



# Understanding and Taming Wireless Interference in Homes: An SDN-centric Approach

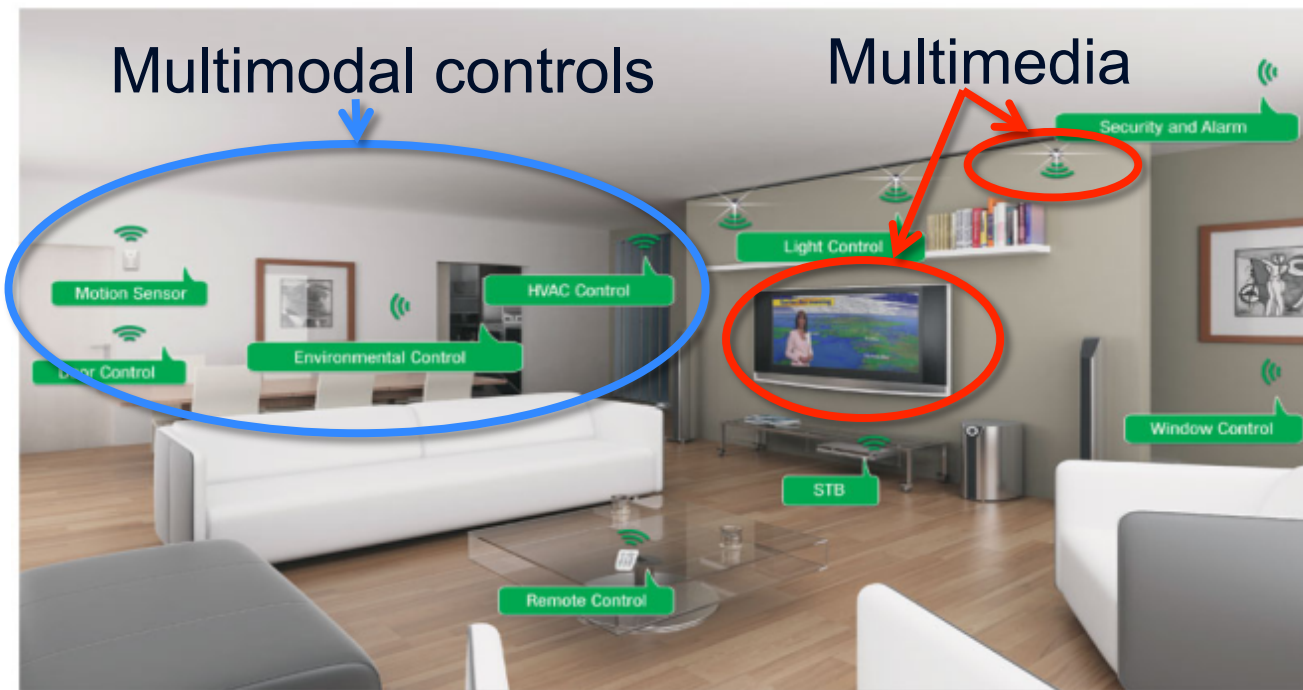
Suman Banerjee  
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# Wireless @ Home

Wireless is the dominant technology in homes for accessing multimedia services

- ISPs have built strong experience in **managing** the **wired** connection into the home
- **Wireless** link has typically been left **unmanaged**

# Wireless management is critical for user experience



- TV
- Tablets
- Storage
- Security
- Sensors

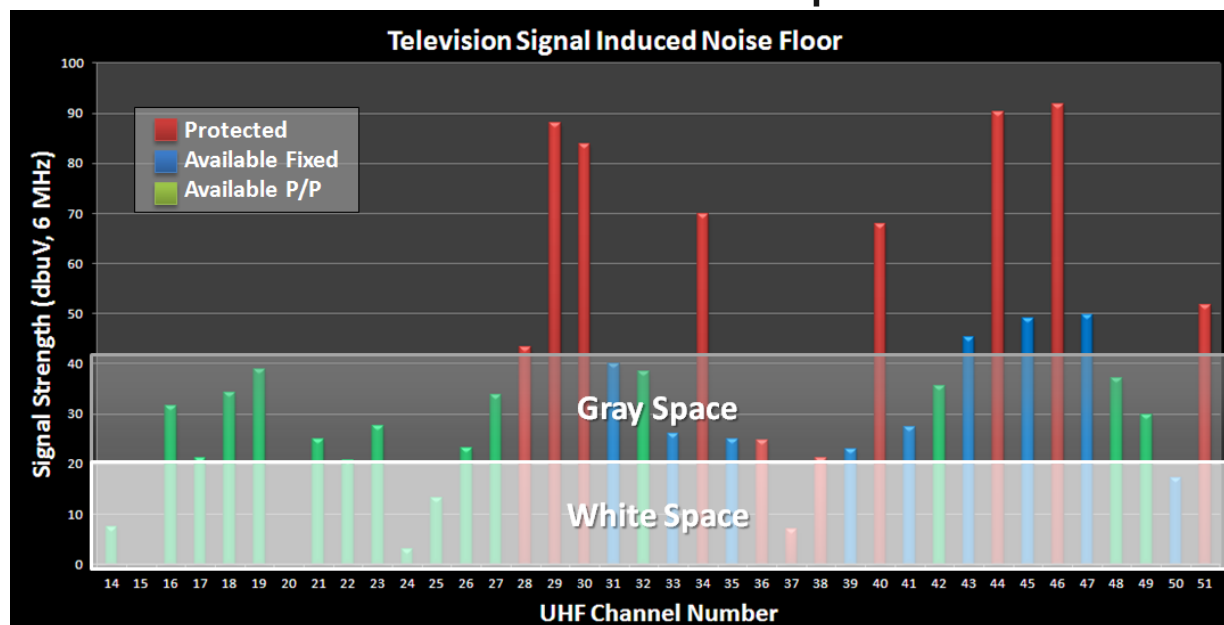
Unlicensed spectrum shared in an uncoordinated manner

# Wireless@Home Technology Landscape



Zigbee

TV Whitespace



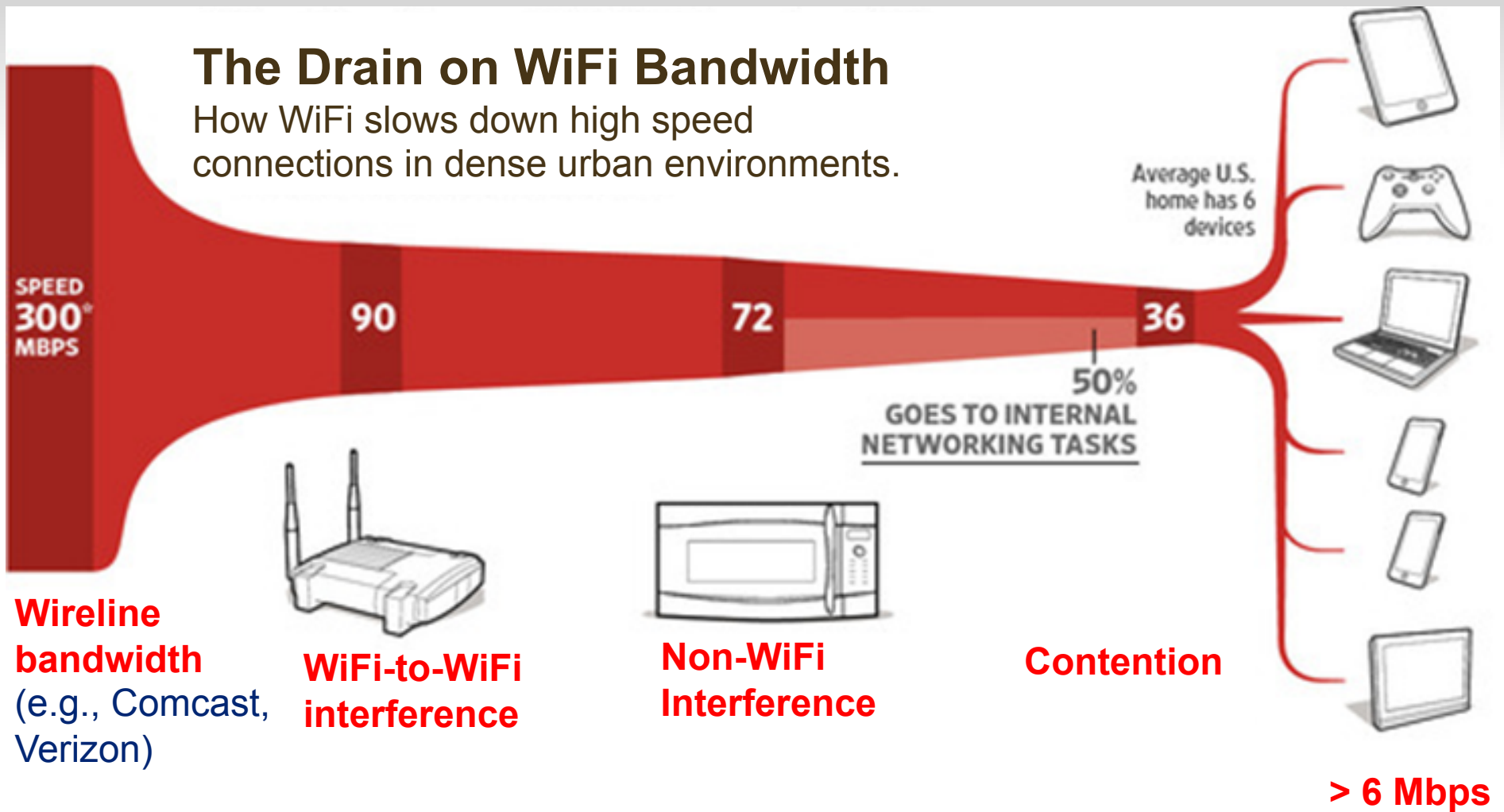
X10





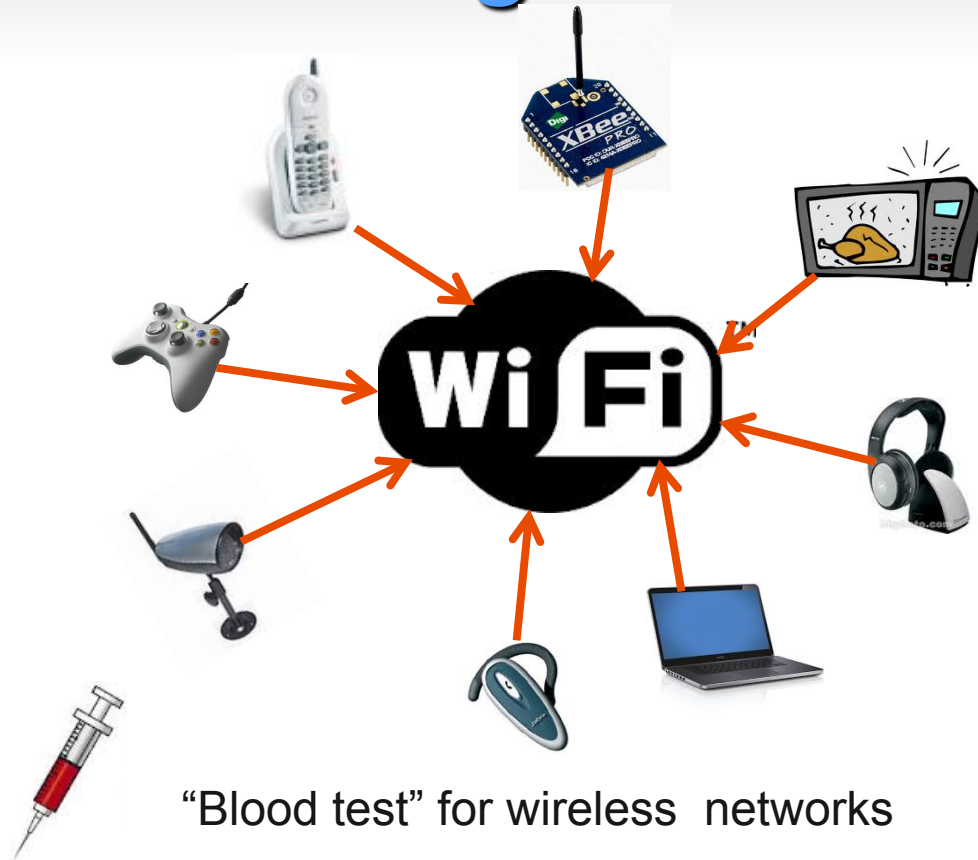
## The Drain on WiFi Bandwidth

How WiFi slows down high speed connections in dense urban environments.

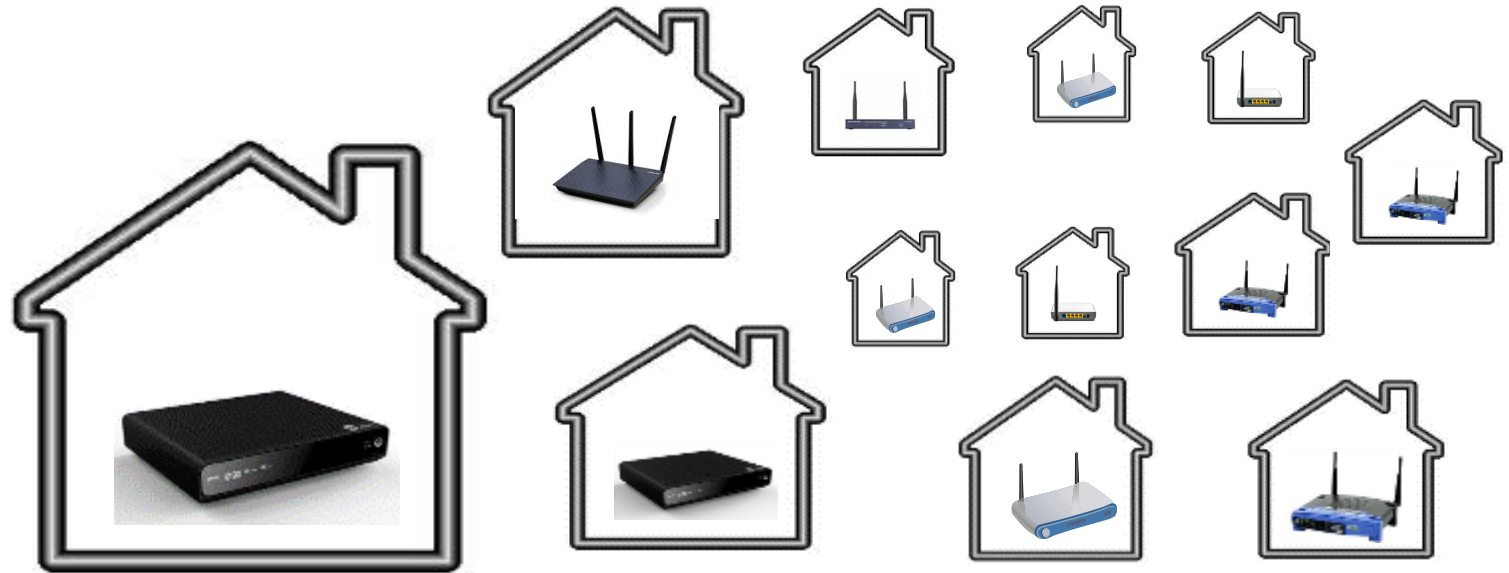
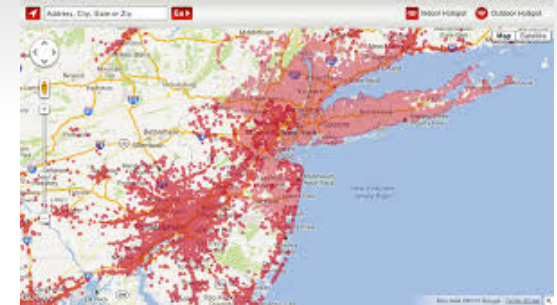


Source: WSJ, Comcast, 5Nines

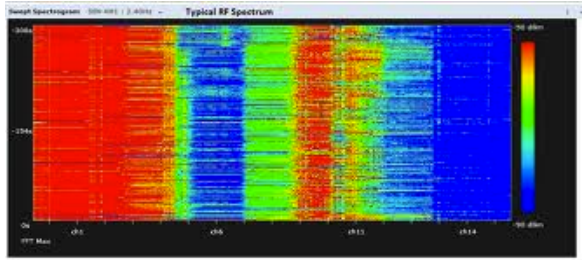
# Goal 1: Understanding interference



# Goal 2: Taming interference



# Toolbox



RF analytics



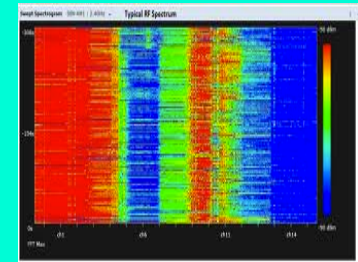
SDN

All implemented in commodity WiFi software and hardware

# Overall architecture



Cloud-based  
Wireless  
Management



RF analytics

SDN



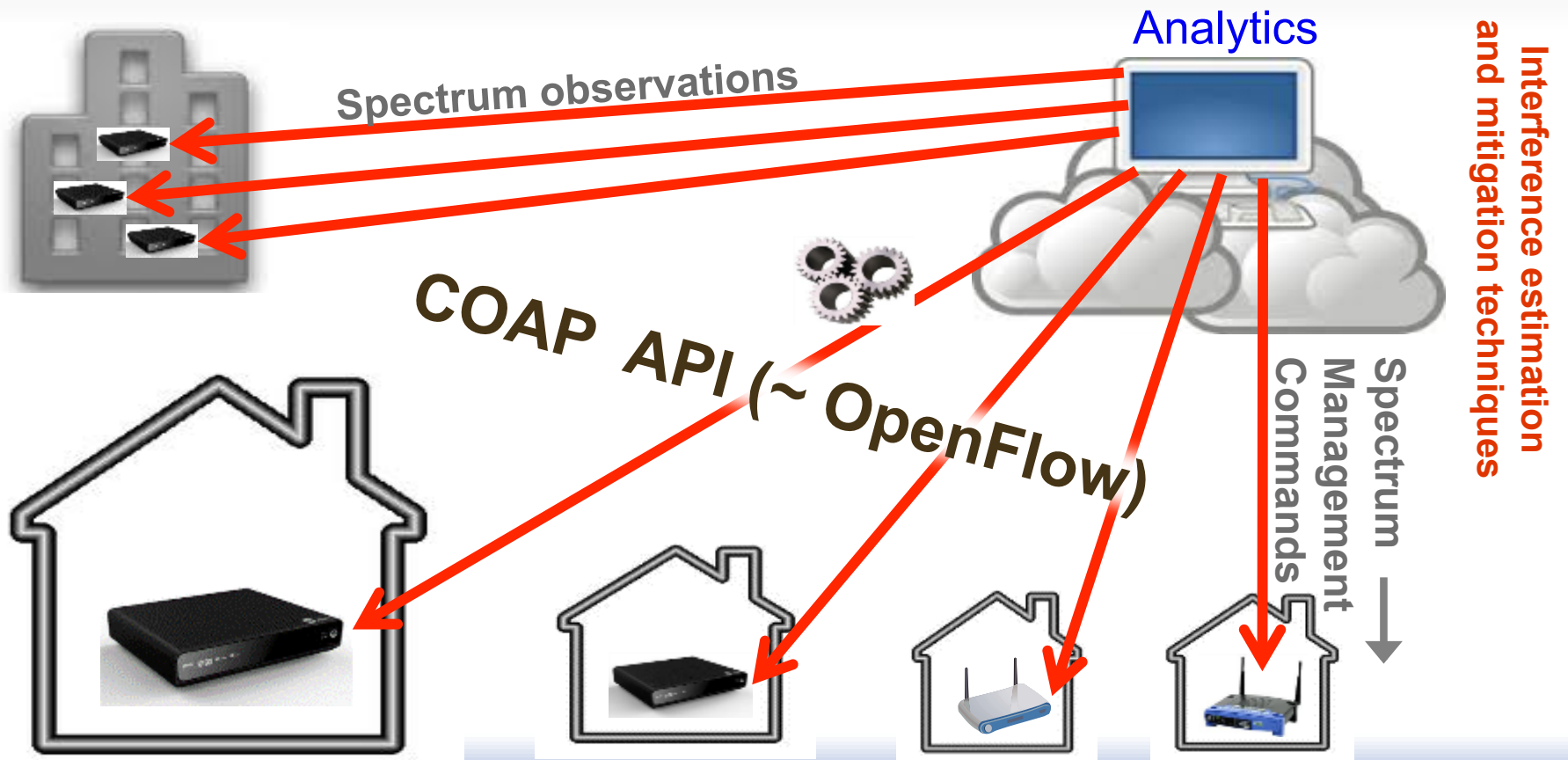
**Commodity AP Hardware**

*(Broadcom, Qualcomm, Marvell ...)*



# Cloud-based RF Management

COAP: **C**oordination framework for **O**pen **A**ccess **P**oints



# Performance Optimization & Analytics

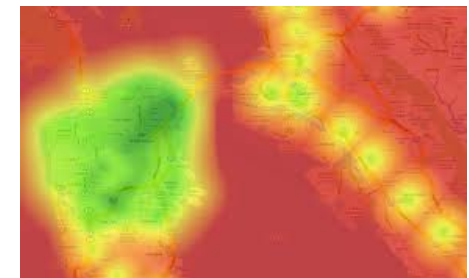
## ✓ Interference Detecting & Quantification

- WiFi, Bluetooth, Analog phones, Microwaves, Game controllers



## ✓ Coverage Maps

- RSSI, CINR at (x,y,z) coordinates



## ✓ Localization of Interferers

- “Your WiFi box is too close to microwave oven. Please move it farther preferably....”
- “There is a cordless phone close by. Please move the cordless phone farther away from your tablet.”

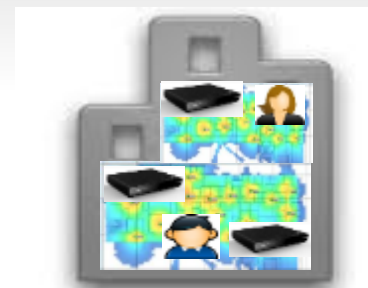




# Performance Optimization & Analytics

## ✓ WiFi interference mitigation

- Frequency, Power, Cross-Layer Optimizations
- Machine Learning & Statistical Analysis



## ✓ Network Performance Matrices

- Quality of Experience
- RF Heat Maps ...



## ✓ Customer Support Assistance

- Go back in time: see interferers & AP performance
- See neighboring APs and details of these APs
- Observe Centaur driven updates and their results





# Understanding Interference



# Our solution

Real-time Interference estimators

WiFi to WiFi Interference

Non-WiFi to WiFi Interference

(use WiFi-only hardware!)

**COLLIE** (Collision Inferencing Engine)

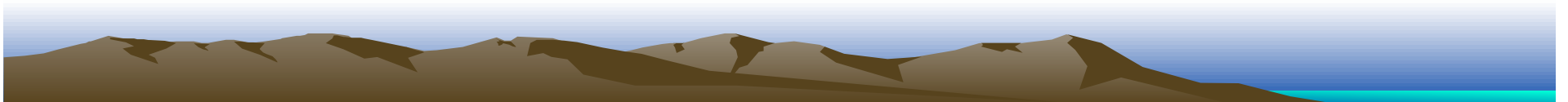
**Airshark**

1. detect non-WiFi devices

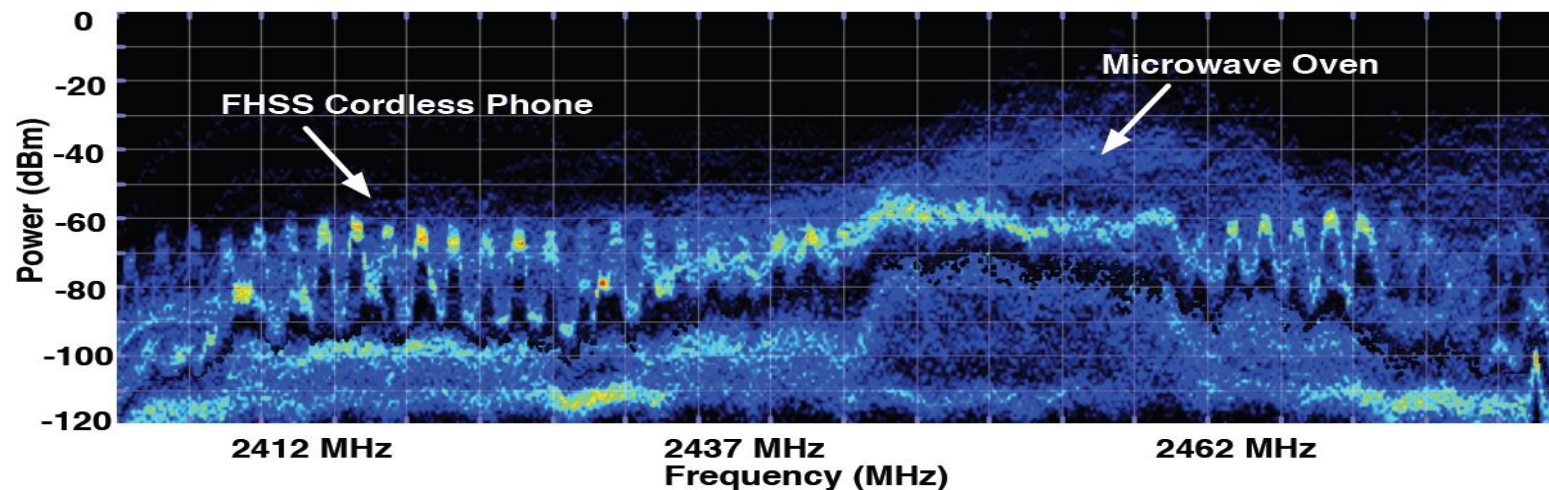
**PIE** (Passive Interference Estimator)

**WiFiNet**

1. quantify interference impact
2. pin point device location

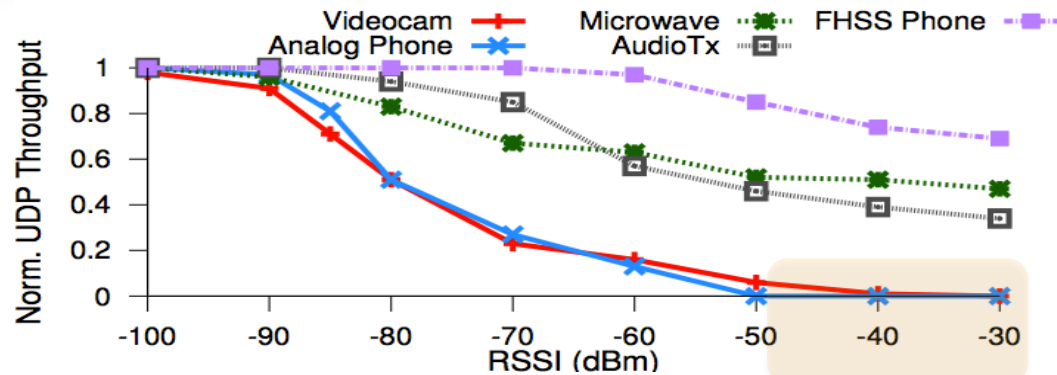


# Spectrum at a university cafe



**High powered non-WiFi devices share the spectrum with WiFi devices**

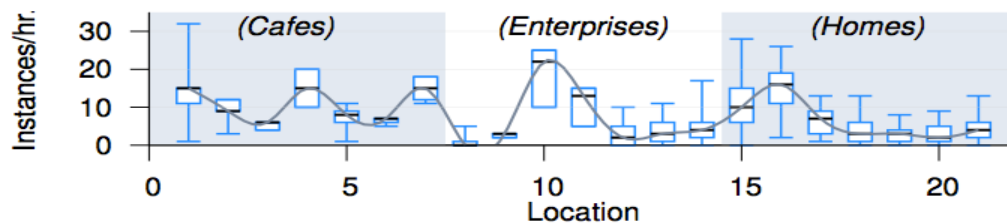
# Is non-WiFi interference a real problem?



How severe is the impact?

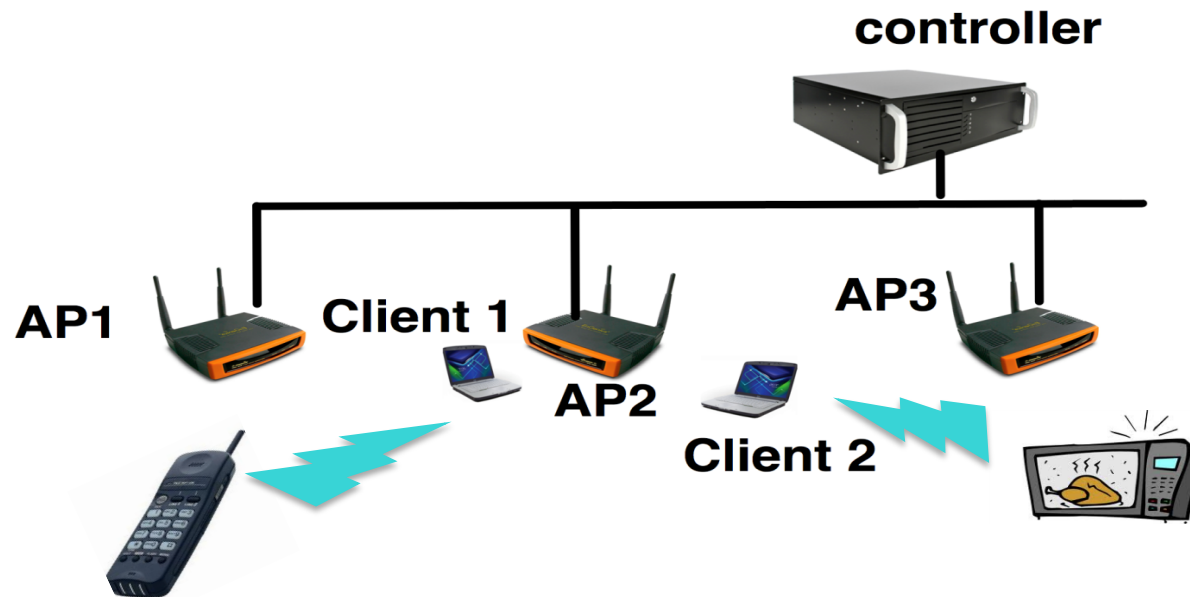
More than 50% throughput drop and, in some cases, throughput drops to zero!

How prevalent are the devices?



Across locations, many devices frequently appeared with a high signal strength

# Interference detection goals



## Key questions:

- Are there any non-WiFi devices in the medium?
- Which non-WiFi devices caused interference?
- How do we locate these non-WiFi devices?

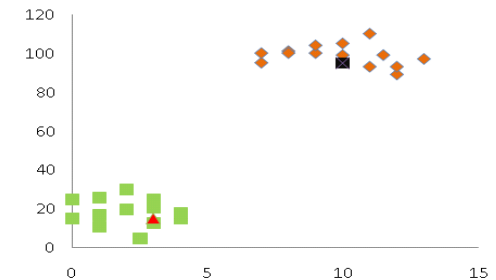
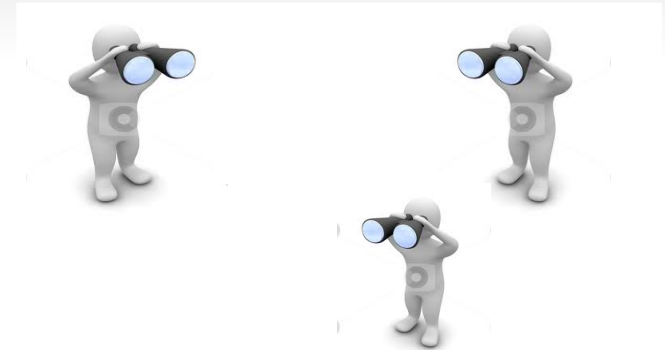
# What is hard?

- Use *existing* WiFi interfaces to detect and quantify
  - **No** dedicated spectrum sensor
  - Who is the interferer?
    - Can I tell multiple identical devices apart?
      - Needed for impact quantification
    - How to localize?



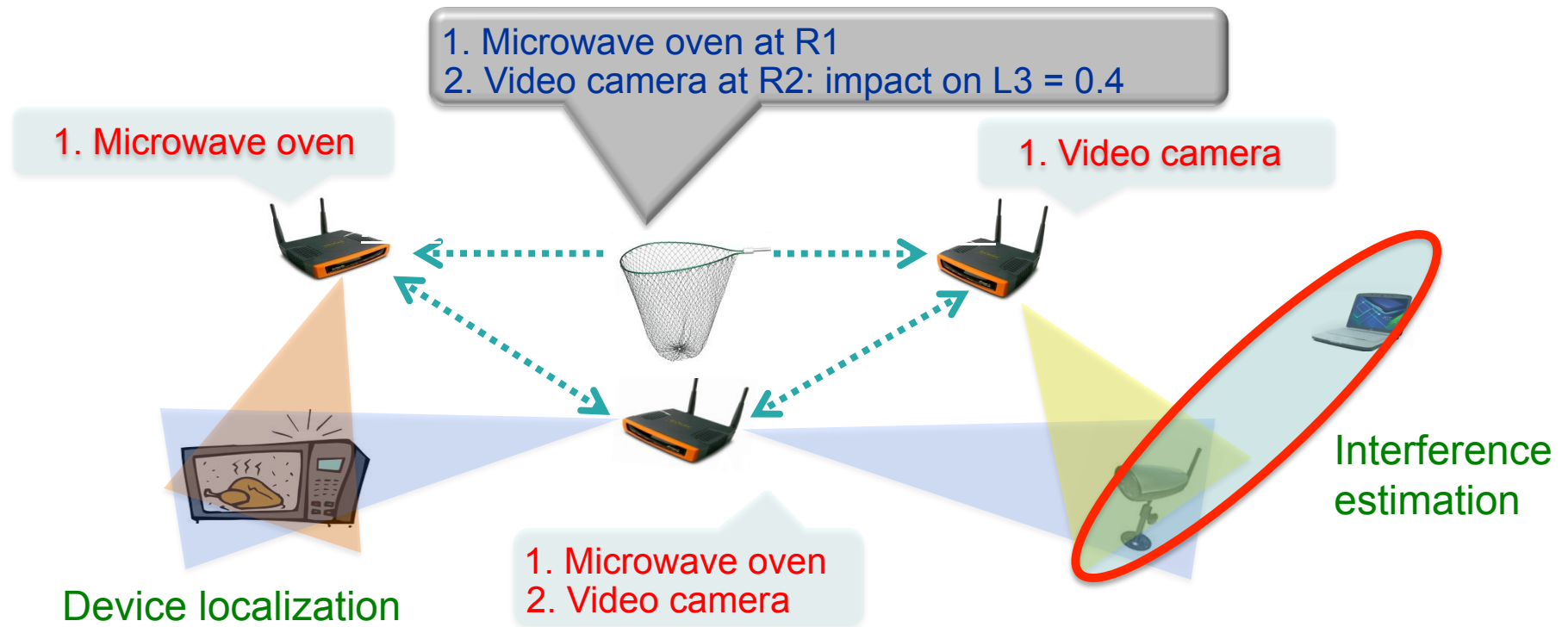
# Solution Approach

- Exploit distributed observers
- Timing information and statistical techniques
- Learn and adapt



# Solution overview

- 1. **AirShark:** Non-WiFi device detection
- 2. **WifiNet:** Quantify interference and localize





# Using a coarse-grained WiFi lens



Coarse-grained  
freq. resolution

312 kHz  
Sub-carriers

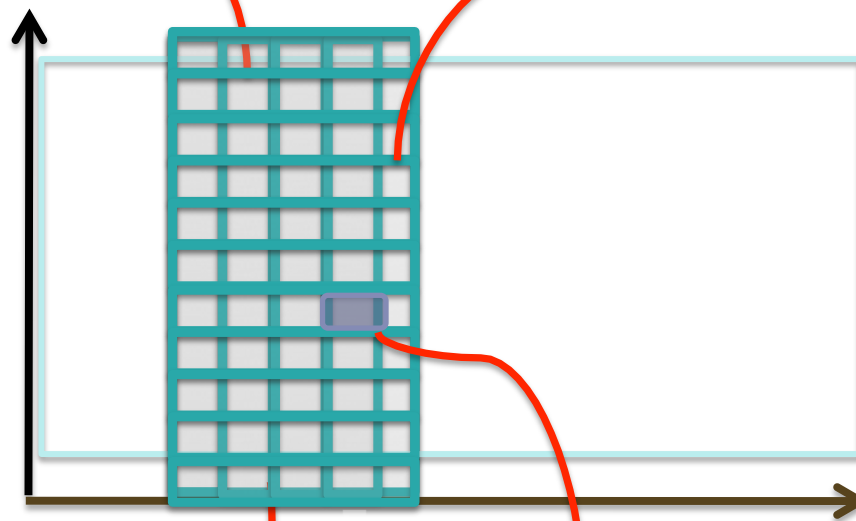
Coarse-grained time resolution

$O(10^3)$  to  
 $O(10^4)$   
samples/sec

22 MHz

RSSI/power per sub-carrier

Limited spectrum view



# Airshark: *how it works*

## Device Detection Pipeline

Spectral  
Sampling

Pulse  
Detection

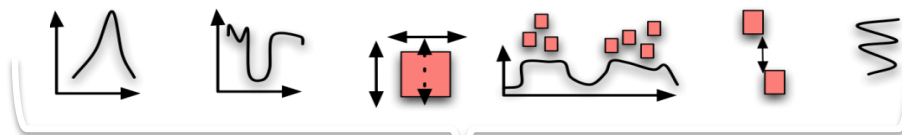
Feature  
Extraction

DT-  
classifiers

(OFF)

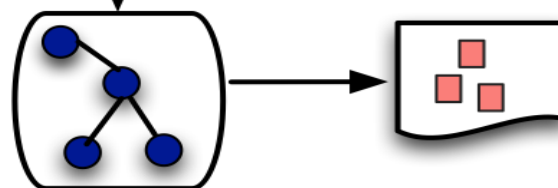


Extract Features

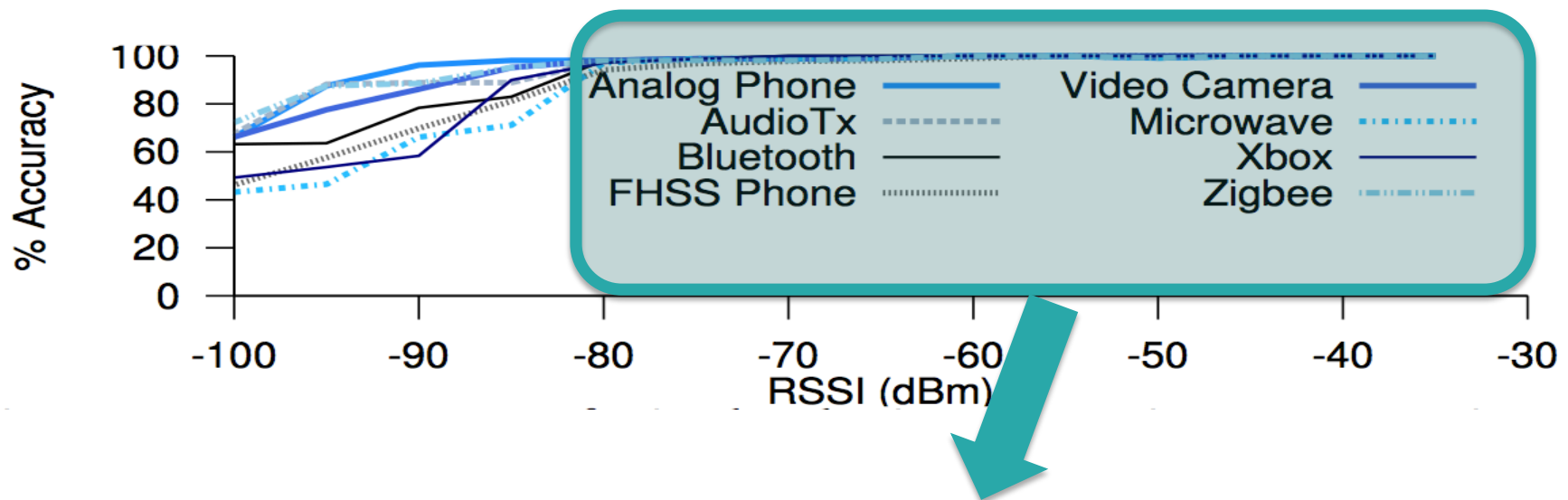


(ON)

Training / Classification  
Decision Tree Classifier

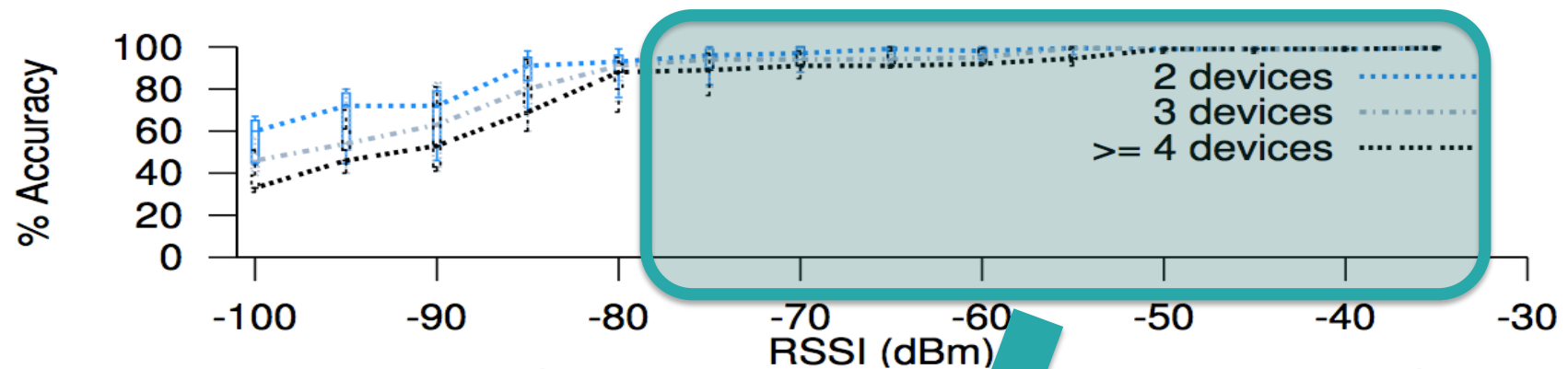


# Detection Accuracy: Single device



**> 98% accuracy at signal strengths  $\geq -80$  dBm**

# Detection Accuracy: Multiple devices



**> 91% accuracy at signal strengths  $\geq -80$  dBm**

# Many trials

Including integrating with a commercial off-the-shelf AP platform

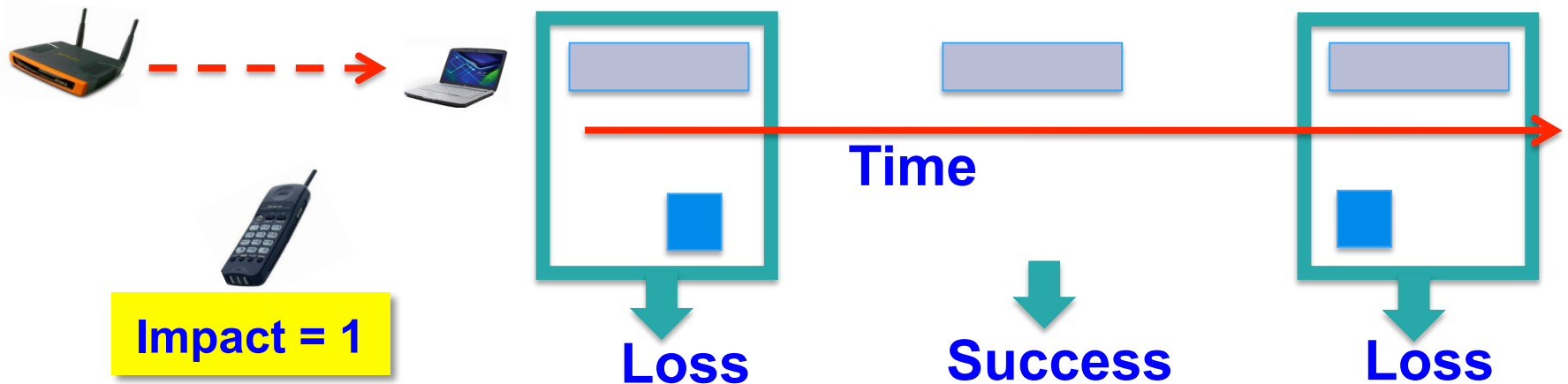


# Demo: Airshark

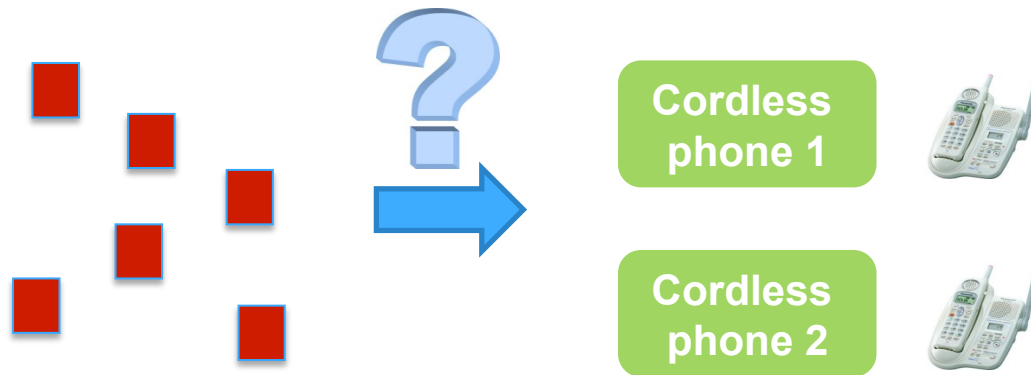


# WiFiNet: Interference estimation concept

- Quantify the “impact” of each device on each WiFi link
  - Identify the **transmission overlaps** between WiFi frames and non-WiFi pulses
  - Correlate** frame losses and transmission overlaps



# WiFiNet: Additional challenges



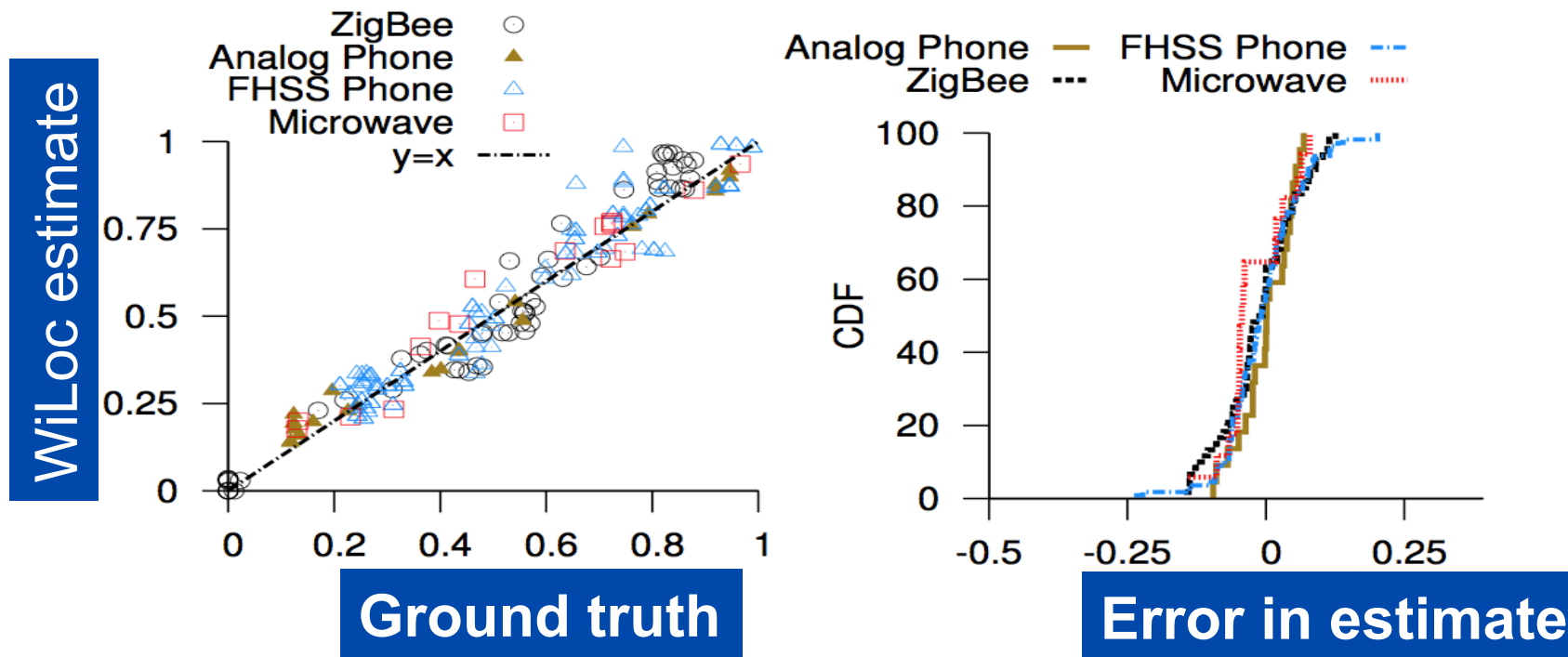
**What about multiple devices of same type?  
Which RF activity belongs to which device?**

Also have to them discern interference impact of each device type



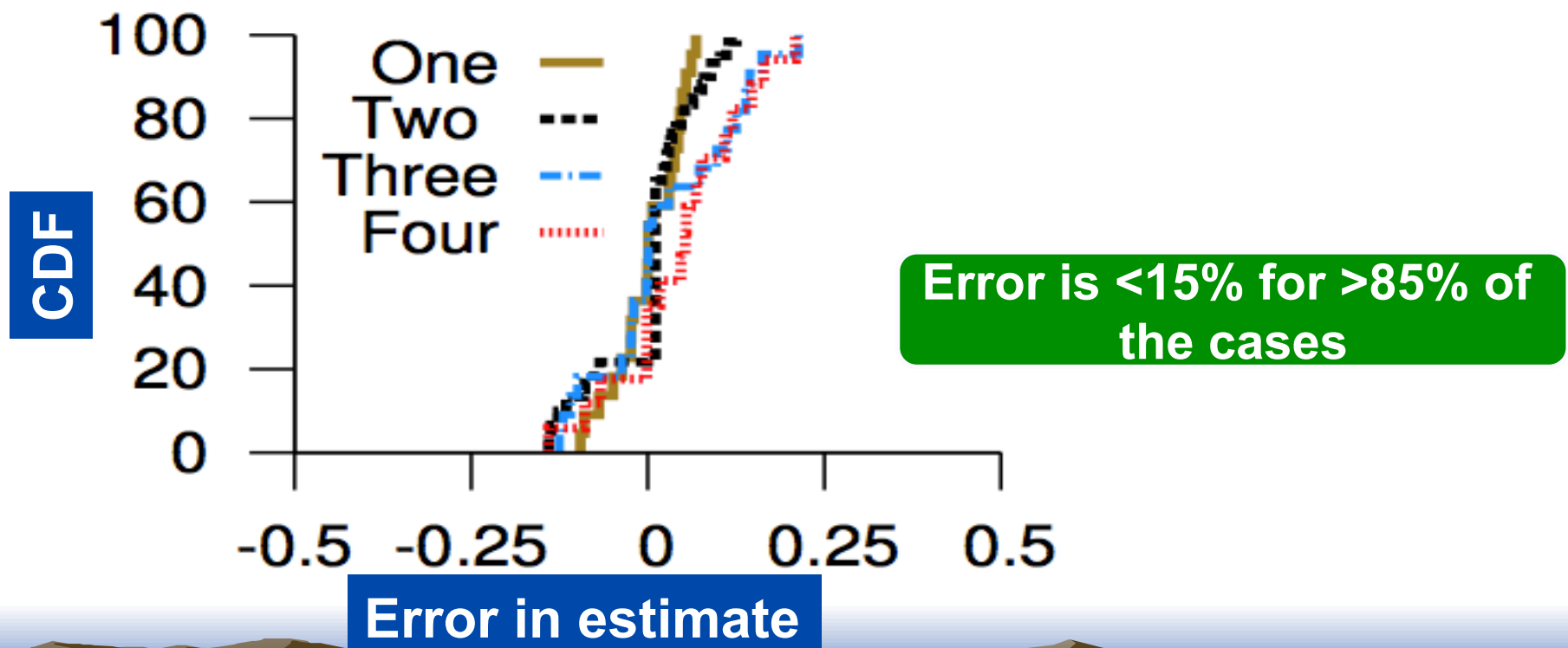
# Interference Estimation Results:

## *Single non-WiFi interferer*

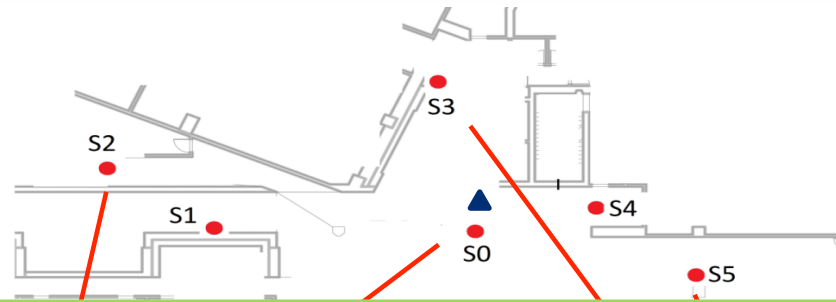


**Error is within 10% for 95% cases**

# Interference Estimation Results: *Multiple non-WiFi interferers*

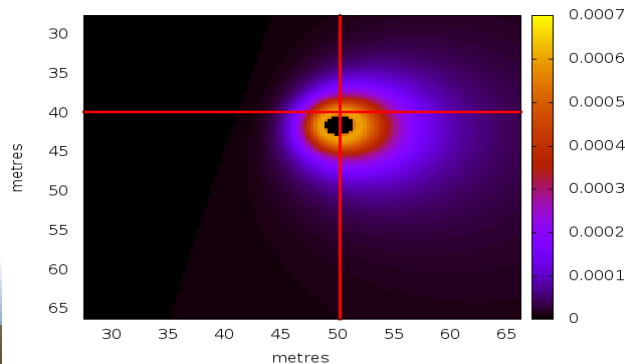


# Model based localization

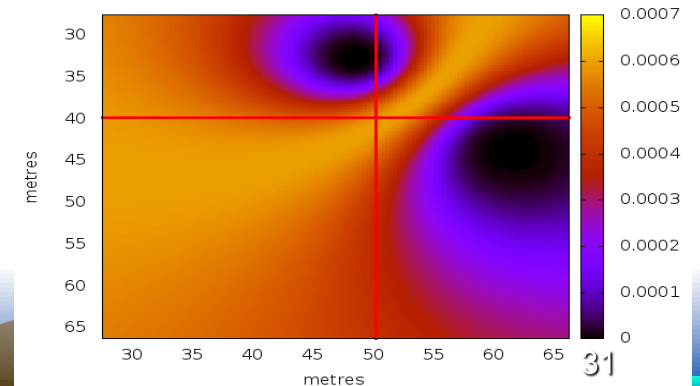


**Feedback from multiple pairs of nodes helps narrow down the device location**

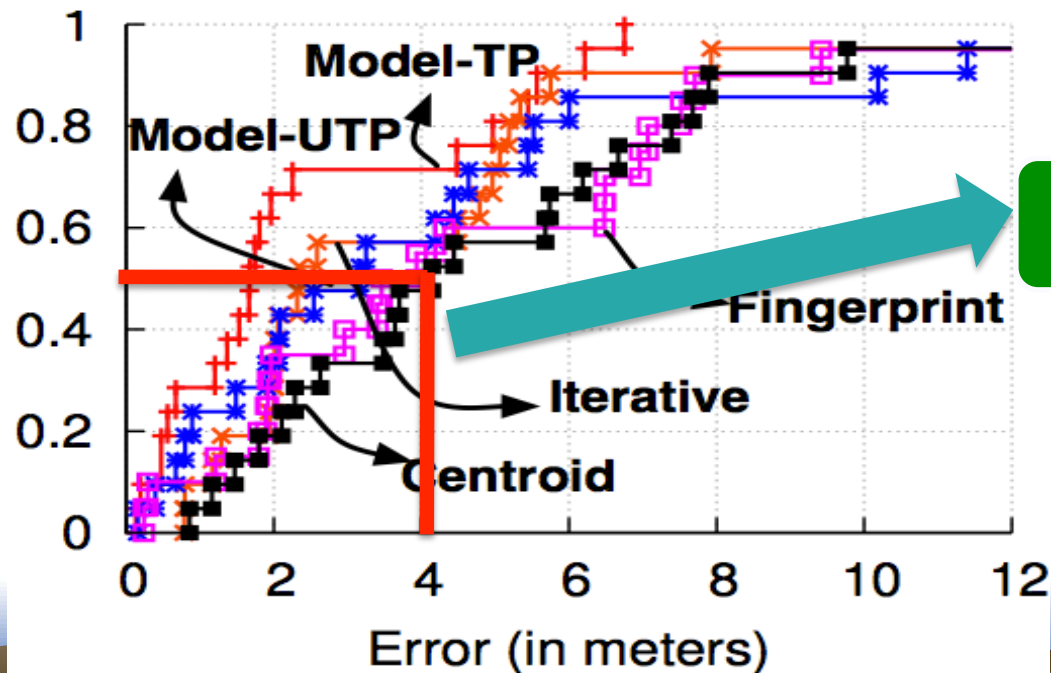
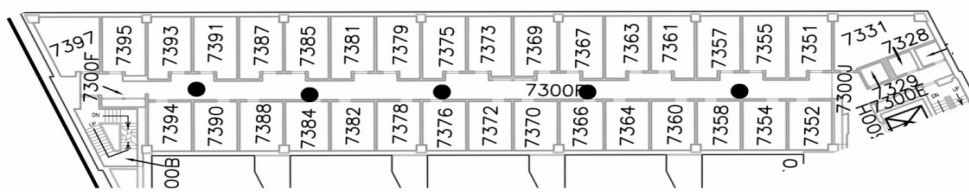
**Feedback from:  
S0, S2**



**Feedback from:  
S3, S5**



# Device Localization Results



Median error <= 4 meters

# Taming Interference



# Today's world of Home WiFi APs



Each AP has to fend for itself



# The SDN approach

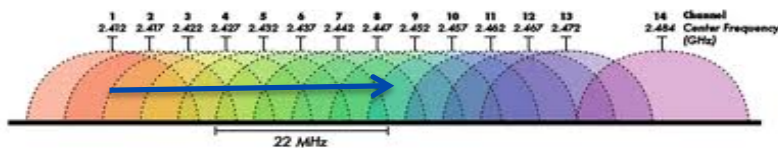
(brings enterprise-style diligence to home APs and much more)



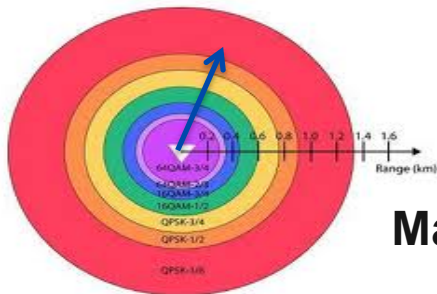
**Controller**



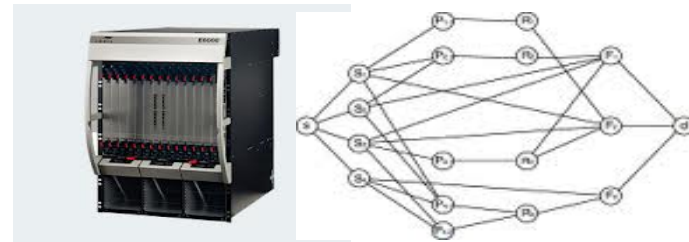
# Interference Mitigation Strategies



Coordinated channel changes



Manage Tx Power



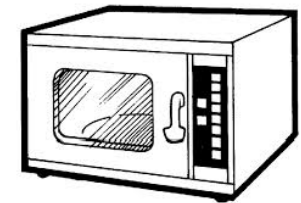
Epoch-based scheduling

**Managed:** Channel Assignments, Power Control,  
Cross-layer Scheduling, Load Balancing & more



# Learning-based configuration

- Microwave comes on at 7pm and stays on for about 30 minutes
- Neighbor starts a Netflix flow late evening



Make proactive configuration  
decisions based on learnt context

# COAP reference implementation

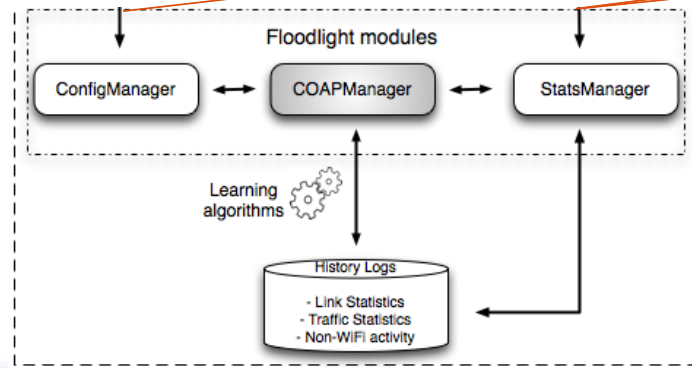
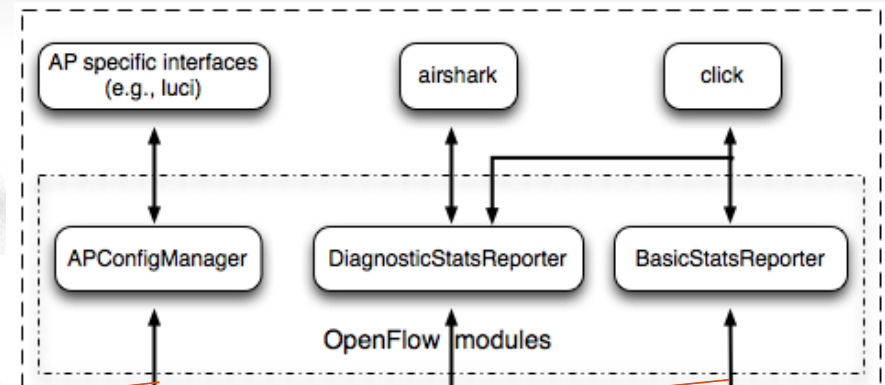
COAP:

Coordination  
framework for

Open  
Access  
Points



Home AP



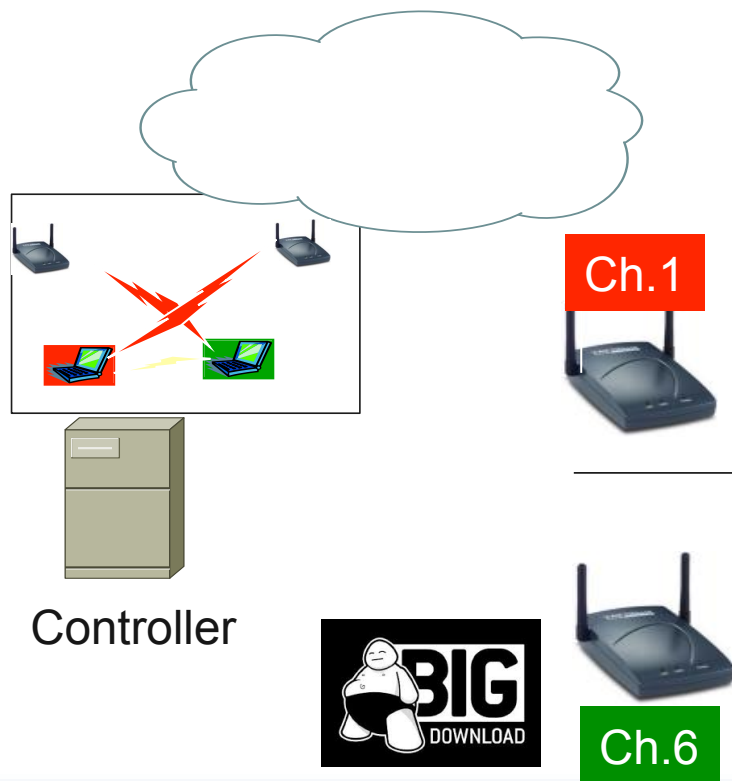
Controller

Implemented using  
a Floodlight controller,  
OpenFlow, and  
OpenWRT APs

# COAP API components

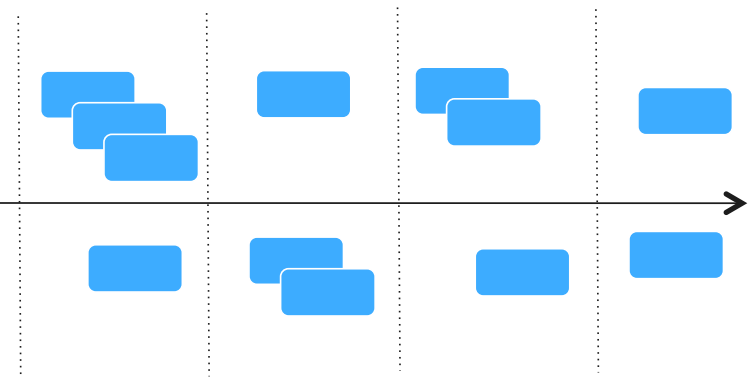
Function
SetParameters (channel, power)
SetAirtimeAccess (slotDur, txBitmap)
GetNeighborInfo()
GetAirtimeUtilization(epoch)
GetClientInfo()
GetLocalLinkStats()
GetTrafficInfo()
GetNonWiFiDevices()
GetPacketSummaries()

# A simple example



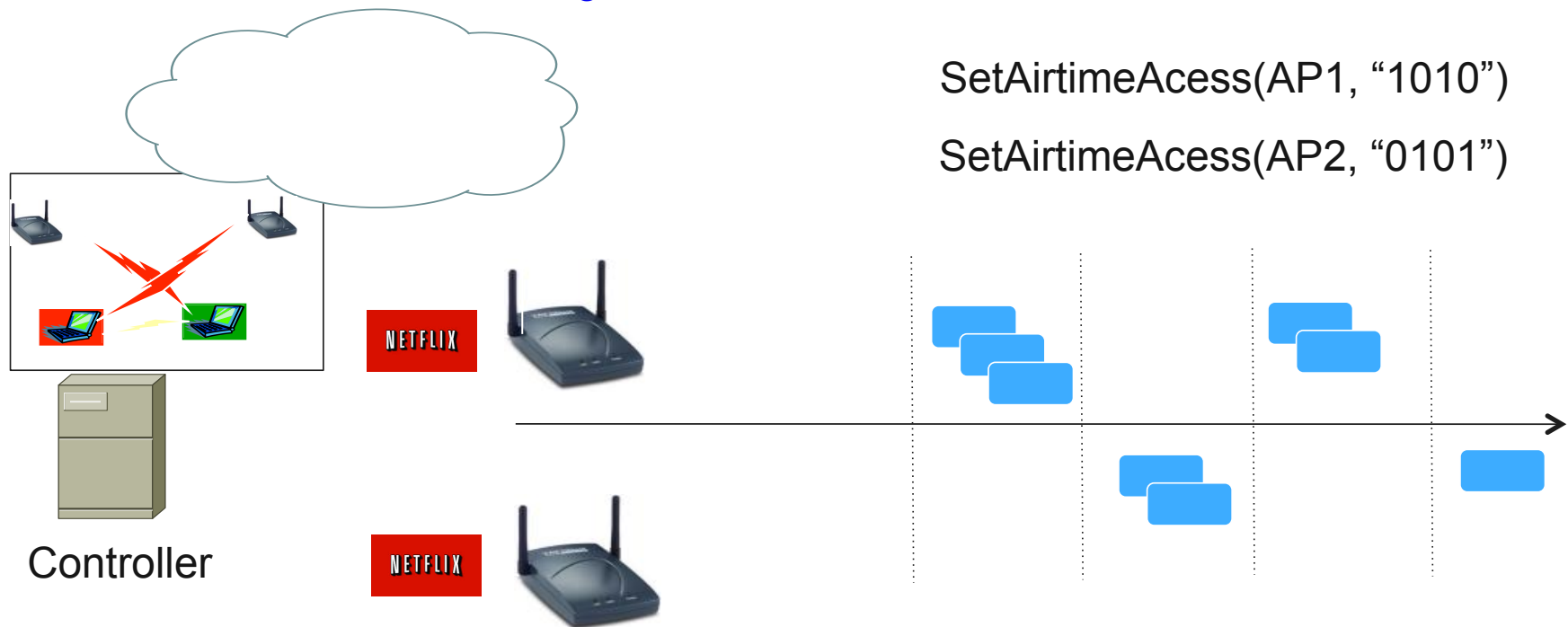
SetParameters(AP1, Channel, 1)

SetParameters(AP2, Channel, 6)



# A simple example

Handling a hidden terminal scenario



# Field Trials



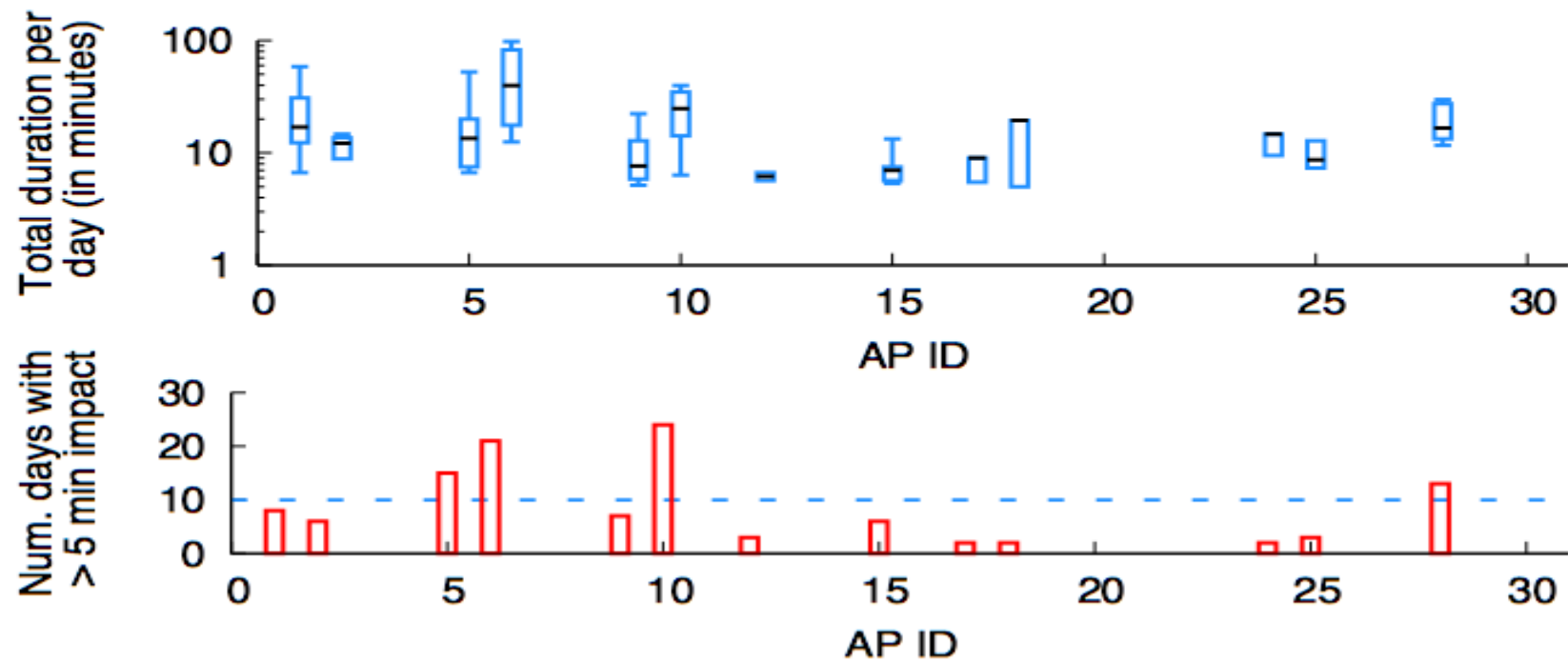
- OpenWRT based APs
  - ALIX 2d2 platform: (500 MHz AMD Geocode CPU, 256 DDR RAM, flash storage)
- 30+ APs deployed in homes & apartment complexes for 2+ years
- COAP Cloud controller hosted in off-the-shelf Linux server



# Understanding poor performance

Indicators				Bldg 1		Bldg 2	
A ↑	S ↓	L ↑	R ↓	V Poor	Poor	V Poor	Poor
Y	X	X	X	0	18.4	0	1
X	X	Y	X	24.2	<b>49.5</b>	25.2	<b>78.1</b>
Y	X	Y	X	<b>61.8</b>	26.7	2.1	1.4
X	Y	Y	X	2.3	1.1	20	15.8
X	Y	Y	Y	9.4	0	<b>51.6</b>	3.4
Others				2.3	4.3	1.1	1.3

# Contention experience



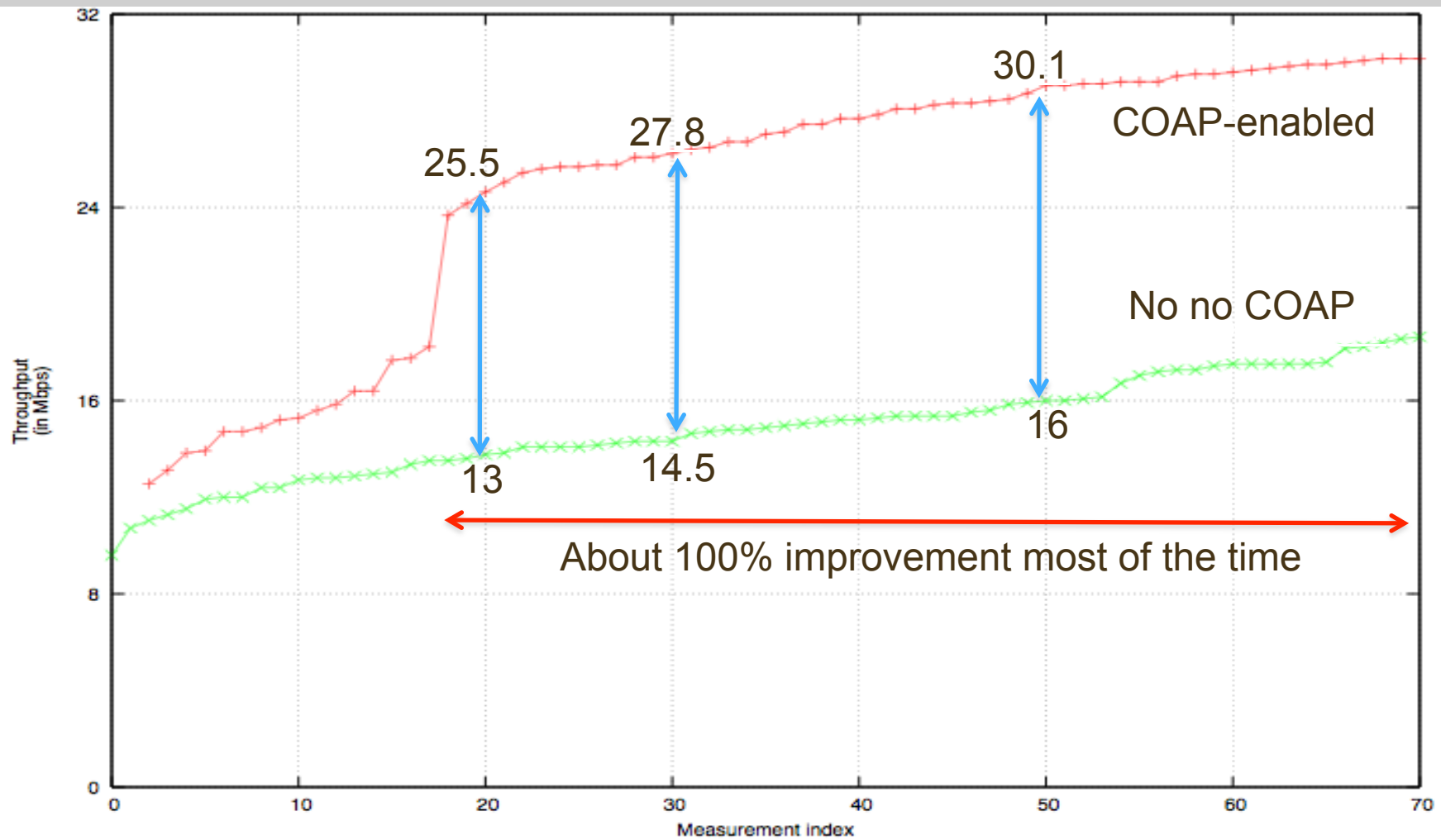
(In a 40 day period)



# Solution advantage

- Compared solution in one of our apartment buildings
- Approach
  - Day 1: COAP completely disabled
  - Day 2: COAP managed
  - Alternated for nearly two weeks





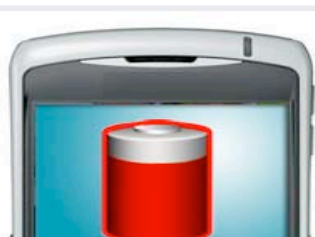
*Data is sorted for the two cases for easier viewing*

## technology review

Published by MIT

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adnant

Meraki Customer Survey - iPads use 400% more WiFi data

MIT's M Control

### Software upgrades could produce self-tuning wireless access points, researchers say

Wi-Fi administrators could manage networks with fewer devices using AirShark

By [Tim Greene](#), Network World  
September 23, 2011 12:19 PM ET

5 Comments | Print

## CNN Tech

Justice | Entertainment | Tech | Health

### one battery life

IN) -- Think you need to buy a new ne to get better battery life?

be not, if researchers get their way.

andful of universities and research labs working on simple changes to Wi-Fi

## Slashdot

stories

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Wi-Fi Card

Posted by tim

from the now-h

## Researchers Combat Wi-Fi RF Interference

University of Wisconsin researchers have developed a cost-effective solution for solving increasing Wi-Fi RF interference issues.



By Samara Lynn

September 26, 2011 01:02pm EST

0 Comments



2



1



An anonymo

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Mary-Jo Foley

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### Microsoft mulls improving hypervisor security for the cloud with Bunker-V

### Airshark: Detecting Non-WiFi RF Devices using Commodity WiFi Hardware

University of Wisconsin, Madison researchers have developed Airshark, software that enables wireless access points to automatically detect radio-frequency interference and make adjustments to preserve the quality of Wi-Fi connections. They say the software could eliminate the need for separate spectrum analyzers that discover interfering devices but do nothing to counter the interference. Airshark can identify Bluetooth and ZigBee devices, cordless phones, wireless video cameras, and Xboxes with at least 91 percent accuracy, depending on the signal strength. Airshark uses a wireless card's application programming interface to gather data about radio frequencies in the surrounding area. The researchers say the program's performance is comparable to a commercial signal analyzer. They also note that if

One more thing

Looking for AP platform partners to deploy COAP

Go to  
[research.cs.wisc.edu/wings/projects/coap](http://research.cs.wisc.edu/wings/projects/coap)

[suman@cs.wisc.edu](mailto:suman@cs.wisc.edu)

Students: Ashish Patro, Dale Willis, Arkodeb Dasgupta, Prakhar Panwaria,  
R Sivasubramanian