# EE359 Final Review

March 11, 2020

**Please** attempt all questions even if you don't know how to get to the final answer

Will likely use Canvas to distribute and collect exams

# Outline

#### Review

- Channel models
- Performance analysis
- Combating fading using diversity
- Combating fading using adaptive modulation and power
- Point to point MIMO systems
- Combating multipath/ISI/small  $B_c$

## 2 Sample finals/discussion

# Broad Topics in Course

- Channel models
  - Path loss
  - Shadowing
  - Fading
- Performance analysis
  - Capacity
  - Probability of outage
  - Probability of bit/symbol error
- Combating fading using diversity
- Combating fading using adaptive modulation and power
- Point to point MIMO systems
  - Capacity and parallel channel decomposition
  - Beamforming
  - Diversity multiplexing tradeoff
  - MIMO receivers
- Combating multipath/ISI/small  $B_c$ 
  - Multicarrier modulation
  - Spread spectrum (has other uses too)

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# Path loss models

Models attenuation caused by "spread" of EM waves due to finite extent of transmitter

- Free space
- 2-ray and n-ray models
- Simplified path loss models

$$P_r = P_t K \left(\frac{d_0}{d}\right)^{\gamma}$$

Valid in the far field, i.e. when d is large,  $\gamma$  is path loss exponent, K can depend on carrier frequency

## Shadowing

Models attenuation caused by EM waves passing through randomly located objects

• Log normal shadowing assumes

$$10\log_{10}(P_r) = 10\log_{10}(\bar{P}_r) + S,$$

where  $S \sim \mathcal{N}(0, \sigma_{\psi_{dB}}^2)$  or equivalently

$$P_r(\mathsf{dB}) = \bar{P}_r(\mathsf{dB}) + S$$

• S is associated with location, closely located points will have correlated S (can talk of decorrelation distance X<sub>c</sub>)

# Fading

Models attenuation due to EM waves combining with random phases due to multipath

#### Recall: Narrowband versus wideband

- Received signal Re{  $\sum_{n=1}^{N} a_n(t) e^{-j\phi_n(t)} u[\tau \tau_n(t)] e^{j2\pi f_c t} \}$
- Narrowband approximation  $u(t) \approx u(t \tau_n(t))$ , i.e. received signal is



# Fading contd.

#### Narrowband fading

• Effect of channel is just scalar multiplication by complex constant

$$\alpha(t) = r_I(t) + jr_Q(t)$$

• Specify distribution on envelope  $z(t) = |\alpha(t)| = \sqrt{r_I(t)^2 + r_Q(t)^2}$ : Rayleigh, Rician, Nakagami  $m, \ldots$ 

## Wideband fading

- Effect of channel no longer modelled by a single scalar multiplication
- Divide up wide band into M narrow bands  $(1,\ldots,m,\ldots,M)$  with fading  $\alpha_m(t)$
- Specify joint distributions on  $\alpha_m(t)$  for  $m \in \{1, \ldots, M\}$

# On fading "types"

## Depends on:

- Signal Bandwidth  $B_u$
- Coherence Time  $T_c$  or Doppler Effects
- Coherence Bandwidth  $B_{c}\ {\rm or}\ {\rm Delay}\ {\rm Spread}$



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# Capacity

#### Definition

Maximum data rate that can be supported by the channel with vanishing probability of error

Capacity C under different models ( $\gamma$  is the instantaneous SNR at the receiver, B is bandwidth)

Scheme	Capacity Expression
AWGN	$C = B \log_2(1+\gamma)$
Shannon capacity in fading	$C = \int_0^\infty B \log_2(1+\gamma)p(\gamma)d\gamma$
with Rx CSI only	
Shannon capacity in fading	$C = \int_0^\infty B \log_2(1+\gamma)p(\gamma)d\gamma$
with constant $Tx$ power and	
Tx, Rx CSI	
Shannon capacity with Tx, Rx	$C = \int_{\gamma_0}^{\infty} B \log_2(\gamma/\gamma_0) p(\gamma) d\gamma$ , where
CSI (Waterfilling)	10
	$\int_{\gamma_0}^{\infty} (1/\gamma_0 - 1/\gamma) p(\gamma) d\gamma = 1$

# Capacity formulas continued ...

## Capacity expressions C

Scheme	Capacity Expression
Channel Inversion	$C = B \log_2 \left( 1 + \frac{1}{E[1/\gamma]} \right)$
Truncated Channel Inversion	$C = B \log_2 \left( 1 + \frac{1}{E_{\gamma_0}[1/\gamma]} \right) p(\gamma > \gamma_0)$ where $E_{\gamma_0}[1/\gamma] = \int_{\gamma_0}^{\infty} \frac{1}{\gamma} p(\gamma) d\gamma$

# Outage probability

#### Idea

 $\mathsf{Outage} \equiv \mathsf{Received} \ \mathsf{SNR} \ \gamma \ \mathsf{is} \ \mathsf{below} \ \mathsf{threshold} \ \gamma_0$ 

#### Reasons

- Path Loss (usually no randomness)
- Shadowing (randomness if shadowing time scales are small)
- Fading (randomness due to multipath combining)

# Outage probability

## Idea

Outage  $\equiv$  Instantaneous probability of error  $P_{e}$  is greater than  $P_{e,0}$ 

#### Reasons

- Path Loss (usually no randomness)
- Shadowing (randomness if shadowing time scales are small)
- Fading (randomness due to multipath combining)

## Outage probability and cell coverage area

#### Outage probability

- Defined for a particular location
- Relates  $P_{\text{out}}$ ,  $P_{\min}$  (dB),  $\bar{P}_r(d)$  (dB),  $\sigma_{\psi_{dB}}$  at a location d via

$$P_{\rm out} = Q\left(\frac{\bar{P}_r(d) - P_{\rm min}}{\sigma_{\psi_{dB}}}\right)$$

under log normal shadowing

Average probability of bit/symbol error

#### Idea

- Compute  $\bar{P}_s = \mathsf{E}_{\gamma}[P_s(\gamma)]$
- May be simplified using alternate Q functions and MGFs of fading distributions

## Regime of relevance

Metric	Relevant regime
Outage probability	$T_s \ll T_c$
Average probability of error	$T_s \approx T_c$
AWGN probability of error	$T_s \gg T_c$

# Error floors

#### What is an error floor?

Error floor whenever  $P_s \not\rightarrow 0$  as  $\gamma \rightarrow \infty$ 

#### Summary of effects

- Data rate cannot be too low with non coherent schemes
  - Non coherent schemes assume channel is constant across subsequent symbols
  - Depends on e.g. Doppler or  $T_c$
- Data rate cannot be too high in any system
  - Channel will "spread" symbols across time, causing self interference (ISI inter symbol interference)
  - Depends on e.g.  $B_c$  or coherence bandwidth of channel

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#### • Combating fading using diversity

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## 2 Sample finals/discussion

# Diversity

#### Idea

Use of independent fading realizations can reduce the probability of error/outage events

Some diversity combining schemes (with M i.i.d. realizations) with  $\mbox{CSIR}$ 

- Selection Combining (SC):  $\gamma_{\Sigma} = \max_i \gamma_i$ ,  $P_{\mathsf{out},M} = P_{\mathsf{out}}^M$
- Maximal Ratio Combining (MRC):  $\gamma_{\Sigma} = \sum_{i} \gamma_{i}$ ,  $\bar{P}_{s,M} = \bar{P}^{M}_{s,1}$ , can use MGF expressions for  $\bar{P}_{s,M}$

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## Benefits

- Diversity gain (or diversity order)
- SNR gain (or array gain)

# Diversity

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## Benefits

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- SNR gain (or array gain)

Can employ MRC and SC at the transmitter also if there is CSIT (transmit diversity)!

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## Adaptive systems

#### Idea

Adapt rate, power, coding, ... to CSIT (fading realization); used all the time in almost all high speed systems

## Condition for validity

Channel cannot change too fast! (can be roughly estimated by a markov model and level crossing rates)

## Our approach to an achievable adaptive scheme

• Use 
$$P_b = 0.2e^{\frac{-1.5\gamma}{M-1}}$$
 or  $M = 1 + K\gamma$  where  $K = \frac{-1.5}{\ln(5P_b)}$ 

- Use waterfilling ideas to optimize average spectral efficiency (  $\log_2(M)$ ) subject to power constraints thus giving  $M(\gamma)$  and  $P(\gamma)$
- Use heuristics to take into account discrete  ${\cal M}$

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# System model

# Model $\underbrace{\begin{bmatrix} y_1 \\ \vdots \\ y_{N_r} \end{bmatrix}}_{\mathbf{y}} = \underbrace{\begin{bmatrix} h_{1,1} & \dots & h_{1,N_t} \\ \vdots & \ddots & \vdots \\ h_{N_r,1} & \dots & h_{N_r,N_t} \end{bmatrix}}_{\mathbf{H}} \underbrace{\begin{bmatrix} x_1 \\ \vdots \\ x_{N_t} \end{bmatrix}}_{\mathbf{x}} + \underbrace{\begin{bmatrix} n_1 \\ \vdots \\ n_{N_r} \end{bmatrix}}_{\mathbf{n}}$

where  $\mathbf{x}$  is what transmitter sends and  $\mathbf{y}$  is what receiver sees

Transmit power constraint

$$\mathsf{E}[\mathbf{x}^*\mathbf{x}] = \sum_{i=1}^{N_t} \mathsf{E}[|x_i|^2] \le \rho$$

# Parallel channel decomposition of ${\bf H}$

#### Idea

Use the singular value decomposition (SVD) of channel matrix

 $\mathbf{H} = \mathbf{U} \boldsymbol{\Sigma} \mathbf{V}^{\mathbf{H}}$ 

#### Parallel channel decomposition

- Transmitter sends  $\mathbf{x} = \mathbf{V} \mathbf{\tilde{x}}$  (transmit precoding)
- Receiver obtains  $\mathbf{\tilde{y}} = \mathbf{U^{H}y}$  (receiver shaping)

$$\tilde{\mathbf{y}} = \boldsymbol{\Sigma} \tilde{\mathbf{x}}$$



Figure: Equivalent parallel channels (no "crosstalk" or interchannel interference)

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$$\mathbf{\tilde{y}}=\mathbf{\Sigma}\mathbf{\tilde{x}}$$

#### Note

The number of such channels equals the rank of  ${\bf H}$ 

Channel capacity

CSIT and CSIR

$$C = \max_{\mathbf{R}_{\mathbf{x}}: \operatorname{Tr}(\mathbf{R}_{\mathbf{x}}) \le \rho} B \log_2 |\mathbf{I} + \mathbf{H}\mathbf{R}_{\mathbf{x}}\mathbf{H}^{\mathbf{H}}| = \max_{\boldsymbol{\rho}: \sum_i \rho_i \le \rho} B \sum_i \log_2(1 + \rho_i \sigma_i^2)$$

#### Note

Can solve this by waterfilling!

CSIR only

$$C = \max_{\mathbf{R}_{\mathbf{x}}:\mathbf{R}_{\mathbf{x}}=\rho/N_t} B \log_2 |\mathbf{I} + \mathbf{H}\mathbf{R}_{\mathbf{x}}\mathbf{H}^{\mathbf{H}}| = \max_{\boldsymbol{\rho}:\rho_i=\rho/N_t} \sum_i B \log_2(1+\rho\sigma_i^2/N_t)$$

# Beamforming

#### Idea

Combine multiple antennas to create a single channel with better SNR

#### Math

Equivalent scalar channel  $\tilde{y} = \mathbf{u}^{\mathbf{H}} \mathbf{H} \mathbf{v} \tilde{x} + n$ ,  $\|\mathbf{u}\| = \|\mathbf{v}\| = 1$ 

#### Some facts

- $\bullet\,$  SNR optimal if  ${\bf u}$  and  ${\bf v}$  are associated with largest singular value of  ${\bf H}$
- Capacity optimal if largest singular value is much larger than the rest (reason: waterfilling solution interpretation)
- Needs CSIT and CSIR

# Diversity multiplexing tradeoff (DMT)



Figure: Blue curve for  $N_t = 3, N_r = 3$ , green for  $N_t = 2, N_r = 2$ . Note the piecewise linear nature.

- High SNR concept:
  - Multiplexing gain  $r = \lim_{SNR \to \infty} \frac{R(SNR)}{\log_2(SNR)}$
  - Diversity gain  $d = \lim_{\text{SNR} \to \infty} \frac{-\log P_e}{\log \text{SNR}}$
- Valid for complex normal statistics for H<sub>i,j</sub> (may not be the same curve for different statistics)
- Achievability does not use CSI at transmitter

MIMO receivers (let's say  $x_i \in \{-1, +1\}$ )

Maximum likelihood (ML), optimal but high complexity

$$\hat{\mathbf{x}} = \operatorname{argmin}_{\mathbf{x} \in \{-1,+1\}^{N_t}} \|\mathbf{y} - \mathbf{H}\mathbf{x}\|^2$$

Zero forcing (ZF), suboptimal but linear complexity  $\mathbf{\hat{x}} = \mathrm{sign}(\mathbf{H}^{\dagger}\mathbf{y} \text{ }) \text{ where } \mathbf{H}^{\dagger} = (\mathbf{H}^{\mathbf{H}}\mathbf{H})^{-1}\mathbf{H}^{\mathbf{H}} \text{ if } \mathbf{H} \text{ is "tall"}$ 

Minimum mean squared error (MMSE) (SNR =  $1/\sigma^2$ ), optimal for gaussian

$$\mathbf{\hat{x}} = \operatorname{sign}((\mathbf{H}^{\mathbf{H}}\mathbf{H} + \sigma^{2}\mathbf{I})^{-1}\mathbf{H}^{\mathbf{H}}\mathbf{y})$$

# MIMO receivers continued

## Sphere decoders (SD)- Near ML performance

- Use  $\|\mathbf{y} \mathbf{H}\mathbf{x}\|^2 = \|\mathbf{Q}^{\mathbf{H}}\mathbf{y} \mathbf{R}\mathbf{x}\|^2 = \sum_{i=N_t}^1 ((Q^H y)i \sum_{j\geq i} R_{i,j}x_j)^2$ to compute  $\operatorname{argmin}_{\mathbf{x}:\|\mathbf{y} - \mathbf{H}\mathbf{x}\| < r} \|\mathbf{y} - \mathbf{H}\mathbf{x}\|^2$
- Tuning r trades off complexity versus performance
- $\bullet$  Optimal if and only if there exists  ${\bf x}$  within restricted region



Figure: Tree with  $2^{N_t}$  possible paths (for BPSK). Each node associated with sum of known terms.

## Algorithm (depth first search)

- Traverse tree depth first
- Prune branches of tree if accumulated sum at a node is greater than r
- Smaller *r* leads to lower complexity but possibly higher BER

# MIMO receivers continued

## Sphere decoders (SD)- Near ML performance

- Use  $\|\mathbf{y} \mathbf{H}\mathbf{x}\|^2 = \|\mathbf{Q}^{\mathbf{H}}\mathbf{y} \mathbf{R}\mathbf{x}\|^2 = \sum_{i=N_t}^1 ((Q^H y)i \sum_{j\geq i} R_{i,j}x_j)^2$ to compute  $\operatorname{argmin}_{\mathbf{x}:\|\mathbf{y} - \mathbf{H}\mathbf{x}\| < r} \|\mathbf{y} - \mathbf{H}\mathbf{x}\|^2$
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## 2 Sample finals/discussion

# Multicarrier modulation

#### Idea

Divide large bandwidth into smaller chunks and use narrowband signals

## Advantages

- Takes care of intersymbol interference (ISI)
- Multiplexing subcarriers (OFDMA)
- Signal processing can be extremely efficient

# Multicarrier modulation

#### Idea

Divide large bandwidth into smaller chunks and use narrowband signals

## OFDM block diagram



# Multicarrier modulation

#### Idea

Divide large bandwidth into smaller chunks and use narrowband signals

#### Fineprint

- Use FFT/IFFT for frequency time interconversion ( $\Theta(N \log N)$  complexity)
- Use cyclic prefix to simulate circular convolution from linear convolution with finite impulse response
- Subchannels may be used for diversity, multiplexing, depending on how correlated they are

# Spread spectrum

#### Idea

Spread a narrowband signal over a wider band

## Some common methods • FHSS

DSSS

## DSSS idea

- At transmitter: Use a spreading code (also known as chip sequence)  $s_c(t)$  of bandwidth  $B = 1/T_c$  (sometimes called *chip rate*) with which to multiply narrowband signal g(t) of duration  $T_s = 1/B_s$
- $\bullet$  At receiver: Take the integral of  $r(t)s_c(t)$  over time  $T_s$
- Processing gain  $\triangleq \frac{B}{B_s}$



- $s_c(t)$  in the time domain  $S_c(f)$  frequency domain
- At transmitter: Send  $s(t) = g(t)s_c(t)$ , g(t) narrowband, duration  $T_s$
- At receiver: Compute  $rac{1}{T_s}\int_0^{T_s} s(t)s_c(t)dt$

## Narrowband interference rejection

- Received signal  $r(t) = s(t) + i(t) = s_c(t)g(t) + i(t)$
- Receiver processing  $\frac{1}{T_s} \int_{t=0}^{T_s} r(t) s_c(t) dt \approx \bar{g} + \frac{1}{T_s} \int_{t=0}^{T_s} i(t) s_c(t) dt$

Here  $\bar{g} = \frac{1}{T_s} \int_{t=0}^{T_s} g(t) dt$ 



- At transmitter: Send  $s(t) = g(t)s_c(t)$ , g(t) narrowband, duration  $T_s$
- At receiver: Compute  $\frac{1}{T_s}\int_0^{T_s} s(t)s_c(t)dt$





 $s_c(t)$  in the time domain  $S_c(f)$  frequency domain

- $\bullet$  At transmitter: Send  $s(t)=g(t)s_c(t){\rm , }\ g(t)$  narrowband, duration  $T_s$
- At receiver: Compute  $\frac{1}{T_s}\int_0^{T_s} s(t)s_c(t)dt$

#### Narrowband interference rejection

Interference energy in the band of g(t) is reduced by approximately  $T_s/T_c!$ 



- $s_c(t)$  in the time domain  $S_c(f)$  frequency domain
- At transmitter: Send  $s(t)=g(t)s_c(t){\rm , }\ g(t)$  narrowband, duration  $T_s$
- At receiver: Compute  $\frac{1}{T_s}\int_0^{T_s} s(t)s_c(t)dt$

## Multipath(ISI) rejection

- Received signal  $r(t) = s_c(t) + \alpha s_c(t \tau)$
- Receiver signal processing  $\frac{1}{T_s}\int_0^{T_s}r(t)s_c(t)dt=\bar{g}\rho(0)+\frac{\alpha\bar{g}}{T_s}\rho(\tau)$



- $s_c(t)$  in the time domain  $S_c(f)$  frequency domain
- At transmitter: Send  $s(t)=g(t)s_c(t){\rm , }\ g(t)$  narrowband, duration  $T_s$
- At receiver: Compute  $\frac{1}{T_s}\int_0^{T_s} s(t)s_c(t)dt$

## Multipath(ISI) rejection

- The support of  $\rho(\tau)$  needs to be concentrated around  $\tau=0$  for good multipath rejection
- Larger support, on the other hand, good for synchronization/ acquisition of phase (why ?)

## Rake receivers

#### Idea

Using spreading codes with good ISI rejection, we can distinguish different multipath components!

## Some facts

- RAKE receiver simply gathers energy from different multipath components with different delays
- Different branches of the RAKE receiver synched to a different delay component
- Can be combined using diversity combining techniques (MRC/SC, etc.)

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Consider the following channel gain matrix:

$$\mathbf{H} = \begin{bmatrix} 0.1 & 0.3 & 0.7 \\ 0.5 & 0.4 & 0.1 \\ 0.2 & 0.6 & 0.8 \end{bmatrix}$$
$$= \begin{bmatrix} -0.555 & 0.3764 & -0.7418 \\ -0.333 & -0.9176 & -0.2158 \\ -0.7619 & 0.1278 & 0.6349 \end{bmatrix} \begin{bmatrix} 1.333 & 0 & 0 \\ 0 & 0.5129 & 0 \\ 0 & 0 & 0.0965 \end{bmatrix}$$
$$* \begin{bmatrix} -0.2811 & -0.7713 & -0.5710 \\ -0.5679 & -0.3459 & 0.7469 \\ -0.7736 & 0.5342 & -0.3408 \end{bmatrix}$$

Assume the system bandwidth is B=1 MHz, the noise power is 0 dBm and perfect CSI at TX and RX. You may use the approximation BER  $\approx 0.2e^{-1.5\gamma/(M-1)}.$ 

What are the transmit precoding and receiver shaping matrices associated with beamforming (1 spatial dimension) and 2D precoding (2 spatial streams)?

Find the capacity when the transmit power is 10 dBm. Can the transmit power affect the optimal number of spatial streams?

Find the data rate that can be achieved with optimal adaptive modulation across spatial dimensions for a total transmit power of 20 dBm, assuming unconstrained MQAM and BER target of  $10^{-4}$ .

For a transmit power of 20 dBm and MQAM constellations constrained to no transmission, BPSK or  $M = 2^k, k = 2, 3, 4, \ldots$ , a target BER of  $10^{-4}$  and power divided equally among all spatial streams, find the total data rate associated with all data streams under beamforming, 2D precoding and using all spatial streams.

For 16QAM modulation and a 20 dBm transmit power equally divided across all spatial streams, find the BER for each stream under beamforming, 2D precoding and spatial multiplexing.

Consider an OFDM system with N subchannels and flat fading on each subchannel. The system uses an appropriate length cyclic prefix to remove ISI between FFT blocks so the *i*th subchannel can be represented as  $Y[i] = H[i] \odot X[i] + N[i]$  where H[i] is the fading assocated with the *i*th subchannel.

Suppose the delay spread is 10  $\mu$ s. If the total channel bandwidth is 10 MHz and the OFDM system has an FFT size that must be a power of 2, what size FFT ensures flat fading on each subchannel?

Assume an OFDM system with 8 subchanels each with a bandwidth of 100kHz. With 400mW transmitted on each subchannel, the received SNR is  $\gamma_i = 400/i$  (linear units). Given a total transmit power of P = 400 mW total across subcarriers, what is the capacity of your system when transmit power is constant across subcarriers?

What is the capacity when power is adapted so there is constant receive SNR on each subcarrier?