

MATLAB in Digital Signal Processing and Communications

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MATLAB Tutorial
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Objective and Focus

- Learn how MATLAB can be used efficiently in order to perform tasks in digital signal processing and digital communications
- Learn something about state-of-the-art digital communications systems and how to simulate/analyze their performance

Focus

- Wireless multi-carrier transmission system based on Orthogonal Frequency-Division Multiplexing (OFDM) including
 - ▶ a simple channel coding scheme for error correction
 - ▶ interleaving across subcarriers for increased frequency diversity
- OFDM is extremely popular and is used in e.g.
 - ▶ Wireless LAN air interfaces (Wi-Fi standard IEEE 802.11a/b/g, HIPERLAN/2)
 - ▶ Fixed broadband wireless access systems (WiMAX standard IEEE 802.16d/e)
 - ▶ Wireless Personal Area Networks (WiMedia UWB standard, Bluetooth)
 - ▶ Digital radio and digital TV systems (DAB, DRM, DVB-T, DVB-H)
 - ▶ Long-term evolution (LTE) of third-generation (3G) cellular systems
 - ▶ Cable broadband access (ADSL/VDSL), power line communications

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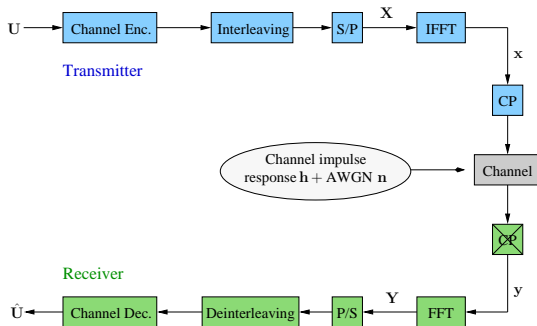
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System Overview



- N_c : number of orthogonal carriers ($N_c := 2^n$); corresponds to (I)FFT size
- R : code rate of employed channel code ($R := 1/2^m \leq 1$)
- U : vector of info symbols (length RN_c), \hat{U} : corresponding estimated vector
- X : transmitted OFDM symbol (length N_c), Y : received OFDM symbol

⇒ We will consider each block in detail, especially their realization in MATLAB

Info Vector \mathbf{U}

- Info symbols U_k carry the actual information to be transmitted (e.g., data files or digitized voice)
- Info symbols U_k typically regarded as independent and identically distributed (i.i.d.) random variables with realizations , e.g., in $\{0, 1\}$ (equiprobable)
- We use antipodal representation $\{-1, +1\}$ of bits as common in digital communications

MATLAB realization

- Generate vector \mathbf{U} of length RN_c with i.i.d. random entries $U_k \in \{-1, +1\}$

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U = 2*round(rand(1,R*Nc))-1;
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Channel Encoding

- Channel coding adds redundancy to info symbols in a structured fashion
- Redundancy can then be utilized at receiver to correct transmission errors (channel decoding)
- For each info symbol U_k the channel encoder computes N code symbols $X_{k,1}, \dots, X_{k,N}$ according to pre-defined mapping rule \Rightarrow Code rate $R := 1/N$
- Design of powerful channel codes is a research discipline on its own
- We focus on simple repetition code of rate R , i.e.,
$$\mathbf{U} = [\dots, U_k, U_{k+1}, \dots] \mapsto \mathbf{X} = [\dots, U_k, U_k, \dots, U_{k+1}, U_{k+1}, \dots]$$
- Example: $U_k = +1$, $R = 1/4$, received code symbols $+0.9, +1.1, -0.1, +0.5$
 \Rightarrow High probability that $U_k = +1$ can be recovered

MATLAB realization

- Apply repetition code of rate R to info vector $\mathbf{U} \Rightarrow$ Vector \mathbf{X} of length N_c

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X = kron(U, ones(1,1/R));
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Interleaving

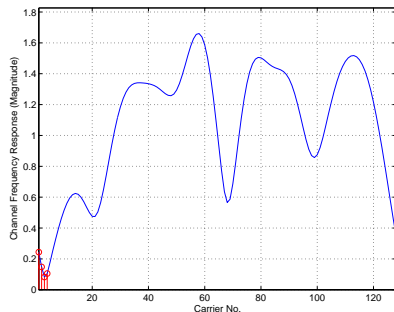
- Code symbols in vector \mathbf{X} (length N_c) will be transmitted in parallel over the N_c orthogonal subcarriers (via IFFT operation)
- Each code symbol 'sees' frequency response of underlying channel on particular subcarrier
- Channel impulse response (CIR) is typically considered random in wireless communications (see slide 'Channel Model')
- Channel frequency response of neighboring subcarriers usually correlated; correlation between two subcarriers with large spacing typically low
- Idea: Spread code symbols $X_{k,1}, \dots, X_{k,N}$ associated with info symbol U_k across entire system bandwidth instead of using N subsequent subcarriers
- We use maximum distance pattern for interleaving
- Example: $N_c = 128$ subcarriers, code rate $R = 1/4$
 - \Rightarrow Use subcarriers $\#k$, $\#(k+32)$, $\#(k+64)$, and $\#(k+96)$ for code symbols associated with info symbol U_k ($k = 1, \dots, 32$)

Interleaving

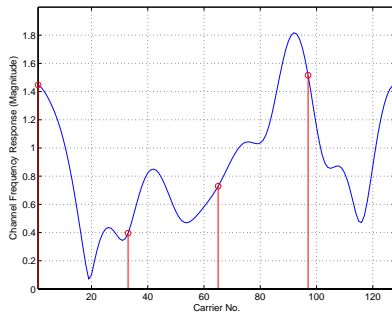
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Interleaving

No Interleaving



With Interleaving



MATLAB realization

- Interleave vector \mathbf{X} according to maximum distance pattern ($N_c = 128$, $R = 1/4$)

```
index = [ 1 33 65 97 2 34 66 98 ... 32 64 96 128 ];  
X(index) = X;
```

OFDM Modulation

- OFDM symbol \mathbf{X} ($\hat{=}$ frequency domain) converted to time domain via IFFT operation \Rightarrow Vector \mathbf{x} (length N_c)
- Assume CIR \mathbf{h} of length N_{ch} \Rightarrow To avoid interference between subsequent OFDM symbols, guard interval of length $N_{ch}-1$ required
- Often cyclic prefix (CP) is used, i.e., last $N_{ch}-1$ symbols of vector \mathbf{x} are appended to \mathbf{x} as a prefix \Rightarrow Vector of length $N_c + N_{ch}-1$
- Details can be found in

Z. Wang and G. B. Giannakis, "Wireless multicarrier communications – Where Fourier meets Shannon," *IEEE Signal Processing Mag.*, May 2000.

MATLAB realization

- Perform IFFT of vector \mathbf{X} and add CP of length $N_{ch}-1$

```
x = ifft(X)*sqrt(Nc);  
x = [ x(end-Nch+2:end) x ];
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Channel Model

- OFDM typically employed for communication systems with large bandwidth
⇒ Underlying channel is frequency-selective, i.e., CIR \mathbf{h} has length $N_{\text{ch}} > 1$
- In wireless scenarios channel coefficients $h_0, \dots, h_{N_{\text{ch}}-1}$ considered random
- We consider baseband transmission model, i.e., channel coefficients h_l are complex-valued (equivalent passband model involves real-valued quantities)
- In rich-scattering environments, Rayleigh-fading channel model has proven useful, i.e., channel coefficients h_l are complex Gaussian random variables:

$$\text{Re}\{h_l\}, \text{Im}\{h_l\} \sim \mathcal{N}(0, \sigma_l^2/2) \Rightarrow h_l \sim \mathcal{CN}(0, \sigma_l^2)$$

- We assume exponentially decaying channel power profile, i.e.,

$$\frac{\sigma_l^2}{\sigma_0^2} := \exp(-l/c_{\text{att}}), \quad l = 0, \dots, N_{\text{ch}} - 1$$

- We assume block-fading model, i.e., CIR \mathbf{h} stays constant during entire OFDM symbol and changes randomly from one OFDM symbol to the next
- Noiseless received vector given by convolution of vector \mathbf{x} with CIR \mathbf{h}
- Noise samples are i.i.d. complex Gaussian random variables $\sim \mathcal{CN}(0, \sigma_n^2)$

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MATLAB realization

- Generate exponentially decaying channel power profile \Rightarrow Variances σ_l^2

```
var_ch = exp(-[0:Nch-1]/c_att);
```

- Normalize channel power profile such that overall average channel energy is 1

```
var_ch = var_ch/sum(var_ch);
```

- Generate random CIR realization with independent complex Gaussian entries and specified channel power profile

```
h = sqrt(0.5)*(randn(1,Nch)+j*randn(1,Nch)) .* sqrt(var_ch);
```

- Calculate noiseless received vector via convolution of vector x with CIR h

```
y = conv(x,h);
```

- Add additive white Gaussian noise (AWGN) samples with variance σ_n^2

```
n = sqrt(0.5)*( randn(1,length(y))+j*randn(1,length(y)) );  
y = y + n * sqrt(sigma2_n);
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OFDM Demodulation

- Received vector resulting from convolution of transmitted vector \mathbf{x} with CIR \mathbf{h} has length $(N_c + N_{\text{ch}} - 1) + N_{\text{ch}} - 1$
⇒ Received vector is truncated to same length $N_c + N_{\text{ch}} - 1$ as vector \mathbf{x}
- Then CP is removed to obtain received vector \mathbf{y} of length N_c
- Finally, FFT is performed to convert received vector \mathbf{y} back to frequency domain ⇒ received OFDM symbol \mathbf{Y} of length N_c

MATLAB realization

- Truncate vector \mathbf{y} by removing last $N_{\text{ch}} - 1$ entries, remove CP (first $N_{\text{ch}} - 1$ entries), and perform FFT to obtain received OFDM symbol \mathbf{Y}

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Deinterleaving and Channel Decoding

- For coherent detection of the info symbols U_k , the channel phases associated with the entries of the received OFDM symbol \mathbf{Y} have to be derotated
⇒ We need to calculate the channel frequency response via FFT of CIR \mathbf{h}
- Perform deinterleaving based on employed interleaver pattern
- If repetition code is used, all entries of \mathbf{Y} that are associated with same info symbols U_k are optimally combined using maximum ratio combining (MRC)
- Finally, estimates \hat{U}_k are formed based on the RN_c output symbols $Z_{\text{mrc},k}$ of the MRC step
- In simulation, determine the number of bit errors in current OFDM symbol by comparing $\hat{\mathbf{U}}$ with \mathbf{U}
- Update error counter and finally determine average bit error rate (BER) by dividing overall number of errors by overall number of transmitted info bits

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MATLAB realization

- Calculate channel frequency response via FFT of zero-padded CIR \mathbf{h}

```
h_zp = [h zeros(1,Nc-Nch)];
```

```
H = fft(h_zp);
```

- Derotate channel phases associated with entries of received OFDM symbol \mathbf{Y}

```
Z = conj(H) .* Y;
```

- Perform deinterleaving ($N_c=128$, $R=1/4$)

```
index_matrix = [1 33 65 97 ; 2 34 66 98 ; ... 32 64 96 128];
```

```
matrix_help = Z(index_matrix);
```

- Perform MRC \Rightarrow Vector \mathbf{Z}_{mrc} of length RN_c

```
Z_mrc = sum(matrix_help,2);
```

- Form estimates \hat{U}_k based on vector \mathbf{Z}_{mrc}

```
Uhat = sign(real(Z_mrc))';
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```

MATLAB realization (cont'd)

- Count bit errors in current OFDM symbol and update error counter

```
err_count = err_count + sum(abs(Uhat-U))/2;
```

- After transmission of N_{real} OFDM symbols calculate final BER

```
ber = err_count/(R*Nc*Nreal);
```

Simulation Results

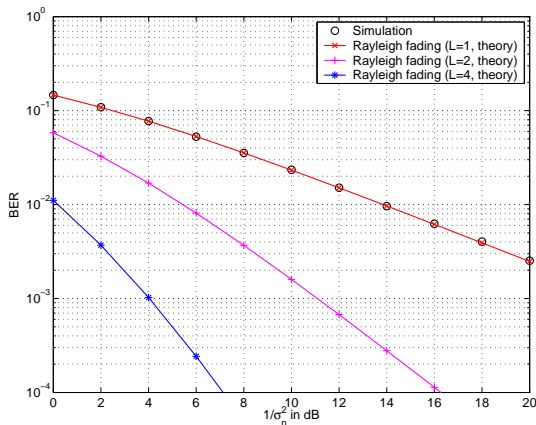
Uncoded transmission

$N_{\text{real}} = 10,000$ OFDM symbols

$N_c = 128$ subcarriers

$N_{\text{ch}} = 10$ channel coefficients

$c_{\text{att}} = 2$ for channel profile



Comparison with analytical results for $L=1$ Rayleigh fading branch (see Appendix) validates simulated BER curve

Simulation Results

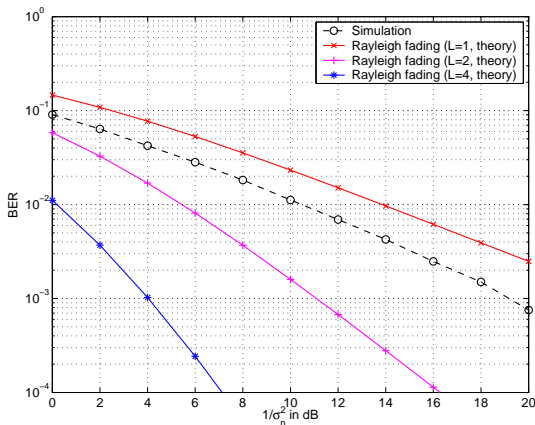
Repetition code (rate 1/2)
No interleaving

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Repetition code yields significant gain, mostly due to increased received power per info bit; hardly any diversity gain as no interleaver is used

Simulation Results

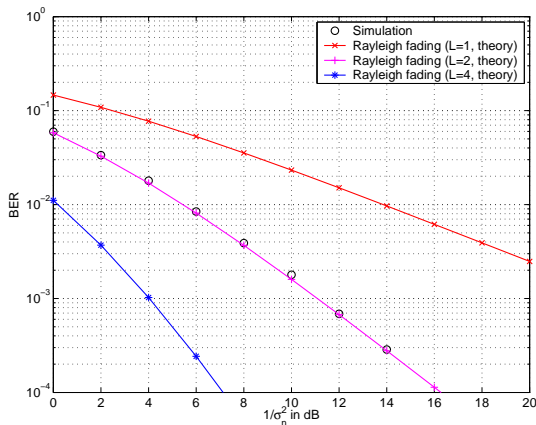
Repetition code (rate 1/2) With interleaving

$N_{\text{real}} = 10,000$ OFDM symbols

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Comparison with analytical results for diversity reception over $L=2$ i.i.d. Rayleigh fading branches (see Appendix) validates simulated BER curve

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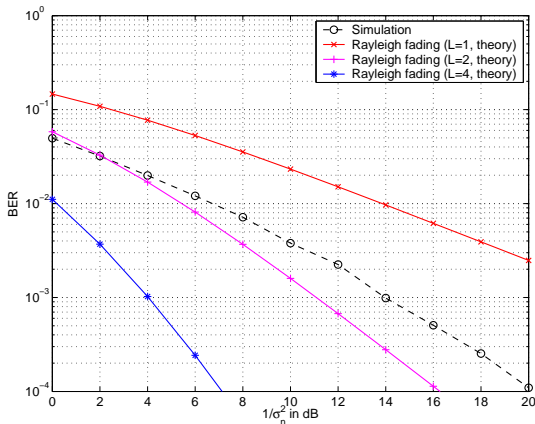
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Repetition code yields significant gain, mostly due to increased received power per info bit; slight diversity gain visible even without interleaver

Simulation Results

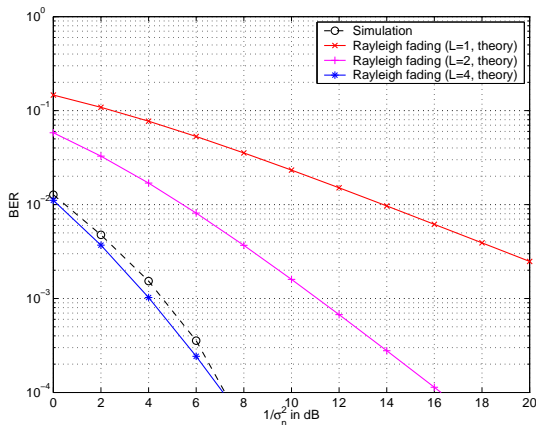
Repetition code (rate 1/4) With interleaving

$N_{\text{real}} = 10,000$ OFDM symbols

$N_c = 128$ subcarriers

$N_{\text{ch}} = 10$ channel coefficients

$c_{\text{att}} = 2$ for channel profile



Comparison with analytical results for diversity reception over $L=4$ i.i.d. Rayleigh fading branches shows that channel does not quite offer diversity order of 4

Analytical results

- Analytical BER performance of binary antipodal transmission over $L \geq 1$ i.i.d. Rayleigh fading branches with MRC at receiver was calculated according to

$$P_b = \frac{1}{2^L} \left(1 - \sqrt{\frac{1}{1 + \sigma_n^2}}\right)^L \sum_{l=0}^{L-1} \binom{L-1+l}{l} \frac{1}{2^l} \left(1 + \sqrt{\frac{1}{1 + \sigma_n^2}}\right)^l$$

using MATLAB function [proakis_equalSNRs.m](#)

- Details can be found in Chapter 14 of
[J. G. Proakis, *Digital Communications*, 4th ed., McGraw-Hill, 2001.](#)

MATLAB code

- The MATLAB code and these slides can be downloaded from my homepage
www.ece.ubc.ca/~janm/
(see 'Teaching')