Fading Channels, Diversity and MIMO systems

EE564: Digital Communication and Coding Systems

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Overview Topics

- Fading channel models
- Performance impact of fading
 - Benefits of diversity
- Methods for obtaining diversity
- MIMO systems
 - Space time codes (for diversity)
 - Space time multiplexing (for increased throughput)
- Capacity measures for MIMO and fading channels

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Typical 3-Level Channel Models

• Path Loss

- Deterministic propagation loss model
- Large scale
- Empirically determined from field measurements

• Shadowing

- Statistical model for the deviation from the path loss model
- Long-term fading e.g., 10-100 wavelengths
- Empirically determined from field measurements
- Fading
 - Statistical model for short-term (sub-wavelength) power fluctuations
 - Also characterizes the distortion characteristics of the channel
 - Simple analytical models, verified via measurements







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Path Loss Models

• Models are Roughly Frequency Independent

- Weak dependency described in more detailed model
- More difficult to predict in smaller regions (e.g., indoor)
- Environment specific models: ray-tracing, Manhattan pico cells, etc.

• Power decays linearly (in dB) with delay

- Free space \Rightarrow 20 dB per decade
- $-\,\beta \Rightarrow 10\beta$ dB per decade
- Utility of path loss models:
 - rough cell planning (*e.g.*, cell size, reuse factors)



Shadowing Models

• Random deviation from path loss model:

$$\frac{P_{r,S}(d;u)}{P_r(d_0)} = \epsilon(u)\frac{P_r(d)}{P_r(d_0)}$$
$$\left[\frac{P_{r,S}(d;u)}{P_r(d_0)}\right]_{dB} = \left[\frac{P_r(d)}{P_r(d_0)}\right]_{dB} + 10\log_{10}\left[\epsilon(u)\right]$$
$$= -10\beta\log_{10}\left(\frac{d}{d_0}\right) + \epsilon_{dB}(u)$$

• Common Model: Log-Normal Shadowing

$$\epsilon_{dB}(u) \sim \mathcal{N}(\cdot; 0; \sigma_{\epsilon_{dB}}^2)$$

- The received power in dB may be thought of as Gaussian with mean given by the path loss model and variance $\sigma^2_{\epsilon_{dB}}$
- Shadowing deviation: $\sigma_{\epsilon_{dB}}$
 - Macrocellular systems have values in the range 5 to 12, with 8 being typical

Short-term (multipath) Fading Models

• Common Model: random, time-varying linear system – Impulse response from a delta applied at time t is $h(u;t;\tau)$ $y(u,\tau) = h(u;t;\tau) \ast x(\tau) \quad z(u,\tau) = h(u;t+\delta;\tau) \ast x(\tau)$ $z(u,\tau) \neq y(u,\tau)$ $h(t_4;\tau)$ t $h(t_2; \tau)$ $h(t_3;\tau)$ $h(t_1;\tau)$ τ 24

Short-term (multipath) Fading Models

- Characterizing Distortion: What is the shape of the impulse response $h(u; t; \tau)$ wrt τ ?
 - $-\tau_d$: *Delay Spread* how long does the channel ring from a time impulse?
 - $-B_c$: Coherence Bandwidth over what range of frequencies is the gain of the channel flat?
- Characterizing Time-variation: How does $h(u; t; \tau)$ change with t?
 - $-t_c$: Coherence time for what value of Δ are the responses at t and $t + \Delta$ uncorrelated?
 - f_d : Doppler Spread how much will the spectrum of an input tone (*i.e.*, frequency impulse) be spread in frequency?

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Short-term (multipath) Fading Models

	Time-variation Properties	Distortion Properties
	variation in t	variation $in\tau$
Time	Coherence	Delay
Domain	Time	Spread
Frequency	Doppler	Coherence
Domain	Spread	Bandwidth

- Distortion Properties: $B_c \propto \frac{1}{\tau_d}$
- Time-variation Properties: $f_d \propto \frac{1}{t_c}$

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Measures Relative to Signals

- Does the channel distort the signal?
 - $-W \ll B_c \Rightarrow \text{NO} \Rightarrow Flat Fading$
 - $-W \ge B_c \Rightarrow \text{YES} \Rightarrow Frequency-Selective Fading}$
 - * Note: If $W \cong \frac{1}{T}$, then frequency selective fading implies that $T \leq \tau_d \Rightarrow$ time dispersion or *intersymbol interference (ISI)*
 - * Not so for wideband systems $W \gg \frac{1}{T}$
 - * Flat Fading \iff amplitude and phase distortion only!
- Does the channel remain constant over many channel uses?

$$-T \ll t_c \Rightarrow \text{YES} \Rightarrow Slow Fading$$

- $-T \ge t_c \Rightarrow \text{NO} \Rightarrow Fast Fading$
 - * Slow fading may still require frequent training and/or adaptive tracking

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Clarke's Doppler Model: Meaning (flat fading)

• I/Q carrier modulated inputs:

$$\begin{aligned} x(t) &= x_I(t)\sqrt{2}\cos(2\pi f_c t) - x_Q(t)\sqrt{2}\sin(2\pi f_c t) \\ &= \Re\left\{\bar{x}(t)\sqrt{2}e^{j2\pi f_c t}\right\} \\ &= |\bar{x}(t)|\cos(2\pi f_c t + \angle \bar{x}(t)) \\ \bar{x}(t) &= x_I(t) + jx_Q(t) \end{aligned}$$

• Output:

$$y(u;t) = [h_I(t)x_I(t) - h_Q(t)x_Q(t)]\sqrt{2}\cos(2\pi f_c t) -[h_I(t)x_Q(t) + h_Q(t)x_I(t)]\sqrt{2}\sin(2\pi f_c t) = \Re \left\{ \bar{y}(t)\sqrt{2}e^{j2\pi f_c t} \right\} = |\bar{y}(t)|\cos(2\pi f_c t + \angle \bar{y}(t)) \bar{y}(t) = y_I(t) + jy_Q(t) = \bar{x}(t)\bar{h}(t)$$



this is the envelope for Rayleigh (flat) fading

Fading Channel Summary

- In general, this is complex stuff...
- Many modern systems use OFDM, so the sub-carrier channels are modeled as frequency flat fading.
 - Correlation in complex gains across frequencies, several coherence bandwidth in a broadband OFDM system
 - Rayleigh fading is worse case: I and Q channel gains are zero mean, independent Gaussian. Results from many, many diffuse scatters
 - Ricean fading is similar with non-zero means in the I and Q channel gains
- Time variation is often modeled as
 - Fixed or quasi-static

Effects of Fading

• **Recall:** for the AWGN channel, for all modulations considered, the error performance decays exponentially in SNR

$$P_b \cong K_1 e^{-K_2 \frac{E_b}{N_0}}$$

• Fading:

– Random variations in received power

- Average the AWGN performance over the statistics E_b/N_0

- Consider the performance as a function of average E_b/N_0

- Performance decays only inverse linearly with Rayleigh (flat) fading

$$P_b \cong K \left[\frac{E_b}{N_0}\right]^{-1}$$



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Combating Fading: Diversity

• **Intuition:** combining multiple independent copies of the received signal will reduce the *variance* of the SNR

$$\bar{r}^{(d)}(t) = \bar{h}^{(d)}s(t;\mathbf{a}) + \bar{n}^{(d)}(t) \quad d = 1, 2...D$$

- Diversity Order: D – number of effectively independent replicas

- Impact on Performance: Increases BER decay

$$P_b \cong K \left[\frac{E_b}{N_0}\right]^{-D}$$

 $-\operatorname{As}\,D$ increases, the performance approaches that of no-fading!

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How to Obtain Diversity

• Spatial Diversity:

-e.g., Space two antennas farther than $\lambda/2$ in dense scattering

• Time Diversity:

 $-\ e.g.,$ Repeat the transmission after waiting longer than the coherence time

• Frequency Diversity:

- e.g., Transmit the signal on two carriers spaced further than the coherence BW

- Which type if best?
 - Performance gains are the same regardless (nominally)
 - Effort required to combine the diversity effectively may differ greatly with the type and the exact signal format



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Optimal Diversity Combining

- Optimal Digital Communication Receiver:
 - Consider all possible versions of the received signal (including distortion, interference, etc.) that arise from possible \mathbf{a}
 - Correlate with each of these possibilities
 - Adjust correlation for energy difference
 - Maximize over possibilities
- This yields Maximum (Signal-to-Noise) Ratio Combining:

$$z_d(\tilde{\mathbf{a}}) = \int \bar{r}^{(d)}(t) s(t; \tilde{\mathbf{a}}) dt$$
$$Z(\tilde{\mathbf{a}}) = \sum_{d=1}^D \left(\bar{h}^{(d)}\right)^* z_d(\tilde{\mathbf{a}})$$

- If each signal $s(t; \tilde{\mathbf{a}})$ has equal energy, then

$$\max_{\tilde{\mathbf{a}}} Z(\tilde{\mathbf{a}})$$

Performance of BPSK in Rayleigh Fading

 $\gamma = E_b/N_0 = \text{random due to fading with mean } \overline{\gamma} = \overline{E}_b/N_0$

 $f(\gamma) = \frac{1}{\overline{\gamma}}e^{-\gamma/\overline{\gamma}}$ $\gamma > 0$ Rayleigh fading (no diversity)

$$\begin{split} P(\mathcal{E}) &= \int_0^\infty \mathbf{Q}(\sqrt{2\gamma})f(\gamma)d\gamma \\ &= \frac{1}{2} \left[1 - \sqrt{\frac{\overline{\gamma}}{1 + \overline{\gamma}}} \right] \\ &\approx \frac{1}{4\overline{\gamma}} \qquad \overline{\gamma} \gg 1 \end{split}$$

Note: all mods we have seen have uncoded performance that is well approximated as a Q-function

Performance of BPSK in Rayleigh Fading

 $\gamma = E_b/N_0$ = random due to fading with mean $\overline{\gamma} = \overline{E}_b/N_0$

$$f(\gamma) = \frac{1}{(D-1)!\overline{\gamma}^D} \gamma^{D-1} e^{-\gamma/\overline{\gamma}} \quad \gamma > 0 \qquad \begin{array}{l} \text{Rayleigh fading, diversity D and MRC} \\ \text{combining} \end{array}$$

Central chi-squared with 2D degrees of freedom

$$\begin{split} P(\mathcal{E}) &= \int_{0}^{\infty} \mathcal{Q}(\sqrt{2\gamma}) f(\gamma) d\gamma \\ &= \left(\frac{1-\mu}{2}\right)^{D} \prod_{k=0}^{D-1} \left(\begin{array}{c} L-1+k \\ k \end{array} \right) \left(\frac{1+\mu}{2}\right)^{D} \\ \mu &= \sqrt{\frac{\overline{\gamma}}{1+\overline{\gamma}}} \\ P(\mathcal{E}) &\approx \left(\begin{array}{c} 2D-1 \\ D \end{array} \right) \left(\frac{1}{4\overline{\gamma}}\right)^{D} \quad \overline{\gamma} \gg 1 \end{split}$$

Practical Frequency Diversity: Spreading

• Use more bandwidth than required:

- provides frequency diversity \iff frequency-selectivity

- spectrally inefficient (single-user)

• Techniques:

- *Direct Sequence:* mix with a pseudorandom squarewave carrier
- Frequency Hopping: change f_c according to a pseudorandom pattern
- *Time Hopping:* change signal epoch of narrow pulse in pseudorandom manner





D ~ number of coherence BWs in the spread BW





Practical Time Diversity: Interleaving and Coding

• Forward Error Correction Coding:

- Provides an SNR gain (*i.e.*, coding gain) on AWGN channel
- Also provides (small) diversity gain on a time-varying fading channel

• Interleaving:

- Greatly improves the diversity gain associated with coding
- Useless without coding



D ~ number of coherence times in the code block

Practical Diversity

- In the above, we do not have access to parallel, decoupled diversity branches
 - diversity is coupled together through the signaling
 - general results still hold
 - obtained by doing some form of whitening/decorrelation on the correlated fading metrics

MIMO Systems





This is a single channel use

MIMO Systems

• Typical Channel Model

• Each element of **H** is an independent, flat-fading, Rayleigh channel

• Space Time Codes (STCs):

- Use to get diversity against multi path fading
 - Typically model the channel as not changing during code blocks
 - Very short code blocks these are really ST Modulations

• Space Time Multiplexing:

- Just send a different QASK signal over each TX antenna
 - If Nt >= Nr, can support Nt "spatial streams"

Space Time Codes

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IEEE TRANSACTIONS ON INFORMATION THEORY, VOL. 44, NO. 2, MARCH 1998

Space–Time Codes for High Data Rate Wireless Communication: Performance Criterion and Code Construction

Vahid Tarokh, Member, IEEE, Nambi Seshadri, Senior Member, IEEE, and A. R. Calderbank, Fellow, IEEE

IEEE TRANSACTIONS ON COMMUNICATIONS, VOL. 47, NO. 4, APRIL 1999

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Signal Design for Transmitter Diversity Wireless Communication Systems Over Rayleigh Fading Channels

Jiann-Ching Guey, Michael P. Fitz, Mark R. Bell, and Wen-Yi Kuo, Member, IEEE

Suggest basic design rules for STCs: Rank and Determinant Criterion

IEEE JOURNAL ON SELECT AREAS IN COMMUNICATIONS, VOL. 16, NO. 8, OCTOBER 1998

A Simple Transmit Diversity Technique for Wireless Communications Siavash M. Alamouti Very simple STC code for Nt = 2

Space Time (block) Codes

 $\mathbf{z}_k = \mathbf{H}\mathbf{x}_k + \mathbf{w}_k \qquad k = 0, 1, 2, \dots L - 1$

 $\mathbf{Z} = \mathbf{H}\mathbf{X} + \mathbf{W}$

For receiver with CSI, the ML receiver is

 $\min_{\mathbf{x}\in\mathcal{C}}\|\mathbf{Z}-\mathbf{H}\mathbf{X}\|^2$

The pairwise error probability, conditioned on \mathbf{H} , will be:

$$P_{PW}(\mathbf{X}^{i}, \mathbf{X}^{j} | \mathbf{H}) = \mathbf{Q}\left(\sqrt{\frac{d^{2}(i, j)}{2N_{0}}}\right)$$

need to average over the fading

$$d^2(i,j) = \|\mathbf{H}(\mathbf{X}^i - \mathbf{X}^j)\|^2$$

Space Time (block) Codes

Remarks on Space-Time Codes Including a New Lower Bound and an Improved Code

Hsiao-feng Lu, Student Member, IEEE, Yuankai Wang, Student Member, IEEE, P. Vijay Kumar, Fellow, IEEE, and Keith M. Chugg, Member, IEEE

$$Q(x) = \int_x^\infty \frac{1}{\sqrt{2\pi}} \exp\left(-\frac{y^2}{2}\right) dy$$
$$= \frac{1}{\pi} \int_0^{\pi/2} \exp\left(-\frac{x^2}{2\sin^2\theta}\right) d\theta$$

Craig form of Q-function

$$P(S_1 \to S_2 | H) = Q\left(\frac{d_E}{\sqrt{2}}\right)$$

$$d_E^2 = \rho_t \sum_{q=1}^Q \lambda_q \sum_{p=1}^P |d_{pq}|^2$$

where $\{\lambda_q\}$ are the eigenvalues of $\Delta S \Delta S^{\dagger}$, where $\Delta S = (S_1 - S_2)$ is the difference-signal matrix, U is the corresponding eigenvector matrix, and $d_{pq} = (HU)_{pq}$. The authors of [2] also make use of the Chersame diversity/fading equation as before, but now D and the branch powers depend on signal differences

$$\frac{\kappa}{2}f^{-P}(\eta) < P(S_1 \to S_2) = \frac{1}{\pi} \int_0^{\frac{\pi}{2}} f^{-P}\left(\frac{\eta}{\sin^2\theta}\right) d\theta$$
$$\leq \frac{1}{2}f^{-P}(\eta).$$

$$f(x) := \prod_{q} (1 + \lambda_q x) = \sum_{i=0}^{Q} \sigma_i x^i.$$

Space Time (block) Codes

Design Criteria for Rayleigh Space-Time Codes:

The Rank Criterion: In order to achieve the maximum diversity mn, the matrix B(c, e) has to be full rank for any codewords c and e. If B(c, e) has minimum rank r over the set of two tuples of distinct codewords, then a diversity of rm is achieved. This criterion was also derived in [15].

These are similar to fading channel code design metrics for singleinput/single-output channels

The Determinant Criterion: Suppose that a diversity benefit of rm is our target. The minimum of rth roots of the sum of determinants of all r × r principal cofactors of A(c, e) = B(c, e)B*(c, e) taken over all pairs of distinct codewords e and c corresponds to the coding advantage, where r is the rank of A(c, e). Special attention in the design must be paid to this quantity for any codewords e and c. The design target is making this sum as large as possible. If a diversity of nm is the design target, then the minimum of the determinant of A(c, e) taken over all pairs of distinct codewords e and c must be pairs of a diversity of nm is the design target.

Ortogonal STCs



Full diversity, full rate STC with very simple decoding

ALAMOUTI: SIMPLE TRANSMIT DIVERSITY TECHNIQUE FOR WIRELESS COMMUNICATIONS



Fig. 4. The BER performance comparison of coherent BPSK with MRRC and two-branch transmit diversity in Rayleigh fading.

In STC development, the best one targets is "full rate (rate 1)" — i.e., if the channel is used L times with M-ary constellation, then there should be M*L STC code matrices

In ST-MUX, we send an M-ary signal point out of each TX antenna at each time — these are "rate Nt" under the STC rate definition

Capacity for Suboptimal Receivers for Coded Multiple-Input Multiple-Output Systems Pansop Kim and Keith M. Chugg, Member, IEEE



IEEE TRANSACTIONS ON WIRELESS COMMUNICATIONS, VOL. 6, NO. 9, SEPTEMBER 200



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$$\underline{y}(l) = \mathbf{H}(l)\underline{x}(l) + \sqrt{\frac{N_T}{\rho}}\underline{n}(l)$$



Linear Minimum Mean Square Error (LMMSE) decoupler is the most widely used

$$\underline{y}(l) = \mathbf{H}(l)\underline{x}(l) + \sqrt{\frac{N_T}{\rho}}\underline{n}(l)$$

A. LZF, LMMSE decouplers

Let \mathbf{A}^{H} be a spatial linear filter, then the decoupled vector, $\underline{\tilde{x}}$ becomes

$$\underline{\tilde{x}} = \mathbf{A}^H \underline{y} \tag{3}$$

where $(\cdot)^H$ is the complex conjugate and transpose of a vector or matrix. For the LZF decoupler, \mathbf{A}^H is a pseudo-inverse of \mathbf{H} , i.e.,

$$\mathbf{A}^{H} = \left(\mathbf{H}^{H}\mathbf{H}\right)^{-1}\mathbf{H}^{H},\tag{4}$$

Note that $\mathbf{H}^{H}\mathbf{H}$ is invertible with probability one¹ if N_{R} is not smaller than N_{T} . For the LMMSE decoupler, \mathbf{A}^{H} minimizes the mean-squared error, which is $\mathbb{E}\{|\underline{x} - \mathbf{A}^{H}\underline{y}|^{2}\}$. Then,

$$\mathbf{A}^{H} = \left(\mathbf{H}^{H}\mathbf{H} + \frac{N_{T}}{\rho}\mathbf{I}\right)^{-1}\mathbf{H}^{H}.$$
 (5)

Linear Minimum Mean Square Error (LMMSE) decoupler is the most widely used



MIMO Capacity Measures

$$C(\mathbf{H}) = \log_2 \left(\det \left[\mathbf{I} + (\rho/N_t) \mathbf{H} \mathbf{H}^{\dagger} \right] \right)$$
$$C_{\text{out}}(p) : \Pr \left\{ C(\mathbf{H}) > C_{\text{out}}(p) \right\} > p$$
$$C_{\text{ergodic}} = \mathbb{E} \left\{ C(\mathbf{H}) \right\}$$

Outage Capacity: code over only one fading channel realization

Ergodic Capacity: code over only many fading channel realizations

MIMO Capacity Measures

KIM and CHUGG: CAPACITY FOR SUBOPTIMAL RECEIVERS FOR CODED MULTIPLE-INPUT MULTIPLE-OUTPUT SYSTEMS



Fig. 5. Outage capacity comparison of decouplers (1% outage probability, Fig. 6. Ergodic capacity comparison of decouplers ($N_T = N_R = 4$). $N_T = N_R = 4$).

Outage Capacity: code over only one fading channel realization

ST-MUX over Quasi-Static Fading



Fig. 7. Uncoded symbol error rates of LMMSE and BLAST ($N_T=N_R=4$, 16QAM, quasi-static fading).

uncoded



Fig. 9. Performance of Turbo code with LMMSE and BLAST receiver using likelihood. ($N_T = N_R = 4$, 8 bits/sec/Hz, 1022 information bits/frame, quasi-static fading).

turbo code

MIMO-OFDM Systems

Modern Code: used over all sub-carriers, over multiple OFDM blocks, over all antennas

Each sub-carrier channel looks like the MIMO channel models that we have considered

Ergodic capacity is a better model when the system gets many orders of diversity — i.e., many coherence BWs, many coherence times, many independent spatial fading modes