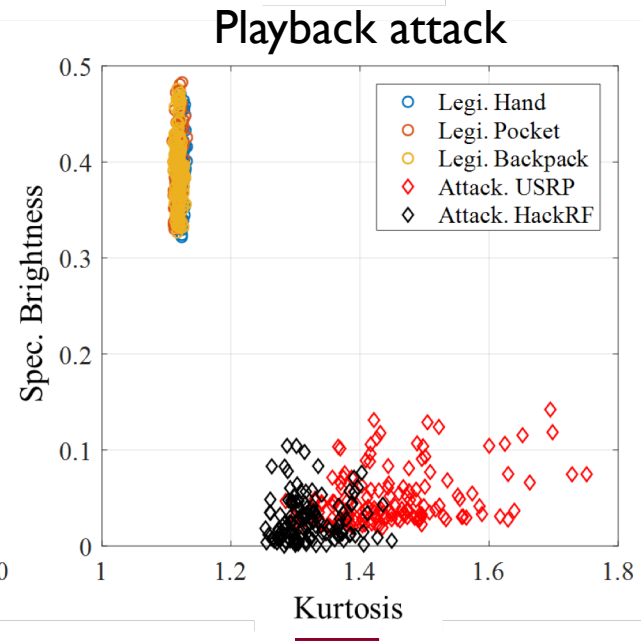
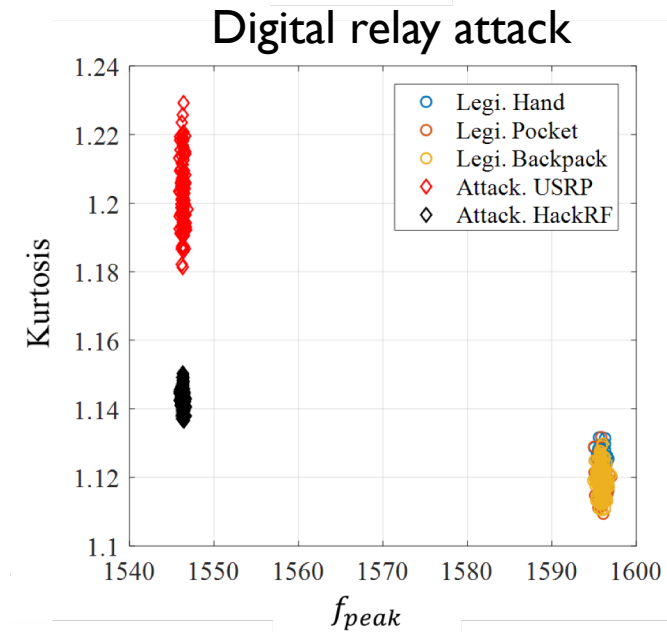
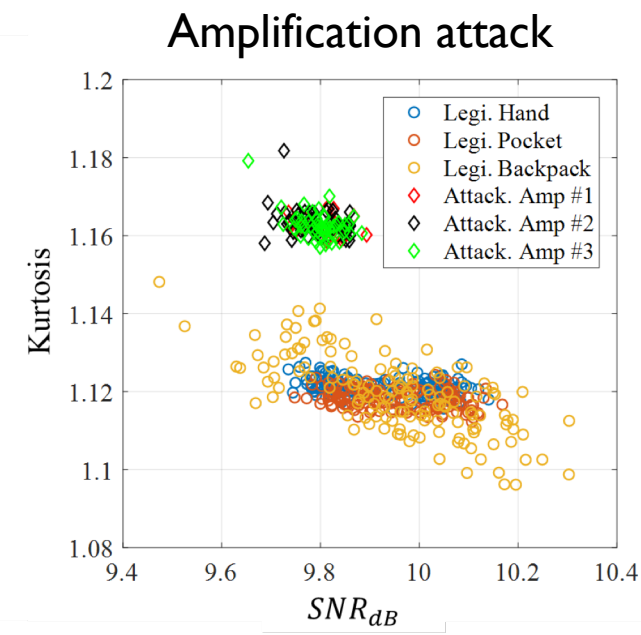
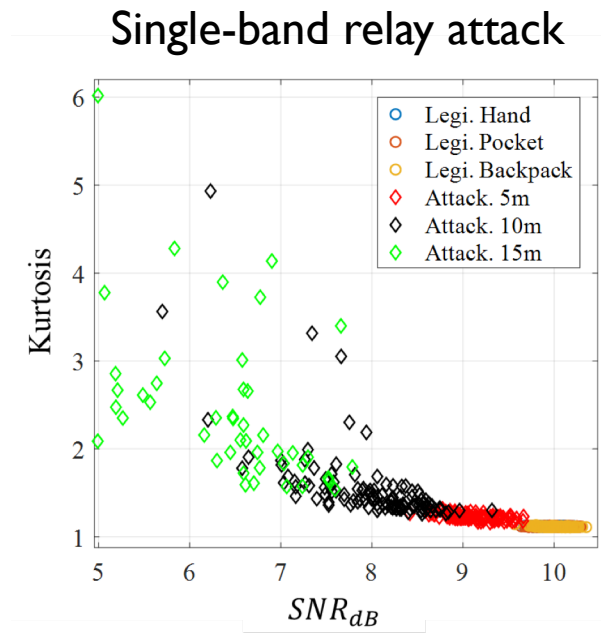
Total Execution Time  
 K-NN: 163.8ms and SVM: 159.038ms



# Evaluation

- Feature Importance
  - Utilizing Relief algorithm

Attack Scenario	Single-band Relay Attack	Amplification Attack	Digital Relay Attack	Playback Attack
Rank	1	2	3	4
	SNR	Kurtosis	$f_{peak}$	Spec. Brightness
	Kurtosis	SNR	Kurtosis	Kurtosis
	Spec. Brightness	Spec. Brightness	Spec. Brightness	$f_{peak}$
	$f_{peak}$	$f_{peak}$	SNR	SNR



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# Discussions

- HODOR and Security
  - Threshold is a trade-off parameter in HODOR
  - Small threshold leads to the false alarm; a large threshold leads to the false-negative (attack success)
- Feature Impersonation
  - Attacker must impersonate the whole feature at the same time
  - Impersonating a specific feature leads to a distortion in other features
- Practicality
  - Shortened execution time

# Conclusion

- Proposed a sub-authentication system
  - Supports current systems to prevent keyless entry system car theft
- Effectively detect simulated attacks that are defined in our attack model
  - Reducing the number of erroneous detection occurrences (i.e., false alarms)
- Found a set of suitable features in a number of environmental conditions
  - Temperature variation, battery aging, and NLoS conditions



**HODOR!**  
(Thank you!)

**Q&A**

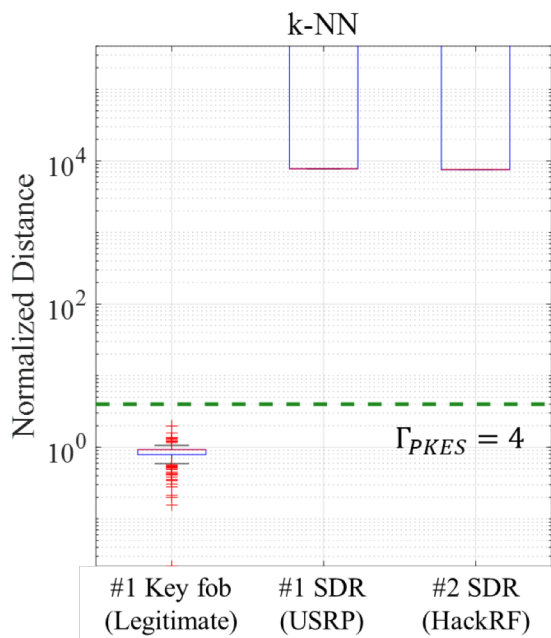


This work was supported by Samsung Electronics

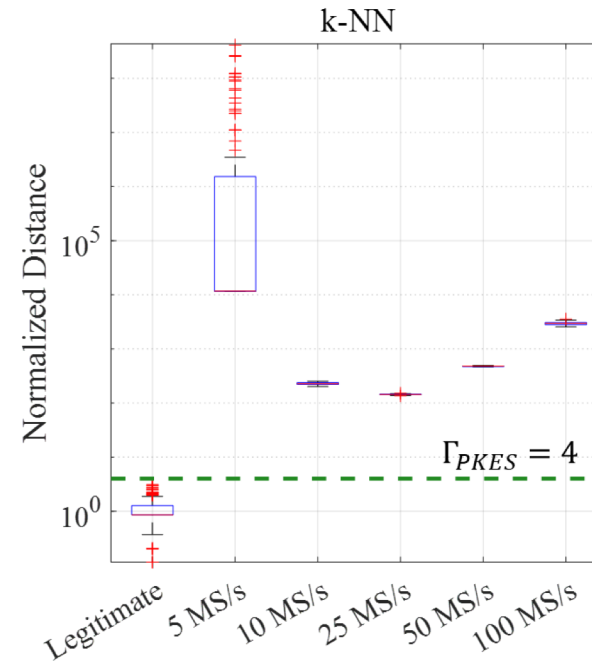
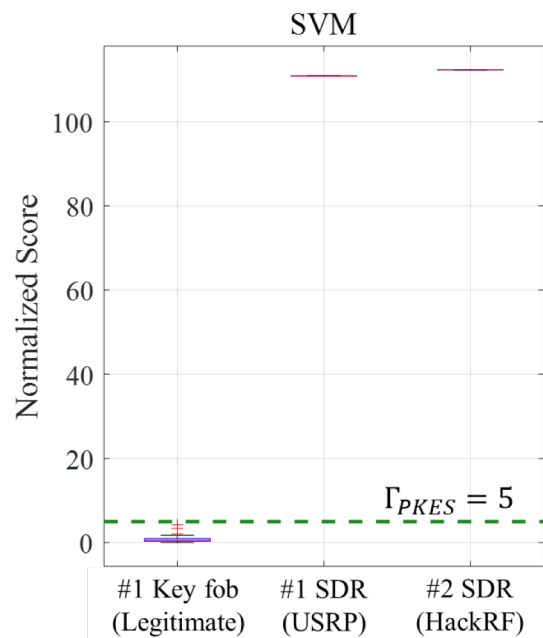
# Appendix



- Playback Attack Detection



Experimental Results  
(SDR with 5MS/s)



Experimental Results  
(USRP with various sample rate)

