### EE359 - Lecture 14 Outline

- Announcements:
  - MT today, 2-4pm, 103 Hewlitt, pizza afterwards
  - HW posted today, due next Friday
- Discrete-Rate Adaptive Modulation
- Introduction to MIMO Communications
- MIMO Channel Decomposition
- MIMO Channel Capacity
- MIMO Beamforming

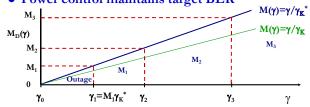
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#### Review continued

#### **Constellation Restriction**

- Restrict  $M_D(\gamma)$  to  $\{M_0=0,...,M_N\}$ .
- Let  $M(\gamma) = \gamma/\gamma_K^*$ , where  $\gamma_K^*$  is optimized for max rate
- Set  $M_D(\gamma)$  to  $\max_i M_i$ :  $M_i \le M(\gamma)$  (conservative)
- Region boundaries are  $\gamma_j = M_j \gamma_K^*, j = 0,...,N$

• Power control maintains target BER



**Review of Last Lecture** 

- Introduction to adaptive modulation
  - Vary different parameters of modulation relative to fading
- Variable-rate variable-power MQAM
  - Maximize average throughput by changing rate and power
  - Optimal power adaptation is water-filling

$$\frac{P(\gamma)}{\overline{P}} = \begin{cases} \frac{1}{\gamma_0} - \frac{1}{\gamma K} & \gamma \ge \frac{\gamma_0}{K} = \gamma_F \\ 0 & \text{else} \end{cases}$$

7/k y

• Optimal rate adaptation:

$$\frac{R}{B} = \int_{\gamma_K}^{\infty} \log_2\left(\frac{\gamma}{\gamma_K}\right) p(\gamma) d\gamma.$$

Equals capacity with effective power loss K=-1.5/ln(5BER).

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#### Power Adaptation and Average Rate

- Power adaptation: Fixed BER within each region
  - $\bullet E_s/N_0=(M_i-1)/K$
  - Channel inversion within a region
  - Requires power increase when increasing M(γ)

$$\frac{P_{j}(\gamma)}{P} = \begin{cases} (M_{j} - 1)/(\gamma K) & \gamma_{j} \le \gamma < \gamma_{j+1}, j > 0 \\ 0 & \gamma < \gamma, \end{cases}$$

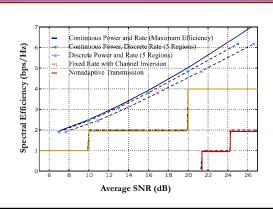
Average Rate

$$\frac{R}{B} = \sum_{i=1}^{N} \log_2 M_j p(\gamma_j \le \gamma < \gamma_{j+1})$$

- Practical Considerations (not covered in lecture):
  - Cannot update more than every 10-100 symbols
  - Estimation error/delay leads to irreducible error floor

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#### Efficiency in Rayleigh Fading



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## **MIMO Decomposition**

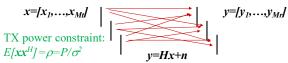
 Decompose channel through transmit precoding (x=Vx) and receiver shaping (y=U<sup>H</sup>y)



- Leads to R<sub>H</sub>≤min(M<sub>t</sub>,M<sub>r</sub>) independent channels with gain σ<sub>i</sub> (i<sup>th</sup> singular value of H) and AWGN
- Independent channels lead to simple capacity analysis and modulation/demodulation design

# Multiple Input Multiple Output (MIMO)Systems

• MIMO systems have multiple transmit and receiver antennas (M, at TX, M, at RX)



- Input described by vector x of dimension M,
- Output described by vector y of dimension M<sub>r</sub>
- Channel described by M,xM, matrix
- Design and capacity analysis depends on what is known about channel *H* at TX and RX
  - If H unknown at TX, requires vector modulation/demod

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# **MIMO Fading Channel Capacity**

- If channel H known, waterfill over space (fixed power at each time instant) or space-time
- Without transmitter channel knowledge, capacity is based on an outage probability
  - P<sub>out</sub> is probability that channel capacity given the channel realization is below the transmission rate C

$$p_{out} = p\left(\mathbf{H} : B \log_2 \det \left[\mathbf{I}_{M_r} + \frac{\rho}{M_t} \mathbf{H} \mathbf{H}^H\right] < C\right)$$

 Massive MIMO: random channel gains converge to static values: C = min(M<sub>D</sub>M<sub>r</sub>) Blog(1+ρ); ρ is SNR

$$\lim_{M_t \rightarrow \infty} B \log_2 \det \left[ \mathbf{I}_{M_r} + \frac{\rho}{M_t} \mathbf{H} \mathbf{H}^H \right] = B \log_2 \det \left[ \mathbf{I}_{M_r} + \rho \mathbf{I}_{M_r} \right] = M_r B \log_2 (1 + \rho)$$

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# **Main Points**

- Discretizing the constellation size in adaptive MQMA results in negligible performance loss.
  - Constellations cannot be updated faster than 10s to 100s of symbol times: OK for most dopplers.
  - Estimation error/delay causes error floor
- MIMO systems exploit multiple antennas at both TX and RX for capacity and/or diversity gain
- With TX/RX CSI, decomposes into independent channels
- Capacity of MIMO systems
  - Static channel with TX/RX CSI: sum of capacity on each spatial dimension
  - Static channel without TX CSI: capacity metric is outage.
  - Fading channel with TX/RX CSI: water-fill power over space or space-time to achieve capacity
  - With only RX CSI, capacity metric is outage.
  - Massive MIMO:  $C = min(M_t, M_r) Blog(1+\rho)$