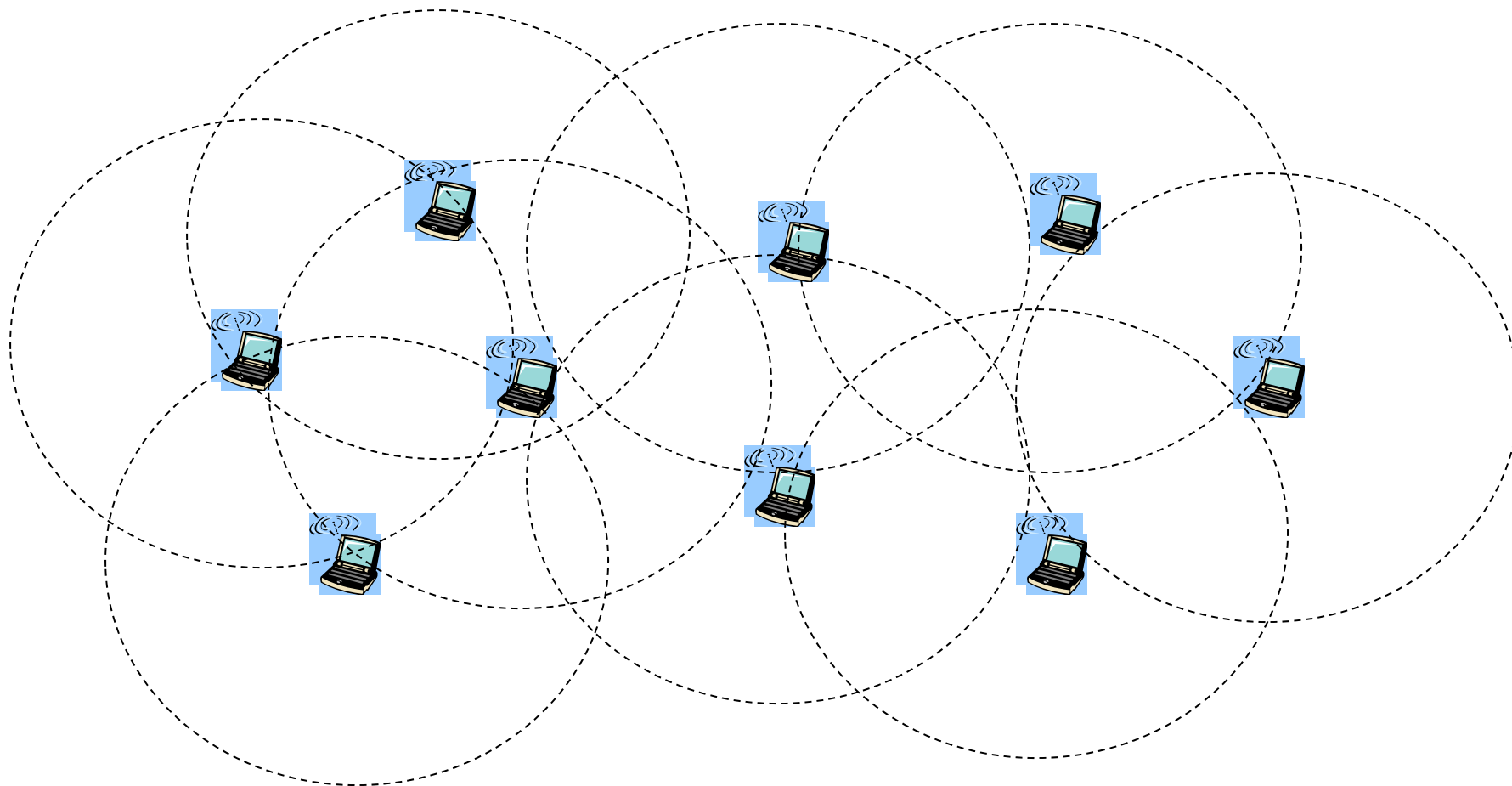


Lecture 5. Multiple Access

- Overview of Multiple Access
- Centralized MAC
- Distributed MAC
- Case Study: WiFi

What is Multiple Access?



- Broadcast channel
- How to share the channel?

Multiple Access

Ideal MAC

- Sum rate (system throughput) $\sum_{k=1}^K R_k$ High throughput
- Rate of each single user R_k Fairness
- Complexity Low complexity
-

-
- Resource Allocation A central controller is required to perform the optimal resource allocation.
 - Given the resources (time, frequency, antennas, power, ...), how to maximize the system objective (sum rate, average user rate, ...)?
 - Protocol Design Minimum system control, fully distributed
 - What is the simplest way to determine how nodes share the channel?

Centralized MAC vs. Distributed MAC

Centralized MAC

- Resource allocation
- Joint processing of users' information
- Multiuser information theory
 - Perfect system guidance and performance evaluation
 - Bursty arrival is not taken into consideration

Distributed MAC

- Resource competition
- No joint transmission/detection
(A “collision” occurs if more than one user transmits. None of them can succeed.)
- Random access theory
 - Simple, scalable
 - No unified framework

- CDMA, OFDMA and Scheduling

- Aloha and CSMA

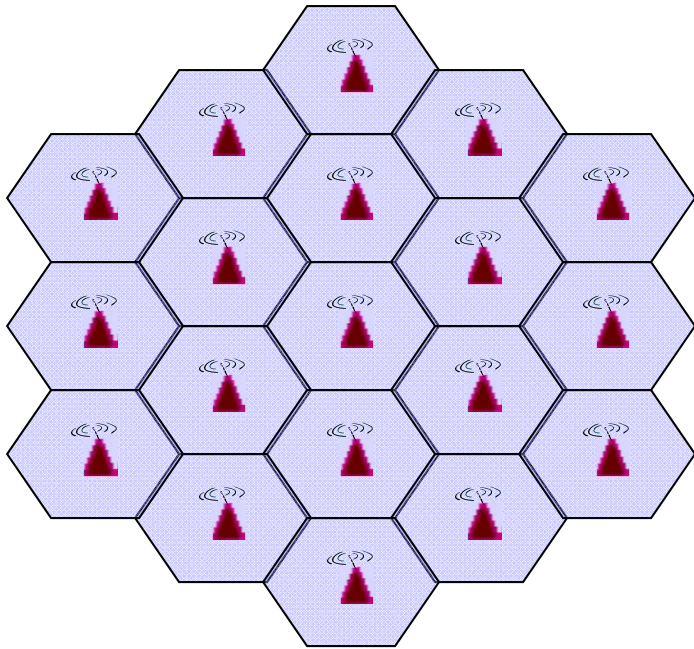
Centralized MAC I: MAC of Wideband Cellular Networks

- CDMA
- OFDMA
- Scheduling

A little bit of History

- 1st Generation: AMPS, TACS, NMT
- 2nd Generation: GSM, IS-136, IS-95
 - 2.5G: GPRS, EDGE
- 3rd Generation: WCDMA, CDMA2000, TD-SCDMA
- 4th Generation: WiMAX, LTE, LTE Advanced

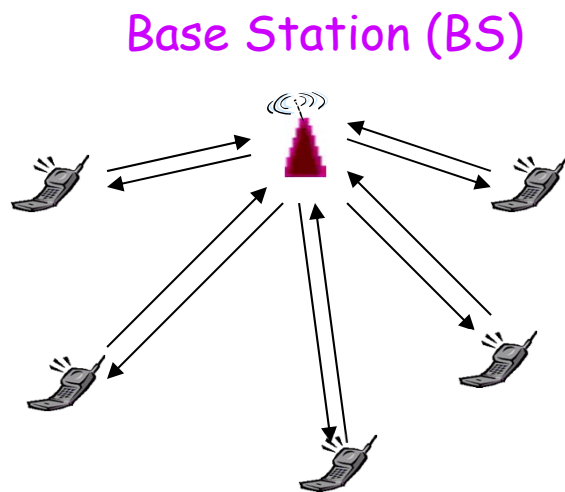
Cellular Networks



- Intra-cell: How to allocate resources to different users inside the cell?
 - FDMA, TDMA, CDMA, OFDMA, SDMA, ...
- Inter-cell: How to overcome the interference outside the cell?
 - Avoid - Average out - Cancel
- How to manage cells?
 - Cell planning - Cell cooperation

- | | | |
|--------------------------|---|-------------------------------|
| • Voice and data service | ⇒ | • Provide distinct QoS |
| • Expensive spectrum | ⇒ | • Improve spectral efficiency |
| • Large-scale network | ⇒ | • Decompose the network |

Uplink vs. Downlink



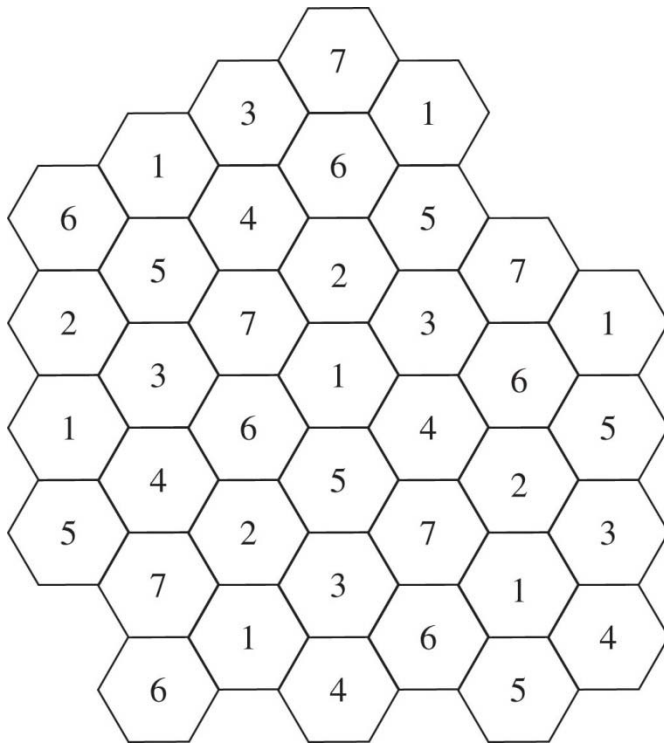
BS→user: downlink

user→BS: uplink

- Synchronization
 - Easier in downlink because all the signals originate from the same transmitter (BS)
- Power control
 - More crucial for uplink because the receive signals experience distinct channels
- Channel measurement
 - Easier in downlink because BS can send a strong pilot signal
- Data rate requirement
 - Higher in downlink (for data service)

- Duplexing: How to allocate resources between uplink and downlink
 - Time Division Duplex (TDD) or Frequency Division Duplex (FDD)

Narrowband Cellular Network (e.g. GSM)



- Intra-cell: TDMA
 - Users are allocated different time slots.
- Inter-cell: Avoid the interference
 - Frequency reuse factor: $1/7$
- Complicated cell planning
- Hard handoff

- ✓ No intra- or inter-cell interference
- ✓ Inefficient use of resources

Wideband Cellular Network

- Universal frequency reuse
 - Share the bandwidth
- Cell cooperation
 - Soft handoff
- Flexible resource allocation
 - Allocate on-demand
 - Exploit the channel condition

Examples:

- CDMA (e.g. IS-95, WCDMA, CDMA2000, TD-SCDMA)
- OFDMA (e.g. Flash-OFDM, WiMAX, LTE)
- Channel-aware Scheduling (e.g. CDMA 1xEVDO, HSDPA)

Wideband Cellular (1): CDMA

- Intra-cell: CDMA
 - Users are allocated different PN sequences.
 - Inter-cell: average out the interference
 - Fluctuations of aggregate interference in adjacent cells are reduced when there are many users in the network.
-
- ✓ Decompose the network problem into a set of independent point-to-point links, while each link sees both interference (regardless of intra-cell or inter-cell) and background thermal noise.
 - ✓ Simple transceiver design
 - ✓ Soft capacity

CDMA Uplink vs. Downlink

Uplink (users-BS)

- Near-far effect (power control is crucial)
- Intra-cell interference (chip-level synchronization is required to keep users orthogonal)
- Interference averaging
- Non-coherent demodulation
- Multiuser detector is affordable

Downlink (BS-users)

- No near-far problem
- Much smaller intra-cell interference
- Less interference averaging due to few base stations
- Coherent demodulation (strong pilot)
- Rake receiver

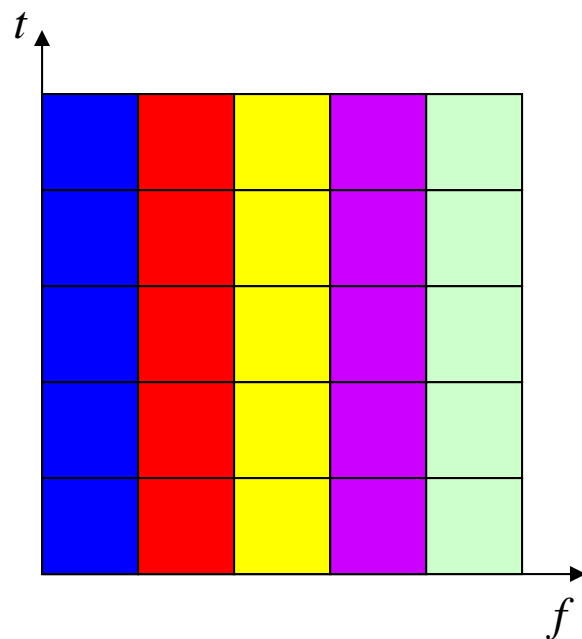
Wideband Cellular (2): OFDMA

- Intra-cell: OFDMA
 - Users are allocated different subcarriers using OFDM.
 - No intra-cell interference.
- Inter-cell: average out the interference
 - Hopping

-
- ✓ Flexible resource allocation
 - ✓ Abundant frequency and time units
 - ✓ Various allocation strategies

Hopping Pattern

Resources: 5 by 5 time-frequency units. To be allocated to 5 users.



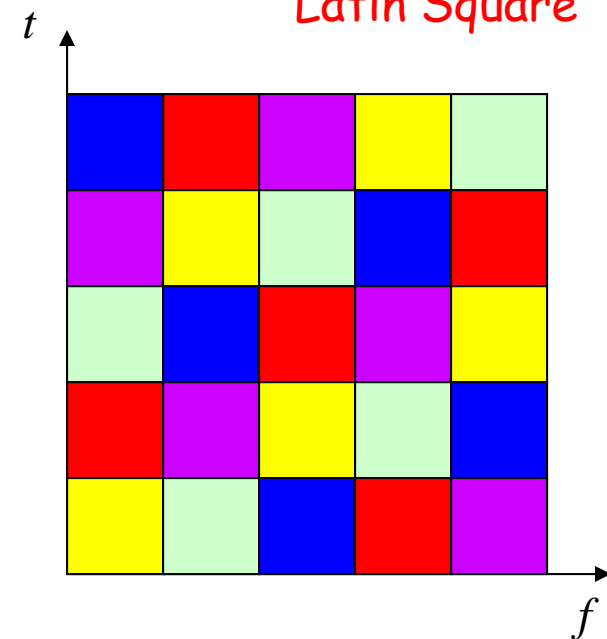
No interference averaging.
Similar to a narrowband system.

• Users should be spread out.



• fair allocation

Latin Square



Each user sees interference from many users instead of a single strong user.

CDMA vs. OFDMA

CDMA

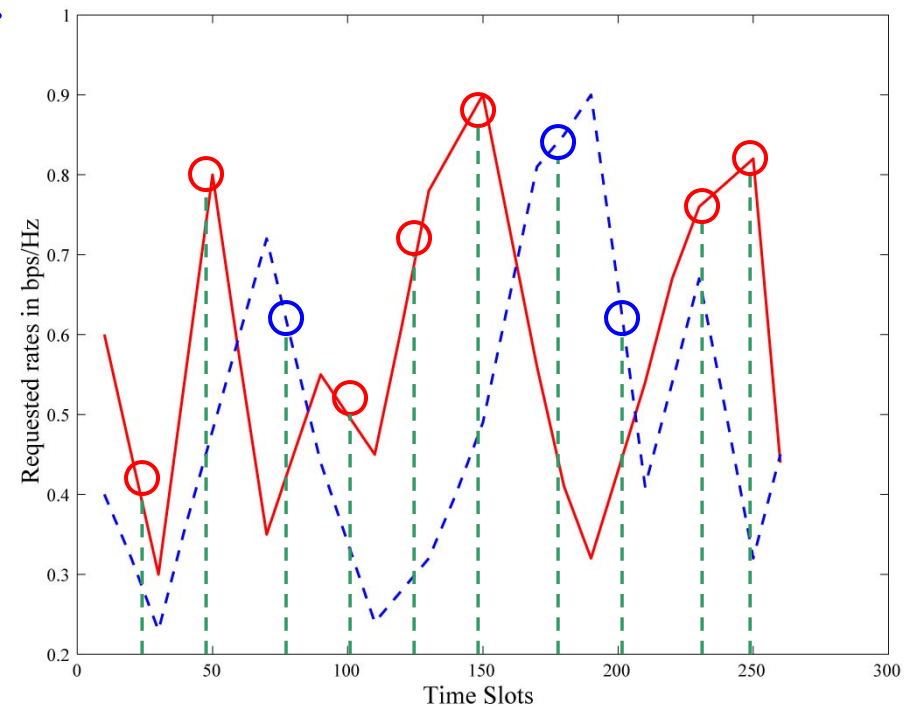
- Universal frequency reuse
- Inter-cell interference averaged
- Significant intra-cell interference
- Tight power control
 - "expensive" for users who only transmit infrequently
 - incur delay
- Fewer degrees of freedom
- Medium PAPR
(Peak-to-Average Power Ratio)

OFDMA

- Universal frequency reuse
- Inter-cell interference averaged
- No intra-cell interference
- Timing and frequency synchronization
- Adaptive resource allocation
- High PAPR

Wideband Cellular (3): Channel-aware Scheduling

- Intra-cell: channel-aware scheduling
 - Users are allocated different time slots according to their channel conditions: **select the best user at each time slot.**
 - No intra-cell interference.
- Inter-cell: opportunistically avoid the interference



CDMA vs. Channel-aware Scheduling

CDMA

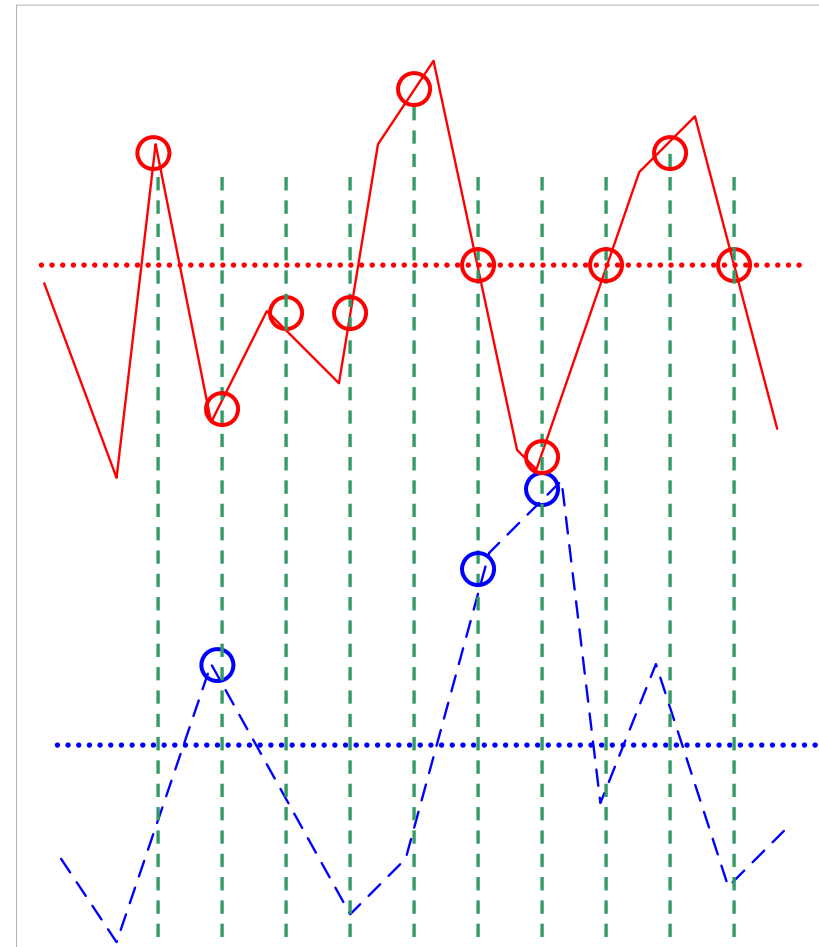
- Average out channel fluctuations
- Track slow fluctuations
- Power control
- Average out inter-cell interference
- Support tight delay

Channel-aware Scheduling

- Exploit channel fluctuations
- Track as many fluctuations as possible
- Rate control
- Opportunistically avoid inter-cell interference
- Need some laxity

More about Channel-aware Scheduling

- Fairness
 - Hit the “peak”
- Channel measurement and feedback
 - Fast channel tracking
- Channel fluctuations
 - Too fast
 - Too slow



“Opportunistic Beamforming”
Introducing randomness

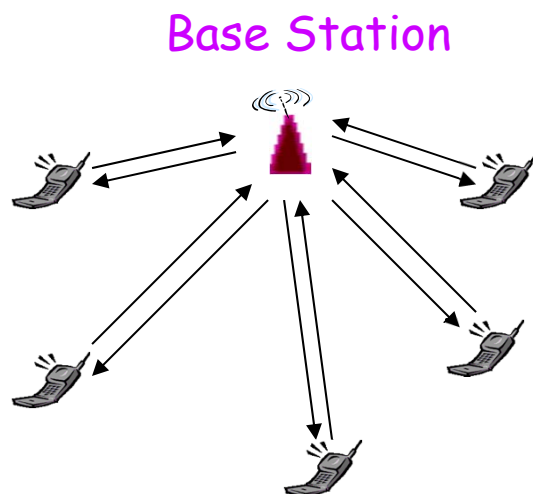
Summary I: MAC of Wideband Cellular Networks

	CDMA	OFDMA	Channel-aware Scheduling
Intra-cell Resources	PN Sequences	Subcarriers & Time slots	Time slots
Intra-cell Interference	Significant	None	None
Control at BS	Tight Power Control	Timing & Frequency Synchronization	Rate Control Track as many fluctuations as possible
	Track slow fluctuations		
Delay Requirement	Can Support Tight Delay		Need some laxity

Centralized MAC II: Multiuser Capacity

- Multiuser Capacity of AWGN Channels
- Multiuser Capacity of Fading Channels

Uplink vs. Downlink Channel Model



• user \rightarrow BS: uplink

$$y[m] = \sum_{k=1}^K h_k[m] x_k[m] + z[m]$$

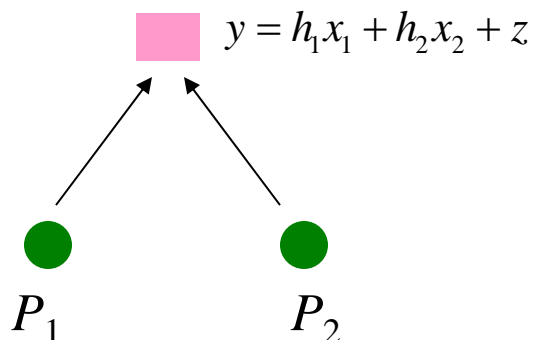
• BS \rightarrow user: downlink

$$y_k[m] = h_k[m] x[m] + z_k[m], \quad k = 1, \dots, K$$

Multuser Capacity of AWGN Channels

- Uplink Capacity
- Downlink Capacity

Capacity of Uplink AWGN Channel



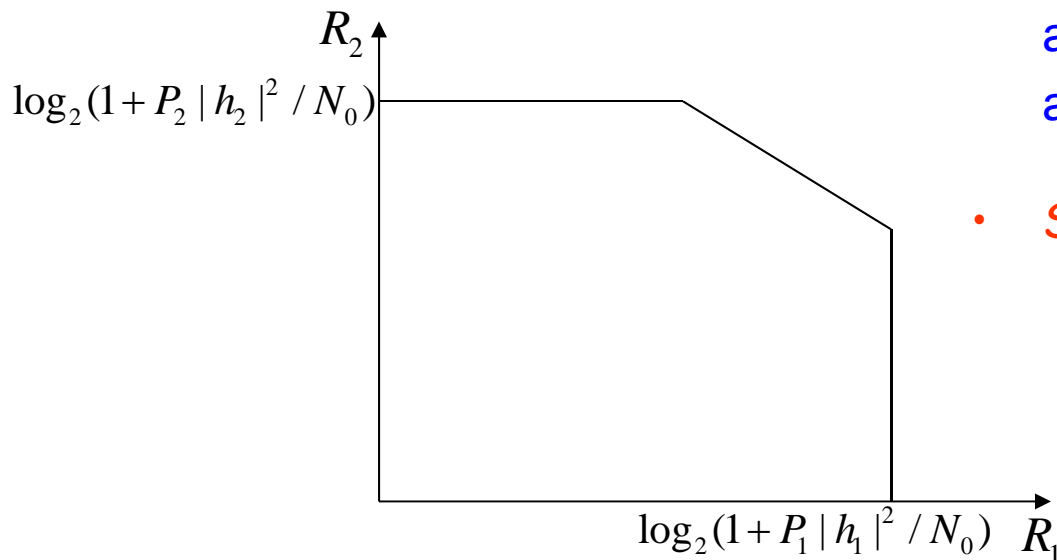
$$R_1 \leq \log_2(1 + P_1 |h_1|^2 / N_0) \quad R_2 \leq \log_2(1 + P_2 |h_2|^2 / N_0)$$

$$R_1 + R_2 \leq \log_2(1 + (P_1 |h_1|^2 + P_2 |h_2|^2) / N_0)$$

- **Capacity Region:** set of pairs (R_1, R_2) at which users 1 and 2 can reliably and simultaneously communicate.

- **Sum Capacity:** the maximum total rate

$$\begin{aligned} C_{sum} &= \max_{(R_1, R_2) \in \mathcal{C}} R_1 + R_2 \\ &= \log_2 \left(1 + \frac{P_1 |h_1|^2 + P_2 |h_2|^2}{N_0} \right) \end{aligned}$$



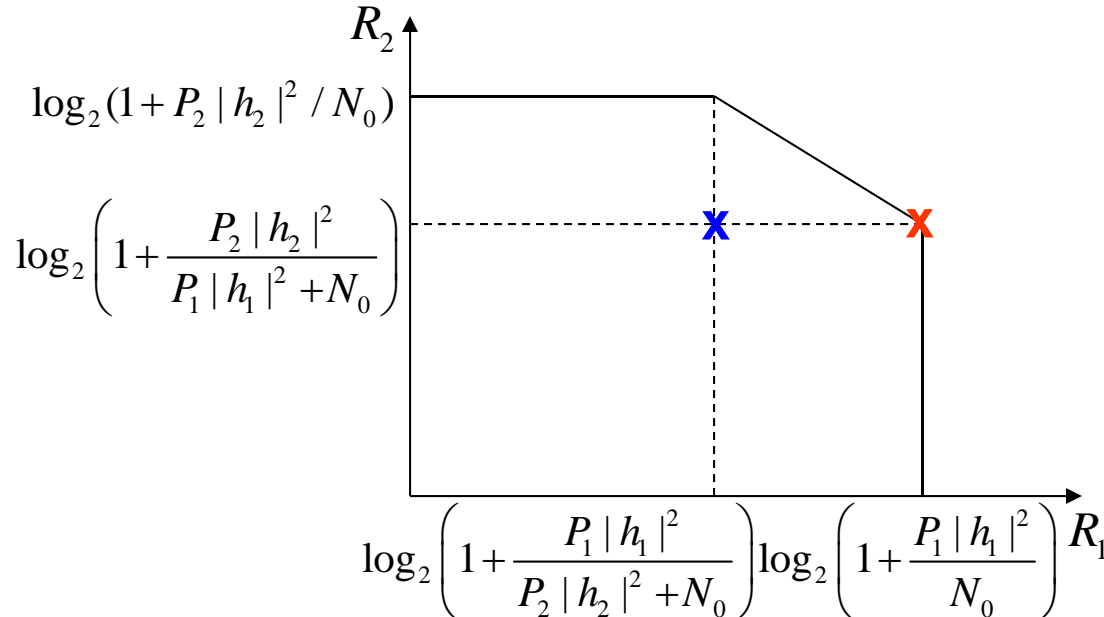
To Achieve Uplink Capacity I: Non-orthogonal Access

- Always treat the other user's signal as noise during detection

$$R_1 = \log_2(1 + P_1 |h_1|^2 / (P_2 |h_2|^2 + N_0)) \quad R_2 = \log_2(1 + P_2 |h_2|^2 / (P_1 |h_1|^2 + N_0))$$

- Successive Interference Cancellation (SIC)

- ✓ Decode the data of user 2, treating user 1's signal as Gaussian noise;



- ✓ Reconstruct user 2's signal and subtract it from the aggregate received signal. Decode the data of user 1.

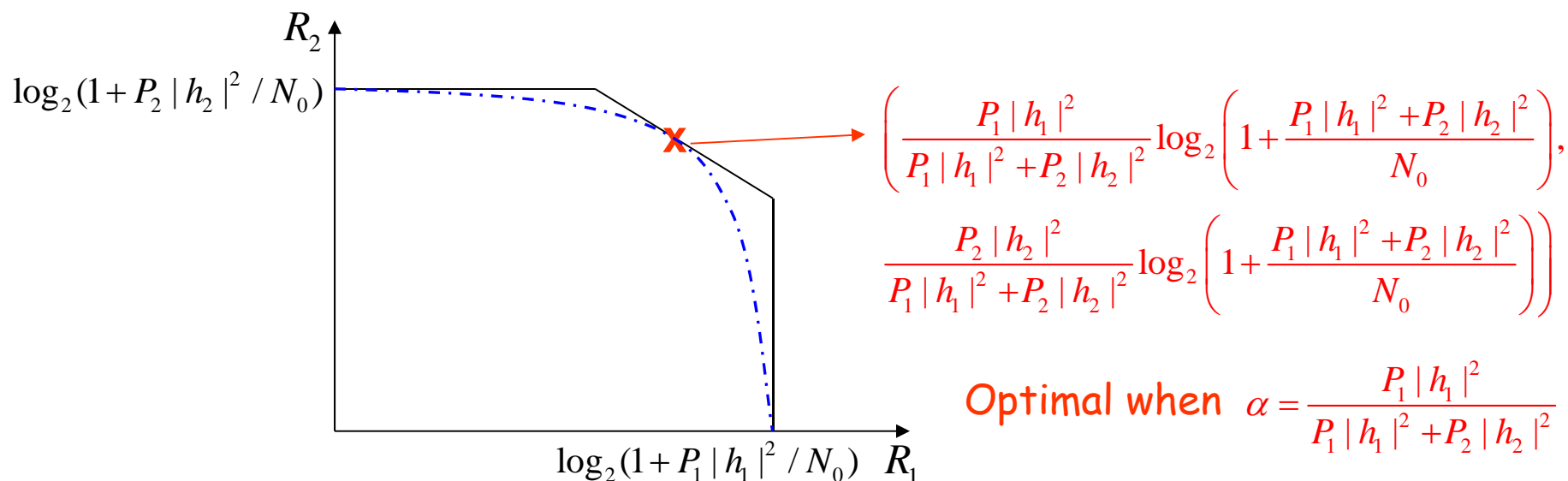
$$R_1 = \log_2 \left(1 + \frac{P_1 |h_1|^2}{N_0} \right)$$

$$R_2 = \log_2 \left(1 + \frac{P_2 |h_2|^2}{P_1 |h_1|^2 + N_0} \right)$$

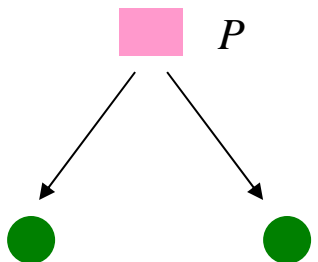
To Achieve Uplink Capacity II: Orthogonal Access

- Suppose a fraction of α of the bandwidth is allocated to user 1 and the rest is allocated to user 2.

$$R_1 = \alpha \log_2 \left(1 + \frac{P_1 |h_1|^2}{\alpha N_0} \right) \quad R_2 = (1 - \alpha) \log_2 \left(1 + \frac{P_2 |h_2|^2}{(1 - \alpha) N_0} \right)$$

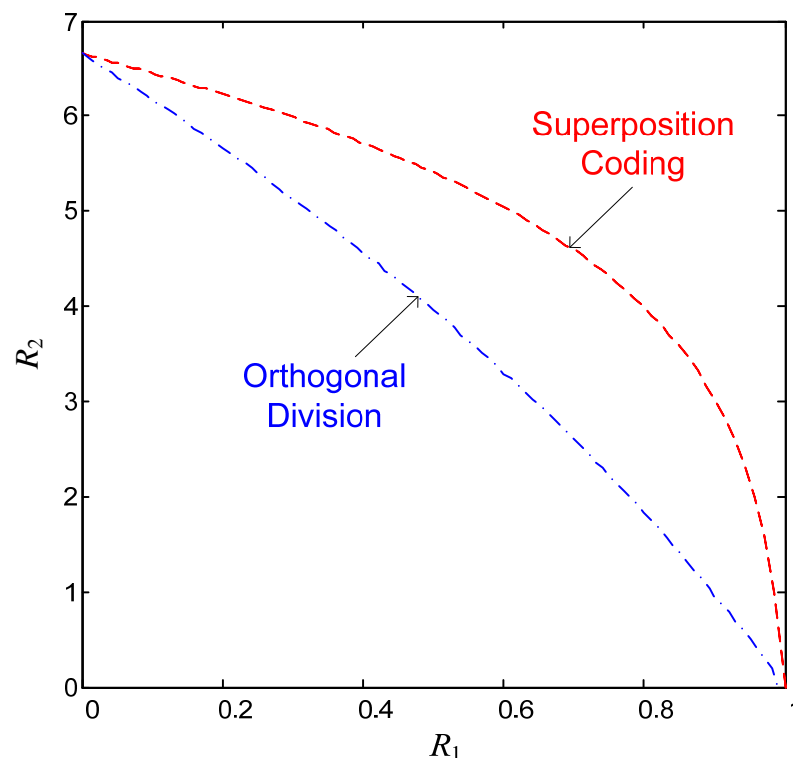


Capacity of Downlink AWGN Channel


$$y_1 = h_1 x + z_1 \quad y_2 = h_2 x + z_2$$
$$R_k \leq \log_2(1 + P |h_k|^2 / N_0), \quad k = 1, 2.$$

Suppose $|h_1| < |h_2|$.

- User 2 has a better channel than user 1.
- User 2 can decode any data that user 1 can successfully decode.



- Superposition coding achieves the downlink AWGN capacity.
- Orthogonal division is strictly inferior to superposition coding.

To Achieve Downlink Capacity

- Superposition Coding

- ✓ The transmit signal is a linear superposition of the signals of two users.

Total transmission power: $P = P_1 + P_2$

Decode user 1's signal first, and then decode its own signal using SIC

User 1: Treat user 2's signal as noise

$$R_1 = \log_2 \left(1 + \frac{P_1 |h_1|^2}{P_2 |h_1|^2 + N_0} \right)$$

User 2: Perform SIC

$$R_2 = \log_2 \left(1 + \frac{P_2 |h_2|^2}{N_0} \right)$$

- Orthogonal Division

- ✓ a fraction of α of the bandwidth is allocated to user 1 and the rest is allocated to user 2. $P = P_1 + P_2$

$$R_1 = \alpha \log_2 \left(1 + \frac{P_1 |h_1|^2}{\alpha N_0} \right)$$

$$R_2 = (1 - \alpha) \log_2 \left(1 + \frac{P_2 |h_2|^2}{(1 - \alpha) N_0} \right)$$

K-User Capacity

- Capacity Region

Uplink

$$R_k \leq \log_2 \left(1 + \frac{P_k |h_k|^2}{N_0} \right), \quad k = 1, \dots, K.$$

$$\sum_{k \in \mathcal{S}} R_k \leq \log_2 \left(1 + \frac{\sum_{k \in \mathcal{S}} P_k |h_k|^2}{N_0} \right), \quad \mathcal{S} \subset \{1, \dots, K\}$$

✓ **SIC**

$$\begin{aligned}
 R_1 &\leq \log_2 \left(1 + \frac{P_1 |h_1|^2}{\sum_{k=2}^K P_k |h_k|^2 + N_0} \right), \\
 &\dots\dots\dots \\
 R_K &\leq \log_2 \left(1 + \frac{P_K |h_K|^2}{N_0} \right).
 \end{aligned}$$

✓ **Orthogonal Access**

$$\begin{aligned}
 R_k &\leq \alpha_k \log_2 \left(1 + \frac{P_k |h_k|^2}{\alpha_k N_0} \right), \\
 \sum_{k=1}^K \alpha_k &= 1.
 \end{aligned}$$

Downlink ($|h_1|^2 \leq |h_2|^2 \leq \dots \leq |h_K|^2$)

$$\begin{aligned}
 R_1 &\leq \log_2 \left(1 + \frac{P_1 |h_1|^2}{|h_1|^2 \sum_{k=2}^K P_k + N_0} \right), \\
 &\dots\dots\dots \\
 R_K &\leq \log_2 \left(1 + \frac{P_K |h_K|^2}{N_0} \right), \quad \sum_{k=1}^K P_k = P.
 \end{aligned}$$

✓ **Superposition Coding**

$$\begin{aligned}
 R_1 &\leq \log_2 \left(1 + \frac{P_1 |h_1|^2}{|h_1|^2 \sum_{k=2}^K P_k + N_0} \right), \\
 &\dots\dots\dots \\
 R_K &\leq \log_2 \left(1 + \frac{P_K |h_K|^2}{N_0} \right), \quad \sum_{k=1}^K P_k = P.
 \end{aligned}$$

✓ **Orthogonal Division**

$$\begin{aligned}
 R_k &\leq \alpha_k \log_2 \left(1 + \frac{P_k |h_k|^2}{\alpha_k N_0} \right), \\
 \sum_{k=1}^K P_k &= P, \quad \sum_{k=1}^K \alpha_k = 1.
 \end{aligned}$$

K-User Capacity

- Sum Capacity $C_{sum} = \max_{R_1 \dots R_K} \sum_{k=1}^K R_k$

Uplink

$$C_{sum}^U = \log_2 \left(1 + \frac{\sum_{k=1}^K P_k |h_k|^2}{N_0} \right)$$

To achieve the sum capacity:

- ✓ SIC
- ✓ Orthogonal Access with

$$\alpha_k = \frac{P_k |h_k|^2}{\sum_{j=1}^K P_j |h_j|^2}, \quad k = 1, \dots, K.$$

Downlink

With $|h_1|^2 \leq |h_2|^2 \leq \dots \leq |h_K|^2$:

$$C_{sum}^D = \log_2 \left(1 + \frac{P |h_K|^2}{N_0} \right)$$

To achieve the sum capacity:

Allocate all the transmission power to the strongest user!

Multiuser Capacity of Fading Channels

- Ergodic Uplink Sum Capacity without CSIT
- Ergodic Uplink Sum Capacity with CSIT

Ergodic Uplink Sum Capacity of without CSIT

- Single-user: $C = E_h[\log_2(1 + |h|^2 P / N_0)]$

- K-user:
$$C_{sum} = E_h \left[\log_2 \left(1 + \frac{\sum_{k=1}^K |h_k|^2 P_k}{N_0} \right) \right]$$
$$\leq \log_2 \left(1 + \frac{\sum_{k=1}^K E_h |h_k|^2 P_k}{N_0} \right) = \log_2 \left(1 + \frac{\sum_{k=1}^K P_k}{N_0} \right)$$

Fading always hurts if no CSI is available at the transmitter side!

Ergodic Uplink Sum Capacity with CSIT

- Single-user:

$$\max_{P_1, \dots, P_L} \frac{1}{L} \sum_{l=1}^L \log_2 \left(1 + \frac{P_l |h_l|^2}{N_0} \right)$$

Subject to: $\frac{1}{L} \sum_{l=1}^L P_l = P.$



$$P_l^{optimal} = \left(\mu - \frac{N_0}{|h_l|^2} \right)^+$$

Waterfilling power allocation

- K-user:

$$\max_{P_{k,l}: k=1, \dots, K, l=1, \dots, L} \frac{1}{L} \sum_{l=1}^L \log_2 \left(1 + \frac{\sum_{k=1}^K P_{k,l} |h_{k,l}|^2}{N_0} \right)$$

Subject to: $\frac{1}{L} \sum_{l=1}^L P_{k,l} = P, \quad k = 1, \dots, K.$



$$P_{k,l}^{optimal} = \begin{cases} \left(\mu - \frac{N_0}{|h_{k,l}|^2} \right)^+ & \text{if } |h_{k,l}| = \max_{i=1, \dots, K} |h_{i,l}| \\ 0 & \text{otherwise} \end{cases}$$

Ergodic Uplink Sum Capacity with CSIT

• Single-user:
$$C = E_h \left[\log_2 \left(1 + \frac{P^*(h) |h|^2}{N_0} \right) \right]$$

$$P^*(h) = \left(\mu - \frac{N_0}{|h|^2} \right)^+ \quad \text{where } \mu \text{ satisfies } E_h[P^*(h)] = P$$

• K-user:
$$C_{sum} = E_{\mathbf{h}} \left[\log_2 \left(1 + \frac{P_k^*(\mathbf{h}) |h_k|^2}{N_0} \right) \right] \quad \mathbf{h} = [h_1, h_2, \dots, h_K]$$

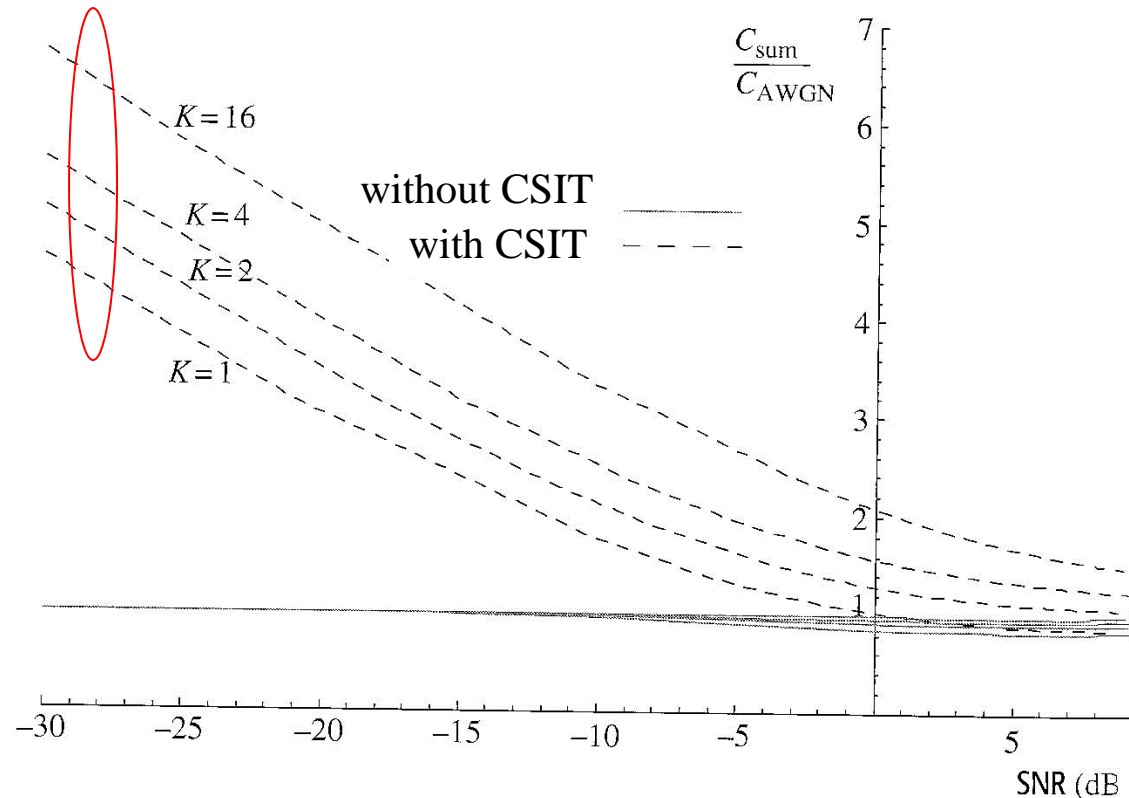
$$P_k^*(\mathbf{h}) = \begin{cases} \left(\mu - \frac{N_0}{|h_k|^2} \right)^+ & \text{if } |h_k| = \max_{i=1, \dots, K} |h_i| \\ 0 & \text{otherwise} \end{cases}$$

where μ satisfies $\sum_{k=1}^K E_{\mathbf{h}}[P_k^*(\mathbf{h})] = KP$

Select the user with the best channel condition!

Multiuser Diversity

The more users,
the higher
capacity benefits!



Multiuser Diversity: when there are many users that fade independently, at any time there is a high probability that one of the users will have a strong channel.

Summary II: Multiuser Capacity

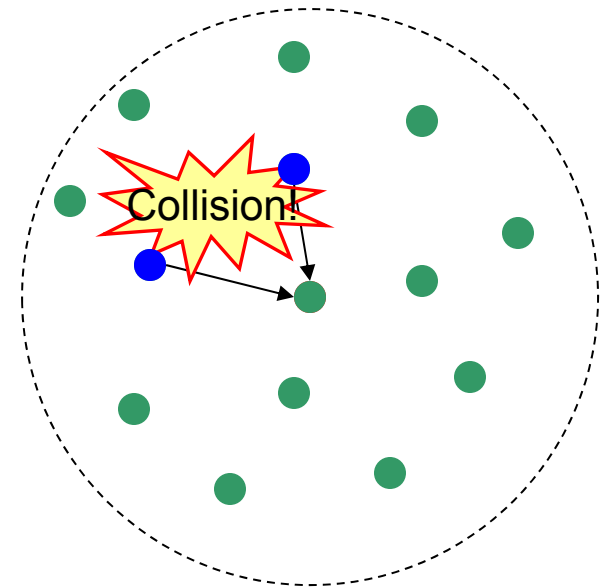
- AWGN channel
 - To achieve uplink capacity: SIC
 - To achieve downlink capacity: superposition coding
- Fading channel
 - Without CSIT: always inferior to AWGN
 - With CSIT: better than AWGN with optimal power allocation

Distributed MAC

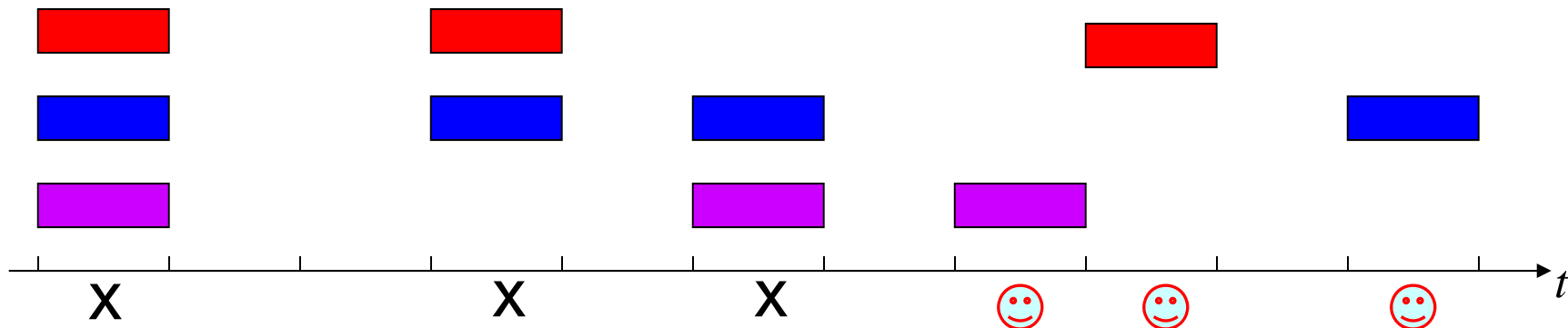
- Aloha
- CSMA

Random Access

- Each node determines whether to access the channel independently.
- Collision
 - The receiver cannot properly detect the signal if more than one node transmit simultaneously.
- Resolving collisions: Backoff
 - Retransmit with a certain probability; or
 - Choose a random value and countdown. Retransmit when the counter is zero.



Random Access I: Aloha



- Slotted Aloha
 - Transmit if there is a new packet;
 - Backoff if there is a collision:
 - Retransmit with a constant probability q ; or
 - Choose a value from $\{0, 1, \dots, \lfloor 1/q \rfloor\}$ and count down. Retransmit when the counter is zero.

Network Throughput of Slotted ALOHA

- Network Throughput: The percentage of time that the network produces an effective output.
 - What is the maximum network throughput of slotted Aloha?
 n : the number of nodes G : the attempt rate
 - ✓ G/n is the attempt rate per node, which is also the probability that a node has an attempt for given time.
 - ✓ The probability of successful transmission p is the probability that there is only one attempt among n nodes for given time.
$$p = n \cdot \frac{G}{n} \cdot \left(1 - \frac{G}{n}\right)^{n-1} \approx Ge^{-G} \quad \text{with a large } n$$
 - ✓ The network has an effective output if there is a successful transmission. Network throughput $S = p \approx Ge^{-G}$

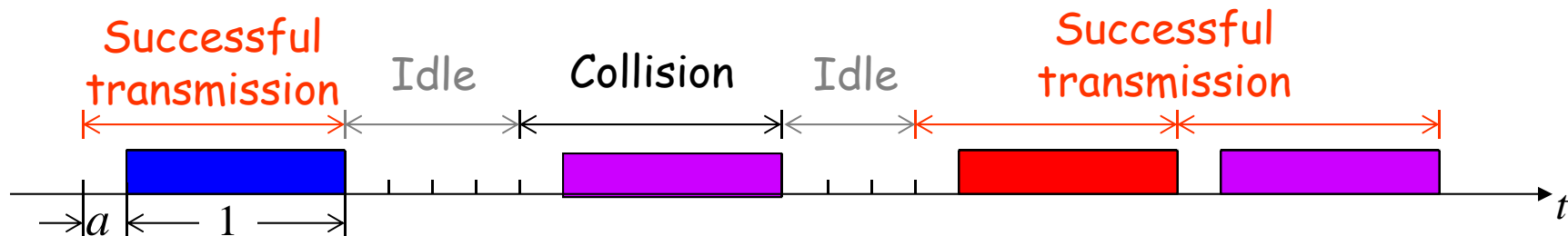
The maximum network throughput of slotted Aloha is e^{-1} , achieved when $G=1$.

Random Access II: Carrier Sense Multiple Access (CSMA)

CSMA: listen before transmit

- If channel sensed idle, transmit entire frame
- If channel sensed busy, defer transmission

- ✓ Can collisions be completely avoided in this way? No.
- ✓ What is the maximum network throughput? 1.



More about CSMA

- The network throughput of CSMA increases as the propagation delay a decreases.
 - CSMA has a much higher throughput than Aloha if a is small enough.
- CSMA/CD (Collision Detection) vs. CSMA/CA (Collision Avoidance)
 - The collision can be detected only if the node is full-duplex (i.e., be able to receive signals via transmission)

Ethernet: CSMA/CD + Binary Exponential Backoff

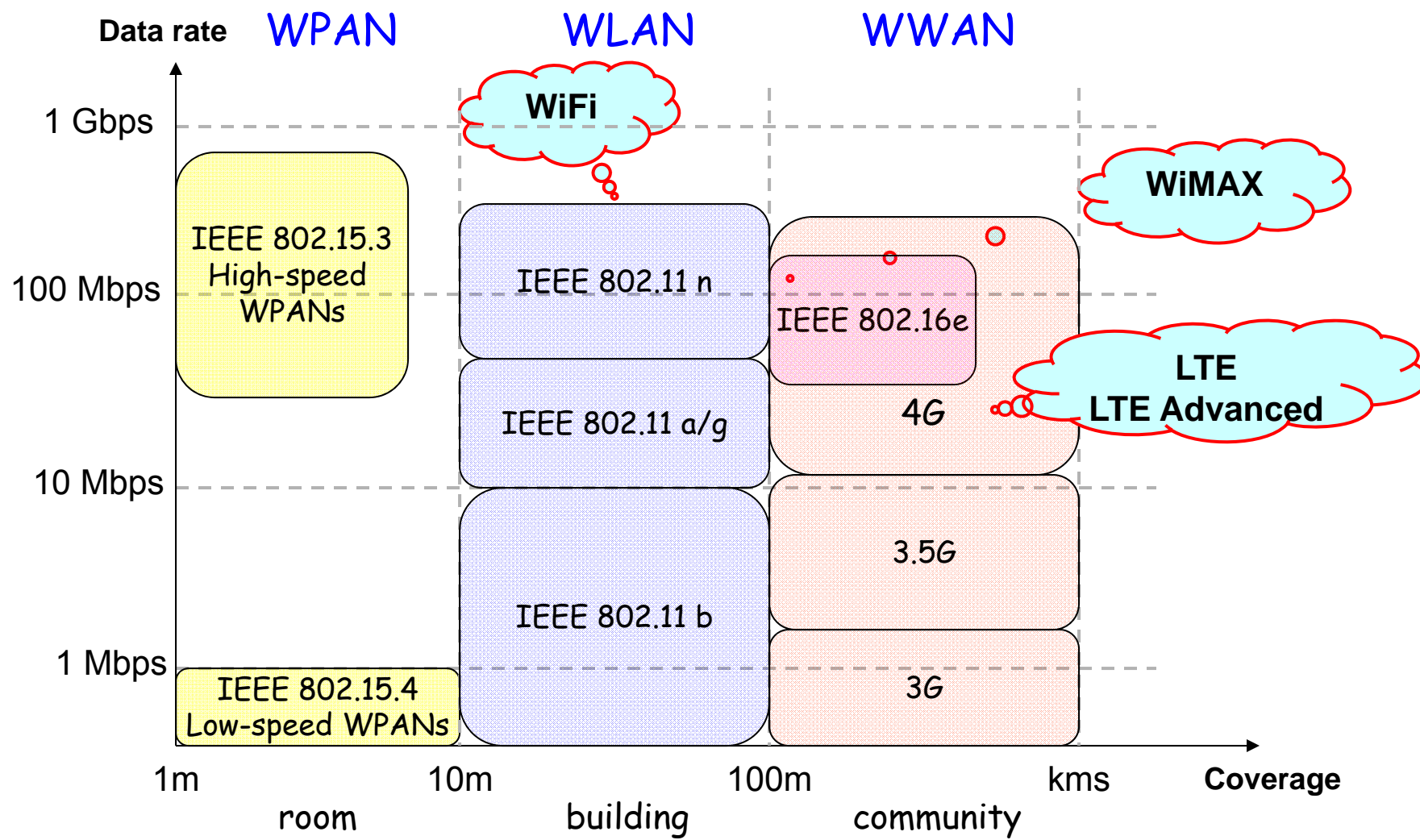
WiFi: CSMA/CA + Binary Exponential Backoff

Summary III: Distributed MAC

- No central controller
- Resource competition
- Aloha: transmit if there is a request, back off if a collision occurs
 - Maximum network throughput e^{-1}
- CSMA: Listen before transmit
 - Reduce the propagation delay a to improve the network throughput.
 - The maximum network throughput approaches 1 as a goes to zero.

Case Study: WiFi

Wireless Networks



WiFi and IEEE 802.11

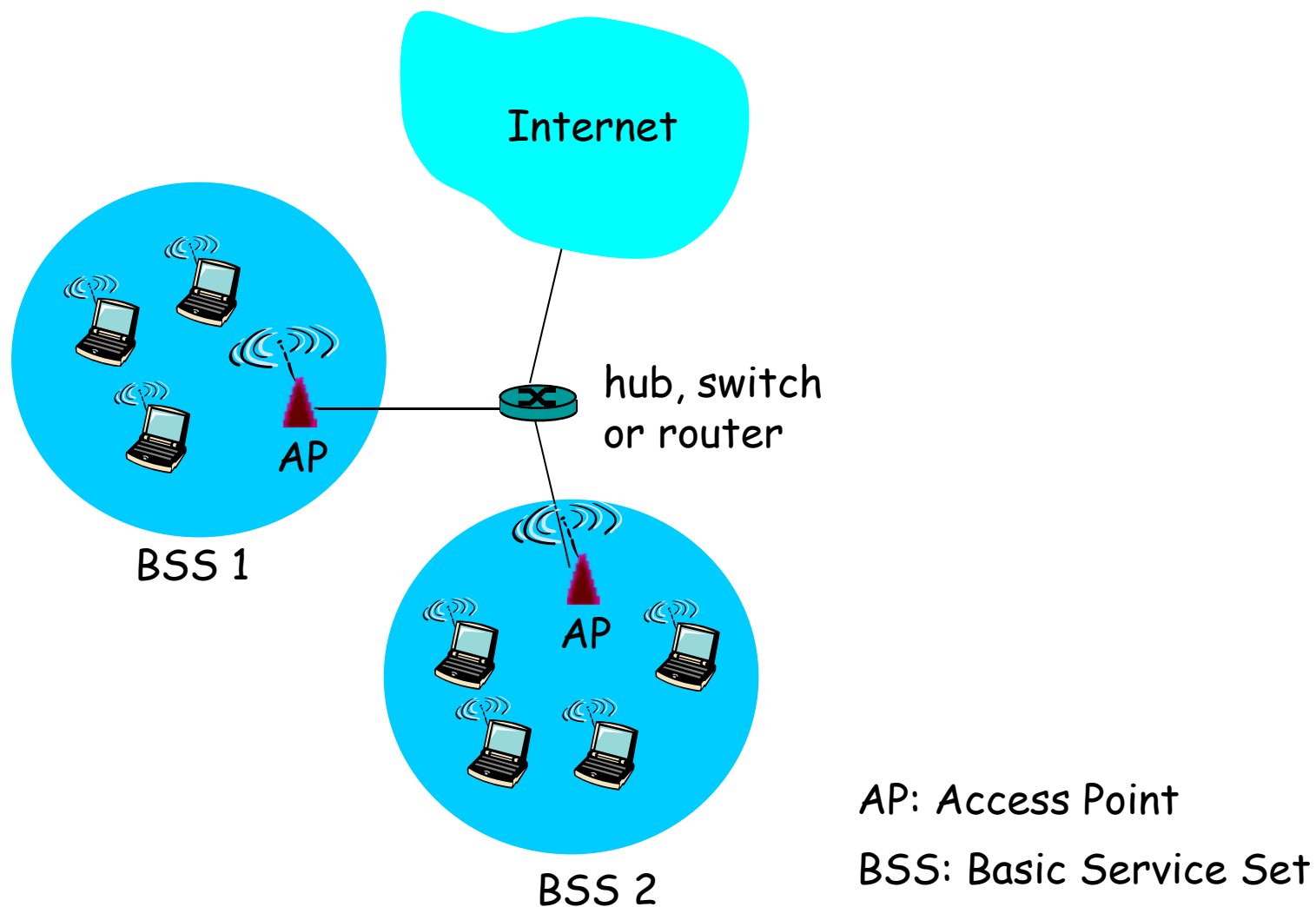
- WiFi
 - a class of WLAN devices based on the IEEE 802.11 standards.
- IEEE 802.11
 - a set of standards carrying out WLAN computer communication in the 2.4, 3.6 and 5 GHz frequency bands. They are implemented by the IEEE LAN/MAN Standards Committee (IEEE 802).



IEEE 802.11 Standards

- 802.11a
 - 5 GHz
 - up to 54 Mbps
 - OFDM in physical layer
 - 802.11g
 - 2.4 GHz
 - up to 54 Mbps
 - OFDM in physical layer
 - 802.11n
 - 2.4 GHz
 - up to 200 Mbps
 - OFDM, Multiple antennas (4)
 - 802.11b
 - 2.4 GHz unlicensed spectrum
 - up to 11 Mbps
 - DSSS in physical layer
 - 802.11ac
 - 5 GHz
 - up to 900 Mbps
 - OFDM, Multiple antennas (8)
- all use CSMA/CA for multiple access
 - all have access-point-based and ad-hoc network versions

LAN Architecture



Channels and Association

- 802.11b: 2.4GHz-2.485GHz spectrum divided into 11 channels at different frequencies
 - AP admin chooses frequency for AP
 - interference possible: channel can be same as that chosen by neighboring AP!
- Wireless Station: must *associate* with an AP
 - scans channels, listening for *beacon frames* containing AP's name (SSID) and MAC address
 - selects AP to associate with
 - typically run DHCP to get IP address in AP's subnet

MAC Protocol: CSMA/CA + Binary Exponential Backoff

Transmitter (Wireless Station)

if **sense** channel idle (idle for a period of time equal to DIFS), then
transmit the entire frame.

- * **else**, choose a random backoff value and count down whenever the channel is sensed idle. Transmit the entire frame when the counter reaches zero.

Collision Avoidance

Receiver (Access Point)

- if frame received OK, then return ACK

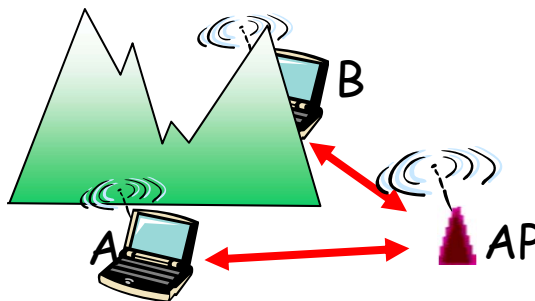
Transmitter (Wireless Station)

if ACK, then **repeat step *** if it has another frame to transmit.

else, choose a random backoff value from $(0, w-1)$, w is initialized at CW_{\min} and doubled after each unsuccessful transmission. Count down whenever the channel is sensed idle. Transmit the entire frame when the counter reaches zero.

Binary Exponential Backoff

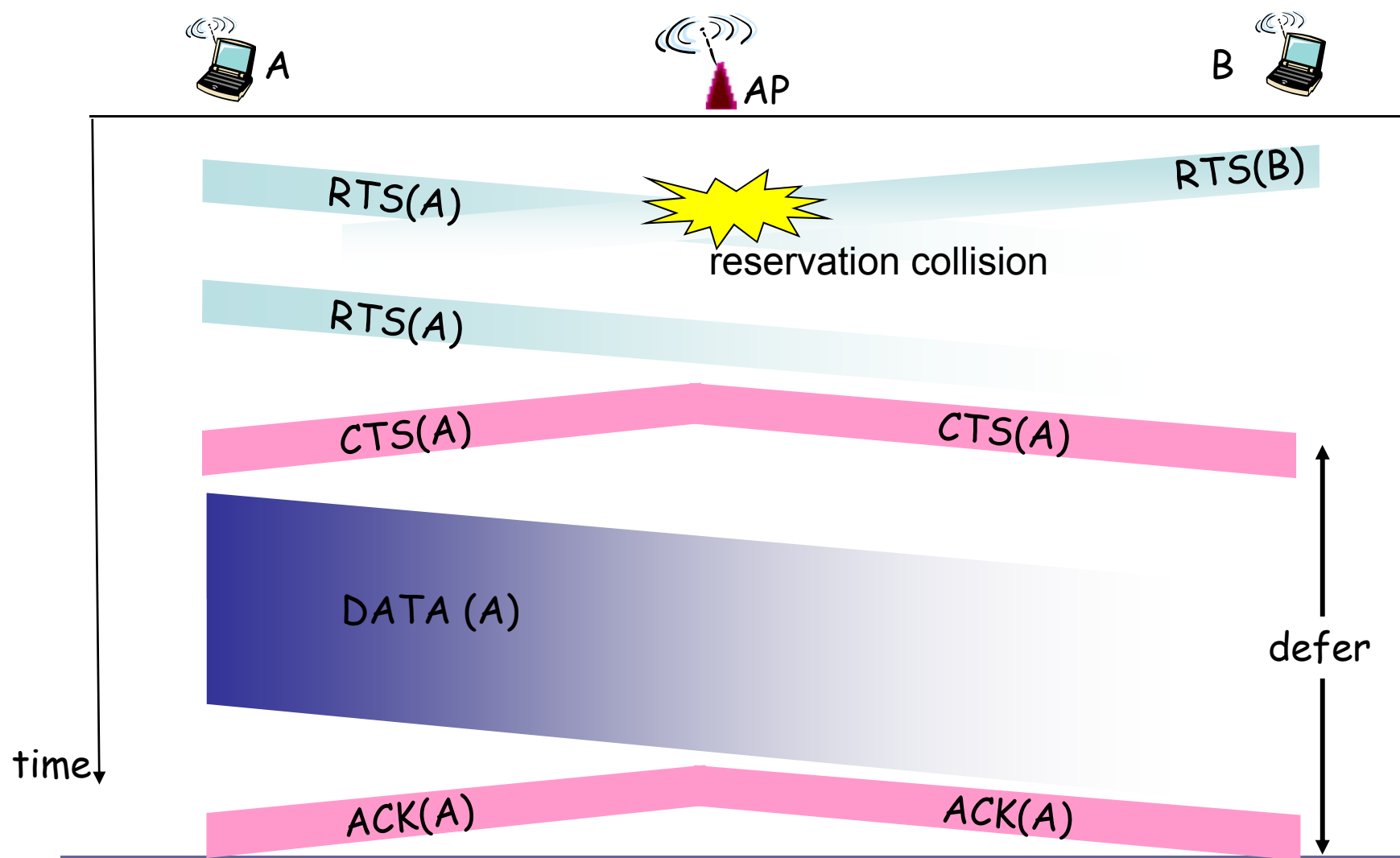
Hidden Terminal Problem



- Node A and AP hear each other
- Node B and AP hear each other
- Node A and Node B cannot hear each other

A and B are unaware of each other's transmission

RTS-CTS Exchange



To Solve the Hidden Terminal Problem: RTS-CTS

- Sender transmits *small* request-to-send (RTS) packets to AP
 - RTSs may still collide with each other (but they're short)
- AP broadcasts clear-to-send (CTS) in response to RTS
- CTS heard by all nodes
 - sender transmits data frame
 - other stations defer transmissions

Avoid data frame collisions by
using small reservation packets!

Summary

- Low cost, short-distance transmission
 - Free spectrum
 - High data rate
- Limited network control
 - Distributed MAC
 - Simple coordination among APs
- IP-based network architecture