

# EIE3280: Networks: Technology, Economics, and Society

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# Q1: What makes CDMA work for my smartphone?

(Acknowledgment to Prof. Mung Chiang for sharing the Slides)

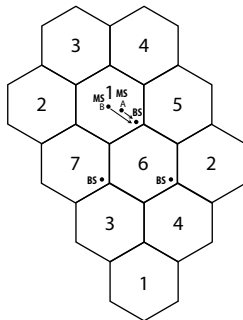
# Take a Look at Your Smartphone

- Networks (wireless, Internet, web...)
- Chip, touch screen, battery, software, business model...
- Data applications: texting, emailing, web browsing, video streaming, file downloading, ...
- Networking
  - ▶ Radio air interface
  - ▶ Core and backhaul

# History of Wireless

- 1940s: terrestrial wireless communications
- 1970s - now: cellular networks
  - ▶ 1G, 2G, 2.5G, 3G, 4G, 5G...
- 1990s - now: WiFi networks
- What is a cellular network?

# Basic Terminologies

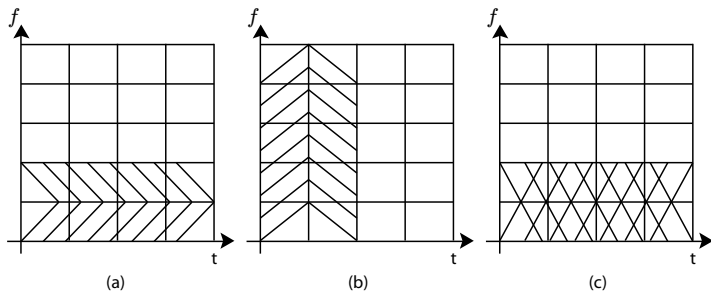


- Cells, Base Station (BS), Mobile Station (MS)
- Each BS has three directional antennas
- Signal attenuation:  $\propto 1/d^2$  to  $1/d^4 \Rightarrow$  Frequency reuse

# The Air

- Interference among multiple transmitter-receiver pairs
- Cocktail party
  - ▶ Use different languages to separate different conversations

# Orthogonal Resource Allocation



- (a) FDMA
- (b) TDMA
- (c) Ideal CDMA

# Non-orthogonal Resource Allocation

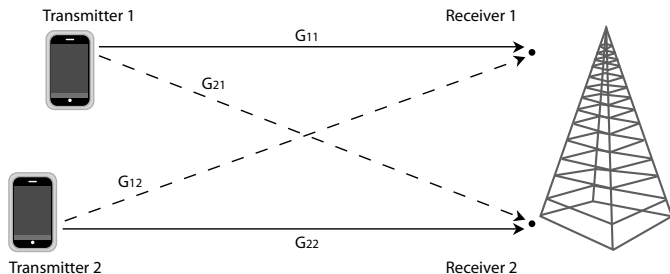
- (Practical) CDMA
- Starting in 1989, then IS-95 in 2G
- Now part of all 3G standards
- Spread spectrum technique
  - ▶ Spreading code: a sequence of 1's and -1's
  - ▶ Special design family of orthogonal spreading codes,
  - ▶ Non-orthogonal in practice due to not enough codes or imperfect synchronization
- Wikipedia: [https://en.wikipedia.org/wiki/Code-division\\_multiple\\_access](https://en.wikipedia.org/wiki/Code-division_multiple_access)



# Interference

- Our first example of **negative externality**
- Famous special case: **near-far problem**
- Simple solution by Qualcomm: feedback control
  - ▶ Transmit power control
  - ▶ Received signal power equalization
- But what if you need to achieve a target signal quality?

# Uplink Interference



- $G_{ij}$ : channel gain from transmitter  $j$  to receiver  $i$
- $G_{ij}$  is enhanced by CDMA spreading codes

- Signal-to-Interference-noise-Ratio (SIR):

$$\text{SIR}_i = \frac{G_{ii} p_i}{\sum_{j \neq i} G_{ij} p_j + n_i}$$

- ▶  $n_i$ : noise at receiver  $i$

# Distributed Power Control

- An iterative, distributed algorithm
- Assume each user  $i$  has an SIR target  $\gamma_i$

$$p_i[t+1] = \frac{\gamma_i}{\text{SIR}_i[t]} p_i[t], \text{ for each } i.$$

- Achieve the target SIR with the minimum transmission power

- Simple

- ▶ in communication
- ▶ in computation
- ▶ in configuration

- Intuitive

- ▶ Equilibrium looks good
- ▶ Convergence sounds plausible

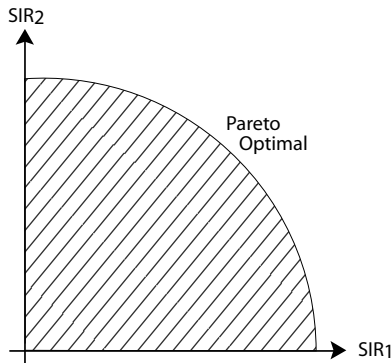
# A General Theme

- Individual behaviors driven by self-interest
- Aggregate into a (hopefully fair and efficient) state across all users
- Helped by feedback signals

# View 1: Optimization

- Objective: power minimization
- Constraints: achieve target SIRs for all users
- Variables: transmit powers
- Constants: channels, noise, target SIRs

# Feasible Region (in SINRs)



- The shaded area is the feasible region
- maximum feasible  $\text{SIR}_i = G_{ii}p_i^{\max}/n_i$
- Interference relationship determines the Pareto Optimal boundary



# Symbolically

- Minimize:  $\sum_i p_i$
- Subject to:  $\text{SIR}_i(\mathbf{p}) \geq \gamma_i, \forall i$
- Variables:  $\mathbf{p} = (p_i, \forall i)$

# Linear Programming

- Minimize a linear function subject to linear constraints
- How to prove convergence of DPC algorithm to a solution of this optimization?

# Terminologies

- **Infeasible** optimization problem
- **Feasible** optimization problem
- **Global** optimal and **local** optimal solution

## View 2: Game

- Power control is a competition
- Every user tries to minimize his transmission power
  - ▶ Subject to the SINR constraint
- Games are models for
  - ▶ Competition
  - ▶ Cooperation
- There is a formal (mathematical) language for games

# A Game

- A set of **players**
- A **strategy space** for each player
- A **payoff** for each player

# Prisoner's Dilemma

- 2-user game

	Not Confess	Confess
Not Confess	$(-1, -1)$	$(-5, 0)$
Confess	$(0, -5)$	$(-3, -3)$

# Strategies

- Best response strategy

$$a^*(b) = \arg \max_{a \in \mathcal{A}} U_1(a, b)$$

- ▶ Best response might not be unique  $\Rightarrow$  Best Response correspondence

- Dominant strategy

- ▶ A player's strategy that always leads to a payoff **no worse** than his any other strategies, **independent** of his opponents' strategies
- ▶ **Strictly** dominant and **weakly** dominant

# Equilibrium

- Equilibrium
  - ▶ Socially optimal?
  - ▶ Pareto optimal?
  - ▶ Exist?
  - ▶ Unique?



# Coordination Game: Battle of Sexes

- Another 2-user game

	Action Movie	Romance Movie
Action Movie	(2, 1)	(0, 0)
Romance Movie	(0, 0)	(1, 2)

# Nash Equilibrium

- Best response strategies “match”

# Power Control Game

- Let's identify
  - ▶ Players
  - ▶ Strategy spaces
  - ▶ Payoff functions
- DPC is just the best response strategy!
- Monotonicity of strategy space  $\rightarrow$  convergence of algorithm

## Example

Receiver of Link	Transmitter of Link			
	1	2	3	4
1	1	0.1	0.2	0.3
2	0.2	1	0.1	0.1
3	0.2	0.1	1	0.1
4	0.1	0.1	0.1	1

- Target SNRs: 2, 2.5, 1.5, 2
- Noise level: 0.1 mW

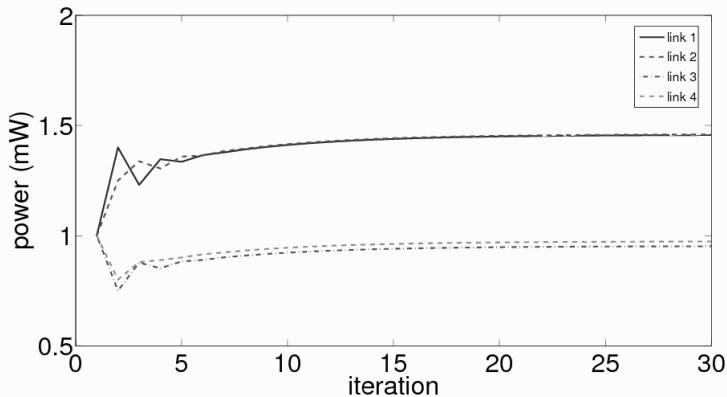
# Iteration 0

- Initialize all power levels to be 1 mW
- Let  $s$  calculate the corresponding SIRs

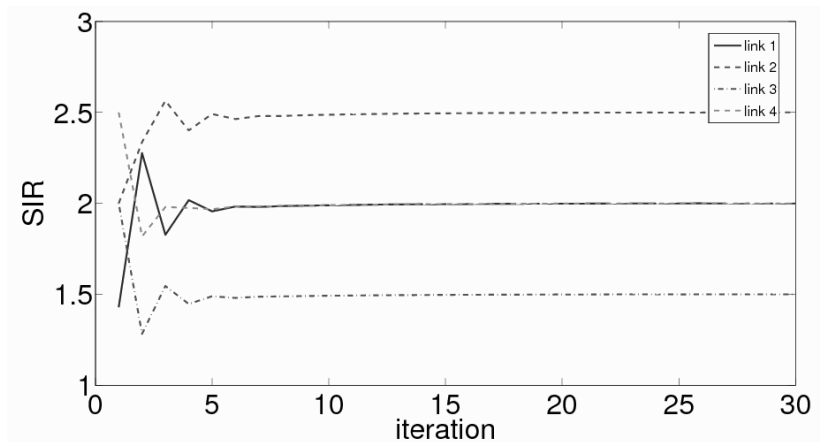
# Iteration 1

- Let's calculate power levels
- Let's calculate SIRs

# Convergence in Powers

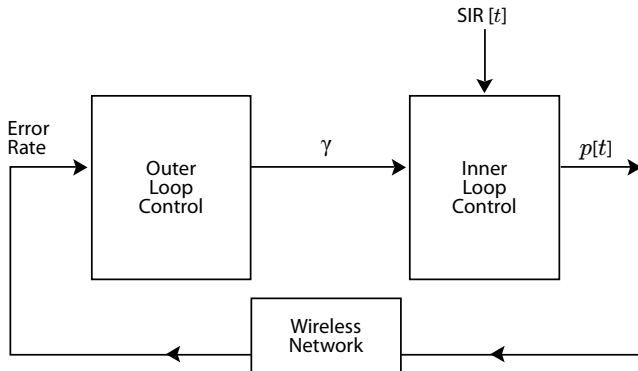


# Convergence in SNRs





# Two Control Loops



# In Practice

- Asynchronous and discrete
- Frequency: 800 1500
- Granularity: 0.1 dB, 0.2 dB, 0.5 dB
- Power control + handoff made all 3G standards work

# Summary

- Different users' signals interfere with each other in the air
  - ▶ Feasible SIR region with a Pareto-optimal boundary
- Interference coordination in CDMA uses DPC with feedback
  - ▶ Solves an optimization problem in the form of LP
  - ▶ Or viewed as the best response updates of a non-cooperative game