

## EE360: Lecture 7 Outline

### Cellular System Capacity and ASE

- Announcements
  - Summary due next week
- Capacity
- Area Spectral Efficiency
- Dynamic Resource Allocation

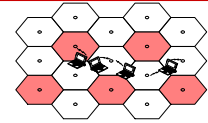
### Cellular System Capacity

- Shannon Capacity
  - Shannon capacity does not incorporate reuse distance.
  - Wyner capacity: capacity of a TDMA systems with joint base station processing
- User Capacity
  - Calculates how many users can be supported for a given performance specification.
  - Results highly dependent on traffic, voice activity, and propagation models.
  - Can be improved through interference reduction techniques.
- Area Spectral Efficiency
  - Capacity per unit area
  - In practice, all techniques have roughly the same capacity for voice, but flexibility of OFDM/MIMO supports more heterogeneous users*

### Approaches to Date

- Shannon Capacity
  - TDMA systems with joint base station processing
- Multicell Capacity
  - Rate region per unit area per cell
  - Achievable rates determined via Shannon-theoretic analysis or for practical schemes/constraints
  - Area spectral efficiency is sum of rates per cell
- User Capacity
  - Calculates how many users can be supported for a given performance specification.
  - Results highly dependent on traffic, voice activity, and propagation models.
  - Can be improved through interference reduction techniques. (Gilhousen et. al.)

## Review of Cellular Lecture



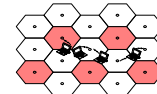
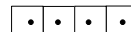
- Design considerations:
  - Spectral sharing, reuse, cell size
- Evolution: 1G to 2G to 3G to 4G and beyond
- Multiuser Detection in cellular
- MIMO in Cellular
  - Multiuser MIMO/OFDM
  - Multiplexing/diversity/IC tradeoffs
  - Distributed antenna systems
  - Virtual MIMO

### Defining Cellular Capacity

- Shannon-theoretic definition
  - Multiuser channels typically assume user coordination and joint encoding/decoding strategies
  - Can an optimal coding strategy be found, or should one be assumed (i.e. TD, FD, or CD)?
  - What base station(s) should users talk to?
  - What assumptions should be made about base station coordination?
  - Should frequency reuse be fixed or optimized?
  - Is capacity defined by uplink or downlink?
  - Capacity becomes very dependent on propagation model
- Practical capacity definitions (rates or users)
  - Typically assume a fixed set of system parameters
  - Assumptions differ for different systems: comparison hard
  - Does not provide a performance upper bound

### Wyner Uplink Capacity

- Linear or hexagonal cells



- Received signal at base station (N total users)

$$Y_n = \sum_{k=1}^K X_{nk} + \alpha \sum_{n' \in A_n} \sum_{k=1}^K X_{n'k} + Z_n,$$

- Propagation for out-of-cell interference captured by  $\alpha$
- Average power constraint:  $E(X_{n,k}^2) \leq P$
- Capacity  $C_N$  defined as largest achievable rate (N users)

## Linear Array

- Theorem:**  $\lim_{N \rightarrow \infty} C_N = C^*(\alpha)$

for

$$C^*(\alpha) \triangleq \frac{1}{2K} \int_0^1 \log \left( 1 + \frac{(1 + 2\alpha \cos 2\pi\theta)^2}{\sigma_0^2} \right) d\theta,$$

$$\sigma_0^2 = \sigma^2 / KP.$$

Optimal scheme uses TDMA within a cell

- Users transmit in  $1/K$  timeslots; power  $KP$

Treats co-channel signals as interference:

## Results

- Alternate TDMA**

$$C_{TDMA} = \frac{1}{4K} \log \left( 1 + \frac{2KP}{\sigma^2} \right)$$

- CDMA w/ MMSE**

$$C_{MMSE} = -\frac{1}{K} \log \left( \int_0^1 \frac{\sigma_0^2}{(1 + 2\alpha \cos(2\pi\theta))^2 + \sigma_0^2} d\theta \right)$$

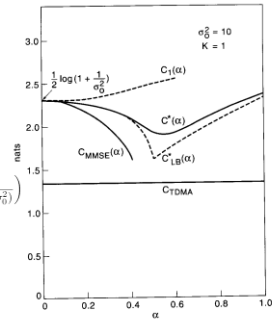


Fig. 1. Plots of  $C^*(\alpha)$ ,  $C(\alpha)$ ,  $C_{TDMA}$ ,  $C_{MMSE}(\alpha)$ , and  $C_{LB}(\alpha)$  versus  $\alpha$  for  $\sigma_0^2 = 0.01$ ,  $K = 1$  (linear array).  $C_{LB}(\alpha)$  is the lower bound of (2.3).

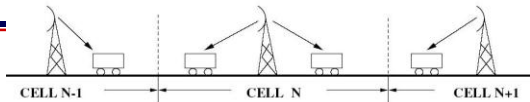
## Channel Reuse in Cellular Systems

- Channel Reuse in Cellular Systems**
  - Motivation: power falloff with transmission distance
  - Pro: increase system spectral efficiency
  - Con: co-channel interference (CCI)
  - "Channel": time slot, frequency band, (semi)-orthogonal code ...
- Cellular Systems with different multiple-access techniques**
  - CDMA (IS-95, CDMA2000): weak CCI, channel reuse in every cell
    - codes designed with a single and narrow autocorrelation peak
  - TDMA (GSM), FDMA (AMPS): much stronger CCI
    - a minimum reuse distance required to support target SINR
- Channel reuse: traditionally a fixed system design parameter**

## Adaptive Channel Reuse

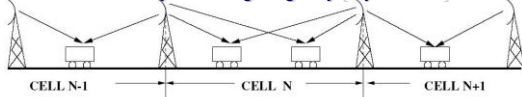
- Tradeoff**
  - Large reuse distance reduces CCI
  - Small reuse distance increases bandwidth allocation
- Related work**
  - [Frodigh 92] Propagation model with path-loss only channel assignment based on sub-cell compatibility
  - [Horikawa 05] Adaptive guard interval control special case of adaptive channel reuse in TDMA systems
- Current work**
  - Propagation models incorporating time variation of wireless channels static (AWGN) channel, fast fading and slow fading
  - Channel reuse in cooperative cellular systems (network MIMO) compare with single base station processing

## System Model



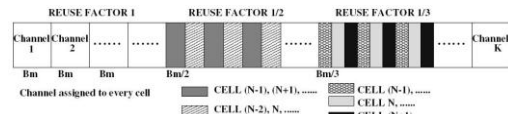
- Linear cellular array, one-dimensional, downlink, single cell processing

best models the system along a highway [Wyner 1994]



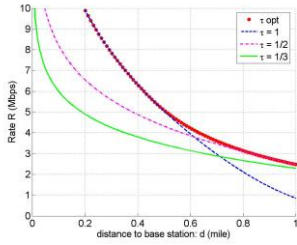
- Full cooperation leads to fundamental performance limit
- More practical scheme: adjacent base station cooperation

## Channel Assignment



- Intra-cell FDMA, K users per cell total bandwidth in the system  $K \cdot B_m$**
- Bandwidth allocated to each user**
  - maximum bandwidth  $B_m$ , corresponding to channel reuse in each cell
  - may opt for a fraction of bandwidth, based on channel strength
    - increased reuse distance, reduced CCI & possibly higher rate

## Single Base Station Transmission: AWGN



• Path loss only, receive power

$$P_r(d) = A \cdot P_t \cdot d^{-\gamma}$$

A: path loss at unit distance

$\gamma$ : path-loss exponent

• Receive SINR  $\rho(d, \tau) =$

$$\frac{d^{-\gamma}}{\left(\frac{2L}{\tau} + d\right)^{-\gamma} + \left(\frac{2L}{\tau} - d\right)^{-\gamma} + \frac{N_0 \tau}{A P_t}}$$

L: cell radius.  $N_0$ : noise power

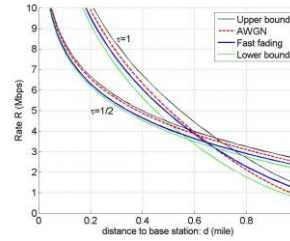
• Optimal reuse factor

$$\arg \max B_m \cdot \tau \log[1 + \rho(d, \tau)]$$

• Observations

- Mobile close to base station  $\rightarrow$  strong channel, small reuse distance
- Reuse factor changes ( $1 \rightarrow 1/2$ ) at transition distance  $d_\tau = 0.62$  mile

## Rayleigh Fast Fading Channel



• Environment with rich scatters

• Applies if channel coherence time shorter than delay constraint

• Receive power  $P_r = A \cdot g \cdot P_t \cdot d^{-\gamma}$

g: exponentially distributed r.v.

• Optimal reuse factor

$$\arg \max B_m \cdot \tau E_g \log[1 + \rho(d, \tau, g)]$$

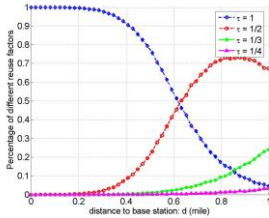
• Lower bound: random signal

Upper bound: random interference

• Observations

- AWGN and fast fading yield similar performance
- reuse factor changes ( $1 \rightarrow 1/2$ ) at transition distance  $d_\tau = 0.65$  mile
- Both "sandwiched" by same upper/lower bounds (small gap in between)

## Rayleigh Slow Fading Channel



• Stringent delay constraint, entire codeword falls in one fading state

• Optimal reuse factor

$$\arg \max B_m \cdot \tau \log[1 + \rho(d, \tau, g)]$$

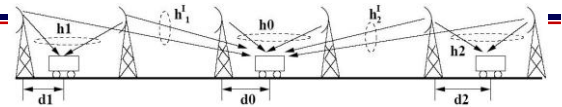
• Compare with AWGN/slow fading:

optimal reuse factor only depends on distance between mobile and base station

• Observations

- Optimal reuse factor random at each distance, also depends on fading
- Larger reuse distance ( $1/\tau > 2$ ) needed when mobiles close to cell edge

## Base Station Cooperation: AWGN



• Adjacent base station cooperation, effectively  $2 \times 1$  MISO system

• Channel gain vectors: signal

$$\mathbf{h}_0 = \begin{bmatrix} d_0^{-\gamma/2} \\ (2L - d_0)^{-\gamma/2} \end{bmatrix}$$

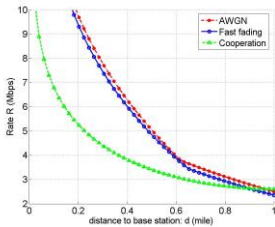
interference

$$\mathbf{h}'_{1,2} = \begin{bmatrix} (\frac{2L}{\tau} \pm d_0)^{-\gamma/2} \\ (\frac{2L}{\tau} \mp 2L \pm d_0)^{-\gamma/2} \end{bmatrix}$$

• Transmitter beamforming  $\mathbf{w} = [w_{1,j}] = [h_{1,j}/|h_{1,j}|]$

- optimal for isolated MISO system with per-base power constraint
- suboptimal when interference present
- an initial choice to gain insight into system design

## Performance Comparison

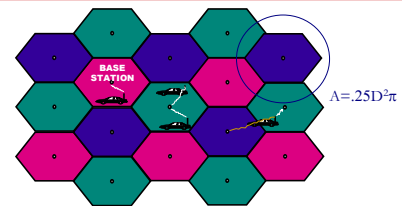


Observations

- no reuse channel in adjacent cell: to avoid base station serving user and interferer at the same time
- reuse factor  $1/2$  optimal at all d: suppressing CCI without overly shrinking the bandwidth allocation
- bandwidth reduction ( $1 \rightarrow 1/2$ ) overshadows benefit from cooperation

- Advantage of cooperation over single cell transmission: only prominent when users share the channel; limited with intra-cell TD/FD [Liang 06]
- Remedy: allow more base stations to cooperate in the extreme case of full cooperation, channel reuse in every cell

## Area Spectral Efficiency

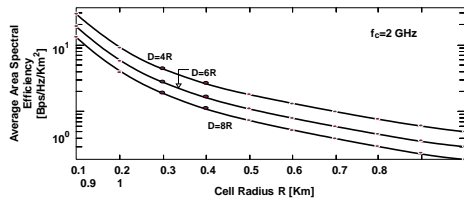


- S/I increases with reuse distance.
- For BER fixed, tradeoff between reuse distance and link spectral efficiency (bps/Hz).
- Area Spectral Efficiency:  $A_e = \sum R_i / (.25D^2\pi)$  bps/Hz/Km<sup>2</sup>.

## ASE with Adaptive Modulation

- Users adapt their rates (and powers) relative to S/I variation.
- S/I distribution for each user based on propagation and interference models.
 
$$\gamma_u = S_u / \sum S_i$$
  - Computed for extreme interference conditions.
  - Simulated for average interference conditions.
- The maximum rate  $R_u$  for each user in a cell is computed from its S/I distribution.
  - For narrowband system use adaptive MQAM analysis

## ASE vs. Cell Radius



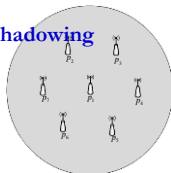
## Average Ergodic Rate

- Assume full CSIT at BS of gains for all antenna ports
- Downlink is a MIMO broadcast channel with full CSIR
- Expected rate is

$$C_{\text{cell}}(P) = E_u E_{\text{th}} \left[ \log_2 \left( 1 + \bar{S} \left( \sum_{l=1}^N \sqrt{\frac{f_l}{D(p_l, u)^\alpha}} \right)^2 \right) \right]$$

- Average over user location and shadowing

- DAS optimization
  - Where to place antennas
  - Goal: maximize ergodic rate



## Propagation Model

- Two-slope path loss model:

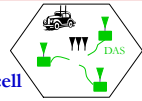
$$\bar{S}_i(d) = \frac{K}{d^\alpha (1 + d/g)^\beta} \bar{S}_i,$$

- Slow fading model: log-normal shadowing
- Fast fading model: Nakagami-m
  - Models Rayleigh and approximates Rician.
- ASE maximized with reuse distance of one!
  - Adaptive modulation compensate for interference

## Distributed Antennas (DAS) in Cellular

- Basic Premise:

- Distribute BS antennas throughout cell
  - Rather than just at the center
- Antennas connect to BS through wireless/wireline links



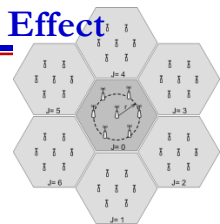
- Performance benefits

- Capacity
- Coverage
- Power consumption

## Interference Effect

- Impact of intercell interference

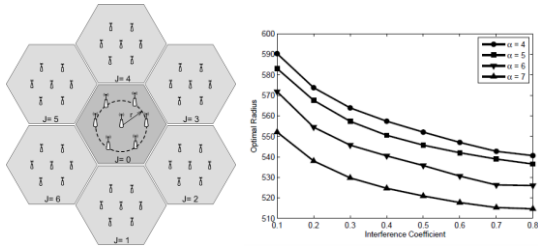
$$SINR = \frac{\sum_{i=1}^N \frac{f_i}{D(p_i, u)^\alpha}}{\sum_{j=1}^6 \sum_{i=1}^N \gamma_j \frac{f_i}{D(p_i^j, u)^\alpha} + \sigma^2}$$



$\gamma_j$

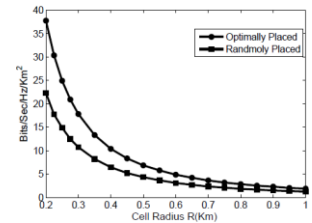
- is the interference coefficient from cell  $j$ 
  - Autocorrelation of neighboring cell codes for CDMA systems
  - Set to 1 for LTE(OFDM) systems with frequency reuse of one.

## Interference Effect



## Area Spectral Efficiency

- Average user rate/unit bandwidth/unit area (bps/Hz/Km<sup>2</sup>)
  - Captures effect of cell size on spectral efficiency and interference



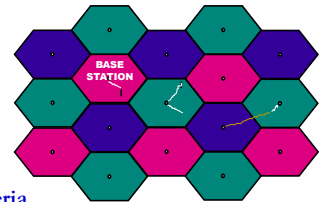
## Summary

- Wireless data/multimedia are main drivers for future generations of cellular systems.
  - Killer application unknown; how will cellular users access the Internet; will cellular or WLANs prevail.
- Efficient systems are interference-limited
  - Interference reduction key to high system capacity
- Adaptive techniques in cellular can improve significantly performance and capacity
- MIMO a powerful technique, but impact on out-of-cell interference and implementation unknown.

## Dynamic Resource Allocation

*Allocate resources as user and network conditions change*

- Resources:
  - Channels
  - Bandwidth
  - Power
  - Rate
  - Base stations
  - Access
- Optimization criteria
  - Minimize blocking (voice only systems)
  - Maximize number of users (multiple classes)
  - Maximize "revenue": utility function
    - Subject to some minimum performance for each user



## Dynamic Channel Allocation

- Fixed channel assignments are inefficient
  - Channels in unpopulated cells underutilized
  - Handoff calls frequently dropped
- Channel Borrowing
  - A cell may borrow free channels from neighboring cells
  - Changes frequency reuse plan
- Channel Reservations
  - Each cell reserves some channels for handoff calls
  - Increases blocking of new calls, but fewer dropped calls
- Dynamic Channel Allocation
  - Rearrange calls to pack in as many users as possible without violating reuse constraints
  - Very high complexity **"DCA is a 2G/4G problem"**

## Variable Rate and Power

- Narrowband systems
  - Vary rate and power (and coding)
  - Optimal power control not obvious
- CDMA systems
  - Vary rate and power (and coding)
    - Multiple methods to vary rate (VBR, MC, VC)
  - Optimal power control not obvious
- Optimization criteria
  - Maximize throughput/capacity
  - Meet different user requirements (rate, SIR, delay, etc.)
  - Maximize revenue

## Multicarrier CDMA

- Multicarrier CDMA combines OFDM and CDMA
- Idea is to use DSSS to spread a narrowband signal and then send each chip over a different subcarrier
  - DSSS time operations converted to frequency domain
- Greatly reduces complexity of SS system
  - FFT/IFFT replace synchronization and despreading
- More spectrally efficient than CDMA due to the overlapped subcarriers in OFDM
- Multiple users assigned different spreading codes
  - Similar interference properties as in CDMA

## Rate and Power Control in CDMA\*

- Optimize power and rate adaptation in a CDMA system
  - Goal is to minimize transmit power
- Each user has a required QoS
  - Required effective data rate

\*Simultaneous Rate and Power Control in Multirate Multimedia CDMA Systems," S. Kandukuri and S. Boyd

## System Model: General

- Single cell CDMA
- Uplink multiple access channel
- Different channel gains
- System supports multiple rates

## System Model: Parameters

- Parameters
  - $N$  = number of mobiles
  - $P_i$  = power transmitted by mobile  $i$
  - $R_i$  = raw data rate of mobile  $i$
  - $W$  = spread bandwidth
- QoS requirement of mobile  $i$ ,  $\gamma_i$ , is the effective data rate

$$\gamma_i = R_i(1 - P_{ei})$$

## System Model: Interference

- Interference between users represented by cross correlations between codes,  $C_{ij}$
- Gain of path between mobile  $i$  and base station,  $L_i$
- Total interfering effect of mobile  $j$  on mobile  $i$ ,  $G_{ij}$  is  $G_{ij} = L_i C_{ij}$

## SIR Model (neglect noise)

$$SIR_i = \frac{G_{ii}P_i}{\sum_{j \neq i} G_{ij}P_j + \eta}$$

$$\beta_i = \left( \frac{E_b}{I_o} \right)_i = \frac{SIR_i W}{R_i}$$

## QoS Formula

- Probability of error is a function of  $\square_1$ 
  - Formula depends on the modulation scheme
- Simplified  $P_e$  expression

$$P_{ei} = \frac{1}{c\beta_i}$$

- QoS formula

$$\gamma_i = R_i \left( 1 - P_e \left( \frac{SIR_i W}{R_i} \right) \right)$$

## Problem Formulation

Minimize  $1^{\text{TP}}$  (sum of powers)

Subject to

$$R_i \left( 1 - P_e \left( \frac{SIR_i W}{R_i} \right) \right) \geq \gamma_i$$

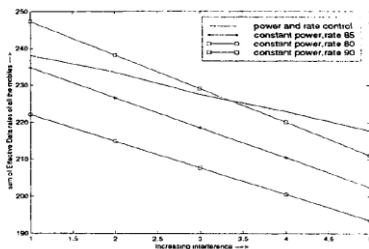
$$R_i \leq R_{\text{thresh}}$$

$$P > 0$$

Can also add constraints such as

$$P_i \geq P_{\min} \quad P_i \leq P_{\max}$$

## Results

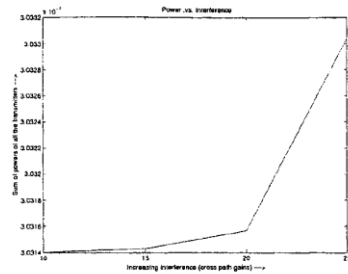


QoS vs. interference

## Solution

- Objective: Minimize sum of mobile powers subject to QoS requirements of all mobiles
- Technique: Geometric programming
  - A non-convex optimization problem is cast as a convex optimization problem
- Convex optimization
  - Objective and constraints are all convex
  - Can obtain a global optimum or a proof that the set of specifications is infeasible
  - Efficient implementation

## Results



Sum of powers transmitted vs interference