# EE359 – Lecture 16 Outline

#### Announcements:

- HW due Fri, new HW to be posted, due week after Thanksgiving
- End-of-Quarter schedule and possible bonus lecture
- Project comments this week.
- MIMO Receiver Design
  - Linear Receivers, Sphere Decoder
- Other MIMO Design Issues
  - Space-time coding, adaptive techniques, limited feedback
- ISI Countermeasures
- Multicarrier Modulation

## End of Quarter Schedule

- Today is last lecture this week
- Lectures week of 11/20: None!



- Thu 11/30 lecture will be Fri 12/1 (10:30, here)
- Normal lectures week of 12/4
  - 12/7 lecture: 10:30am-11:30am (class summary), 11:30am-12:30pm (bonus lecture on advanced topics)
- Final exam is 12/13 from 12:15-3:15pm

### **Review of last lecture**

## Capacity of Fading & Massive MIMO Systems

- For static channel with perfect CSI at TX and RX, power water-filling over space is optimal:
  - In fading waterfill over space (based on short-term power constraint)

$$C = \mathbf{E}_{\mathbf{H}} \left[ \max_{\mathbf{R}_{\mathbf{x}}: \mathrm{Tr}(\mathbf{R}_{\mathbf{x}}) = \rho} B \log_2 \det \left[ \mathbf{I}_{\mathbf{M}_{\mathbf{r}}} + \mathbf{H} \mathbf{R}_{\mathbf{x}} \mathbf{H}^{\mathbf{H}} \right] \right] = \mathbf{E}_{\mathbf{H}} \left[ \max_{P_i: \sum_i P_i \le P} \sum_i B \log_2 \left( 1 + \frac{P_i \gamma_i}{P} \right) \right]$$

• Or over space-time (long-term constraint)

$$C = \max_{\substack{P_H : E_H[P_H] \le \overline{P}}} E_H \left[ \max_{\substack{P_i : \sum_i P_i \le P_H}} \sum_i B \log_2 \left( 1 + \frac{P_i \gamma_i}{P_H} \right) \right]$$

• Without transmitter channel knowledge, capacity metric is based on an outage probability with respect to transmitted rate C:

$$p_{out} = p \left( \mathbf{H} : B \log_2 \det \left[ \mathbf{I}_{M_r} + \frac{\rho}{M_t} \mathbf{H} \mathbf{H}^H \right] \triangleleft C \right) \quad \text{Correction to} \quad \text{Lect. 15 ppt slides}$$

• Massive MIMO: At high SNR, as Mt,Mr $\rightarrow \infty$ , by random matrix theory C=min(M<sub>t</sub>,M<sub>r</sub>)Blog<sub>2</sub>(1+ $\rho$ )

# Review of Last Lecture (Cont'd)

- Beamforming: Scalar transmission
  - Principle vectors of U and V are weights: maximizes SNR



- Diversity-Multiplexing Tradeoff: high SNR •Can use some antennas for diversity, some for capacity gain:  $d^*(r) = (M_t - r)(M_r - r)$ 
  - •How antennas used depends on system metric
  - •If requirements unmet, need more antennas



# **MIMO Receiver Design**

### • Optimal Receiver:

- Maximum likelihood: finds input symbol most likely to have resulted in received vector
- Exponentially complex # of streams and constellation size

#### • Linear Receivers

- Zero-Forcing: forces off-diagonal elements to zero, enhances noise
- Minimum Mean Square Error: Balances zero forcing against noise enhancement

## • Sphere Decoder:

- Only considers possibilities within a sphere of received symbol.
  - If minimum distance symbol is within sphere, optimal, otherwise null is returned

$$\hat{x} = \arg\min_{x} |y - Hx|^2$$



Sphere Decoding

 $\hat{x} = \arg\min |Q^H y - Rx|^2$  $x:|Q^{\overline{H}}y-Rx| < r$ 

# Other MIMO Design Issues Not covered in lecture/HW/exams

## • Space-time coding:

- Map symbols to both space and time via space-time block and convolutional codes.
- For OFDM systems, codes are also mapped over frequency tones.
- Adaptive techniques:
  - Need fast and accurate channel estimation
  - Adapt the use of transmit/receive antennas
  - Adapting modulation and coding.
- Limited feedback transmit precoding:
  - Partial CSI introduces interference in parallel decomp: can use interference cancellation at RX
  - TX codebook design for quantized channel

# **ISI Countermeasures**

## • Equalization

- Signal processing at receiver to eliminate ISI
- Complex at high data rates, performs poorly in fast-fading
- Not used in state-of-the-art wireless systems

### Multicarrier Modulation

• Break data stream into lower-rate substreams modulated onto narrowband flat-fading subchannels

### Spread spectrum

- Superimpose a fast (wideband) spreading sequence on top of data sequence, allows resolution for combining or attenuation of multipath components.
- Antenna techniques (Massive MIMO)
  - (Highly) directional antennas reduce delay spread/ISI

# **Multicarrier Modulation**



- Breaks data into N substreams
- Substream modulated onto separate carriers
  - Substream passband BW is B/N for B total BW
  - B/N<B<sub>c</sub> implies flat fading on each subcarrier (no ISI)

# **Overlapping Substreams**

- Can have completely separate subchannels
  - Required passband bandwidth is B.
- OFDM overlaps substreams
  - Substreams (symbol time  $T_N$ ) separated in RX
  - Minimum substream separation is  $1/T_N$  for rectangular pulses
  - Total required bandwidth is B/2



# **Main Points**

- MIMO RX design trades complexity for performance
  - ML detector optimal exponentially complex
  - DF receivers prone to error propagation
  - Sphere decoders allow performance tradeoff via radius
- Other MIMO design issues include space-time coding, adaptation, codebooks for limited feedback
- ISI mitigated through equalization, multicarrier modulation (MCM) or spread spectrum
  - Today, equalizers often too complex or can't track channel.
  - MCM splits channel into NB flat fading subchannels
  - Can overlap subcarriers to preserve bandwidth