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DolphinAttack: Inaudible Voice Commands

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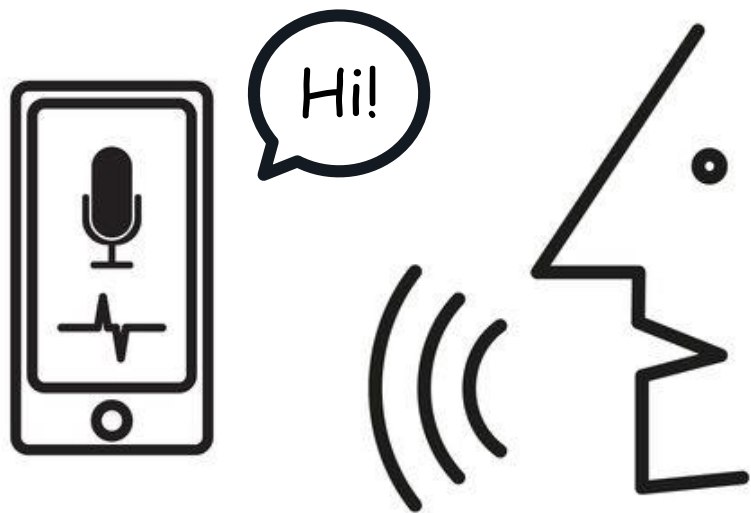


智能系统安全实验室
UBIQUITOUS SYSTEM SECURITY LAB.

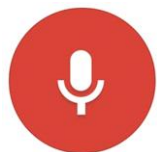
Outline

1. Background of Voice Assistants
2. Design of DolphinAttack
3. Attack Scenarios
4. Evaluation
5. Defense & Responsible Disclosure

Voice becomes an increasingly important interface



Siri



Google Now



Alexa



Cortana

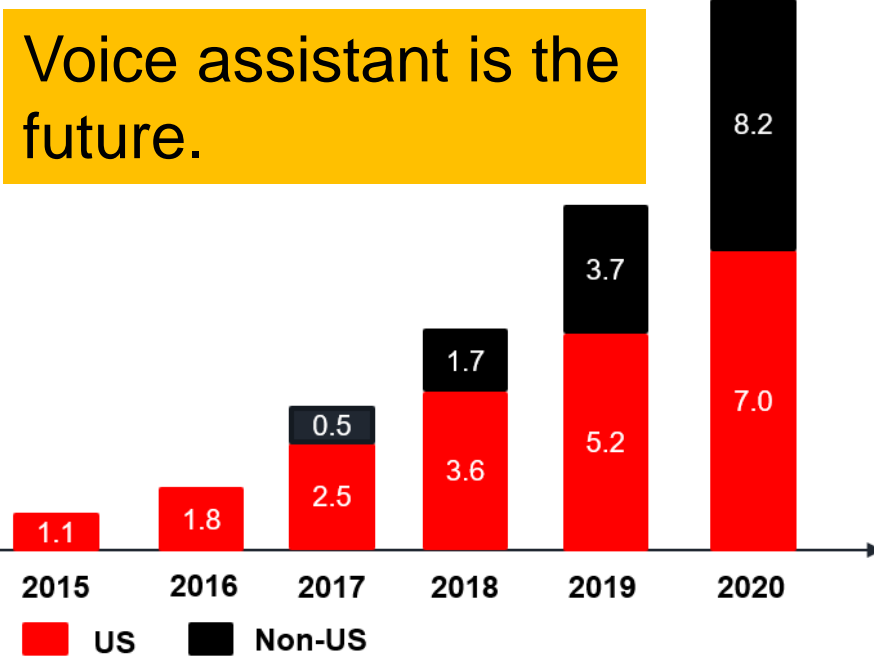


S Voice



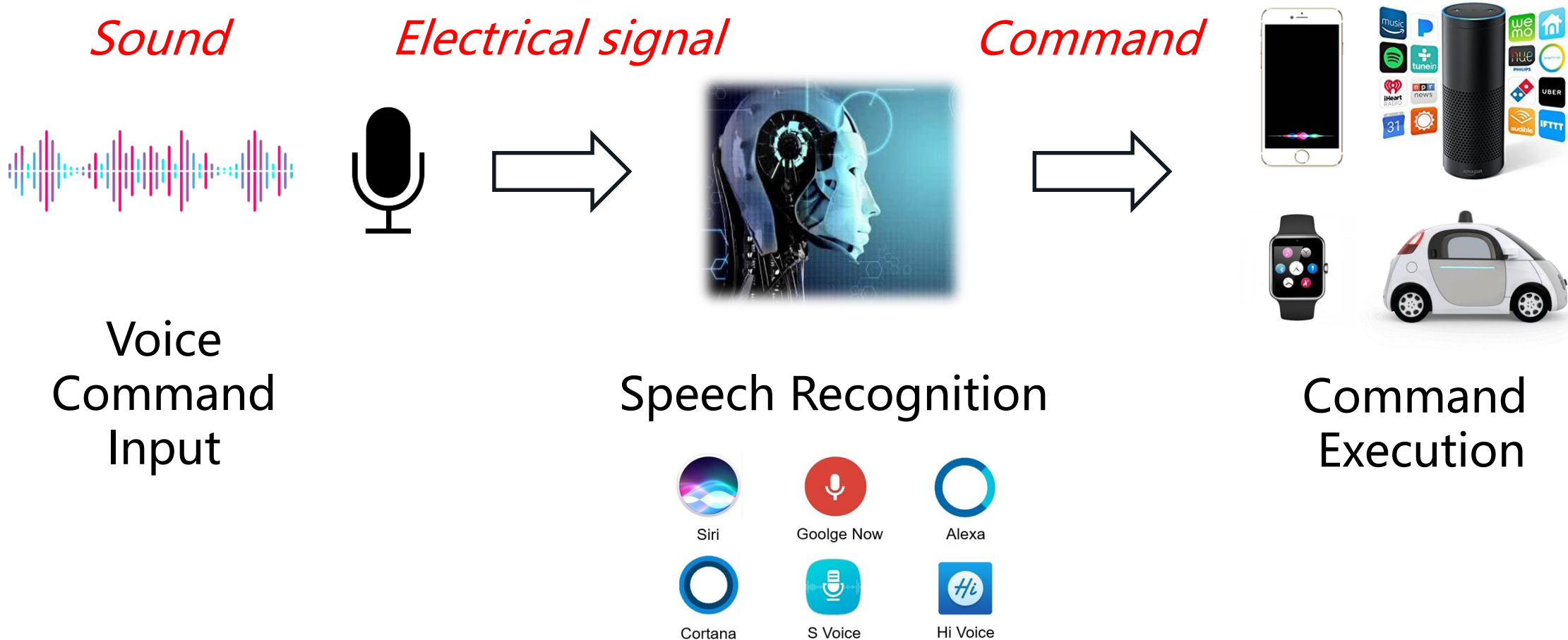
Hi Voice

Digital Voice-activated Assistant Device Shipments Worldwide, US vs. Non-us, 2015-2020
millions



Source: Strategy Analytics as cited in press release, Aug,26,2016

How do voice assistants work?



What can a malicious user achieve?

What's on my calendar today?
Sensitive information

Open *evil.com*
Malicious website

Tell my wife I love her
Fake message

Send an email to my boss
Social engineering

Open the front door
Break-in

Buy something on Amazon
Lose money

Transfer \$100 to *Eve*
Steal money

Call 1234567890
Eavesdrop

Facetime *Eve*
Spy

Drive me to *Austin*
Mislead

Attack Scenario 1: fake online orders



Attacker

Alexa, buy something expensive but useless.

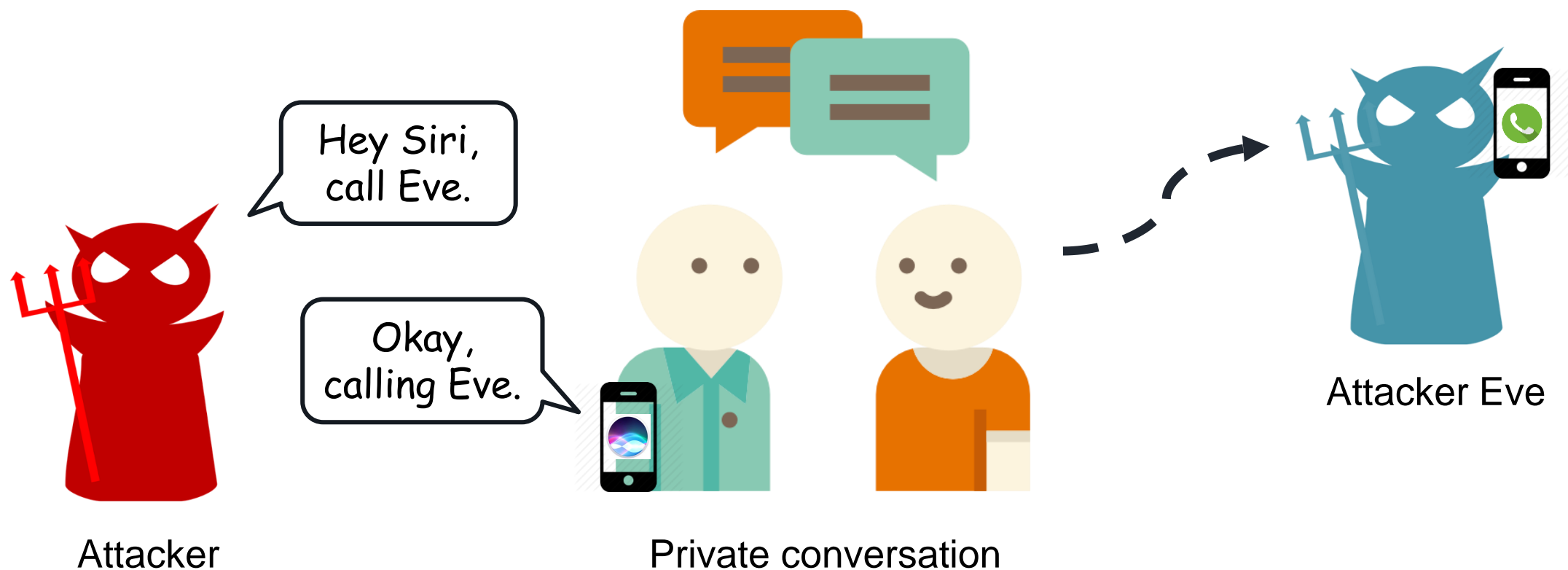
Okay, order placed.



Amazon Echo



Attack Scenario 2: spying phone/video calls



Related Work

Vaidya et al., **Cocaine Noodles** (WOOT 2015)

Carlini et al., **Hidden Voice Commands** (Usenix Security 2016)

The attacking commands are still **audible**.





DolphinAttack

ATTACKED DEVICE : AMAZON ECHO

Attack Scenario

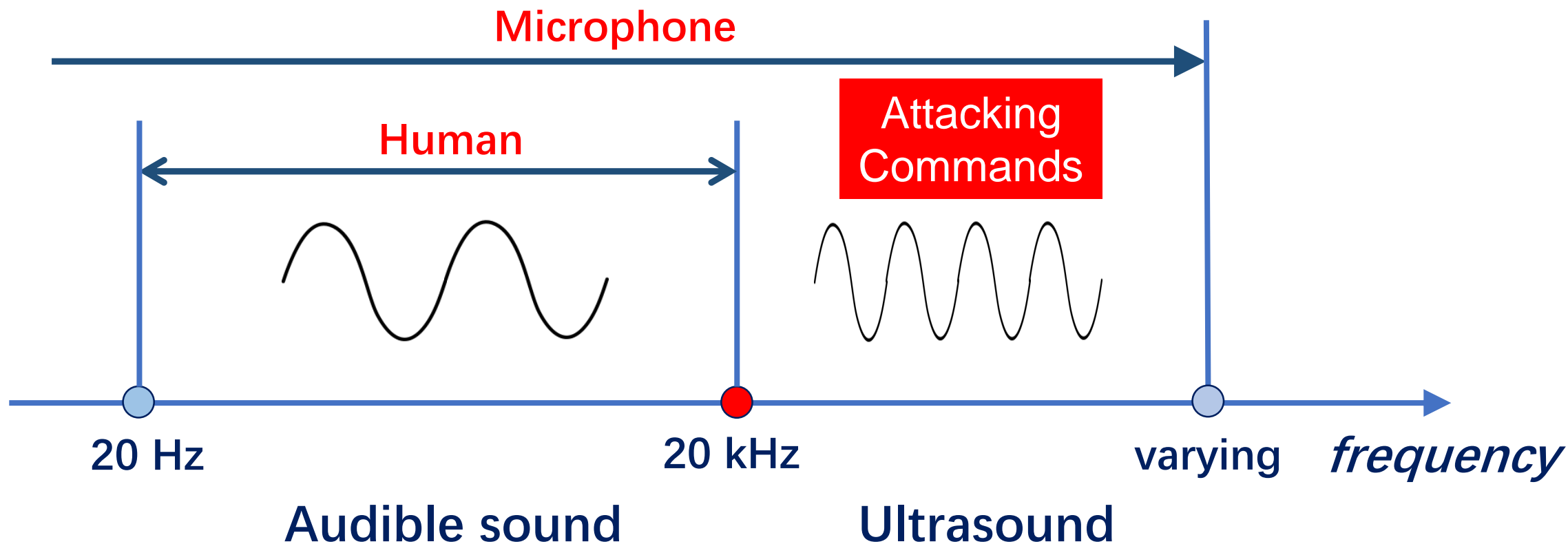
- Order stuff
- Make a call
- Read to-do list
- Open the door

Video can be found at usslab.org



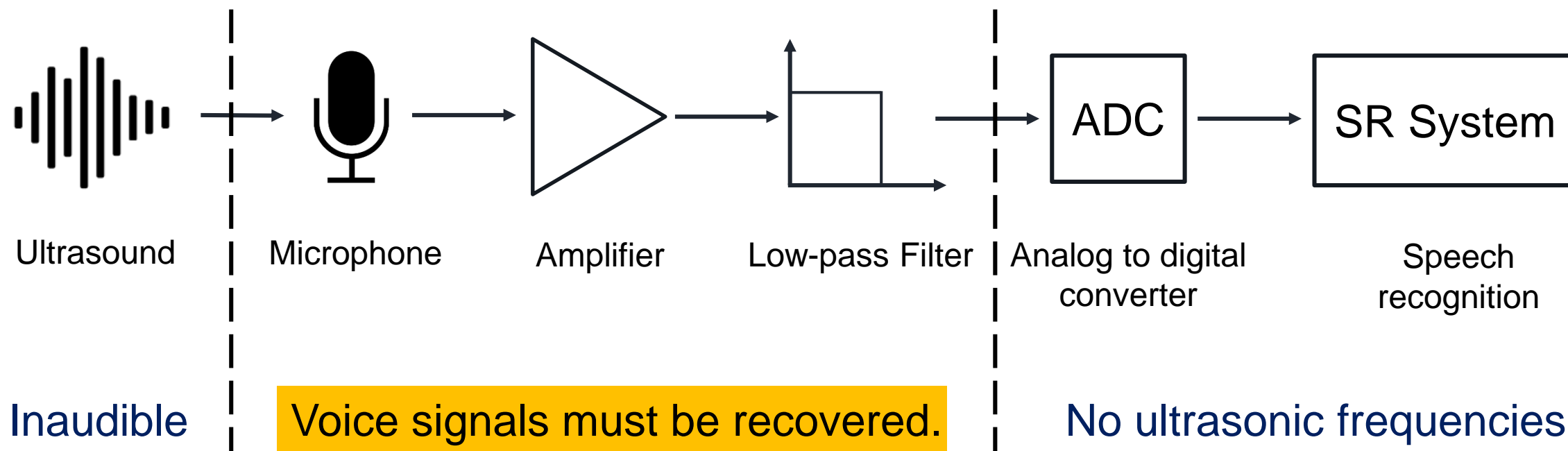
Hearing Range of Human and Microphone

Speech recognition systems only accept signals of **audible sound**.

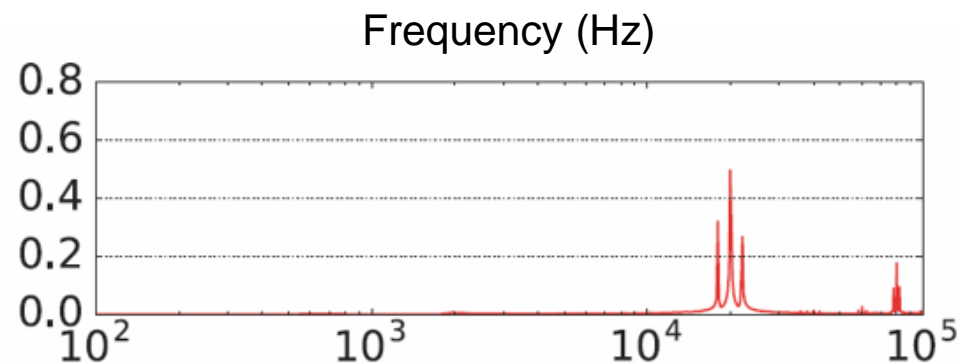
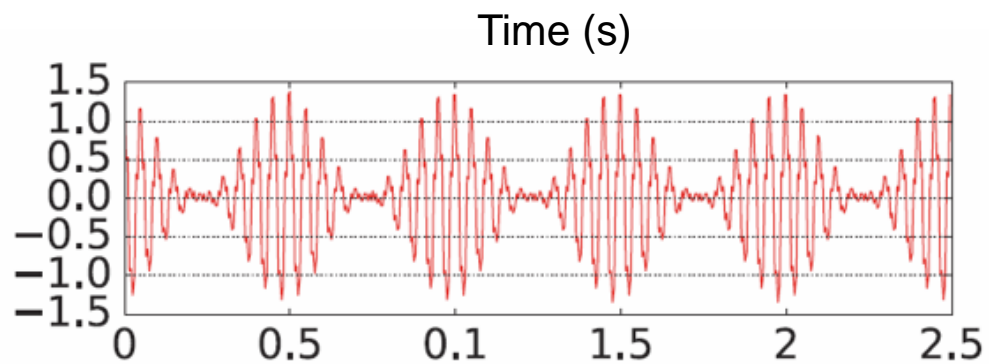


How can voice assistants accept ultrasound?

- The low-pass filter will **remove ultrasonic frequencies** to avoid aliasing.

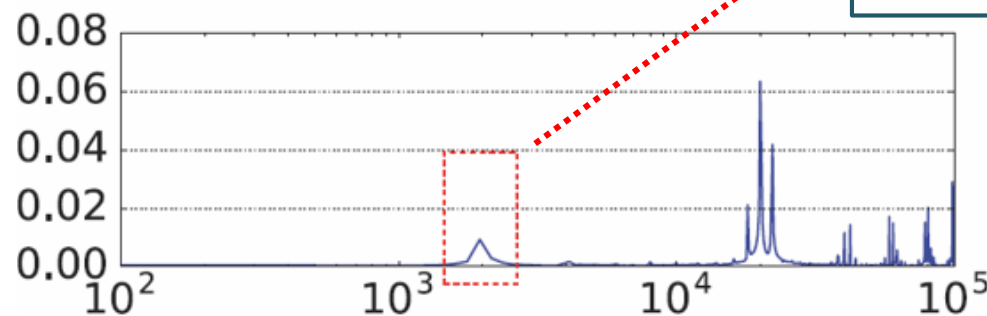
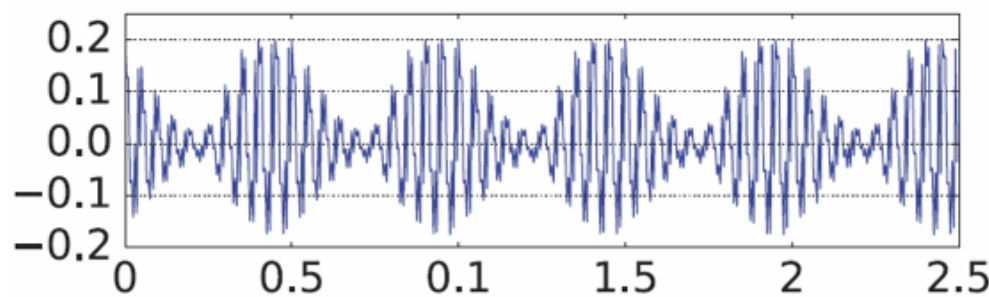


Nonlinearity Effect Validation



$f_c = 22 \text{ kHz}, f_m = 2 \text{ kHz}$

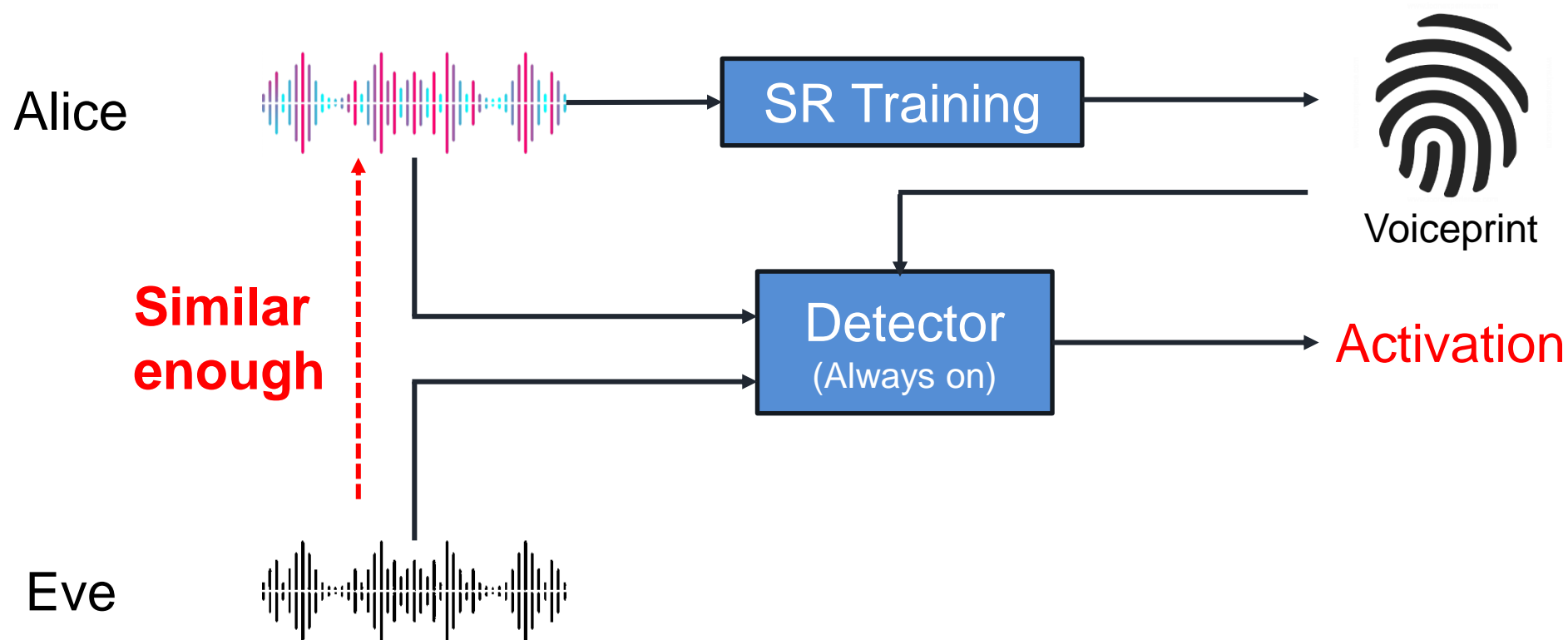
Signals of DolphinAttack



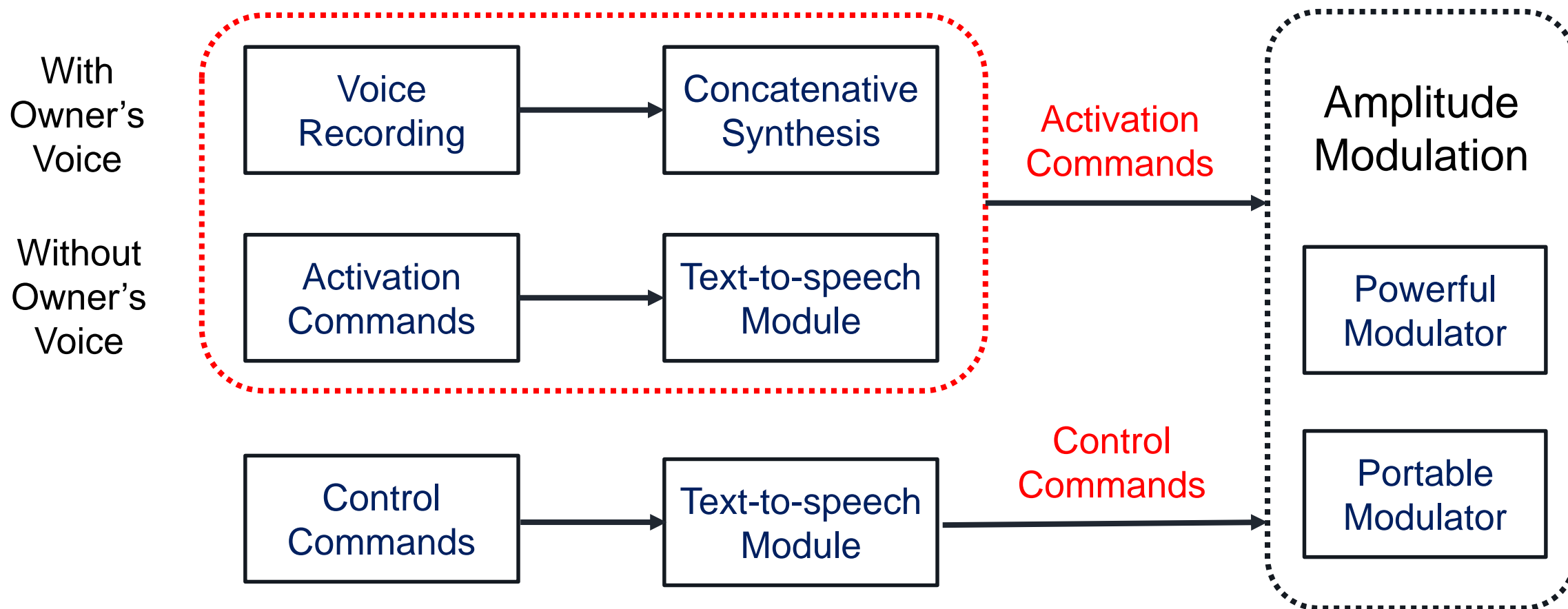
Nonlinearity
Effect

Signals received by a MEMS microphone

Speaker Dependent SR – Activation

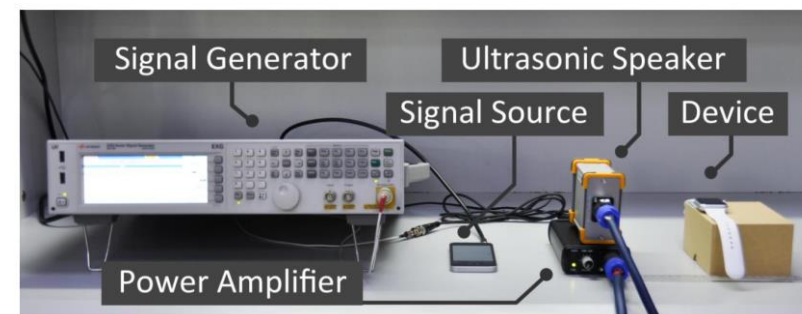
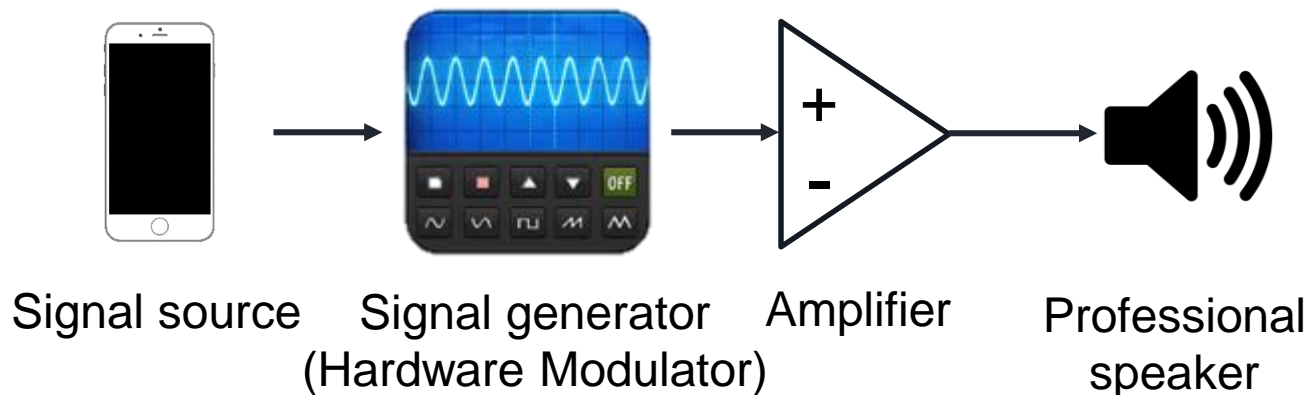


Design of DolphinAttack

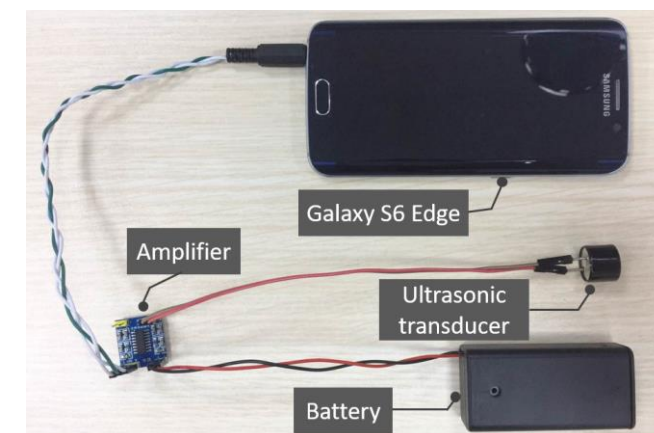
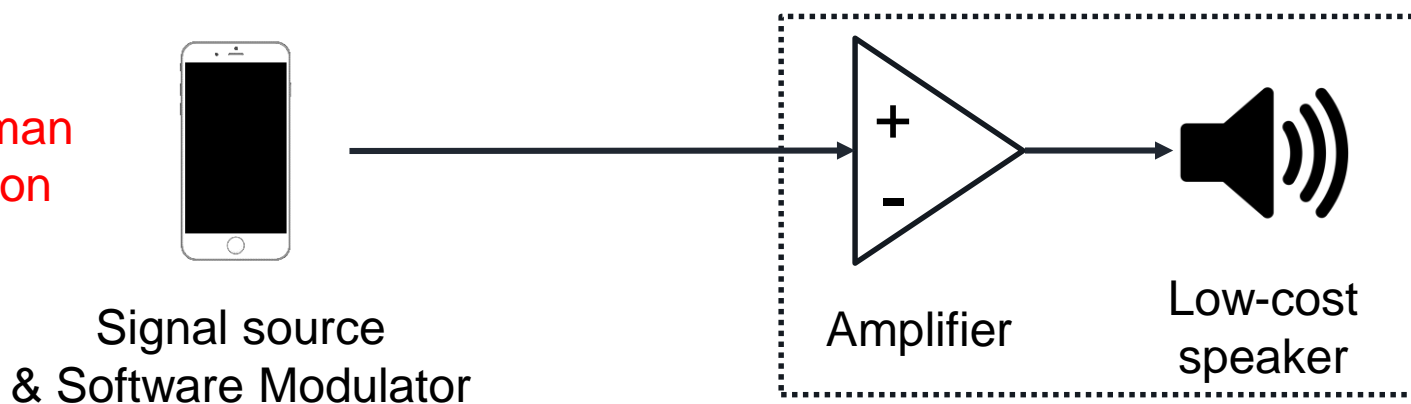


Inaudible Voice Commands Transmitter

Rich man solution

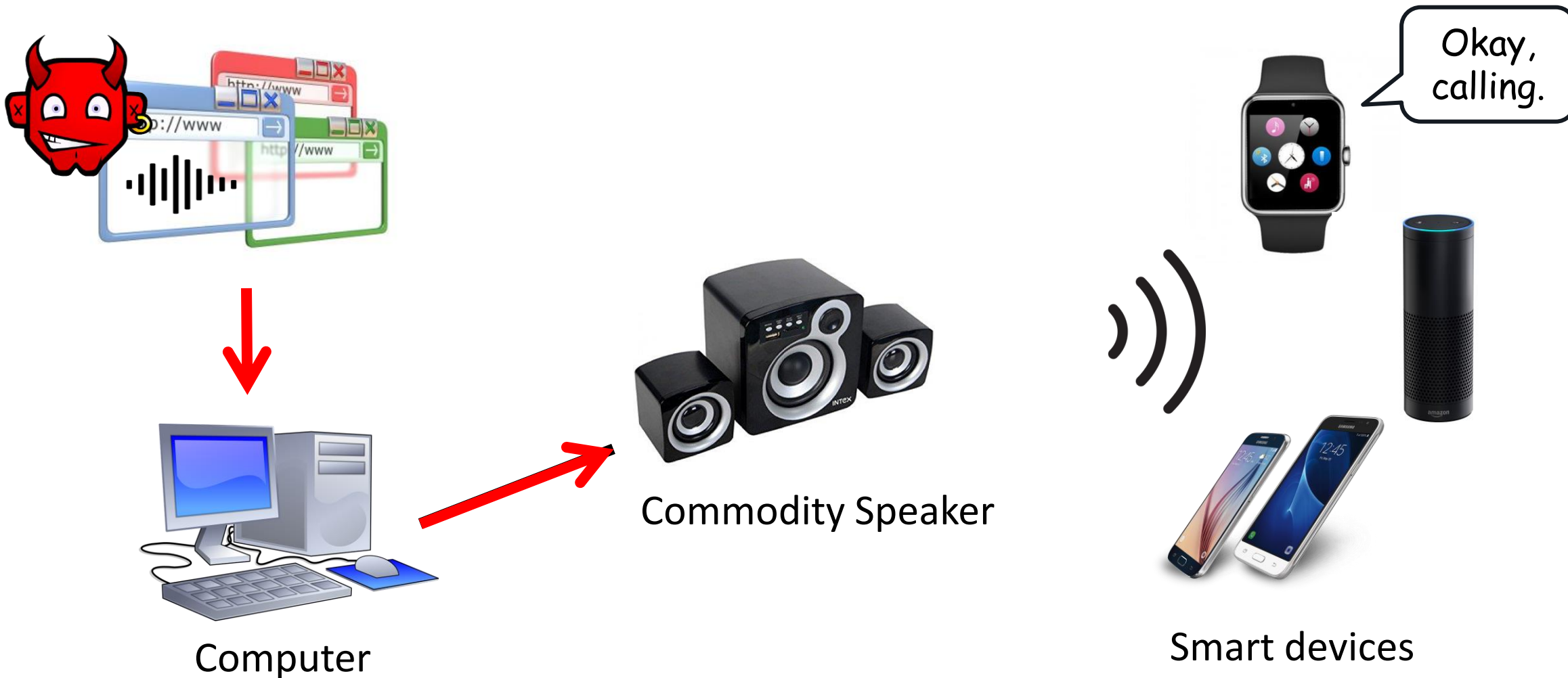


Poor man solution



Less than \$3

Attack Scenario: Remote Attack



| Manuf. | Model | OS/Ver. | SR System | Attacks | | Modulation Parameters | | Max Dist. (cm) | |
|---------|-----------------|---------------|------------|---------|--------|--------------------------------|-------|----------------|--------|
| | | | | Recog. | Activ. | f_c (kHz) & [Prime f_c] ‡ | Depth | Recog. | Activ. |
| Apple | iPhone 4s | iOS 9.3.5 | Siri | √ | √ | 20-42 [27.9] | ≥ 9% | 175 | 110 |
| Apple | iPhone 5s | iOS 10.0.2 | Siri | √ | √ | 24.1 26.2 27 29.3 [24.1] | 100% | 7.5 | 10 |
| Apple | iPhone SE | iOS 10.3.1 | Siri | √ | √ | 22-28 33 [22.6] | ≥ 47% | 30 | 25 |
| | | | Chrome | √ | N/A | 22-26 28 [22.6] | ≥ 37% | 16 | N/A |
| Apple | iPhone SE † | iOS 10.3.2 | Siri | √ | √ | 21-29 31 33 [22.4] | ≥ 43% | 21 | 24 |
| Apple | iPhone 6s * | iOS 10.2.1 | Siri | √ | √ | 26 [26] | 100% | 4 | 12 |
| Apple | iPhone 6 Plus * | iOS 10.3.1 | Siri | × | √ | — [24] | — | — | 2 |
| Apple | iPhone 7 Plus * | iOS 10.3.1 | Siri | √ | √ | 21 24-29 [25.3] | ≥ 50% | 18 | 12 |
| Apple | watch | watchOS 3.1 | Siri | √ | √ | 20-37 [22.3] | ≥ 5% | 111 | 164 |
| Apple | iPad mini 4 | iOS 10.2.1 | Siri | √ | √ | 22-40 [28.8] | ≥ 25% | 91.6 | 50.5 |
| Apple | MacBook | macOS Sierra | Siri | √ | N/A | 20-22 24-25 27-37 39 [22.8] | ≥ 76% | 31 | N/A |
| LG | Nexus 5X | Android 7.1.1 | Google Now | √ | √ | 30.7 [30.7] | 100% | 6 | 11 |
| Asus | Nexus 7 | Android 6.0.1 | Google Now | √ | √ | 24-39 [24.1] | ≥ 5% | 88 | 87 |
| Samsung | Galaxy S6 edge | Android 6.0.1 | S Voice | √ | √ | 20-38 [28.4] | ≥ 17% | 36.1 | 56.2 |
| Huawei | Honor 7 | Android 6.0 | HiVoice | √ | √ | 29-37 [29.5] | ≥ 17% | 13 | 14 |
| Lenovo | ThinkPad T440p | Windows 10 | Cortana | √ | √ | 23.4-29 [23.6] | ≥ 35% | 58 | 8 |
| Amazon | Echo * | 5589 | Alexa | √ | √ | 20-21 23-31 33-34 [24] | ≥ 20% | 165 | 165 |
| Audi | Q3 | N/A | N/A | √ | N/A | 21-23 [22] | 100% | 10 | N/A |

‡ Prime f_c is the carrier wave frequency that exhibits highest baseband amplitude after demodulation.

— No result

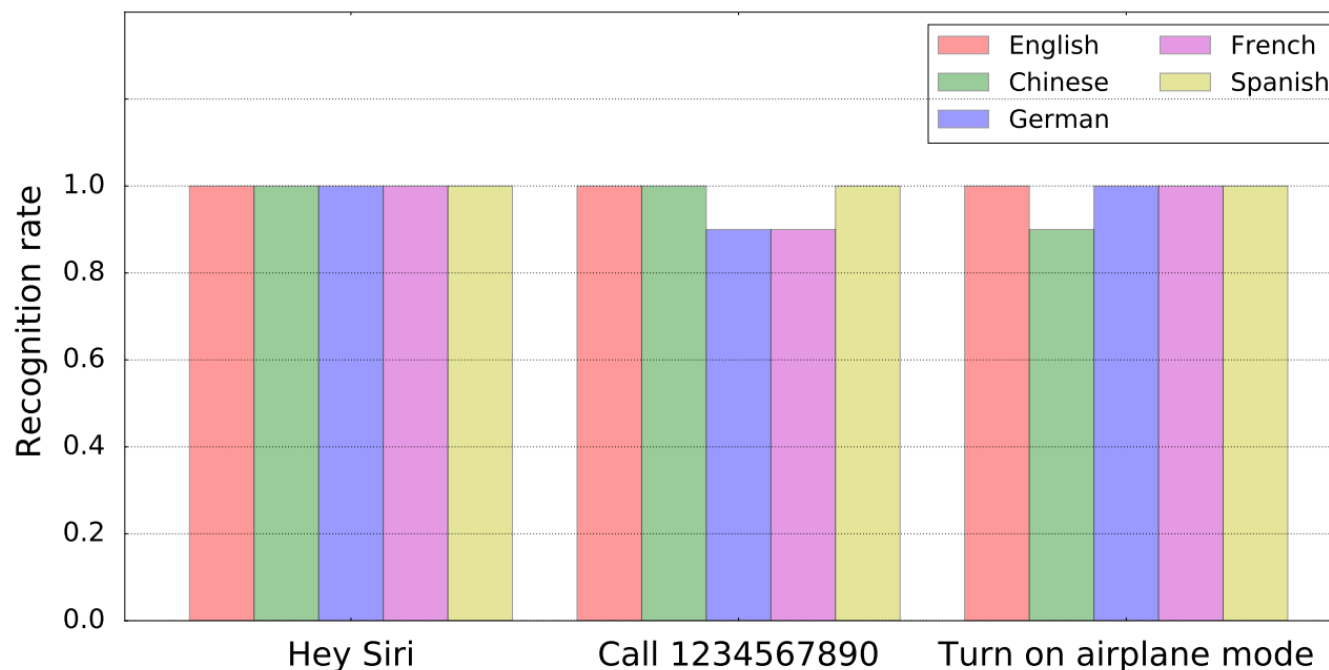
† Another iPhone SE with identical technical spec.

* Experimented with the front/top microphones on devices.

Evaluation: Impact of Languages

DolphinAttack is effective for various languages and voice commands.

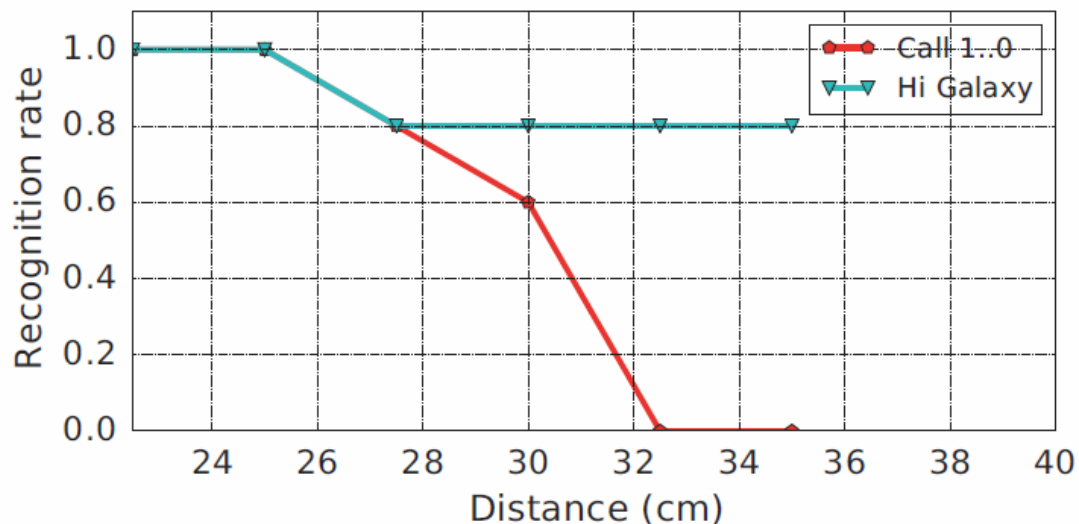
- English
- Chinese
- French
- German
- Spanish



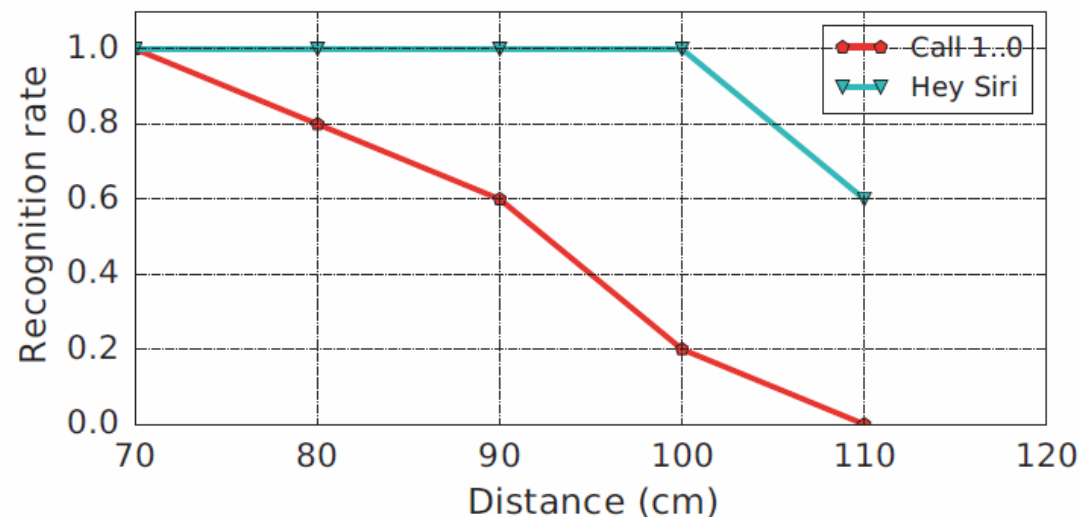
The recognition rates of voice commands in five languages

Evaluation: Impact of Attack Distance

The attack distance has fundamental impact on the effectiveness of DolphinAttack and is device dependent.



(a) The recognition rates of the Galaxy S6 Edge

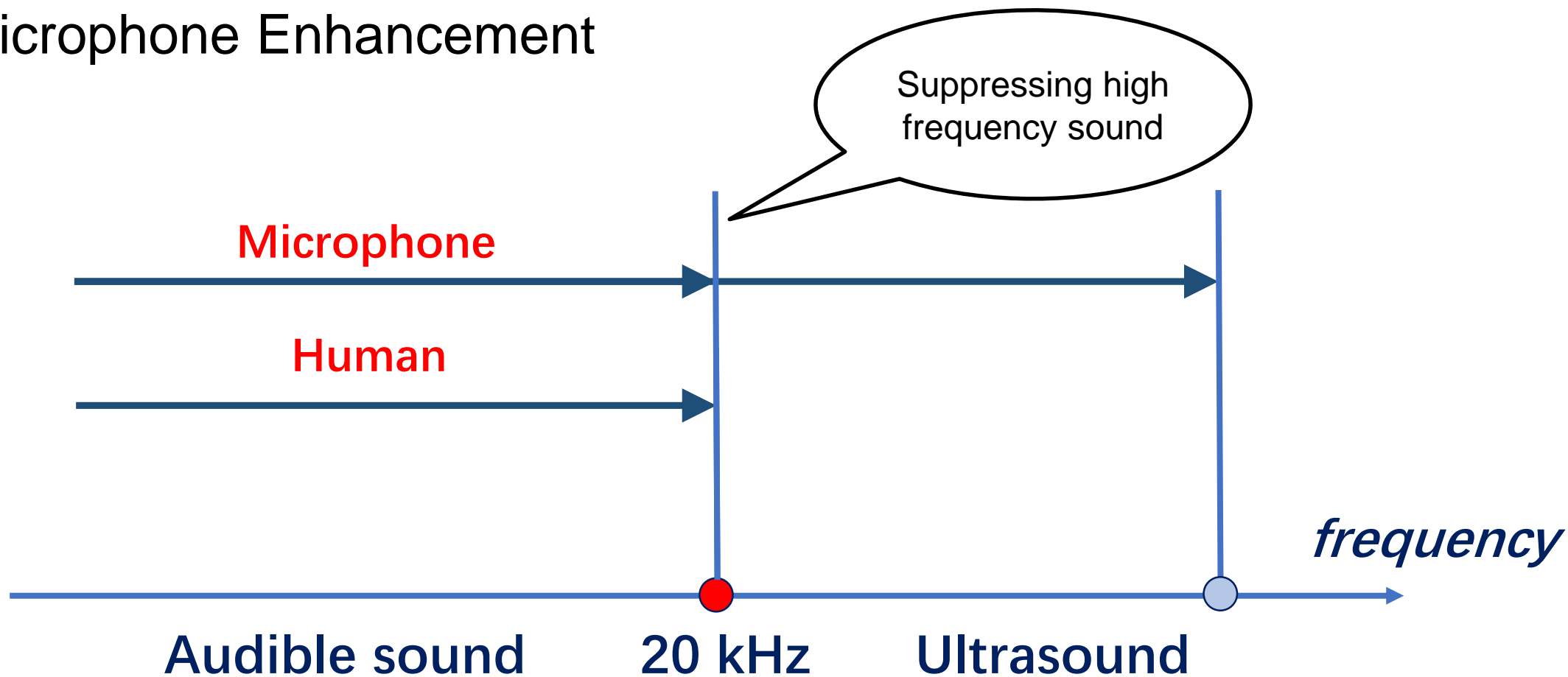


(b) The recognition rates of the Apple watch

The impact of attack distances on the recognition rates for **S6 Edge** and **Apple watch**.

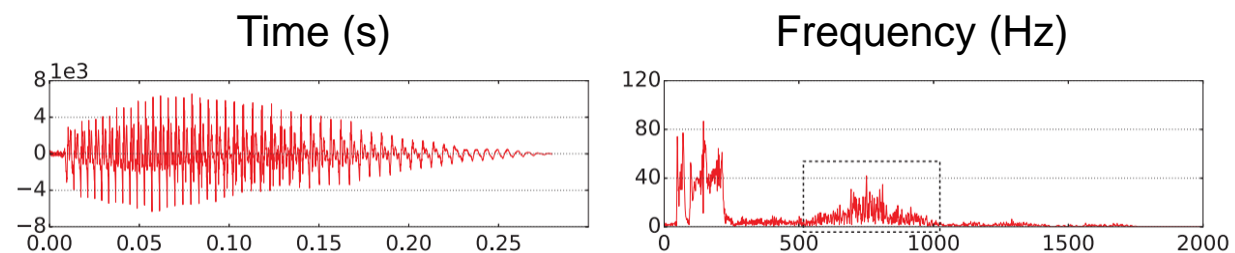
Hardware-Based Defense

- Microphone Enhancement

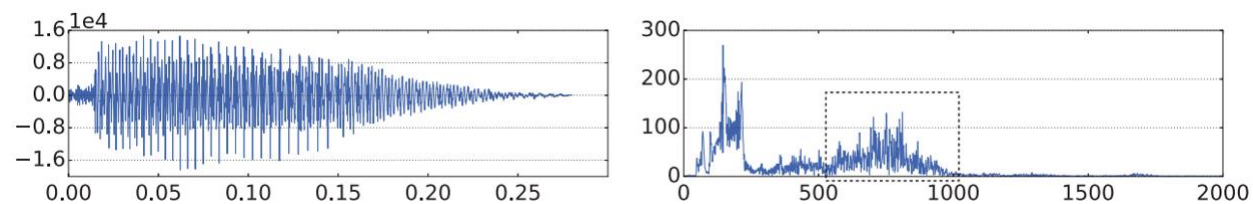


Software-Based Defense

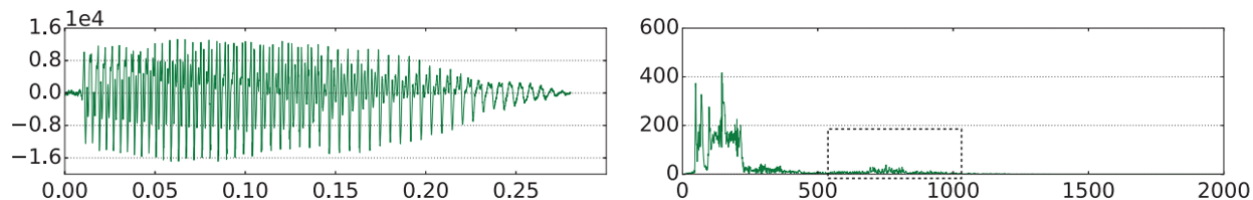
- Modulated voice commands are distinctive from genuine ones.
- Supported vector machine (SVM) as the classifier to detect the malicious command from the normal command.
- Result: **100%** true positive rate (7/7) and **100%** true negative rate (7/7).



Original sound



Recorded from audible sound



Recovered from inaudible sound

Summary

- Voice assistant has become an increasingly popular human-computer interaction mechanism, but **they are vulnerable to attacks**.
- DolphinAttack is a totally **inaudible attack from a new perspective**, could attack Siri, Alexa, Google Now, Cortana, Samsung S Voice, Huawei Hi Voice.
- To avoid the abuse of DolphinAttack in reality, we propose two **defense** solutions from the aspects of both hardware and software.

Questions

DolphinAttack Homepage: <http://dolphinattack.com/>

USS Lab Homepage: <http://usslab.org/>