

18-452/18-750  
**Wireless Networks and Applications**  
**Lecture 12: MIMO and**  
**WiFi Deployments**

Peter Steenkiste

Spring Semester 2018

<http://www.cs.cmu.edu/~prs/wirelessS18/>

Peter A. Steenkiste, CMU

1

## Outline

- **MIMO and recent WiFi versions**
  - » Refresher: spatial diversity
  - » MIMO basics
  - » Single user MIMO: 802.11n
  - » Multi-user MIMO: 802.11ac
  - » Millimeter wave: 802.11ad
- **WiFi deployments**
  - » Planning
  - » Channel selection
  - » Rate adaptation

Peter A. Steenkiste, CMU

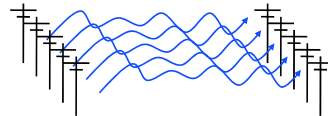
2

## How Do We Increase Throughput in Wireless?

- **Wired world:**  
**Pull more wires!**



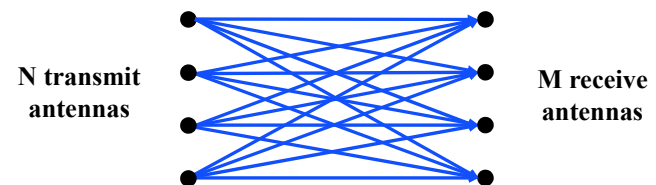
- **Wireless world:**  
**How about if we could do the same thing and simply use more antennas?**



Peter A. Steenkiste, CMU

3

## MIMO Multiple In Multiple Out



- **N x M subchannels that can be used to send multiple data streams simultaneously**
- **Fading on channels is largely independent**
  - » Assuming antennas are separate  $\frac{1}{2}$  wavelength or more
- **Combines ideas from spatial and time diversity, e.g. 1 x N and N x 1**
- **Very effective if there is no direct line of sight**
  - » Subchannels become more independent

Peter A. Steenkiste, CMU

4

## Why So Exciting?

Method	Capacity
SISO	$B \log_2(1 + \rho)$
Diversity (1xN or Nx1)	$B \log_2(1 + \rho N)$
Diversity (NxN)	$B \log_2(1 + \rho N^2)$
Multiplexing	$NB \log_2(1 + \rho)$

802.11 with multiple antennas for dummies, Daniel Halperin, Wenjun Hu, Anmol Sheth, David Wetherall, ACM CCR, Jan 2010

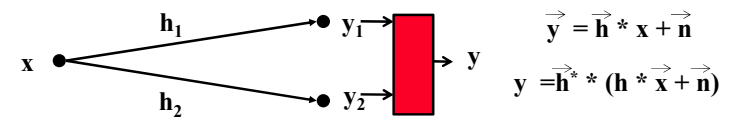
Peter A. Steenkiste, CMU

5

## Spatial Diversity

- Use multiple antennas that pick up the signal in slightly different locations
  - Channels uncorrelated with sufficient antenna separation

- Receiver diversity:  $\vec{y} = \vec{h} * \vec{x} + \vec{n}$



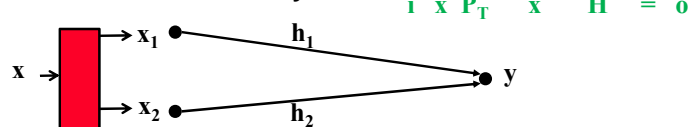
- Receiver can pick strongest signal:  $y_1$  or  $y_2$
- Or combines the signals: multiply  $y$  with the complex conjugate  $\vec{h}^*$  of the channel vector  $\vec{h}$ 
  - Can learn  $\vec{h}$  based on training data (Lecture 5)

Peter A. Steenkiste, CMU

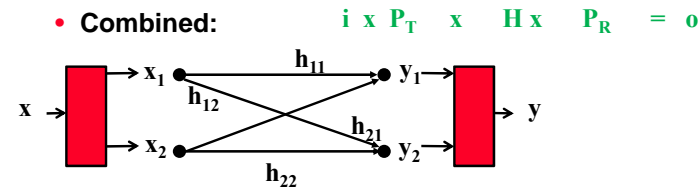
6

## Other Diversity Options

- Transmit diversity:



- Combined:

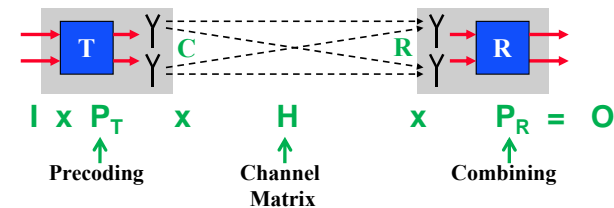


Peter A. Steenkiste, CMU

7

## MIMO How Does it Work?

- Transmit and receive multiple data streams
- Coordinate the processing at the transmitter and receiver to overcome channel impairments
  - Maximize throughput or minimize interference



- Combines previous techniques

Peter A. Steenkiste, CMU

10

## Direct-Mapped NxM MIMO Only Receiver Processing ( $P_T=I$ )

Effect of transmission

$$\vec{R} = \overset{M}{H} * \overset{M \times N}{C} + \overset{N}{N}$$

Decoding

$$\vec{O} = \underset{D}{P_R} * \underset{D \times M}{R} \quad \underset{M}{C} = \underset{N}{I}$$

Results

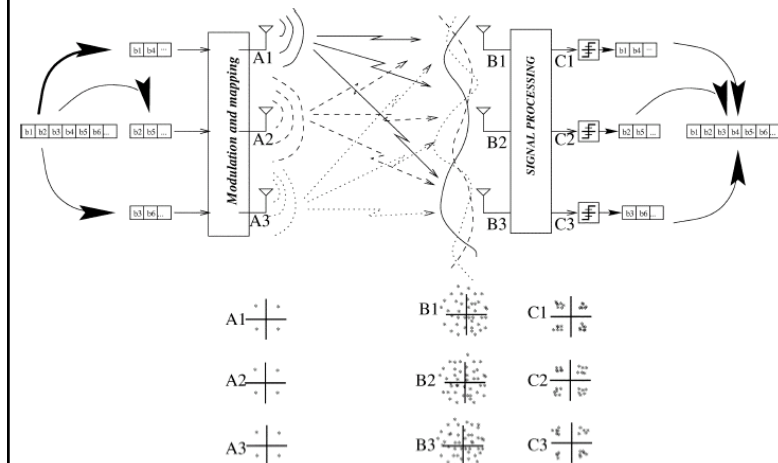
$$\vec{O} = P_R * H * \vec{I} + P_R * \vec{N}$$

- How do we pick  $P_R$ ? “Inverse” of  $H$ :  $H^{-1}$ 
  - » Equivalent of nulling the interfering signals (zero forcing)
  - » Only possible if the paths are completely independent
- Noise amplification is a concern if  $H$  is non-invertible – its determinant will be small

Peter A. Steenkiste, CMU

11

## An Example of Space Coding



## Precoded NxM MIMO

Effect of transmission

$$\vec{R} = \overset{M}{H} * \overset{M \times N}{C} + \overset{N}{N}$$

Coding/decoding

$$\vec{O} = \underset{D}{P_R} * \underset{D \times M}{R} \quad \underset{M}{C} = \underset{N}{P_T} * \underset{D}{I}$$

Results

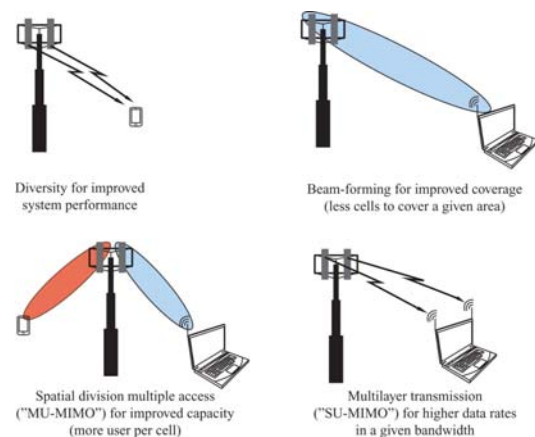
$$\vec{O} = P_R * H * P_T * \vec{I} + P_R * \vec{N}$$

- How do we pick  $P_R$  and  $P_T$ ?
- Singular value decomposition of  $H = U * S * V$ 
  - »  $U$  and  $V$  are unitary matrices –  $U^H * U = V^H * V = I$
  - »  $S$  is diagonal matrix

Peter A. Steenkiste, CMU

13

## Mechanisms Supported by MIMO



Peter A. Steenkiste, CMU

15

## MIMO Discussion

- **Need channel matrix H: use training with known signal**
- **So far we have ignored multi-path**
  - » Each channel is multiple paths with different properties
  - » Becomes even messier!
- **MIMO is used in 802.11n**
  - » Can use two adjacent non-overlapping “WiFi channels”
  - » Raises lots of compatibility issues
  - » Potential throughputs of 100s of Mbps
- **Focus is on maximizing throughput between two nodes**
  - » Is this always the right goal?

Peter A. Steenkiste, CMU

16

## 802.11n Overview

- **802.11n extends 802.11 for MIMO**
  - » Supports up to 4x4 MIMO
  - » Preamble that includes high throughput training field
- **Standardization was completed in Oct 2009, but, early products had long been available**
  - » WiFi alliance started certification based on the draft standard in mid-2007
- **Supported in both the 2.4 and 5 GHz bands**
  - » Goal: typical indoor rates of 100-200 Mbps; max 600 Mbps
- **Use either 1 or 2 non-overlapping channels**
  - » Uses either 20 or 40 MHz
  - » 40 MHz can create interoperability problems
- **Supports frame aggregation to amortize overheads over multiple frames**
  - » Optimized version of 802.11e

Peter A. Steenkiste, CMU

17

## 802.11n Backwards Compatibility

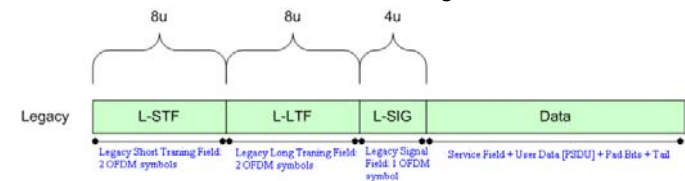
- **802.11n can create interoperability problems for existing 802.11 devices (abg)**
  - » 802.11n does not sense their presence
  - » Legacy devices end up deferring and dropping in rate
- **Mixes Mode Format protection embeds an n frame in a g or a frame**
  - » Preamble is structured so legacy systems can decode header, but MIMO can achieve higher speed (training, cod/mod info)
  - » Works only for 20 MHz 802.11n use
  - » Only deals with interoperability with a and g – still need CTS protection for b
- **For 40 MHz 802.11n, we need CTS protection on both the 20 MHz channels – similar to g vs. b**
  - » Can also use RTS/CTS (at legacy rates)
  - » Amortize over multiple transmissions

Peter A. Steenkiste, CMU

18

## Interoperability Uses PLC in Three Modes

- **Legacy mode: use 802.11a/g OFDM format**
  - » The L-SIG field contains rate and length information

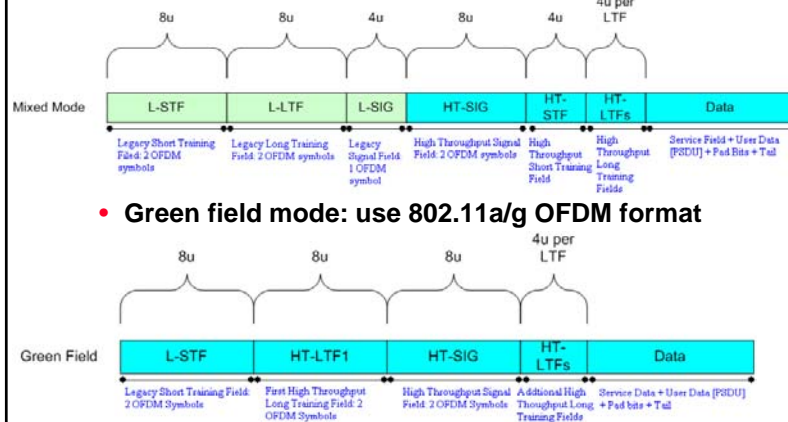


- **Mixed mode:**
  - » Include both an 802.11a/g and 802.11n PLC
  - » See next slide for figure
  - » 802.11n devices can interpret green field, which includes the L-SIG field (rate and length information)

Peter A. Steenkiste, CMU [http://rfmw.em.keysight.com/wireless/helpfiles/n7617a/mimo\\_ofdm\\_signal\\_structure.htm](http://rfmw.em.keysight.com/wireless/helpfiles/n7617a/mimo_ofdm_signal_structure.htm)

19

## Interoperability: High Throughput (HT) Modes

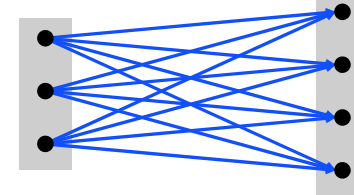


- **Green field mode: use 802.11a/g OFDM format**

Peter A. Steenkiste, CMU [http://rfmw.cm.csight.com/wireless/helpfiles/n7617a/mimo\\_ofdm\\_signal\\_structure.htm](http://rfmw.cm.csight.com/wireless/helpfiles/n7617a/mimo_ofdm_signal_structure.htm) 20

## MIMO in a Network Context

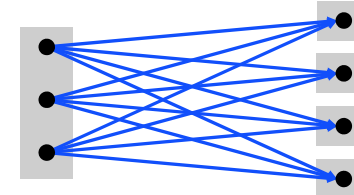
N transmit  
antennas



M receive  
Antennas  
-  
1 receiver

**How is this Different?**

N transmit  
antennas



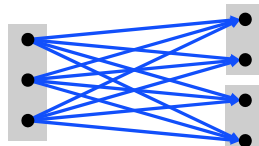
M receive  
antennas  
-  
M receivers

Peter A. Steenkiste, CMU

21

## Multi-User MIMO Discussion

- **Math is similar to MIMO, except for the receiver processing ( $P_R$ )**
  - › Receivers do not have access to the signals received by antennas on other nodes
  - › Cannot cancel interference – limits ability to extract useful data
  - › Can only do transmit-side preprocessing
- **MU-MIMO versus MIMO is really a tradeoff between TDMA and use of space diversity**
  - › Sequential short packets versus parallel long packets

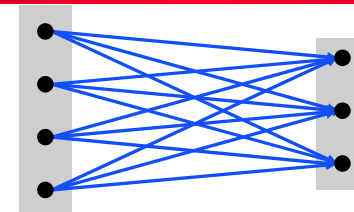


Peter A. Steenkiste, CMU

22

## How about This?

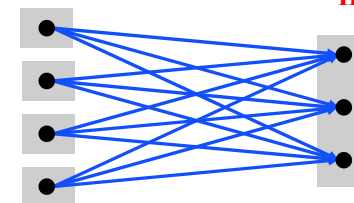
N transmit  
antennas



M receive  
Antennas  
-  
1 receiver

**How is this Different?**

N transmit  
antennas



M receive  
antennas  
-  
M receivers

Peter A. Steenkiste, CMU

23

## Multi-User MIMO Up versus Down Link

- Assume an AP with multiple clients
- Uplink: Multiple Access Channel (MAC)
  - » Multiple clients transmit simultaneously to a single base station
  - » Requires fine grain clock coordination among clients on packet transmission – hard problem!
- Downlink: Broadcast Channel (BC)
  - » Base station transmit separate data streams to multiple independent users
  - » Easier to do: closer to traditional models of having each client receive a packet from the base station independently

Peter A. Steenkiste, CMU

24

## 802.11ac Multi-user MIMO

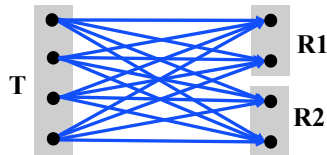
- Extends beyond 802.11n
  - » MIMO: up to 8 x 8 channels (vs. 4 x 4)
  - » More bandwidth: up to 160 MHz by bonding up to 8 channels (vs. 40 MHz)
  - » More aggressive signal coding: up to 256 QAM (vs. 64 QAM); both use 5/6 coding rate (data vs. total bits)
  - » Uses RTS-CTS for clear channel assessment
  - » Multi-gigabit rates (depends on configuration)
- Support for multi-user MIMO on the downlink
  - » Can support different frames to multiple clients at the same time
  - » Especially useful for smaller devices, e.g., smartphones
  - » Besides beam forming to target signal to device, requires also nulling to limit interference

Peter A. Steenkiste, CMU

25

## Challenges in 802.11ac

- You must have traffic for multiple receivers!
- Channels to the receivers be “orthogonal”



$$R1: O_1 = P_{R1} * H_1 * P_T * I + P_{R1} * N$$

$$R2: O_2 = P_{R2} * H_2 * P_T * I + P_{R2} * N$$

- » The signal that you create with the packet for one destination should have a “null” for the other destination(s)
- » Important since the other receivers cannot cancel out that signal
- Becomes a scheduling problem: for each “packet” transmission, identify the destinations that have traffic waiting and that are “the most” orthogonal

Peter A. Steenkiste, CMU

26

## 802.11ad 60 GHz WiFi

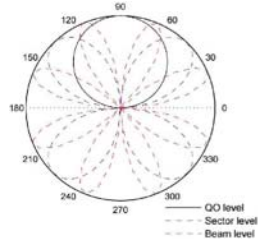
- Uses a new physical layer definition specifically for 60 GHz band
  - » Very different signal propagation properties
  - » Does not penetrate walls, but does work with reflections
  - » Shorter distances; up to 7 Gbps
  - » 6 channels of 2.16 GHz
- Compatible with 802.11 in 2.4 / 5 GHz bands
  - » Backwards compatible MAC
  - » E.g., mobile devices can switch between bands
- Has been used for point-point links for a while
  - » APs now available
  - » Combined with other 802.11 versions

Peter A. Steenkiste, CMU

27

## Optimizing Communication in 802.11ad

- **Transmission range in 60 GHz is limited**
- **Must use directional antennas to direct energy to the receiver**
  - » Increases range and throughput (high signal strength)
  - » Also reduces interference at other nodes!
- **Good news: antenna size scales with wave length**
  - » Small antennas and narrow beams
- **Bad news: how do nodes find each other?**
  - » Use iterative algorithm, starting with wider beams



Peter A. Steenkiste, CMU

28

## Outline

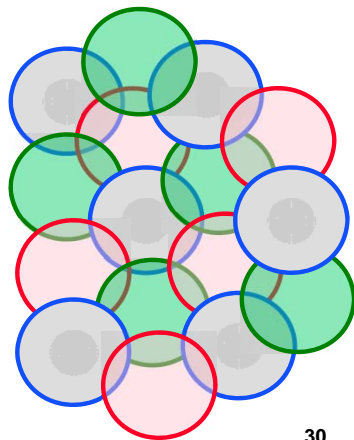
- **WiFi deployments**
  - » Planning
  - » Channel selection
  - » Rate adaptation

Peter A. Steenkiste, CMU

29

## Infrastructure Deployments Frequency Reuse in Space

- **Set of cooperating cells with a base stations must cover a large area**
- **Cells that reuse frequencies should be as distant as possible to minimize interference and maximize capacity**
  - » Hidden and exposed terminals are also a concern

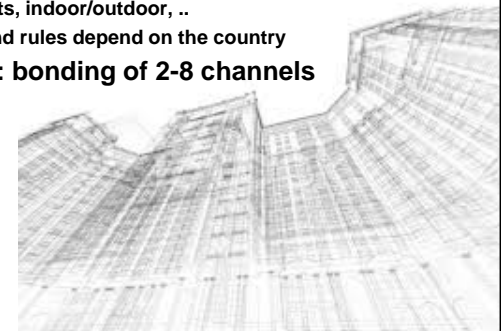


Peter A. Steenkiste, CMU

30

## Frequencies are Precious

- **2.4 GHz: 3 non-overlapping channels**
  - » Plus lots of competition: microwaves and other devices
- **5 GHz: 20+ channels, but with constraints**
  - » Power constraints, indoor/outdoor, ..
  - » Exact number and rules depend on the country
- **802.11n and ac: bonding of 2-8 channels**
- **And the world is not flat!**



Peter A. Steenkiste, CMU

## Frequency Planning

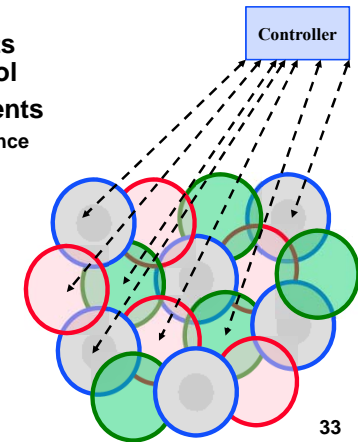
- **Campus-style WiFi deployments are very carefully planned:**
- **A lot of measurements to determine where to place the AP**
  - » What is the coverage area?
  - » What set of APs has good coverage with few “dead spots”
  - » What level of interference can we expect between cells
  - » What traffic loads can we expect, e.g., auditorium vs office
- **Frequencies are very carefully assigned**
  - » Can use the above measurements
- **Must periodically re-evaluate infrastructure**
  - » Furniture is moved, remodeling, ...

Peter A. Steenkiste, CMU

32

## Centralized Control

- **Many WiFi deployments have centralized control**
- **APs report measurements**
  - » Signal strengths, interference from other cells, load, ...
- **Controller makes adjustments**
  - » Changes frequency bands
  - » Adjusts power
  - » Redistributes load
  - » Can switch APs on/off
  - » Very sophisticated!



Peter A. Steenkiste, CMU

33

## Monitoring the Spectrum

- **FCC (in the US) controls spectrum use**
  - » Rules for unlicensed spectrum, licenses for other spectrum, what technologies can be used
- **... but there is an special clause for campuses**
  - » They have significant control over unlicensed spectrum use on the campus
  - » They can even use some “licensed” spectrum if it does not interfere with the license holder
- **Network management carefully monitors spectrum use to make sure it is used well**
  - » Shut down rogue APs – interference, security
  - » Non-approved equipment - interference
  - » Discourages outdated standards - inefficient

Peter A. Steenkiste, CMU

34

## How about Small Networks?

- **Most WiFi networks are small and (largely) unmanaged**
  - » Home networks, hotspots, ...
- **Traditional solution: user-chosen frequency of their AP or a factory set default**
  - » How well does that work?
- **Today, APs pick a channel automatically in a smart way**
  - » Monitors how busy channels are or how strong the signals are and then picks the best channel
  - » Can periodically check for better channels

Peter A. Steenkiste, CMU

35



## Outline

- WiFi deployments and channel selection
- Rate adaptation
  - » Background
  - » RRAA
  - » Charm

Peter A. Steenkiste, CMU

36

## Bit Rate Adaptation

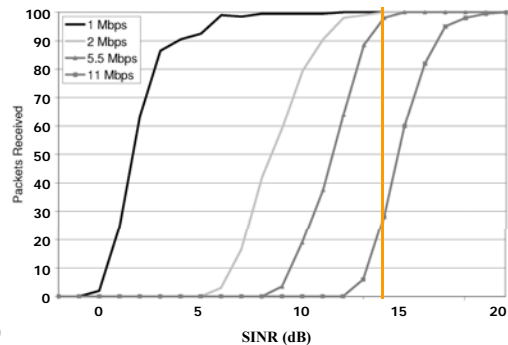
- All modern WiFi standards are multi bit rate
  - » 802.11b has 4 rates, more recent standards have 10s
  - » Vendors can have custom rates!
- Many factors influence packet delivery:
  - » Fast and slow fading: nature depends strongly on the environment, e.g., vehicular versus walking
  - » Interference versus WiFi contention: response to collisions is different
  - » Random packet losses: can confuse “smart” algorithms
  - » Hidden terminals: decreasing the rate increases the chance of collisions
- Transmit rate adaptation: how does the sender pick?

Peter A. Steenkiste, CMU

37

## Transmit Rate Selection

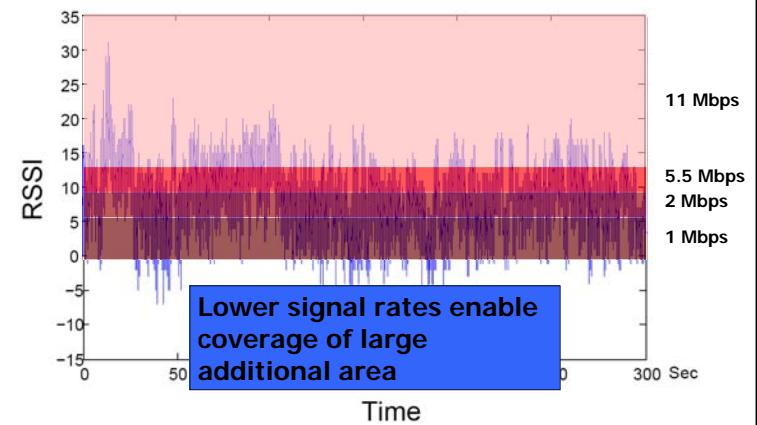
- Goal: pick rate that provides best throughput
  - » E.g. SINR 14 dB  $\rightarrow$  5.5 Mbps
  - » Needs to be adaptive



Peter A. Steenkiste, CMU

38

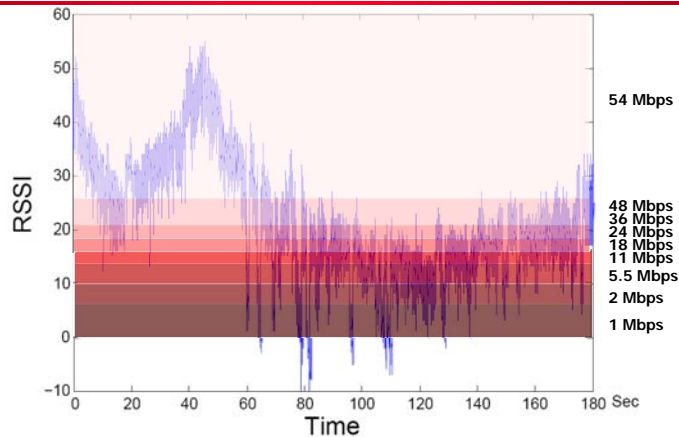
## “Static” Channel



Peter A. Steenkiste, CMU

39

## Mobile Channel – Pedestrian



Peter A. Steenkiste, CMU

40

## High Level Designs

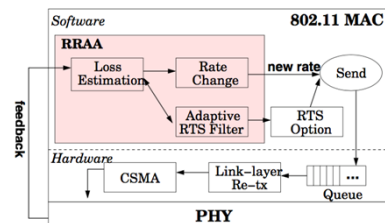
- “Trial and Error”: senders use past packet success or failures to adjust transmit rate
  - » Sequence of x successes: increase rate
  - » Sequence of y failures: reduce rate
  - » Hard to get x and y right
  - » Random losses can confuse the algorithm
- Signal strength: stations use channel state information to pick transmit rate
  - » Use path loss information to calculate “best” rate
  - » Assumes a relationship between PDR and SNR
    - Need to recover if this fails, e.g., hidden terminals
- Newest class: context sensitive solutions
  - » Adjust algorithm depending on, e.g., degree of mobility, ..

Peter A. Steenkiste, CMU

41

## Robust Rate Adaptation Algorithm

- RRAA goals
  - » Maintain a stable rate in the presence of random loss
  - » Responsive to drastic channel changes, e.g., caused by mobility or interference
- Adapt rate based on short term PDR
 
$$R_{new} = \begin{cases} R^+ & P > P_{MTL} \\ R_- & P < P_{ORT} \end{cases}$$
  - » Thresholds and averaging windows depend on rate
- Selectively enable RTS-CTS



Peter A. Steenkiste, CMU

42

## CHARM

- Channel-aware rate selection algorithm
- Transmitter passively determines SINR at receiver by leveraging channel reciprocity
  - » Determines SINR without the overhead of active probing (RTS/CTS)
- Select best transmission rate using rate table
  - » Table is updated (slowly) based on history
  - » Needed to accommodate diversity in hardware and special conditions, e.g., hidden terminals
- Jointly considers problem of transmit antenna selection

Peter A. Steenkiste, CMU

43

## SINR: Noise and Interference

$$\text{SINR} = \frac{\text{RSS}}{\text{Noise} + \sum \text{Interference}}$$

- **Noise**
  - » Thermal background radiation
  - » Device inherent
    - Dominated by low noise amplifier noise figure
  - » ~Constant
- **Interference**
  - » Mitigated by CSMA/CA
  - » Reported as “noise” by NIC

Peter A. Steenkiste, CMU

44

## SINR: RSS

$$\text{RSS} = P_{tx} + G_{tx} - PL + G_{rx} \quad (1)$$



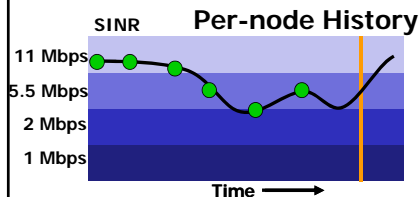
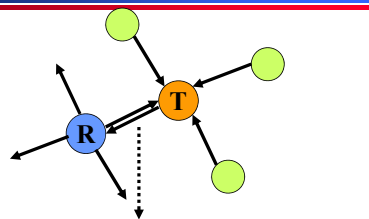
$$PL = P_{tx} + G_{tx} + G_{rx} - \text{RSS} \quad (2)$$

- By the reciprocity theorem, at a given instant of time
  - »  $PL_{A \rightarrow B} = PL_{B \rightarrow A}$
- A overhears packets from B and records RSS (1)
- Node B records  $P_{tx}$  and card-reported noise level in beacons and probes, so A has access to them
- A can then calculate path-loss (2) and estimate RSS and SINR at B

Peter A. Steenkiste, CMU

45

## CHARM: Channel-aware Rate Selection



- **Leverage reciprocity to obtain path loss**
  - » Compute path loss for each host:  $P_{tx} - \text{RSSI}$
- **On transmit:**
  - » Predict path loss based on history
  - » Select rate & antenna
  - » Update rate thresholds

Peter A. Steenkiste, CMU

46