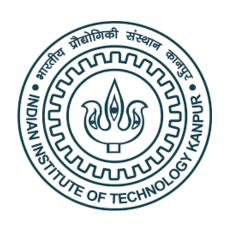
# **EE670** - Wireless Communications



Python Assignment #2

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### **Question:**

Simulate **multiple antenna Rayleigh fading** communication systems with L=2,3 antennas in PYTHON. Generate the BER curves vs SNR for QPSK detection in the SNR range required to achieve at least  $BER=10^{-6}$  for each system. Superpose the analytical curves over them and compare with L=1 antenna system. Submit the code and relevant plot for each system.

#### **Solution:**

#### Code:

```
import numpy as np
import matplotlib.pyplot as plt
import numpy.random as nr
from scipy.special import comb
blockLength = 10000; # Number of symbols per block
nBlocks = 10000; # Number of blocks
EbdB = np.arange(1.0,18.1,1.5); # Energy per bit in dB
Eb = 10**(EbdB/10); # Energy per bit Eb
No = 1; # Total noise power No
SNR = 2*Eb/No; # Signal-to-noise power ratio
SNRdB = 10*np.log10(Eb/No); # SNR values in dB
BER1 = np.zeros(len(EbdB)); # Bit error rate (BER) values
BER2 = np.zeros(len(EbdB));
BER3 = np.zeros(len(EbdB));
BERt1 = np.zeros(len(EbdB)); # Analytical values of BER from formula
BERt2 = np.zeros(len(EbdB));
BERt3 = np.zeros(len(EbdB));
\#T = 1
for blk in range(nBlocks):
  #Rayleigh fading channel coefficient with avg power unity
  h=nr.normal(0,np.sqrt(1/2))+1j*nr.normal(0,np.sqrt(1/2));
  #Complex gaussian noise with power No
noise=nr.normal(0,np.sqrt(No/2),blockLength)+1j*nr.normal(0,np.sqrt(No/2),(b
lockLength));
  BitsI=nr.randint(2,size=blockLength); #Bits for I channel
  BitsQ=nr.randint(2,size=blockLength); #Bits for Q channel
```

```
Sym=(2*BitsI-1)+1j*(2*BitsQ-1); #Complex QPSK symbols
      for K in range(len(SNRdB)):
           #Tx operation
           TxSym=np.sqrt(Eb[K])*Sym; #Transmit symbols with power scaling
           #Multi-antenna channel and reception
           RxSym=h*TxSym+noise; #Output symbols across L antennas
           #Rx for MRC
           MRCout=1/h*RxSym;
           DecBitsI=(np.real(MRCout)>0); #Decoded bits for I channel
           DecBitsQ=(np.imag(MRCout)>0); #Decoded bits for Q channel
           #Evaluating total number of bit errors
BER1[K]=BER1[K]+np.sum(DecBitsI!=BitsI)+np.sum(DecBitsQ!=BitsQ);
BER1 = BER1/blockLength/nBlocks/2;# Evaluating BER from simulation
BERt1 = 0.5*(1-np.sqrt(SNR/(2+SNR))); # Evaluating BER from formula
#for L=2
L=2:
for blk in range(nBlocks):
      #Rayleigh fading channel coefficient with avg power unity
     h1=(nr.normal(0,1,(L,1))+1j*nr.normal(0,1,(L,1)))/np.sqrt(2);
     h2=(nr.normal(0,1,(L,1))+1j*nr.normal(0,1,(L,1)))/np.sqrt(2);
      #Complex gaussian noise with power No
noise1=(nr.normal(0,np.sqrt(No/2),(L,blockLength))+1j*nr.normal(0,np.sqrt(No
/2),(L,blockLength)));
noise2 = (nr.normal(0,np.sqrt(No/2),(L,blockLength)) + 1j*nr.normal(0,np.sqrt(No/2),(L,blockLength)) + 1j*nr.normal(0,np.sqr
/2),(L,blockLength)));
      BitsI=nr.randint(2,size=blockLength); #Bits for I channel
      BitsQ=nr.randint(2,size=blockLength); #Bits for Q channel
      Sym=(2*BitsI-1)+1j*(2*BitsQ-1); #Complex QPSK symbols
      w1 = h1/(np.abs(h1)**2 + np.abs(h2)**2);
      w2 = h2/(np.abs(h1)**2 + np.abs(h2)**2);
      for K in range(len(SNRdB)):
```

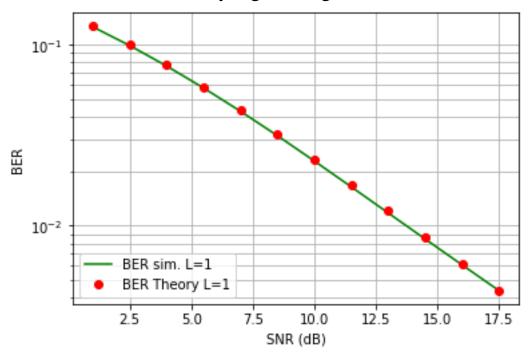
```
#Tx operation
    TxSym=np.sqrt(Eb[K])*Sym; #Transmit symbols with power scaling
    #Multi-antenna channel and reception
    RxSym1=h1*TxSym+noise1; #Output symbols across L antennas
    RxSym2=h2*TxSym+noise2;
    #Rx for MRC
    MRCout=np.conj(w1)*RxSym1+np.conj(w2)*RxSym2;
    DecBitsI=(np.real(MRCout)>0); #Decoded bits for I channel
    DecBitsQ=(np.imag(MRCout)>0); #Decoded bits for Q channel
    #Evaluating total number of bit errors
BER2[K]=BER2[K]+np.sum(DecBitsI!=BitsI)+np.sum(DecBitsQ!=BitsQ);
BER2 = BER2/blockLength/nBlocks/2;
BERt2 = comb(2*L-1, L)/2**L/SNR**L;
#for L=3
L=3:
for blk in range(nBlocks):
  #Rayleigh fading channel coefficient with avg power unity
  h1=(nr.normal(0,1,(L,1))+1j*nr.normal(0,1,(L,1)))/np.sqrt(2);
  h2=(nr.normal(0,1,(L,1))+1j*nr.normal(0,1,(L,1)))/np.sqrt(2);
  h3=(nr.normal(0,1,(L,1))+1i*nr.normal(0,1,(L,1)))/np.sqrt(2);
  #Complex gaussian noise with power No
noise1=(nr.normal(0,np.sqrt(No/2),(L,blockLength))+1j*nr.normal(0,np.sqrt(No
/2),(L,blockLength)));
noise2=(nr.normal(0,np.sqrt(No/2),(L,blockLength))+1j*nr.normal(0,np.sqrt(No
/2),(L,blockLength)));
noise3=(nr.normal(0,np.sqrt(No/2),(L,blockLength))+1j*nr.normal(0,np.sqrt(No
/2),(L,blockLength)));
  BitsI=nr.randint(2,size=blockLength); #Bits for I channel
  BitsQ=nr.randint(2,size=blockLength); #Bits for Q channel
  Sym=(2*BitsI-1)+1j*(2*BitsQ-1); #Complex QPSK symbols
```

```
w1 = h1/(np.abs(h1)**2 + np.abs(h2)**2 + np.abs(h3)**2);
  w2 = h2/(np.abs(h1)**2 + np.abs(h2)**2 + np.abs(h3)**2);
  w3 = h3/(np.abs(h1)**2 + np.abs(h2)**2 + np.abs(h3)**2);
  for K in range(len(SNRdB)):
    #Tx operation
    TxSym=np.sqrt(Eb[K])*Sym; #Transmit symbols with power scaling
    #Multi-antenna channel and reception
    RxSym1=h1*TxSym+noise1; #Output symbols across L antennas
    RxSym2=h2*TxSym+noise2;
    RxSym3=h3*TxSym+noise3;
    #Rx for MRC
MRCout=np.conj(w1)*RxSym1+np.conj(w2)*RxSym2+np.conj(w3)*RxSym3;
    DecBitsI=(np.real(MRCout)>0); #Decoded bits for I channel
    DecBitsQ=(np.imag(MRCout)>0); #Decoded bits for Q channel
    #Evaluating total number of bit errors
BER3[K]=BER3[K]+np.sum(DecBitsI!=BitsI)+np.sum(DecBitsQ!=BitsQ);
BER3 = BER3/blockLength/nBlocks/2;
BERt3 = comb(2*L-1, L)/2**L/SNR**L;
# Plotting the bit error rate from Simulation and formula
plt.figure(1)
plt.yscale('log')
plt.plot(SNRdB, BER1, 'g-')
plt.plot(SNRdB, BERt1,'ro')
plt.grid(1,which='both')
plt.suptitle('BER for Rayleigh fading channel with L=1')
plt.legend(["BER sim. L=1", "BER Theory L=1"], loc ="lower left");
plt.xlabel('SNR (dB)')
plt.ylabel('BER')
plt.figure(2)
plt.yscale('log')
plt.plot(SNRdB, BER2,'b-')
plt.plot(SNRdB, BERt2,'yo')
```

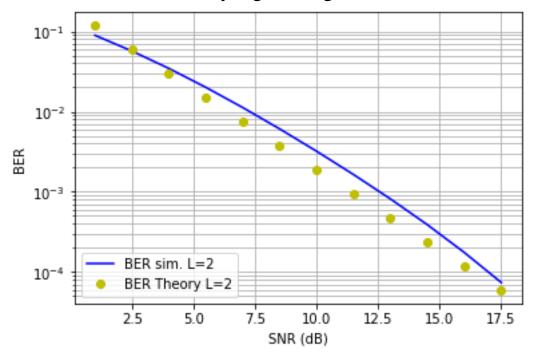
```
plt.grid(1,which='both')
plt.suptitle('BER for Rayleigh fading channel with L=2')
plt.legend(["BER sim. L=2", "BER Theory L=2"], loc ="lower left");
plt.xlabel('SNR (dB)')
plt.ylabel('BER')
plt.figure(3)
plt.yscale('log')
plt.plot(SNRdB, BER3,'y-')
plt.plot(SNRdB, BERt3,'ko')
plt.grid(1,which='both')
plt.suptitle('BER for Rayleigh fading channel with L=3')
plt.legend(["BER sim. L=3", "BER Theory L=3"], loc ="lower left");
plt.xlabel('SNR (dB)')
plt.ylabel('BER')
plt.figure(4)
plt.yscale('log')
plt.plot(SNRdB, BER1, 'g-')
plt.plot(SNRdB, BERt1,'ro')
plt.plot(SNRdB, BER2,'b-')
plt.plot(SNRdB, BERt2,'yo')
plt.plot(SNRdB, BER3,'y-')
plt.plot(SNRdB, BERt3,'ko')
plt.grid(1,which='both')
plt.suptitle('BER for MRC')
plt.legend(["BER sim. L=1", "BER Theory L=3", "BER sim. L=2", "BER
Theory L=2","BER sim. L=3", "BER Theory L=3"], loc ="lower left");
plt.xlabel('SNR (dB)')
plt.ylabel('BER')
```

# **Output**

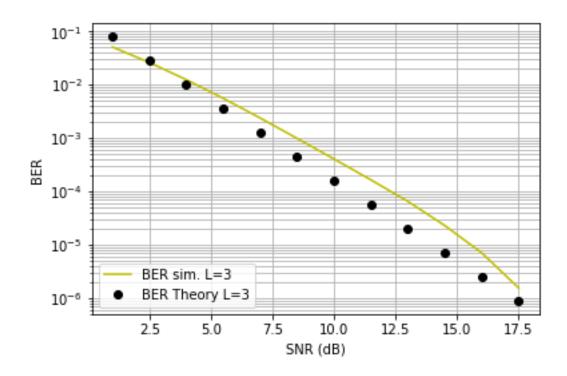
BER for Rayleigh fading channel with L=1



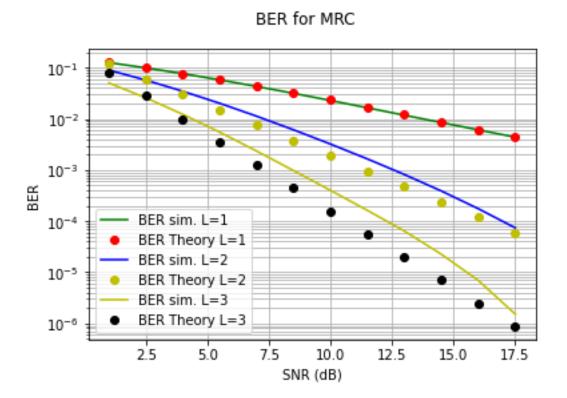
BER for Rayleigh fading channel with L=2



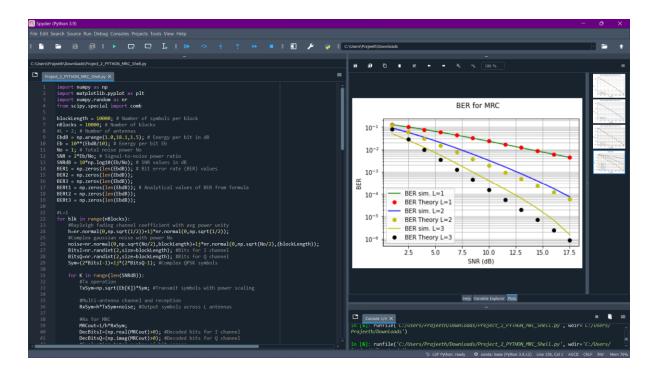
## BER for Rayleigh fading channel with L=3



Comparing L=2, L=3 with L=1



#### Output in spyder



# **Conclusion**

BER for L receiver antenna system with MRC with high SNR approximation is given by-

$$BER = {}^{2L-1}C_L \times \frac{1}{2^L} \times \frac{1}{SNR^L}$$

Therefore for L=1,2,3 the BER is given as

$$BER_{L=1} = \frac{1}{2SNR}$$

$$BER_{L=2} = \frac{3}{4} \frac{1}{SNR^2}$$

$$BER_{L=3} = \frac{5}{4} \frac{1}{SNR^3}$$

As we increase number of receive antennas (L), BER of the system decreases as given by

$$BER \propto \frac{1}{SNR^L}$$

So, by using Multiple Antenna System, We are able to reduce our BER.