### All Things Considered: An Analysis of IoT Devices on Home Networks

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#### Smart home devices attract hackers in their 'World's first Bluetooth hair first five minutes online straighteners' can be easily hacked

Researchers demonstrate new ways to hack your stupidly complex smart home

#### How one lightbulb could allow hackers to burgle your home

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#### "I'm in your baby's room": Nest cam hacks show risk of internet-connected devices

#### **Security flaws in a popular smart** home hub let hackers unlock front doors









### We have little visibility into the devices consumers are putting into their homes



# What does the home IoT ecosystem look like?









# Avast Wi-Fi Inspector



 Performs internal network scans and checks devices for weak security

# Avast Wi-Fi Inspector



devices for weak security

- Device identification
- Weak default credentials
- Vulnerability to known recent CVEs

# Avast Wi-Fi Inspector

- Performs internal network scans and checks



# Avast Wi-Fi Inspector



Open **Services** 









# Avast Wi-Fi Inspector

#### Probe devices in increasing IP order via ICMP, TCP/UDP



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Open Services





























#### Collects semantically rich broadcast/multicast traffic via DHCP, mDNS, UPnP







## Avast Wi-Fi Inspector: DeviceID

#### • Determine device vendor, fit device into one of 14 device classes



### Avast Wi-Fi Inspector: DeviceID Classes

Device Classes	
Computer	Router
Mobile Device	Wearable
Game Console	Home Automation
Storage	Surveillance
Work Appliance	Voice Assistant
Vehicle	Media/TV
Home Appliance	Generic IoT



### Avast Wi-Fi Inspector: DeviceID Classes



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	Router
	Wearable
	Home Automation
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	Voice Assistant
	Media/TV
	Generic IoT



## Avast Wi-Fi Inspector: DeviceID

- 14 device classes
  - Network Rules (regex)

### • Determine device vendor, fit device into one of





# Network Rules

Protocol	Field	
DHCP	Class ID	(?i)SAMSUNG[- :_
mDNS	Name	(?i)_nano \to
UPnP	Device Type	
HTTP	Title	- Polycom - (?:Sound





## Avast Wi-Fi Inspector: DeviceID

- 14 device classes
  - Network Rules (regex)
  - Supervised ML

### • Determine device vendor, fit device into one of





# Supervised ML

- Ensemble model that leverages several network features
- Trained on 500K devices from real world scans
  - 300K labels from network rules
  - 200K manually labeled

Tested on a set of 1K manually labeled unseen devices



# Machine Learning

Classifier	Coverage	Accuracy	F1
Network	0.89	0.96	0.79
UPnP	0.27	0.91	0.37
mDNS	0.05	0.94	0.25
HTTP	0.14	0.98	0.23
Supervised Ensemble	0.92	0.96	0.8



# Ethical Considerations

- Avast only shared **aggregate** data to our team, aggregated by device manufacturer, region, and device type
- No personally identifiable data was shared with research team, including IP addresses of homes
- Scans in our dataset are all user initiated, never automated



### Network scans collected from **15.5 million homes**, spanning 83 million devices across **11 geographic regions**

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### Dataset



# What do home networks look like?



# Homes w/ IoT Devices

Region	% Homes w/ IoT Device	Med. Devices per Home
North America	66.3%	7
Western Europe	53.5%	4
Oceania	49.2%	4
<b>Central + South America</b>	31.7%	4
East Asia	30.8%	3
Eastern Europe	25.2%	3
Southeast Asia	21.7%	4
Sub-Saharan Africa	19.7%	3
North Africa/Middle East	19.1%	3
Central Asia	17.3%	2
South Asia	8.7%	2



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## What is an IoT device?\*

\*empirically





# A Typical North American Home



# A Typical North American Home

**Device Type** 

Media Work Appliance (e.g., printer) **Gaming Console Voice Assistant** Surveillance **Storage (NAS)** Home Automation (e.g., Nest) Wearable (e.g., watch) **Other IoT** 

#### % of North American Homes

43%
33%
16%
10%
4%
3%
2%
0.2%
0.4%



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Fraction IoT Type





## 7 of 11 regions





Home automation and voice assistants are only prevalent (>1% of homes) in North America, Western Europe, Oceania




#### device type in South/Southeast Asia





#### Work appliances are the most common device type in East Asia/Sub-Saharan Africa









# Who is making these devices?



0.9 Cumulative Fraction of Devices 0.8 0.7 0.6 0.5 0.4 0.3 0.2 0.1 0 10

	Central and South America – Central Asia –	
	Eastern and Southern Europe – Eastern Asia –	
	North Africa and Middle East – Northern America –	
	Oceania –	
	<ul> <li>Southeastern Asia</li> <li>Southern Asia</li> </ul>	
	Sub-Saharan Africa - Western and Northern Europe -	
100	1000	100
Vendor by F	Rank	

























Cumulative Fraction of Devices

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### loT Vendors by Device Type

- •
- •
100
-





## loT Vendors by Device Type



	Game Console Voice Assistant	
100	1000	100
Vendor by Rank		





### loT Vendors by Device Type



	Media Surveillance Storage	
100	1000	100
Vendor by Rank		











# What does that mean for IoT security?



• "Security" is hard to measure in such a heterogeneous ecosystem



- We check weak credentials as a proxy for security

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- We check weak credentials as a proxy for security
- 7.8% devices support FTP, 7.1% devices support Telnet



- "Security" is hard to measure in such a heterogeneous ecosystem
- We check weak credentials as a proxy for security
- 7.8% devices support FTP, 7.1% devices support Telnet
  - 17.4% exhibit weak FTP credentials
  - 2.1% exhibit weak Telnet credentials



Device Type	% Support Telnet	% Weak Telnet
Surveillance	14.6%	10.7%
Router	14.6%	1.9%
Home Appliance	3.2%	1.6%
Media	1.4%	0.9%



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Region	% IoT Weak Telnet	% Surveillance
North America	0.5%	3.7%
South America	4.9%	13.3%
Eastern Europe	3.0%	14.0%
Western Europe	1.0%	5.6%
East Asia	0.4%	9.1%
Central Asia	4.9%	30.3%
SE Asia	3.6%	37.0%
South Asia	2.9%	54.5%
Oceania	0.7%	4.3%
N. Africa + Middle East	4.8%	28.5%
Sub-Saharan Africa	1.1%	18%



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South America	4.9%	13.3%
Eastern Europe	3.0%	14.0%
Western Europe	1.0%	5.6%
East Asia	0.4%	9.1%
<b>Central Asia</b>	4.9%	30.3%
SE Asia	3.6%	37.0%
South Asia	2.9%	54.5%
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#### Mirai Infections





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Security challenges vary per region depending on device preferences



 Home IoT ecosystem is diverse and fragmented



- Home IoT ecosystem is diverse and fragmented
  - Regional differences in # of devices, device types, and device vendors



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- Quantifying IoT security at scale remains an outstanding challenge



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- IoT has been here... for years



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- IoT has been here... for years

#### **Questions?** dkumar11@illinois.edu @ kumarde

