

# CSE227 – Graduate Computer Security

*Side Channels*

UC San Diego

# Housekeeping

*General course things to know*

- Course projects
  - I will provide some initial thoughts and feedback on each of your project ideas by **this Friday** via email
  - Start meeting with your teams, ideating, and reaching out to me if you have things you want to chat about

# Today's lecture

## Learning Objectives

- Discuss the "Cold boot" attack on DRAM
- Learn about IoT devices, voice interfaces, and how those interfaces fall apart in practice
- Discuss "Skill Squatting Attacks" paper
- Discuss "Light Commands" paper

# Lest We Remember: Cold-Boot Attacks on Encryption Keys

# What is DRAM?

# What is DRAM?

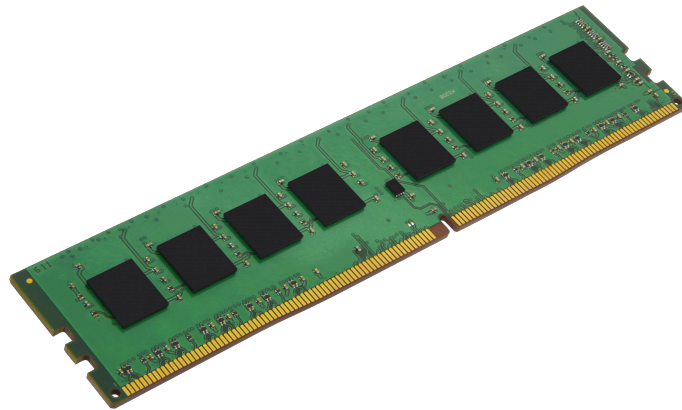
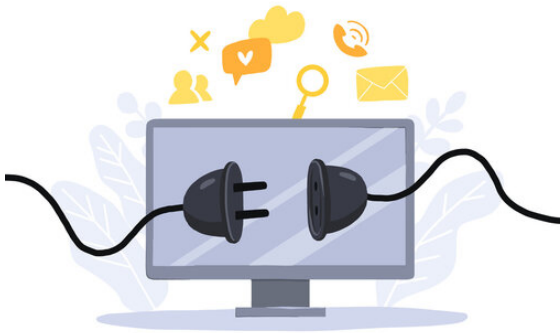
DRAM: Dynamic random-access memory – a type of computer memory (hardware)

# Cold Boot Attack

What is the attack the authors want to conduct?

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# Cold Boot Attack

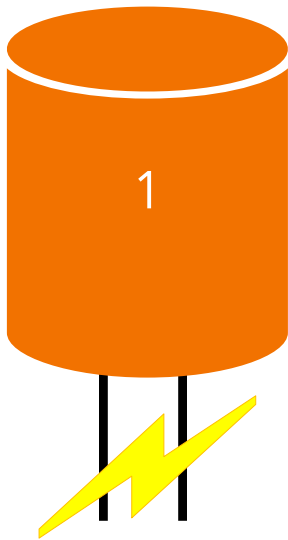
What is the attack the authors want to conduct?

What makes the attack possible?

**Memory remanance:** Most DRAM lose contents *gradually* over a period of seconds not all at once. This creates an opportunity to inspect what's in DRAM!

# How does DRAM work?

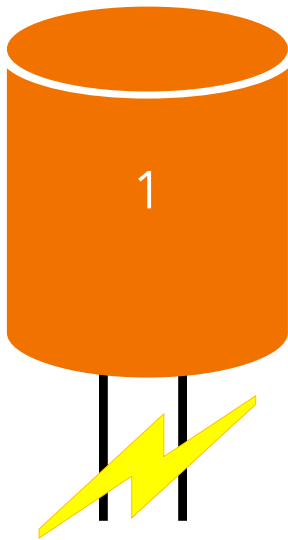
DRAM cells are essentially just capacitors. What is a capacitor?



Write "1"

# How does DRAM work?

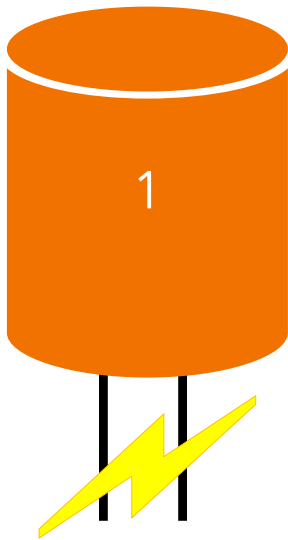
What is a *refresh* in DRAM, and how does it work?



Write "1"

# How does DRAM work?

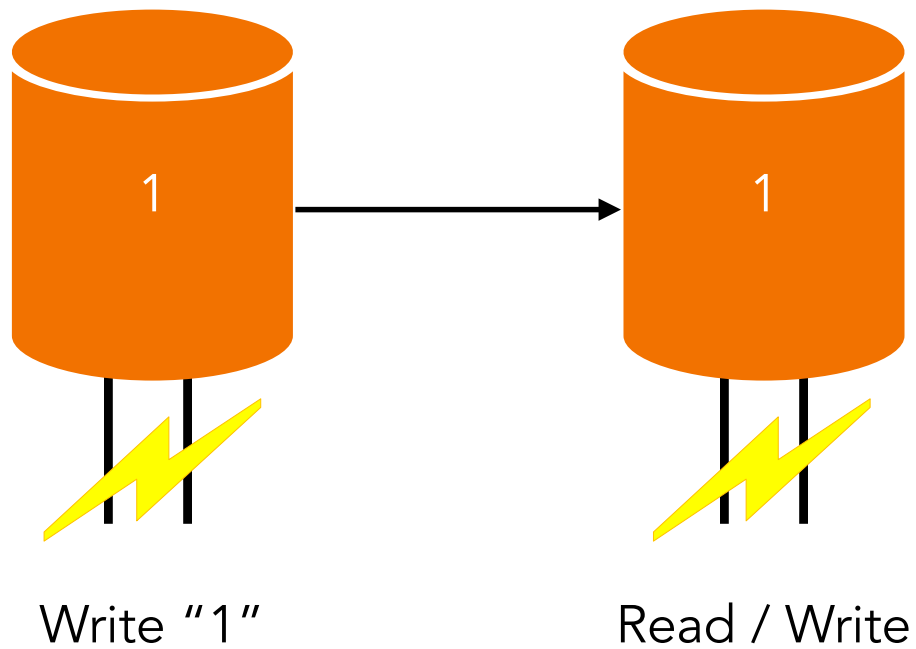
What is a refresh interval?



Write "1"

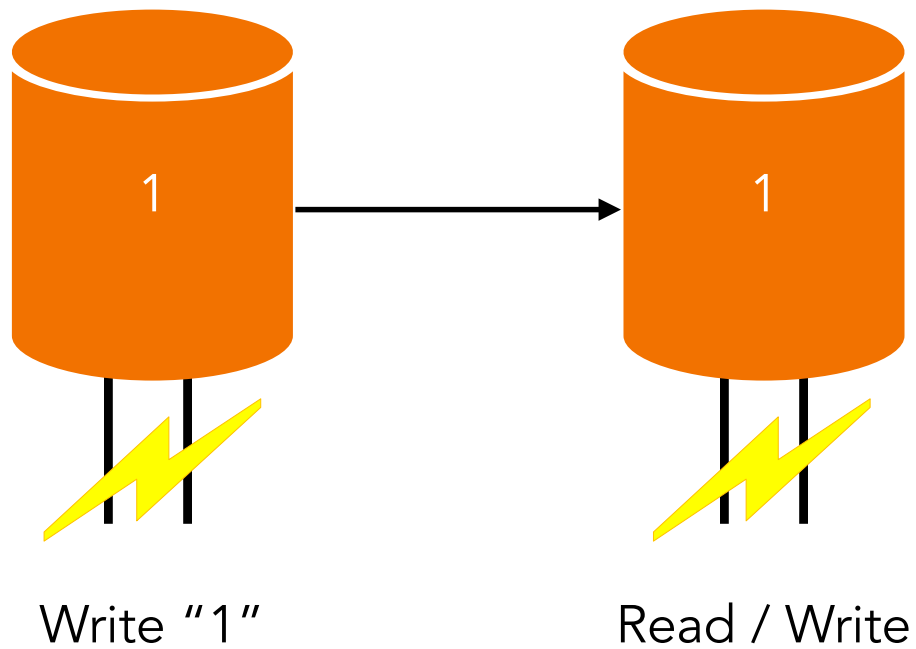
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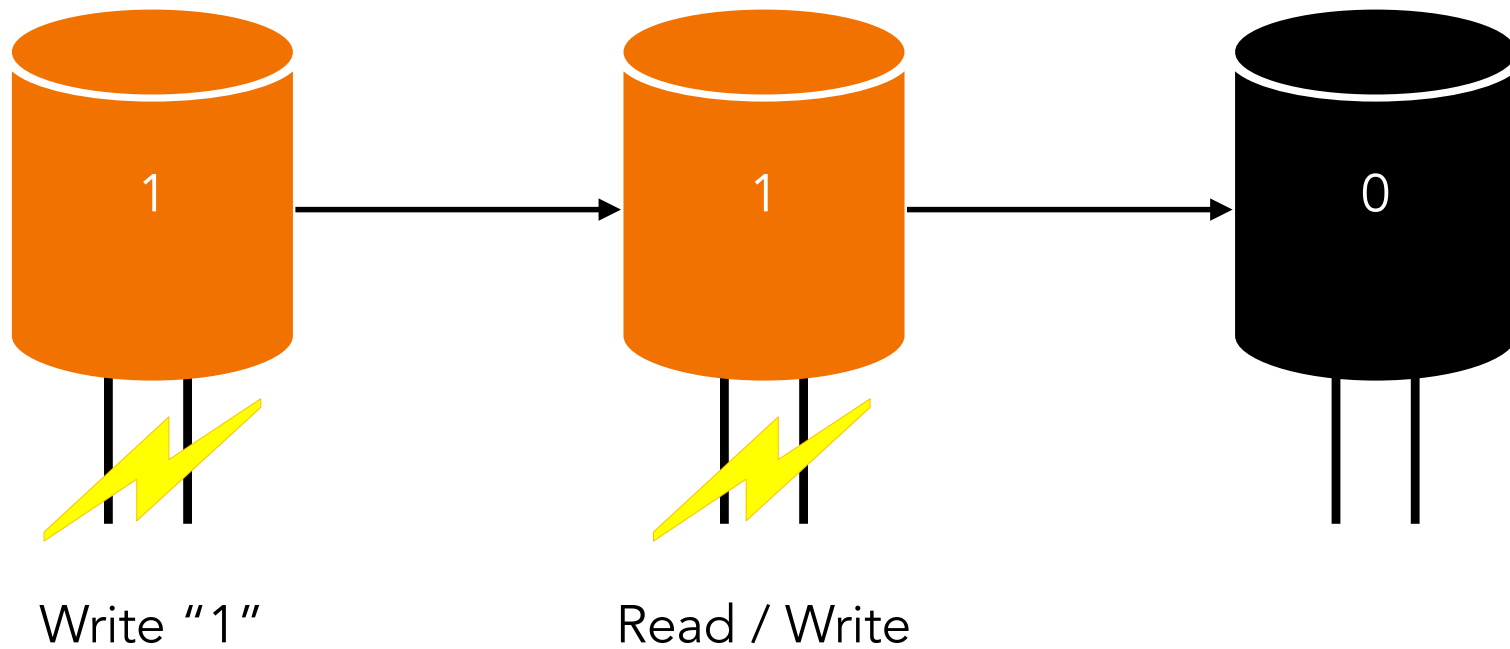
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What happens if we don't refresh the cell?



# How does DRAM work?

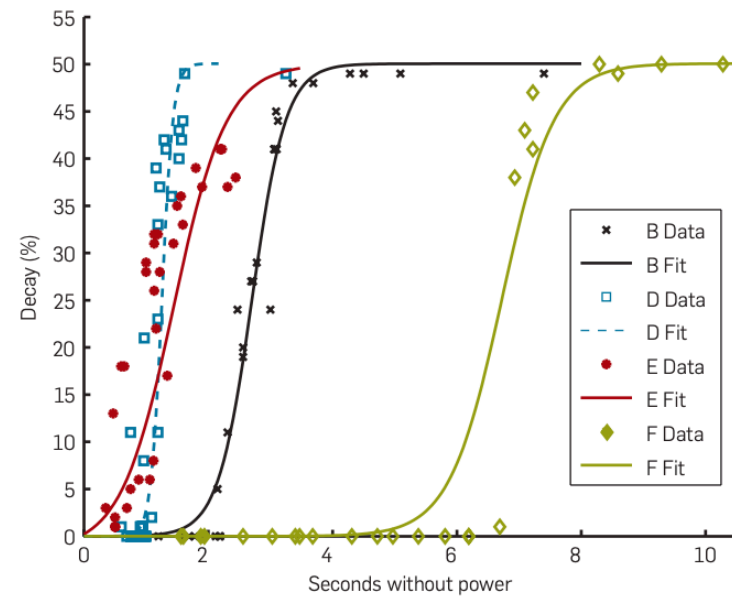
What happens if we don't refresh the cell?



# DRAM Decay Curves

- How did the authors test the time for DRAM cells to decay?

**Figure 2: Measuring decay.** We measured memory decay after various intervals without power. The memories were running at normal operating temperature, without any special cooling. Curves for machines A and C would be off the scale to the right, with rapid decay at around 30 and 15s, respectively.

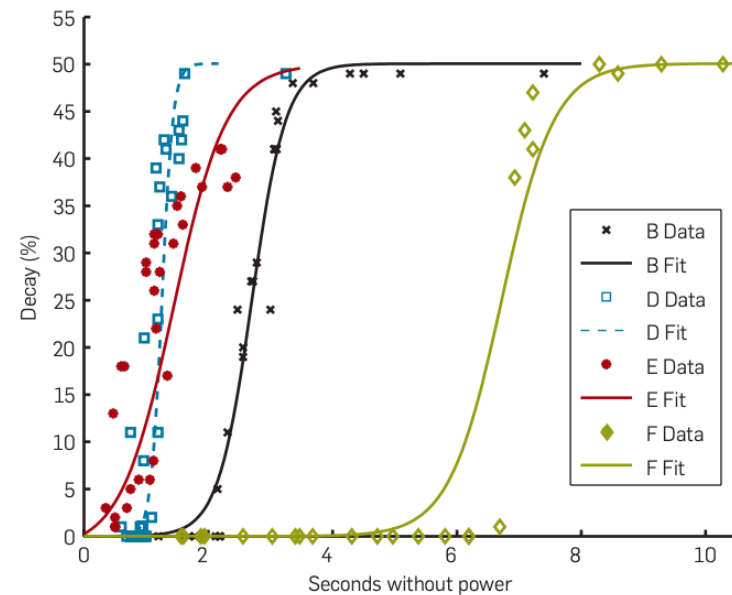




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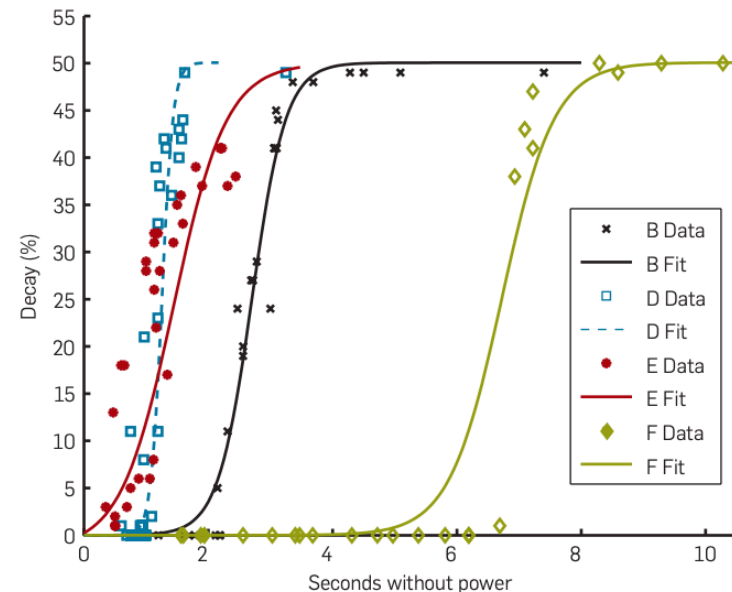
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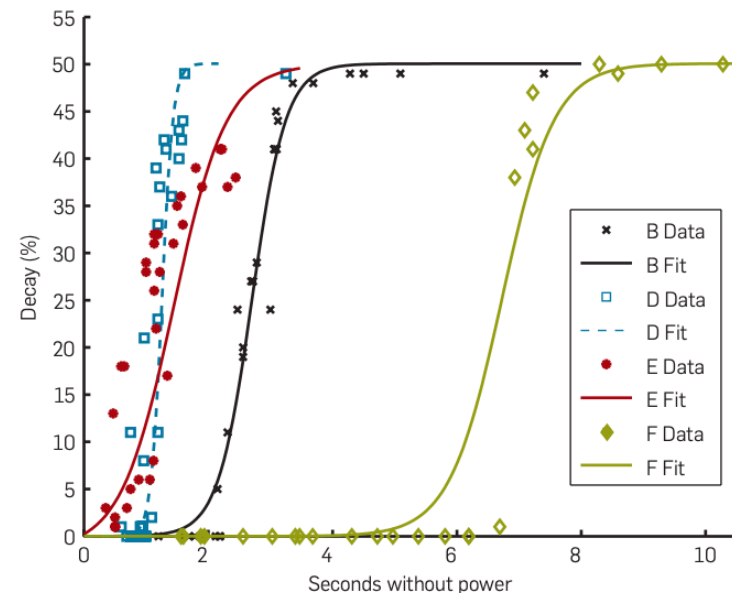
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# DRAM Decay Curves

- How did the authors test the time for DRAM cells to decay?
- How did the authors measure errors?
  - **Hamming distance:** number of bit errors divided by the total number of bits
- What would the error rate be if memory had fully decayed?

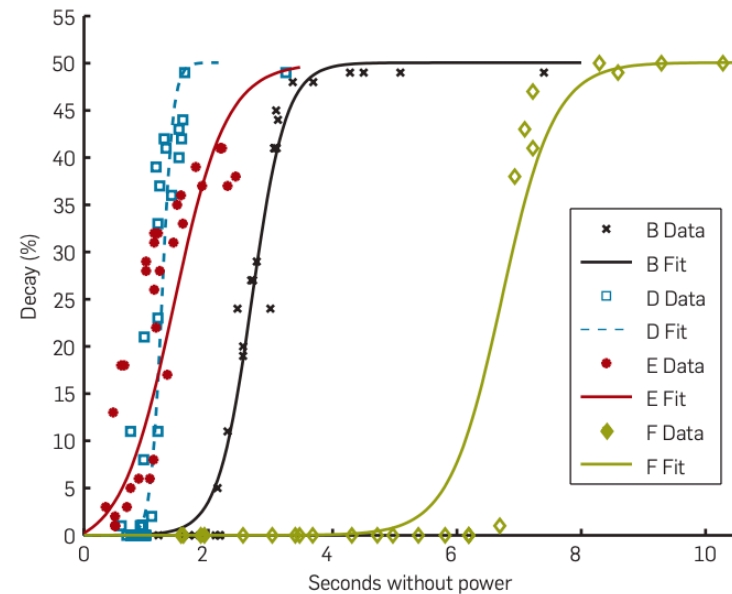
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# Reduced Temperature Experiments

- How did changing the temperature affect decay times?

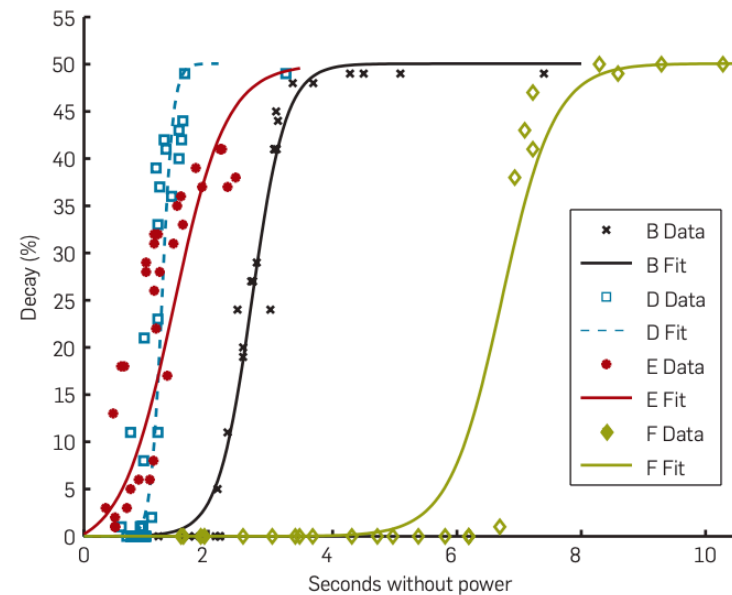
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- How did changing the temperature affect decay times?
- Reduced temperature to -50 degrees celsius (-58 degrees F) – attacker could cut power for 1 minute and recover at least 99.9% of bits correctly

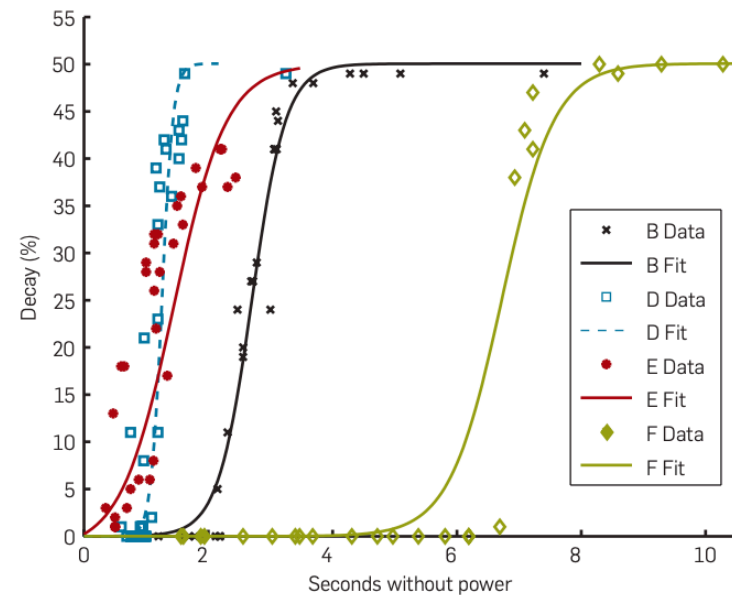
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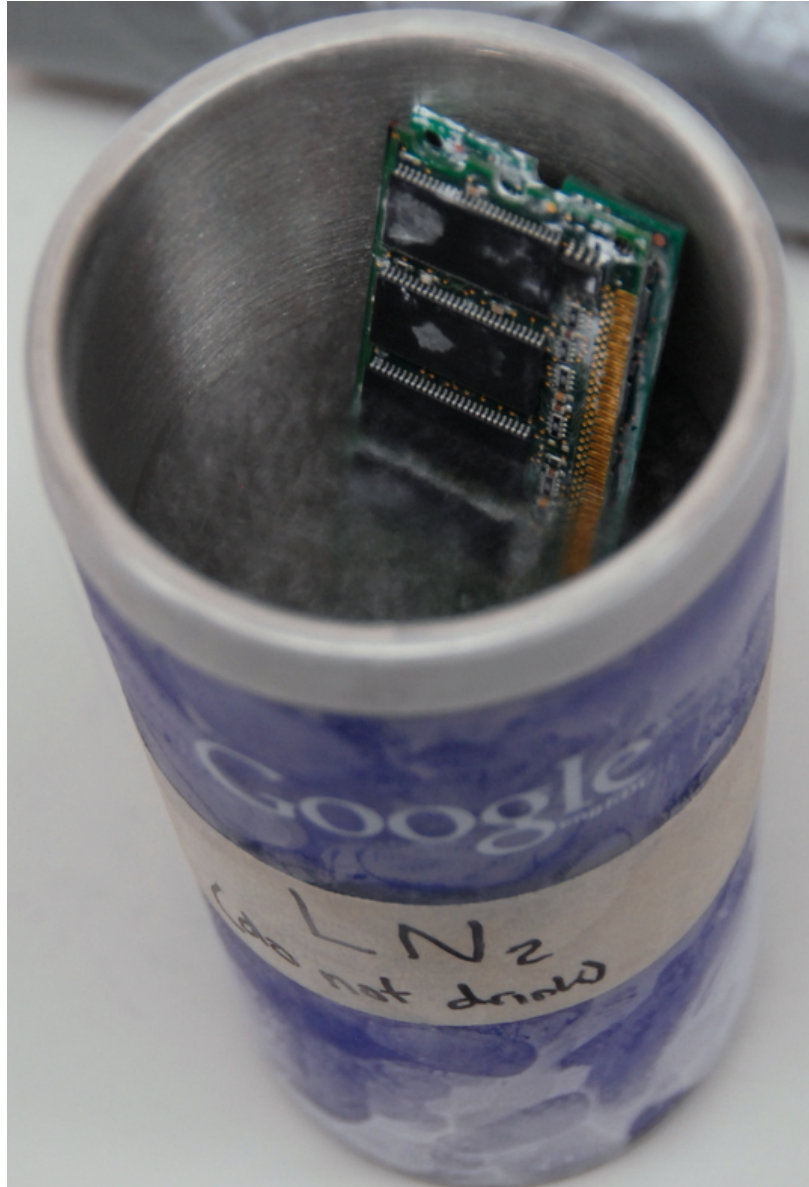


# Reduced Temperature Experiments

- How did changing the temperature affect decay times?
- Reduced temperature to -50 degrees celsius (-58 degrees F) – attacker could cut power for 1 minute and recover at least 99.9% of bits correctly
- How did the authors make it even colder?

**Figure 2: Measuring decay.** We measured memory decay after various intervals without power. The memories were running at normal operating temperature, without any special cooling. Curves for machines A and C would be off the scale to the right, with rapid decay at around 30 and 15s, respectively.





# Getting data out of DRAM

- Turns out, this is nontrivial
  - Rebooting immediately starts to refresh DRAM cells, which could **erase** memory that was previously written in those cells
- You could write a small program that can copy memory to another medium
  - Authors essentially created a few extremely tiny programs to do this to show proof of concept – we won't discuss this but it's pretty cool



# What can we do with this?

- Paper goes into lots of fun detail about reconstructing cryptographic keys
  - DES, AES, RSA —> all of these can be reconstructed
- What is the fundamental reason why keys can be reconstructed?

# What can we do with this?

- Paper goes into lots of fun detail about reconstructing cryptographic keys
  - DES, AES, RSA —> all of these can be reconstructed
- What is the fundamental reason why keys can be reconstructed?
  - Keys have unique signatures: AES has a **key schedule** with a repeatable pattern that you can exploit as a side channel to find an AES key :)

# Attacking Encrypted Disks

- What is an encrypted disk?



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- What is on-the-fly encryption?



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- How does BitLocker encrypt data on the disk?



# Attacking Encrypted Disks

- What is an encrypted disk?
- What is on-the-fly encryption?
- How does BitLocker encrypt data on the disk?
  - **Authors defeated BitLocker, FileVault, TrueCrypt, dm-crypt, Loop-AES, and could probably have done a lot more!**



# Feasibility

- How feasible is this attack?
- Do you believe this attack will work in practice? Why or why not?

## Break Time + Attendance



**Codeword:**  
Florida-On-Ice

<https://tinyurl.com/cse227-attend>



# Skill Squatting Attacks

# What's an IoT Device?

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IoT devices are devices with sensors, processing, software, and other tech that allow them to exchange data with other devices and actuate in the real world

# What's a voice user interface?

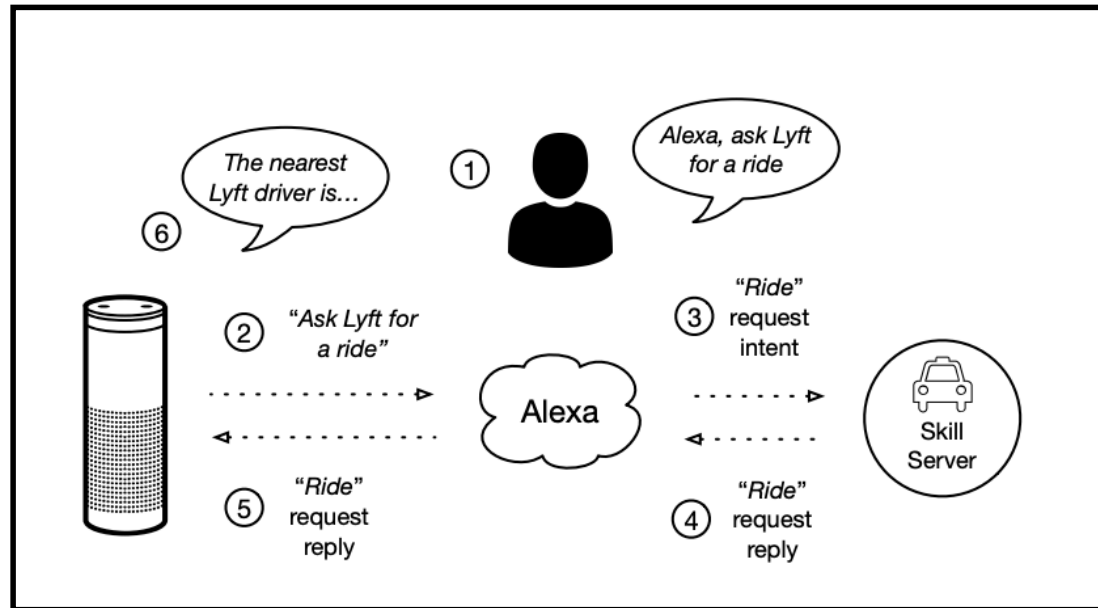
# What's a voice user interface?

Technology that lets you engage with a device or application using speech recognition.

# What's a "skill?" (Amazon Alexa)

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Essentially, an "app" controlled by the user's voice.

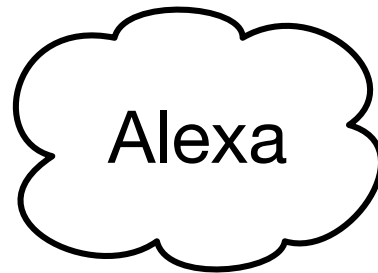
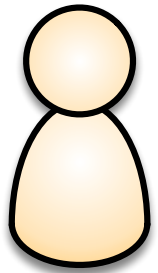


# Skill Squatting Attack

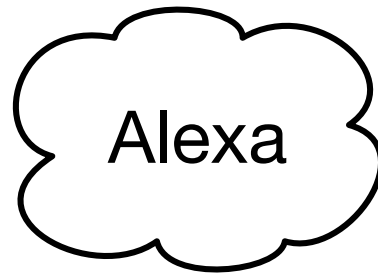
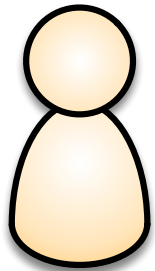
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"Alexa, tell me some cat facts!"

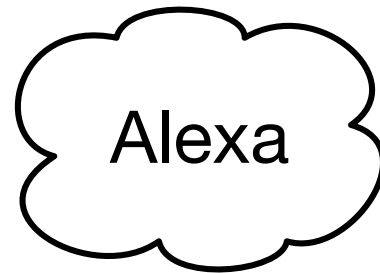
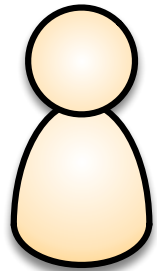


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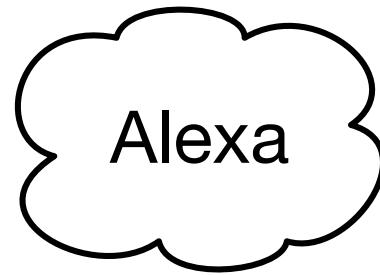
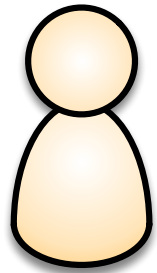
- | Skills    |
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| ...       |
| cat forks |
| cat fast  |
| cat facts |
| ...       |
| ...       |
| ...       |
| ...       |

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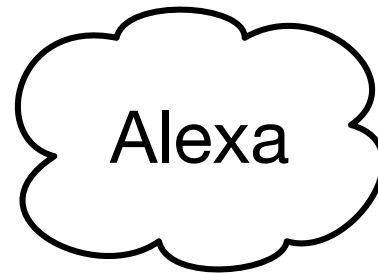
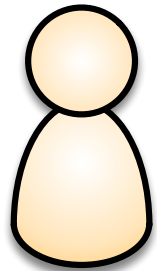
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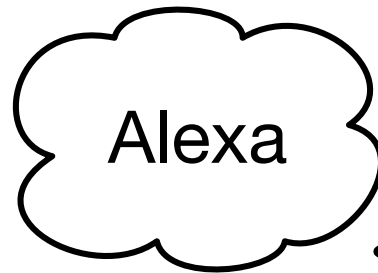
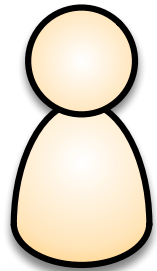
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“Alexa, tell me some cat facts!”



cat fact

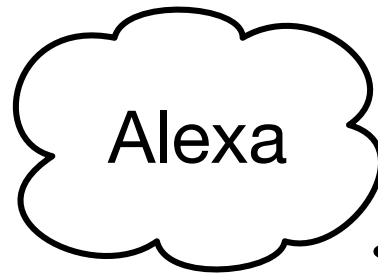
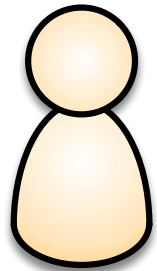


**Skills**

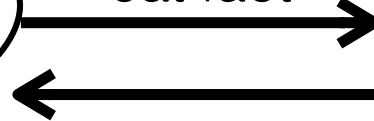
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- ...
- ...
- ...
- ...



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cat fact



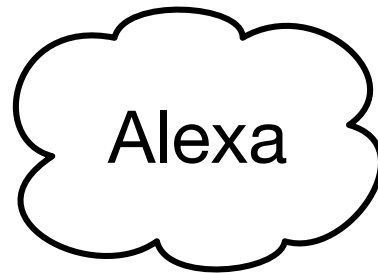
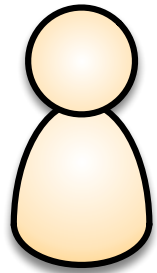
Skills
...
...
cat forks
cat fast
cat facts
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“A group of cats is called a clowder!”



“Alexa, tell me some cat facts!”



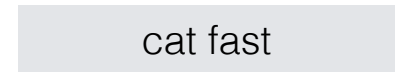
**Skills**

...



...

cat forks



cat fast

cat facts



***cat fax***



...

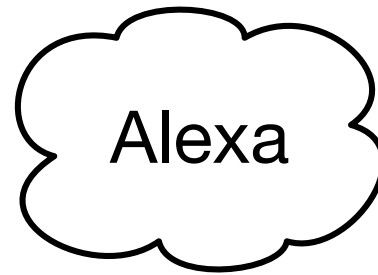
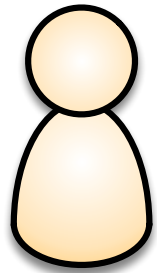


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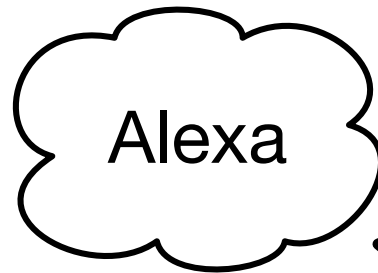
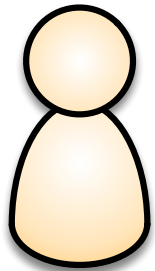


**Skills**

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- ...



“Alexa, tell me some cat facts!”



cat fact



Skills
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...
...



“A group of cats is called a murder!”



# Skill Squatting Attack

What is the attack the authors want to conduct?

What makes the attack possible?

# Skill Squatting Attack

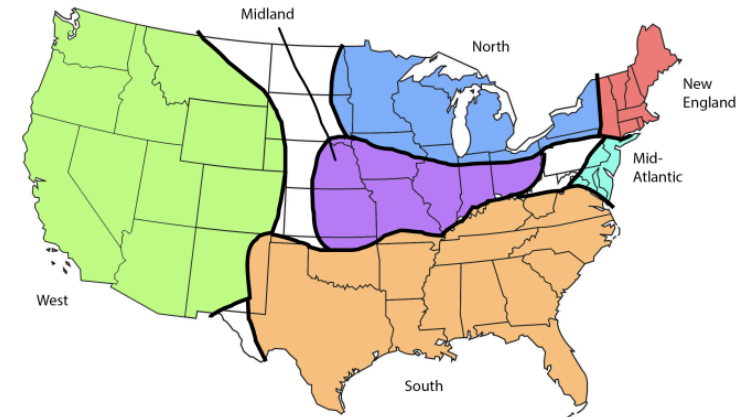
What is the attack the authors want to conduct?

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Authors found that Amazon's speech-to-text algorithm makes **predictable errors**

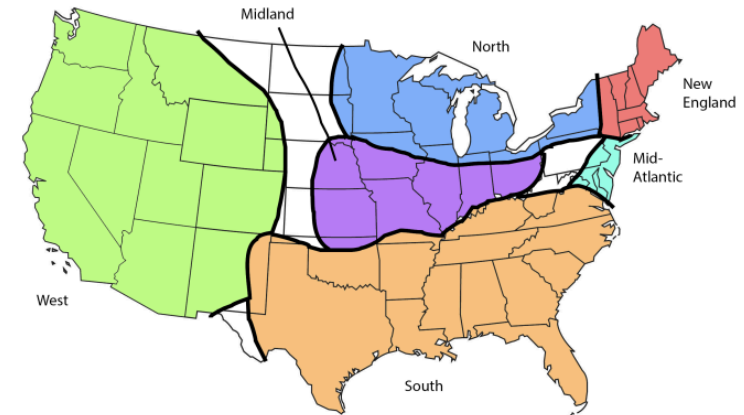
# Identifying Predictable Errors

- What data did the authors use to identify predictable errors?
- What was the strategy the authors used to *record* what Alexa interpreted on the other end of speech recognition?
- How well did Alexa do?



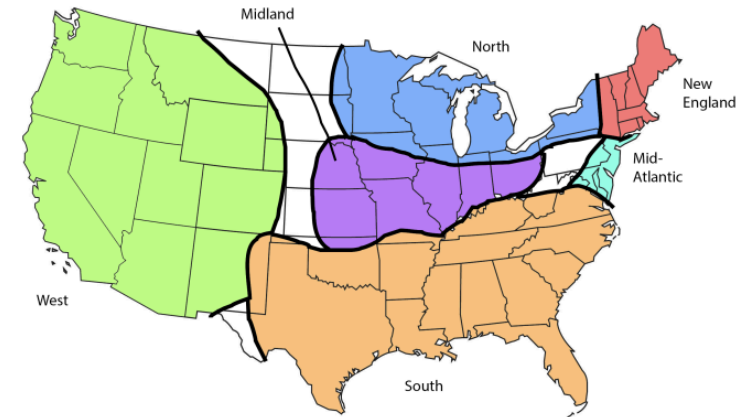
# Identifying Predictable Errors

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- How well did Alexa do?
  - **68.9% success rate**



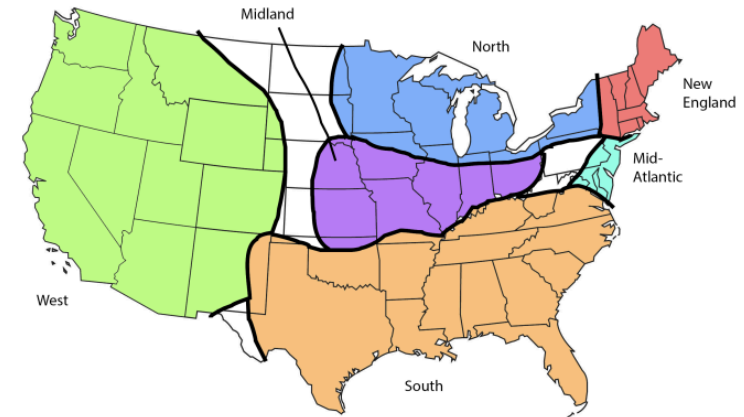
# Reasons for Errors

- What's a homophone?
- What's a compound word?
- What's a phoneme?



# Reasons for Errors

- What's a homophone?
- What's a compound word?
- What's a phoneme?
  - A single basic sound – the smallest possible phonetic unit – that helps distinguish one word from another in a language





# Predictable Errors

Word	Prediction
Sail	Sale
Rip	Rap
Outshine	Outshyne
Lung	Lang
Accelerate	Xcelerate
Mill	No
Preferably	Preferrably
Earthy	Fi
Calm	Com
Coal	Call
Outdoors	Out Doors
Loud	Louder

Word	Prediction
Superhighway	Super Highway
Wet	What
Main	Maine
Boil	Boyle
Sell	Cell
Full	Four
Dime	Time
Bean	Been
Dull	Doll
Sweeten	Sweden
Luck	Lock
Con	Khan

# Predictable Errors

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Rip	Rap
Outshine	Outshyne
Lung	Lang
Accelerate	Xcelerate
Mill	No
Preferably	Preferrably
Earthy	Fi
Calm	Com
Coal	Call
Outdoors	Out Doors
Loud	Louder

Word	Prediction
Superhighway	Super Highway
Wet	What
Main	Maine
Boil	Boyle
Sell	Cell
Full	Four
Dime	Time
Bean	Been
Dull	Doll
Sweeten	Sweden
Luck	Lock
Con	Khan



# Extending the attack with phonemes

- The authors extended their attack beyond words using phonemes
  - What was their basic attack strategy?
  - How effective was their attack?
    - Increased possible word errors from 188 —> **3606** (17.5x increase)



Secure | https://echosim.io

Inbox Email Mint USAA BoA Discover Calendar Self Service Box Trello 598NB SP18 QualStudy Group -... 598NB Other Bookmarks

Echosim.io  
COMMUNITY EDITION BETA


Log Out Resources Help Language EN-US Console OFF

Echosim.io provided by iQuarius Media. Special thanks to Sam Machin for his Alexa in the Browser [project](#).

## Alexa Skill Testing Tool

Click and **hold** the microphone button  
or hold down the space bar on your keyboard to activate the microphone.

Ready...



# Meta-points

- What are the capabilities of the attacker?
- What's the threat model in this attack?
- Do you believe this attack will work in practice? Why or why not?
- How would you defend against this attack?

# Light Commands

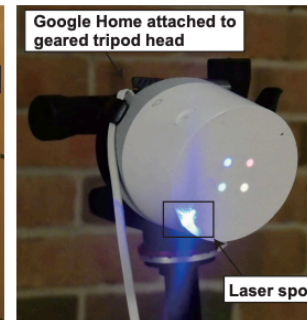
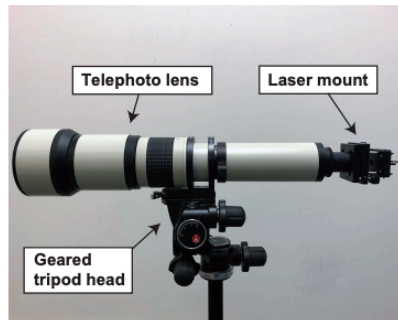
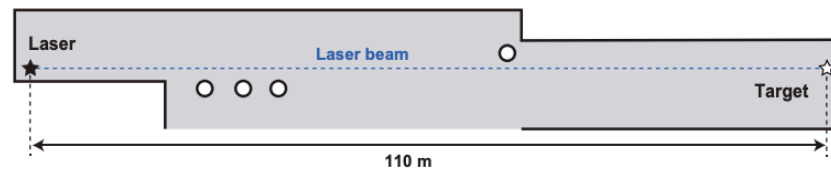
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What makes the attack possible?

“A semantic gap between the physics and specifications of microphones, where microphones often unintentionally respond to light as if it was sound.”

# Light Commands – Threat Model

- What are the capabilities of the attacker?

# Light Commands – Threat Model

- What are the capabilities of the attacker?
  - No physical access
  - Line of sight
  - Device feedback
  - Device characteristics (they can test at home)

# Light Commands Attack

What is the attack the authors want to conduct?

What makes the attack possible?

“A semantic gap between the physics and specifications of microphones, where microphones often unintentionally respond to light as if it was sound.”

# Injecting Sounds as Light

- How did the authors convert a sound (e.g., an audio file saying “OK Google”) into light?

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# Injecting Sounds as Light

- How did the authors convert a sound (e.g., an audio file saying “OK Google”) into light?
  - Essentially, modulated laser intensity as a function of the audio waveform
- Why are microphones sensitive to light in this way?
  - Photoelectric effects – emission of electrons due to light hitting the circuit
  - Photoacoustic effect – the diaphragm **moves** because the high intensity light hits it – and moves with intensity thus recording the sound

# Authors tried this on a number of devices – and it worked!

Device	Backend	Category	Authen- tication	Minimum Power [mW]*	Max Distance at 60 mW [m]**	Max Distance at 5 mW [m]***
Google Home	Google Assistant	Speaker	No	0.5	50+	110+
Google Home Mini	Google Assistant	Speaker	No	16	20	—
Google Nest Cam IQ	Google Assistant	Camera	No	9	50+	—
Echo Plus 1st Generation	Alexa	Speaker	No	2.4	50+	110+
Echo Plus 2nd Generation	Alexa	Speaker	No	2.9	50+	50
Echo	Alexa	Speaker	No	25	50+	—
Echo Dot 2nd Generation	Alexa	Speaker	No	7	50+	—
Echo Dot 3rd Generation	Alexa	Speaker	No	9	50+	—
Echo Show 5	Alexa	Speaker	No	17	50+	—
Echo Spot	Alexa	Speaker	No	29	50+	—
Facebook Portal Mini (Front Mic)	Alexa	Speaker	No	1	50+	40
Facebook Portal Mini (Front Mic) <sup>§</sup>	Portal	Speaker	No	6	40	—
Fire Cube TV	Alexa	Streamer	No	13	20	—
EcoBee 4	Alexa	Thermostat	No	1.7	50+	70
iPhone XR (Front Mic)	Siri	Phone	Yes	21	10	—
iPad 6th Gen	Siri	Tablet	Yes	27	20	—
Samsung Galaxy S9 (Bottom Mic)	Google Assistant	Phone	Yes	60	5	—
Google Pixel 2 (Bottom Mic)	Google Assistant	Phone	Yes	46	5	—

\*at 30 cm distance, \*\*Data limited to a 50 m long corridor, \*\*\*Data limited to a 110 m long corridor, §Data generated using only the first 3 commands.

**What were the authors able to do?**

# What were the authors able to do?

- Ask for the time
- Set the volume to zero
- Purchase items
- Open connected devices (e.g., doors)
- Generate commands + even trigger skills!

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# Feasibility

- Do you believe this attack will work in practice? Why or why not?
- How would you defend against this



# Discussion

**What about these attacks *surprised* you?**

**What do these attacks teach us about *trust*?**

# Next time...

- Moving away from software and devices, moving towards the **web**
  - Next two weeks on web, next four weeks on “networking”