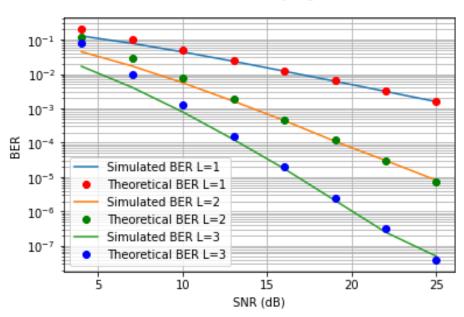
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0.00
1.
2. EE 670A
3. Python Assignment #2
4. Submitted by: M. Aravind
5. 20-10-2021
6.
7.
8. import numpy as np
9. import matplotlib.pyplot as plt
10. import numpy.random as nr
11. from math import comb
12.
14. rblockLength = 10000 # Samples per block
15. nBlocksr = 1000 # Number of blocks. Multipltication of this with above gives total
       number of symbols. Here it is taken 10^7, So that the empirical curve follows analytical
       atleast till 10^-7 BER.
16. No=1
17. EbdBr = np.arange(1,35,3)
18. Ebr=10**(EbdBr/10)
19. SNRr = 2 \cdot Ebr/No;
20. SNRdBr= 10*np.log10(SNRr);
21. BERr = np.zeros(len(EbdBr))
22. BERrt = np.zeros(len(EbdBr))
23.
24. #Start Plotting
25. plt.figure()
26. plt.yscale('log');
27.
28. # L=1 antenna
29. L=1
30. for blk in range (nBlocksr):
               BitsIr = nr.randint(2, size=rblockLength)
31.
               BitsQr = nr.randint(2,size=rblockLength)
32.
               Sym_r = (2*BitsIr-1)+1j*(2*BitsQr-1)
               noise r =
       nr.normal(0,np.sqrt(No/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(No/2),size=(L,rb
       lockLength)) #of L x blocklength dimenstion correspoinding to L paths
              h =
       nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblo
       ckLength)) #Rayleigh Fading Channel (Similarly of L x blocklength dimension)
36.
               for k in range(len(EbdBr)):
37.
                      TxSym_r = np.sqrt(Ebr[k])*Sym_r #Transmited symbol through Rayleigh Channel
38.
                      RxSym_r = h*TxSym_r + noise_r
39.
                      EqSym_r_h = RxSym_r*(np.conj(h))/(np.linalg.norm(h,1)) #MRC
                      EqSym_r = np.sum(EqSym_r_h,0) #Converting from SIMO to SISO for easy MRC
40.
       simplification (Adding up columns of the Lxblocklength matrix to create a single vector)
       Here h is an Lxblocklength vector (representing L blocklength duration vectors or L
       different channel taps)
41.
                     DecBitsIr = (np.real(EqSym_r)>0)
                     DecBitsQr = (np.imag(EqSym_r)>0)
42.
                     BERr[k] = BERr[k] + np.sum(DecBitsIr! = BitsIr) + np.sum(DecBitsQr! = BitsQr)
43.
44. BERr = BERr/rblockLength/2/nBlocksr
45. BERrt = comb(2*L-1,L)/((2*SNRr)**L)
46. plt.plot(SNRdBr,BERr)
47. plt.plot(SNRdBr,BERrt,'ro')
49. # L=2 antenna
50. L=2
51. for blk in range (nBlocksr):
52.
               BitsIr = nr.randint(2, size=rblockLength)
53.
               BitsQr = nr.randint(2, size=rblockLength)
54.
               Sym_r = (2*BitsIr-1)+1j*(2*BitsQr-1)
55.
               noise r =
       nr.normal(0,np.sqrt(No/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(No/2),size=(L,rb
       lockLength))
56.
              h =
       nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.n
       ckLength))
```

```
57.
       for k in range(len(EbdBr)):
58.
            TxSym r = np.sqrt(Ebr[k])*Sym r
59
            RxSym_r = h*TxSym_r + noise_r
            EqSym_r_h = RxSym_r*(np.conj(h))/(np.linalg.norm(h,1)) #MRC
60.
61.
            EqSym_r = np.sum(EqSym_r_h,0)
62.
           DecBitsIr = (np.real(EqSym_r)>0)
           DecBitsQr = (np.imag(EqSym_r)>0)
63.
64.
           BERr[k] = BERr[k]+ np.sum(DecBitsIr != BitsIr) + np.sum(DecBitsQr != BitsQr)
65. BERr = BERr/rblockLength/2/nBlocksr
66. BERrt = comb(2*L-1,L)/((2*SNRr)**L)
67. plt.plot(SNRdBr,BERr)
68. plt.plot(SNRdBr,BERrt, 'go')
69.
70. # L=3 antenna
71. L=3
72. for blk in range (nBlocksr):
73.
        BitsIr = nr.randint(2,size=rblockLength)
74.
        BitsQr = nr.randint(2,size=rblockLength)
75.
       Sym_r = (2*BitsIr-1)+1j*(2*BitsQr-1)
        noise_r =
   nr.normal(0,np.sqrt(No/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(No/2),size=(L,rb
   lockLength))
77.
       h =
   nr.normal(0,np.sqrt(1/2),size=(L,rblockLength))+1j*nr.normal(0,np.sqrt(1/2),size=(L,rblo
   ckLength))
78.
       for k in range(len(EbdBr)):
           TxSym_r = np.sqrt(Ebr[k])*Sym_r
79.
80.
            RxSym_r = h*TxSym_r + noise_r
81.
            EqSym_r_h = RxSym_r*(np.conj(h))/(np.linalg.norm(h,1))
82.
           EqSym_r = np.sum(EqSym_r_h,0)
83.
           DecBitsIr = (np.real(EqSym_r)>0)
           DecBitsQr = (np.imag(EqSym_r)>0)
84.
           BERr[k] = BERr[k]+ np.sum(DecBitsIr != BitsIr) + np.sum(DecBitsQr != BitsQr)
86. BERr = BERr/rblockLength/2/nBlocksr
87. BERrt = comb(2*L-1,L)/((2*SNRr)**L)
88. plt.plot(SNRdBr,BERr)
89. plt.plot(SNRdBr,BERrt, 'bo')
90.
91. plt.grid(1,which='both')
92. plt.suptitle('BER - SNR curve for Rayleigh channel')
93. plt.xlabel('SNR (dB)')
94. plt.ylabel('BER')
95. plt.legend(["Simulated BER L=1", "Theoretical BER L=1", "Simulated BER L=2",
    'Theoretical BER L=2", "Simulated BER L=3", "Theoretical BER L=3" ])
96.
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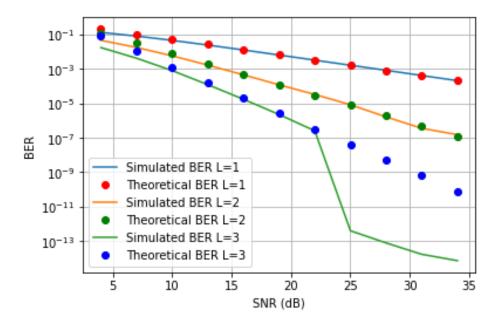
## Output:

(Truncated till BER =  $10^{-7}$  for L=3)



BER - SNR curve for Rayleigh channel

(Plotted till SNR = 32 dB; corresponding to BER  $10^{-7}$  for L=2) (Here, BER crosses  $10^{-6}$  for both L=2 and L=3)



BER - SNR curve for Rayleigh channel

Why the sharp drop in BER after  $10^{-7}$  for L=3? It is because, in the code, I took only  $10^7$  samples. Had I taken  $10^{13}$  samples (blocklength x number of blocks), then the simulated (or empirical) plot would have followed the theoretical (or analytical) plot till BER  $10^{-13}$ . It is that I stopped at  $10^7$  samples in the code, for computational simplicity. (Calculations for  $10^{13}$  samples take a very long time) Hence the sharp dip indicates just the deficiency of the number of symbols I took.

## Observation:

Bit Error Rate, BER for an L antenna system with Maximal Ratio Combining at the receiver end (high SNR approximation) is:

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

For L=2, BER 
$$\geq$$
10<sup>-6</sup>  $\rightarrow$  SNR  $\leq$  30.88 dB  
For L=3, BER  $\geq$ 10<sup>-6</sup>  $\rightarrow$  SNR  $\leq$  20.32 dB

Hence I plotted till around 35 dB.

From the above BER vs SNR plots, it can be easily observed that as we increase the number of receive antennas (L), BER of the system will decrease.

or 
$$BER_{L=3}\!<\!BER_{L=2}\!<\!BER_{L=1}$$

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

Also, the empirical (or simulated) plot was found to follow the theoretical/formula based (analytical) plot.

