



Cairo University
Faculty of Engineering

Department of Computer
Engineering



ELC 325B – Spring 2023

Digital Communications

Assignment #2

Submitted to

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Submitted by

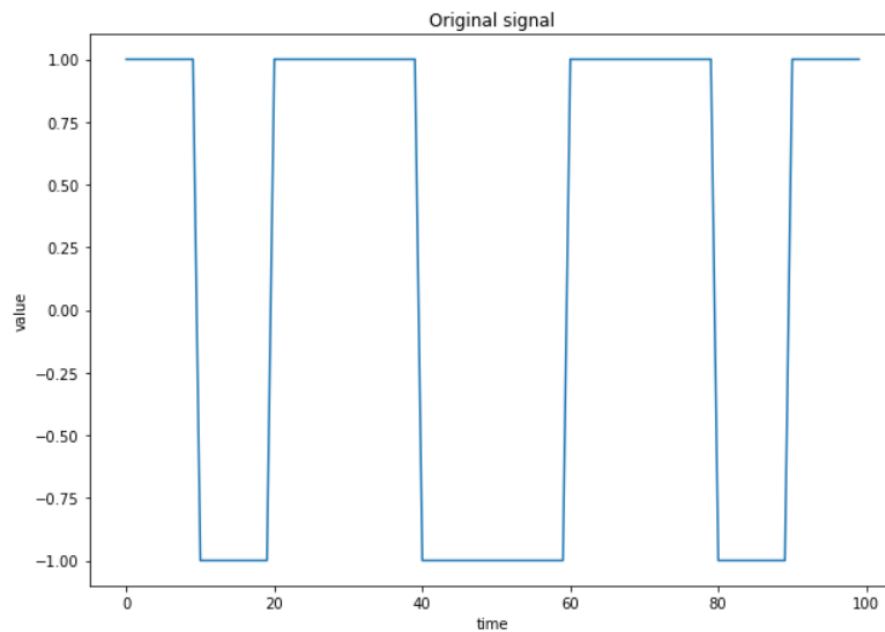
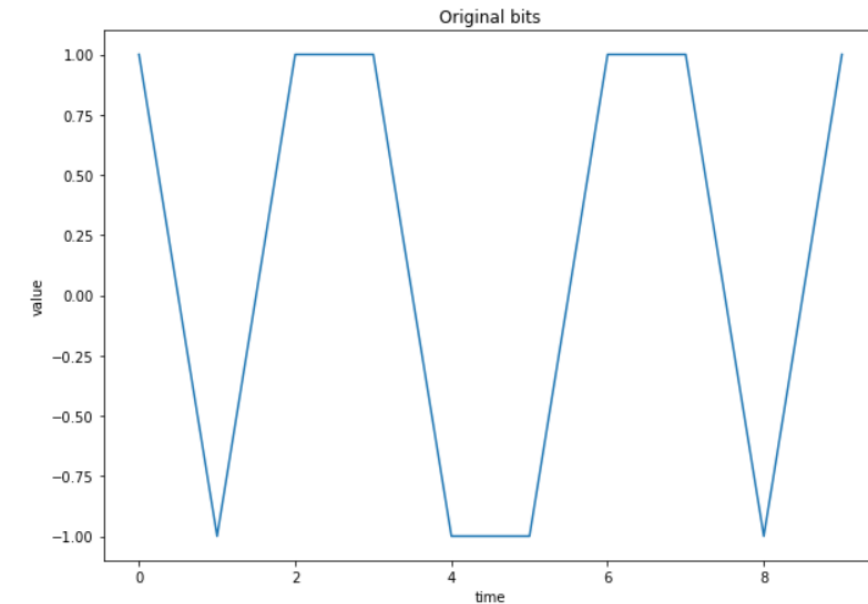
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Part 2:

Figures:

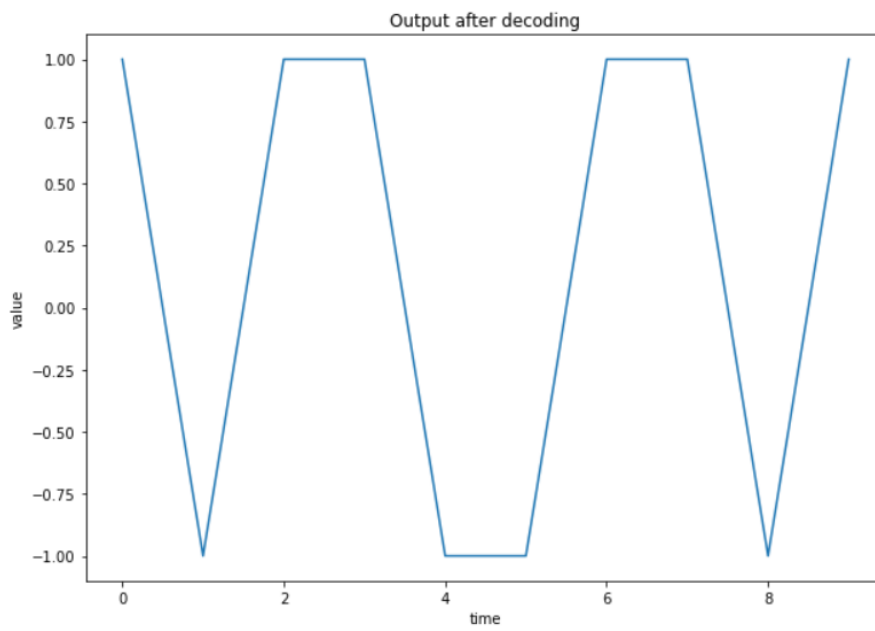
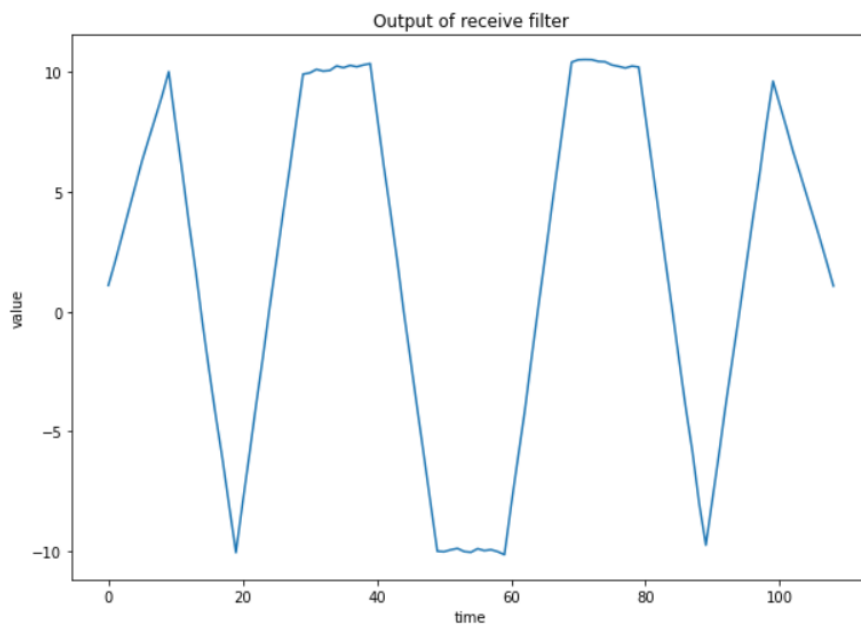
Test for no of bits = 10, each bit from no of samples = 10

Original signal:

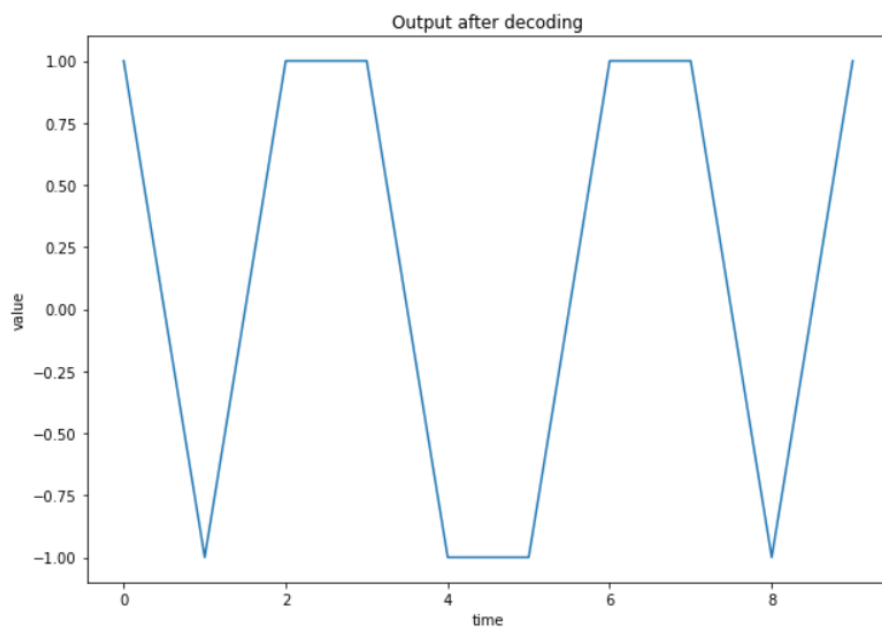
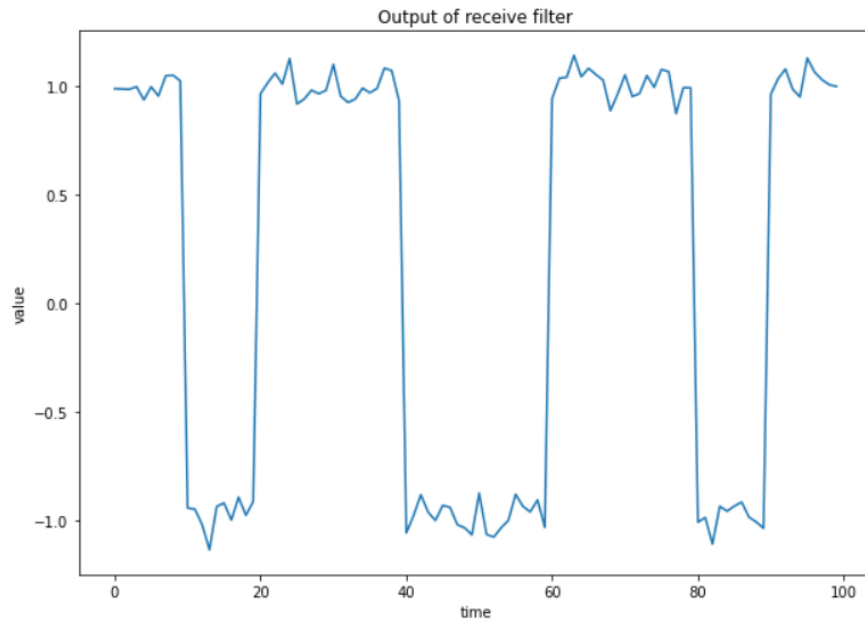


Output of the receive filter:

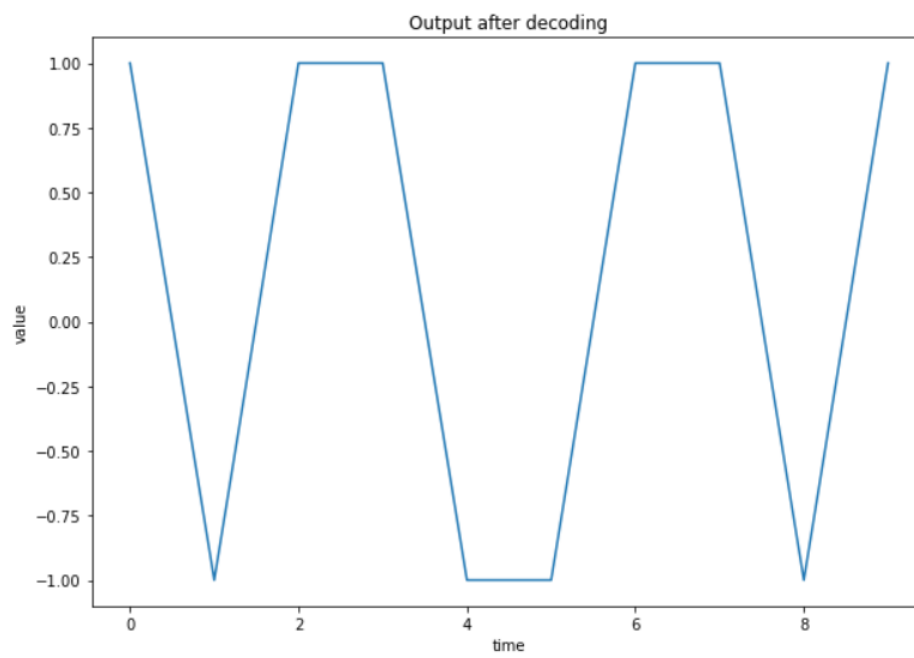
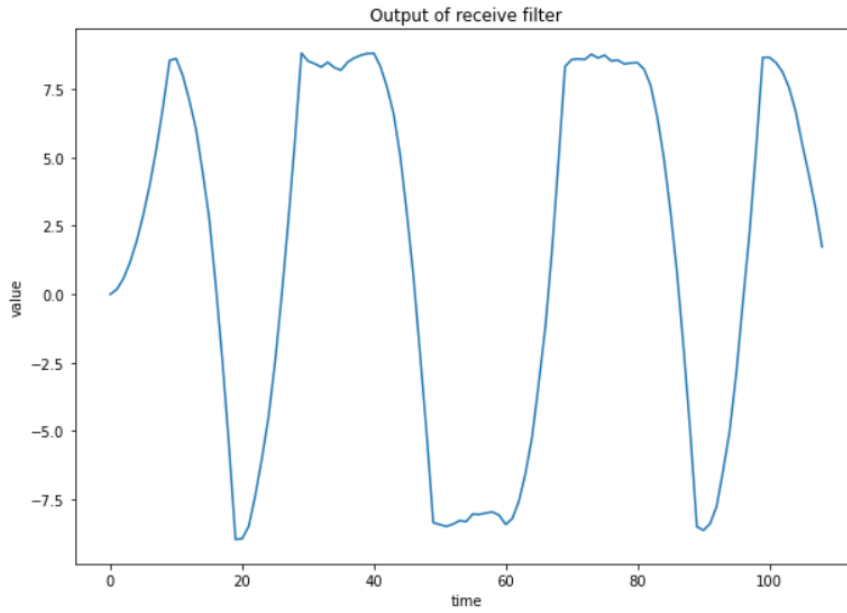
Case 1:



Case 2:

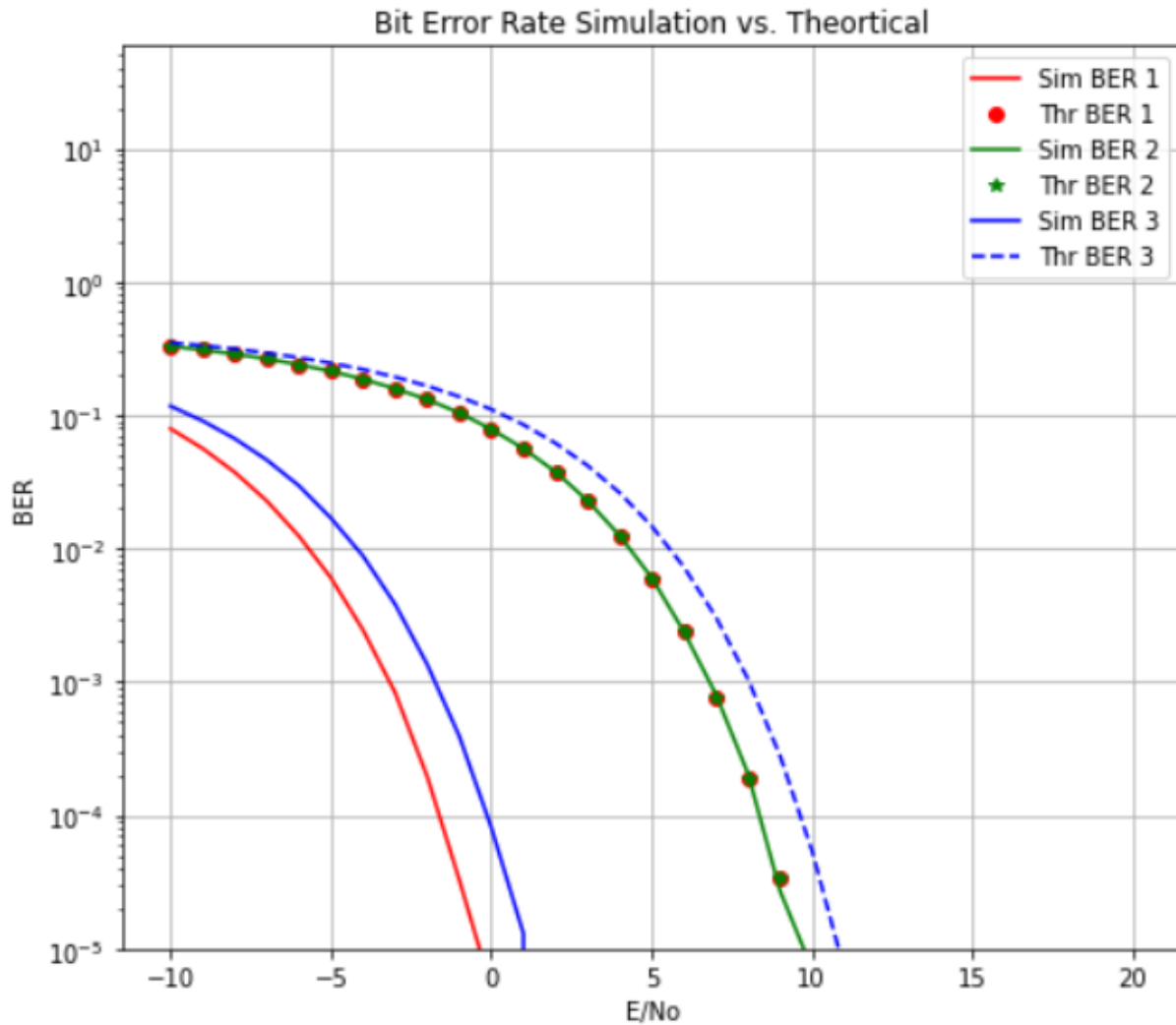


Case 3:



Simulation & Theoretical BER vs. E/No:

Test for no of bits = 1000000, each bit from no of samples = 10



Note:

Thr BER 1 = Thr BER 2

avg sim BER 1 = 0.007015290322580645

avg sim BER 2 = 0.07850425806451612

avg sim BER 3 = 0.01229625806451613

min avg sim BER = 0.007015290322580645 -> case 1 of matched filter

avg sim BER 1 < avg sim BER 3 < avg sim BER 2

5. Is the BER an increasing or a decreasing function of E/N_0 ? Why?

increasing E/N_0 -> decreasing BER

-> The sequence:

increase E/N_0

decrease N_0

decrease sigma of gaussian noise -> make gaussian noise distribution narrower

increase the transmitted energy to noise energy (increase SNR)

then noise didn't affect transmitted signal a lot

and make it easier to detect transmitted bits

-> The relationship between E/N_0 ratio and BER is not linear, but logarithmic

BER decreases exponentially as the E/N_0 ratio increases

6. Which case has the lowest BER? Why?

Case 1: The receive filter $h(t)$ is a matched filter with unit energy

it gives the lowest average simulation BER

because of that it uses a matched filter

which is designed to match the characteristics of the transmitted signal

and this makes the filter provides the best detection strategy

by correlating the received signal with a replica of the transmitted signal

so as a result the BER will be reduced and the SNR will be maximized

Code:

```
import numpy as np
import matplotlib.pyplot as plt
import math
#####

# generate random noise with gaussian distribution
def generate_gaussian_noise(mu, sigma, bits_no, bit_samples_no):
    return np.random.normal(mu, sigma, bits_no * bit_samples_no)
#####

# generate random bits with values {-1,1} with probability = 0.5
def generate_random_bits(bits_no):
    return np.random.choice(a = [-1,1], size=bits_no, p=[1./2, 1./2])
#####

def add_gaussian_noise(bits_no, bit_samples_no, signal_bits, noise):

    size = bits_no * bit_samples_no
    signal_samples=np.zeros(size)
    noisy_signal_samples=np.zeros(size)

    # repeat the bit with no of samples per bit
    for i in range(bits_no):
        # 0:9 10:19 20:39
        signal_samples[i * bit_samples_no : (i + 1) * bit_samples_no] = signal_bits[i]

    # add signal to the noise
    noisy_signal_samples = signal_samples + noise

    return signal_samples, noisy_signal_samples
#####

def convolution(noisy_signal_samples, receive_filter, bits_no, bit_samples_no):

    size = bits_no * bit_samples_no
    result_samples = np.zeros(size)
    result_bits = np.zeros(bits_no)
    decoded_result_bits = np.zeros(bits_no)
```



```

# convolution between signal and receive filter to get filter output
if(receive_filter is None):
    result_samples = noisy_signal_samples
else:
    result_samples = np.convolve(noisy_signal_samples, receive_filter)

# sampling at T
for i in range(bits_no):
    # 0:9->9 10:19->19 20:29->29
    result_bits[i]=result_samples[i * bit_samples_no + bit_samples_no - 1]

# decoding to {-1,1}
decoded_result_bits = np.sign(result_bits)

return result_samples,result_bits,decoded_result_bits
#####

def calc_simulation_error(signal_bits,decoded_result_bits,bits_no):
    error = np.sum(signal_bits != decoded_result_bits) / bits_no
    return error
#####

def calc_theoretical_error(z):
    return math.erfc(z)
#####

def test(receive_filter, thr_error_coeff, is_plot):
    sim_error, thr_error = [], []

    for E_No_db in range(-10, 21):
        E_No = 10 ** (E_No_db / 10) #get E/No from its db value
        E = 1
        sigma = np.sqrt(E/(2*E_No))

        noise = generate_gaussian_noise(0, sigma, bits_no, bit_samples_no)
        signal_samples, noisy_signal_samples = add_gaussian_noise(bits_no, bit_samples_no, signal_bits,
        noise)
        result_samples,result_bits,decoded_result_bits = convolution(noisy_signal_samples, receive_filter,
        bits_no, bit_samples_no)

```

```

x = calc_simulation_error(signal_bits,decoded_result_bits,bits_no)
y = 0.5 * calc_theoretical_error(thr_error_coeff * (E_No ** 0.5))
sim_error.append(x)
thr_error.append(y)

if(is_plot):
    plt.figure(figsize=(10,7))
    plt.plot(range(0,len(signal_bits)), signal_bits)
    plt.title("Original bits")
    plt.xlabel('time')
    plt.ylabel('value')

    plt.figure(figsize=(10,7))
    plt.plot(range(0,len(signal_samples)), signal_samples)
    plt.title("Original signal")
    plt.xlabel('time')
    plt.ylabel('value')

    plt.figure(figsize=(10,7))
    plt.plot(range(0,len(result_samples)), result_samples)
    plt.title("Output of receive filter")
    plt.xlabel('time')
    plt.ylabel('value')

    plt.figure(figsize=(10,7))
    plt.plot(range(0,len(decoded_result_bits)), decoded_result_bits)
    plt.title("Output after decoding")
    plt.xlabel('time')
    plt.ylabel('value')

    return sim_error, thr_error
#####

bits_no,bit_samples_no = 10 , 10
size = bits_no * bit_samples_no
signal_bits = generate_random_bits(bits_no)

receive_filter1 = np.ones(bit_samples_no)
receive_filter2 = None
receive_filter3 = np.linspace(0, 1, bit_samples_no) * np.sqrt(3)

```

```
sim_error1, thr_error1, sim_error2, thr_error2, sim_error3, thr_error3 = [], [], [], [], [], []
```

```
sim_error1, thr_error1 = test(receive_filter1, 1, True)
```

```
sim_error2, thr_error2 = test(receive_filter2, 1, True)
```

```
sim_error3, thr_error3 = test(receive_filter3, (3**0.5/2), True)
```

```
#####
```

```
# test to simulate error
```

```
bits_no, bit_samples_no = 1000000, 10
```

```
signal_bits = generate_random_bits(bits_no)
```

```
sim_error1, thr_error1 = test(receive_filter1, 1, False)
```

```
sim_error2, thr_error2 = test(receive_filter2, 1, False)
```

```
sim_error3, thr_error3 = test(receive_filter3, (3**0.5/2), False)
```

```
# plot
```

```
plt.figure(figsize=(8,7))
```

```
x_axis_range = range(-10, 21)
```

```
plt.semilogy(x_axis_range, sim_error1, 'r-')
```

```
plt.semilogy(x_axis_range, thr_error1, 'ro')
```

```
plt.semilogy(x_axis_range, sim_error2, 'g-')
```

```
plt.semilogy(x_axis_range, thr_error2, 'g*')
```

```
plt.semilogy(x_axis_range, sim_error3, 'b-')
```

```
plt.semilogy(x_axis_range, thr_error3, 'b--')
```

```
plt.title('Bit Error Rate Simulation vs. Theoretical')
```

```
plt.legend(['Sim BER 1', 'Thr BER 1', 'Sim BER 2', 'Thr BER 2', 'Sim BER 3', 'Thr BER 3'])
```

```
plt.xlabel('E/No')
```

```
plt.ylabel('BER')
```

```
plt.yscale('log')
```

```
plt.ylim(10**(-4))
```

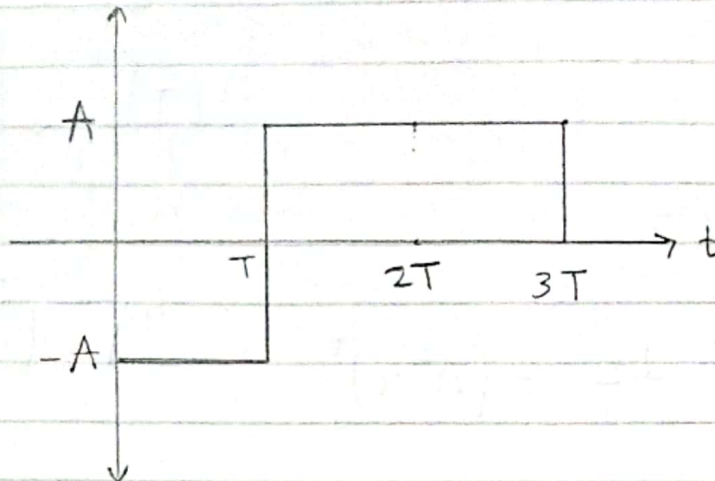
```
plt.grid()
```

```
plt.show()
```

Part I

amplitude

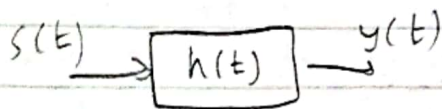
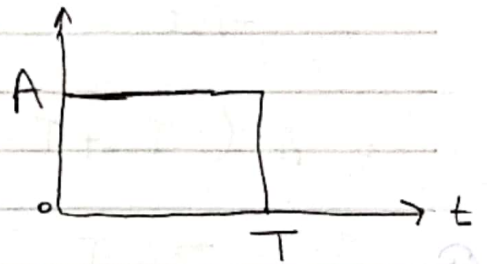
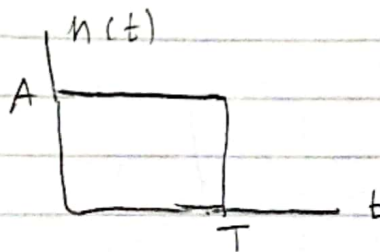
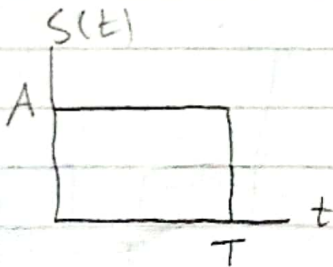
a



$$g(t) = A \text{rect} \left(\frac{t - \frac{T}{2}}{T} \right)$$

$$h(t) = g(T-t) = A \text{rect} \left(\frac{T-t - \frac{T}{2}}{T} \right) =$$

$$h(t) = A \text{rect} \left(\frac{\frac{T}{2} - t}{T} \right)$$



$$y(t) = s(t) * h(t)$$

$$y(t) = \int_{-\infty}^{\infty} s(\tau) h(t-\tau) d\tau$$

(2)

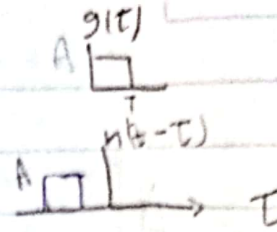
Subject

موضوع الدرس

Date

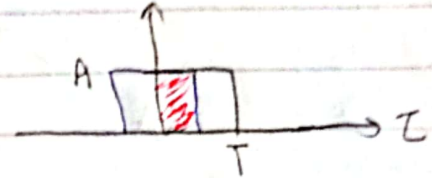
التاريخ

* For $t < 0$
 $y(t) = 0$



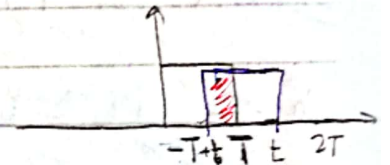
* For $0 < t < T$

$$y(t) = \int_0^t A^2 d\tau = (A^2 \tau)_0^t = A^2 t$$



* For $T < t < 2T$

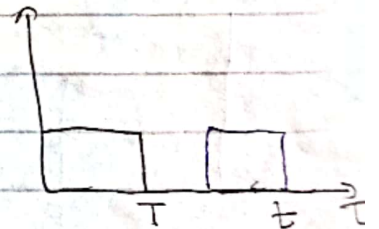
$$y(t) = \int_{-T+t}^T A^2 d\tau = (A^2 \tau)_{-T+t}^T$$



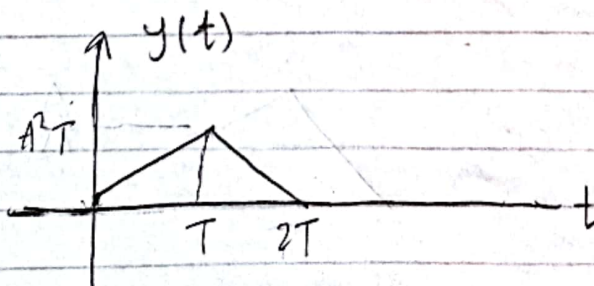
$$= A^2 (T + T - t) = A^2 (2T - t)$$

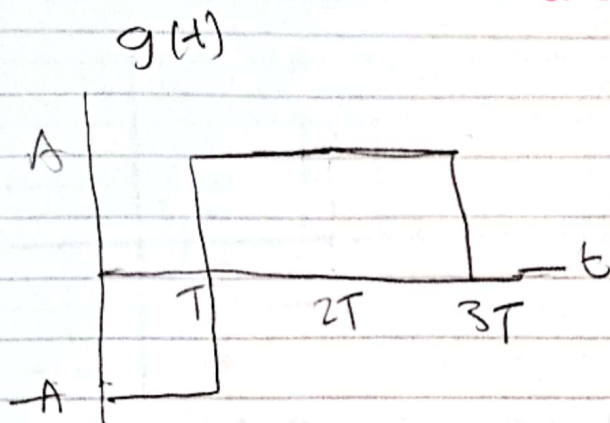
* For $t > 2T$

$$y(t) = 0$$

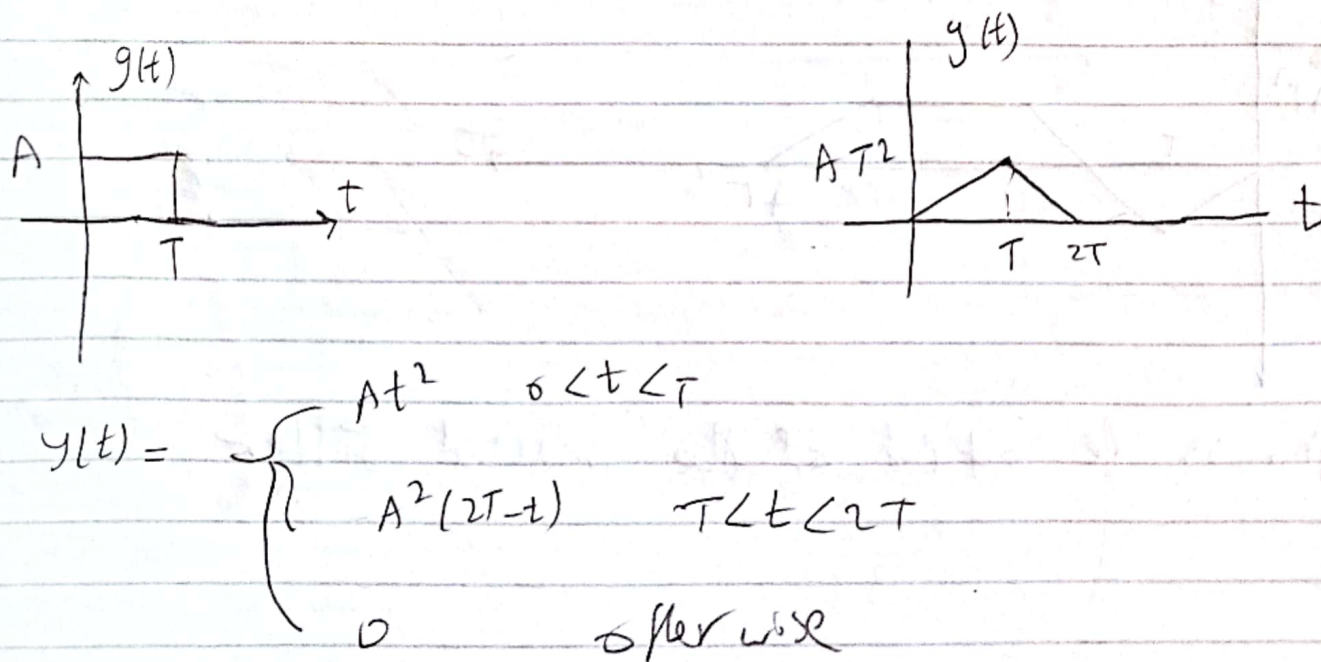
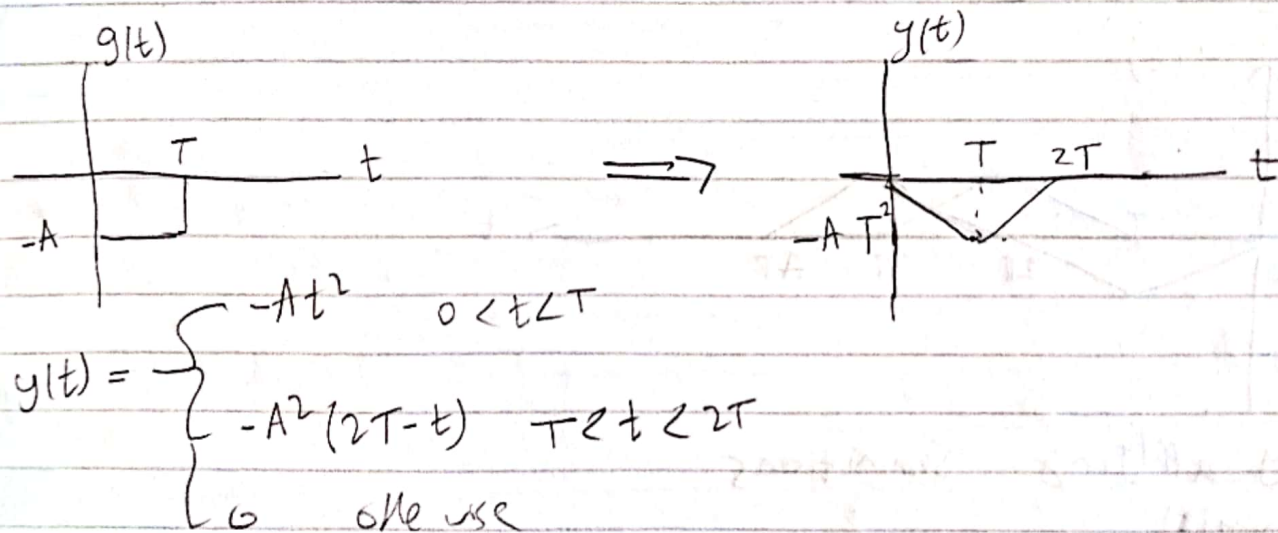


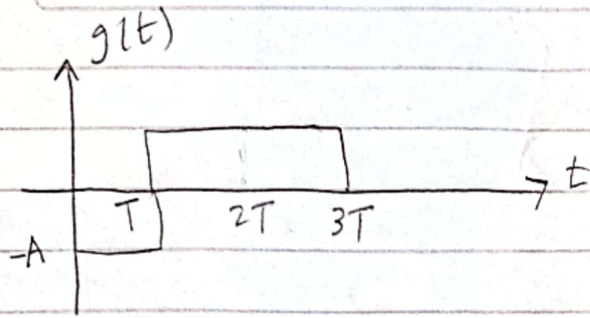
$$y(t) = \begin{cases} 0 & t < 0 \\ A^2 t & 0 < t < T \\ A^2 (2T - t) & T < t < 2T \\ 0 & t > 2T \end{cases}$$



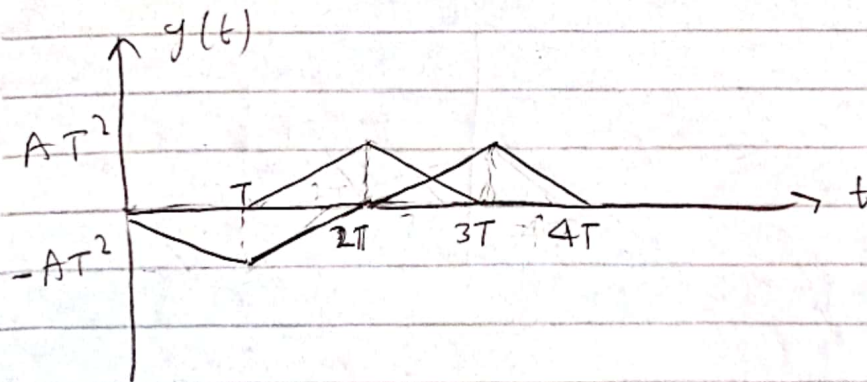


From the last result

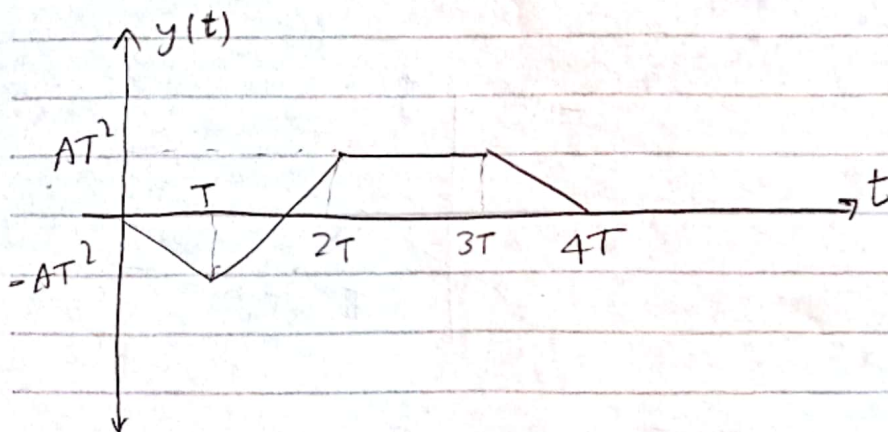




For this signal by applying super position to get $y(t)$



by applying summations



this is the output of the matched filter

3

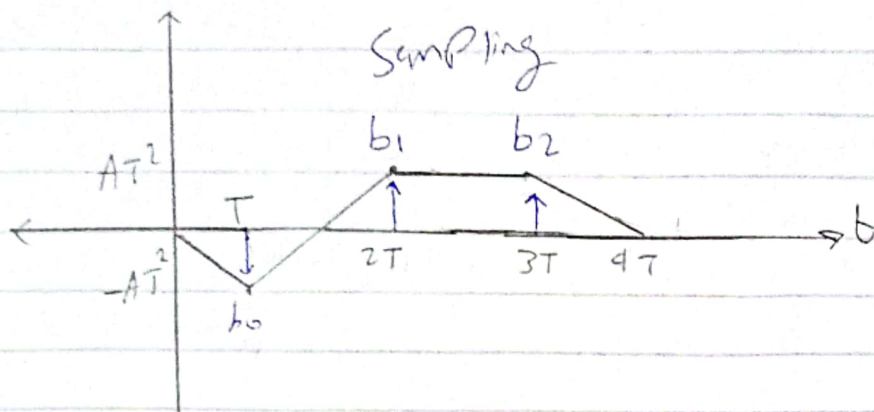
Subject

موضوع الدرس

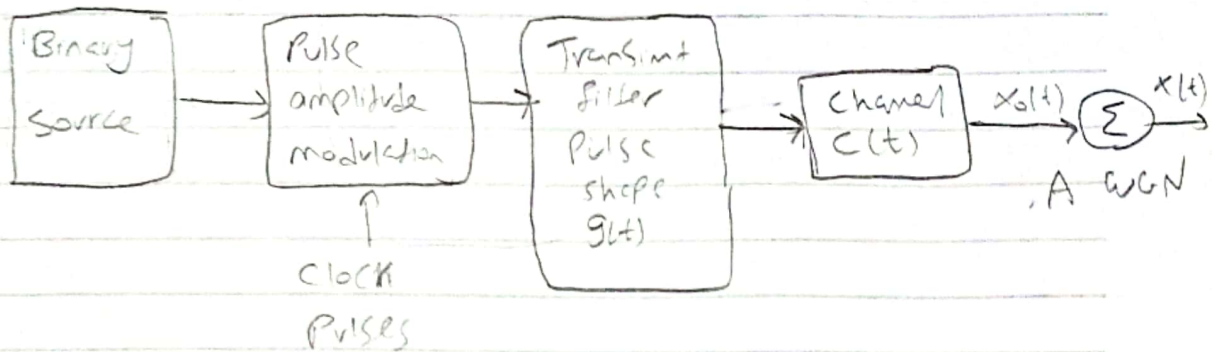
Date

التاريخ

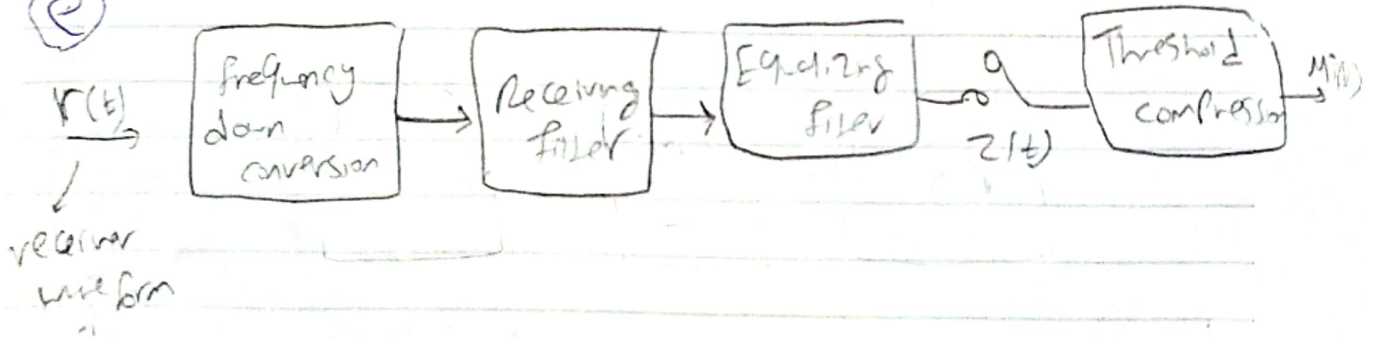
c



d



e



Part II $g(t) = \begin{cases} -A \\ A \end{cases}, \quad 0 < t < T$

@ The receiver filter $h(t)$ is a matched filter with unit energy

$$g(t) = A \operatorname{rect}\left(\frac{t - \frac{T}{2}}{T}\right)$$

$$r(t) \rightarrow \boxed{h(t)} \rightarrow y(t)$$

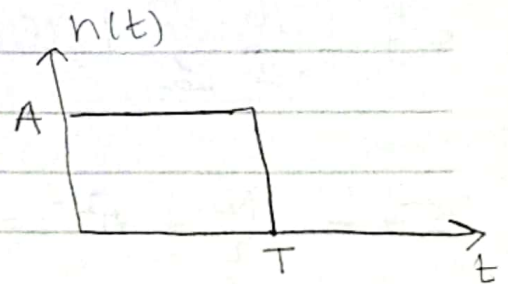
$$h(t) = g(T-t) = A \operatorname{rect}\left(\frac{T-t-\frac{T}{2}}{T}\right) = A \operatorname{rect}\left(\frac{\frac{T}{2}-t}{T}\right)$$

$$r(t) = g(t) + w(t)$$

$$y(t) = r(t) * h(t)$$

$$y(t) = g(t) * h(t) + w(t) * h(t) \\ = g_0(t) + n(t)$$

From Part (I) (b)



$$g_0(t) = \begin{cases} 0 & \text{otherwise} \\ A^2 T & 0 < t \leq T \\ A^2(2T-t) & T < t \leq 2T \end{cases}$$

$$\therefore y(T) = \begin{cases} -A^2 T + n(T) & \text{"0"} \\ A^2 T + n(T) & \text{"1"} \end{cases}$$

$$N_y = E(y(T)) = E(g_0(T)) + E(n(T))$$

$$N_y = E(\pm A^2 T + n(T)) = \pm A^2 T + E(n(T))$$

$$E(n(T)) = E\left(\int w(\tau) h(T-\tau) d\tau\right)$$

$$= E\left(\int w(\tau) g(\tau) d\tau\right) =$$

$$E\left(\int_0^T \pm A w(\tau) d\tau\right) = \int_0^T \pm A E(w(\tau)) d\tau = 0$$

$$\therefore N_y = \pm A^2 T$$

$$\therefore N_y = \begin{cases} -A^2 T & \text{"0"} \\ A^2 T & \text{"1"} \end{cases}$$

$$\sigma_y^2 = \text{Var}(y(T)) = E(n^2(T) + n(T))$$

$$\sigma_y^2 = \text{Var}(n(T)) = E(n^2(T)) - E(n(T))^2$$

$$\sigma_y^2 = E(n^2(T)) = \int_{-\infty}^{\infty} S_n(f) df$$

$$\sigma_y^2 = \frac{N_0}{2} \int_{-\infty}^{\infty} |H(f)|^2 df = \frac{N_0}{2} \int_0^T |h(t)|^2 dt$$

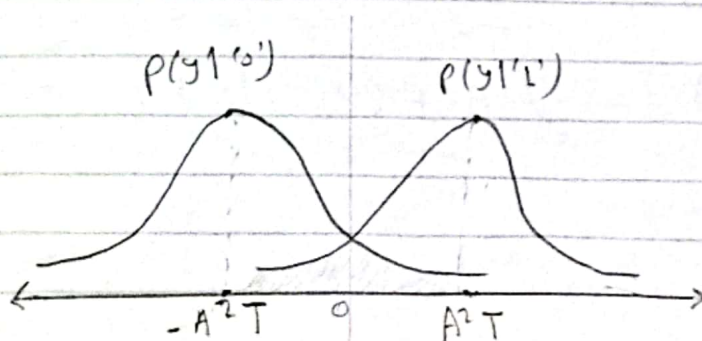
$$\sigma_y^2 = \frac{N_0}{2} \times A^2 T = \frac{N_0 A^2 T}{2}$$

$$P(y) = \frac{1}{\sqrt{2\pi}\sigma^2} e^{-\frac{(y-\mu_y)^2}{2\sigma^2}}$$

$$P(y|10) = \frac{1}{\sqrt{2\pi + \frac{N_0 A^2 T}{2}}} e^{-\frac{(y + A^2 T)^2}{2 \times \frac{N_0 A^2 T}{2}}}$$

$$P(y|0) = \frac{1}{\sqrt{\pi N_0 A^2 T}} e^{-\frac{(y + A^2 T)^2}{N_0 A^2 T}}$$

$$P(y|1) = \frac{1}{\sqrt{\pi N_0 A^2 T}} e^{-\frac{(y - A^2 T)^2}{N_0 A^2 T}}$$



$$P(e|'0') = \int_0^{\infty} \frac{1}{\sqrt{\pi N_0 A^2 T}} e^{-\frac{(y+A^2 T)^2}{N_0 A^2 T}} dy$$

$$\text{let } z = \frac{y+A^2 T}{\sqrt{N_0 A^2 T}}$$

$$dz = \frac{dy}{\sqrt{N_0 A^2 T}}$$

$$P(e|'0') = \int_{\frac{A^2 T}{\sqrt{N_0 A^2 T}}}^{\infty} \frac{1}{\sqrt{\pi} \sqrt{N_0 A^2 T}} \times e^{-z^2} \times \sqrt{N_0 A^2 T} dz$$

$$P(e|'0') = \int_{\frac{A^2 T}{\sqrt{N_0 A^2 T}}}^{\infty} \frac{1}{\sqrt{\pi}} e^{-z^2} dz = \frac{1}{2} \operatorname{erfc}\left(\frac{A^2 T}{\sqrt{N_0 A^2 T}}\right)$$

$$P(e) = P(e|'1') P('1') + P(e|'0') P('0')$$

$$P('1') = P('0') = 0.5$$

$$\therefore P(e) = 2 P(e|'0') \times 0.5 = P(e|'0')$$

$$\therefore P(e) = \frac{1}{2} \operatorname{erfc}\left(\frac{A^2 T}{\sqrt{N_0 A^2 T}}\right)$$

$$A=1, T=1$$

$$\therefore P(e) = \frac{1}{2} \operatorname{erfc}\left(\frac{1}{\sqrt{N_0}}\right)$$

⑥ the receive filter $h(t)$ is not existent ($h(t) = \delta(t)$)

$$y(t) = v(t) * h(t) = v(t) * \delta(t) = v(t)$$

convolution with δ gives the same signal

$$y(T) = g(T) + w(T)$$

$$y(T) = \pm A + w(T)$$

$$E(y(T)) = E(\pm A + w(T)) = \pm A + E(w(T))$$

$$N_y = \begin{cases} -A & (0) \\ A & (1) \end{cases}$$

$$\sigma_y^2 = \text{var}(y(T)) = \text{var}(\pm A + w(T)) = \text{var}(w(T))$$

$$\sigma_y^2 = \text{var}(w(T)) = \frac{N_0}{2}$$

$$p(y|'0') = \frac{1}{\sqrt{N_0 \pi}} e^{-\frac{(y+A)^2}{N_0}} = \mathcal{N}(A, \frac{N_0}{2})$$

$$p(y|'1') = \frac{1}{\sqrt{N_0 \pi}} e^{-\frac{(y-A)^2}{N_0}} = \mathcal{N}(-A, \frac{N_0}{2})$$

Due to symmetry $\lambda = 0$, $P('0') = P('1')$

$$P(e|'0') = \int_0^\infty p(y|'0') dy$$

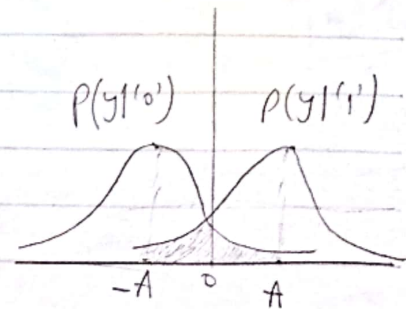
$$= \int_0^\infty \frac{1}{\sqrt{N_0 \pi}} e^{-\frac{(y+A)^2}{N_0}} dy$$

$$\text{let } z = \frac{y+A}{\sqrt{N_0}}, \quad dz = \frac{dy}{\sqrt{N_0}}$$

$$P(e|'0') = \int_{\frac{A}{\sqrt{N_0}}}^\infty \frac{1}{\sqrt{\pi}} \times e^{-z^2} \times \sqrt{N_0} dz = \frac{1}{2} \text{erfc}\left(\frac{A}{\sqrt{N_0}}\right)$$

$$P(e) = P(e|'0') \times P('0') + P(e|'1') \times P('1') = 2 P(e|'0') \times 0.5 =$$

$$P(e|'0') = \frac{1}{2} \text{erfc}\left(\frac{A}{\sqrt{N_0}}\right) = \frac{1}{2} \text{erfc}\left(\frac{1}{\sqrt{N_0}}\right)$$

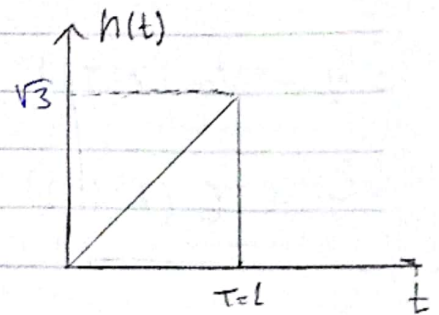


(C) The receive filter $h(t)$ has the following impulse response

$$y(t) = r(t) * h(t) = g_0(t) + n(t)$$

$$g_0(t) = g(t) * h(t)$$

$$g_0(t) = \int_{-\infty}^{\infty} g(\tau) h(t-\tau) d\tau$$

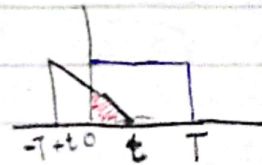


* For $t < 0$



$$g_0(t) = 0$$

* For $0 < t \leq T$



$$g_0(t) = \int_0^t \sqrt{3} A \tau d\tau = \sqrt{3} A \left[\frac{\tau^2}{2} \right]_0^t = \frac{\sqrt{3} A t^2}{2}$$

$$= \sqrt{3} A t$$

$$y(T) = \begin{cases} -\frac{\sqrt{3}}{2} A T^2 + n(T) & '0' \\ \frac{\sqrt{3}}{2} A T^2 + n(T) & '1' \end{cases}$$

$$M_y = E(y(T)) = E(g_0(T)) + E(n(T))$$

$$M_y = E\left(\pm \frac{\sqrt{3}}{2} A T^2 + n(T)\right) = \pm \frac{\sqrt{3}}{2} A T^2 + E(n(T))$$

$$E(n(T)) = E\left(\int_{-\infty}^{\infty} w(\tau) g(\tau) d\tau\right)$$

$$= E\left(\int_0^T \pm A w(\tau) d\tau\right) = \int_0^T \pm A E(w(\tau)) d\tau = 0$$

$$M_y = \begin{cases} -\frac{\sqrt{3}}{2} A T^2 & '0' \\ \frac{\sqrt{3}}{2} A T^2 & '1' \end{cases}$$

$$\sigma_y^2 = \text{Var}(y(T)) = E(g_0(T) + n(T)) = E\left(\pm \frac{\sqrt{3}}{2} AT^2 + n(T)\right)$$

$$\sigma_y^2 = \text{Var}(n(T)) = E(n^2(T)) + E(n(T))^2$$

$$\sigma_y^2 = E(n^2(T)) = \int_{-\infty}^{\infty} S_n(f) df$$

$$\sigma_y^2 = \frac{N_0}{2} \int_{-\infty}^{\infty} |H(f)|^2 df = \frac{N_0}{2} \int_0^T |h(t)|^2 dt$$

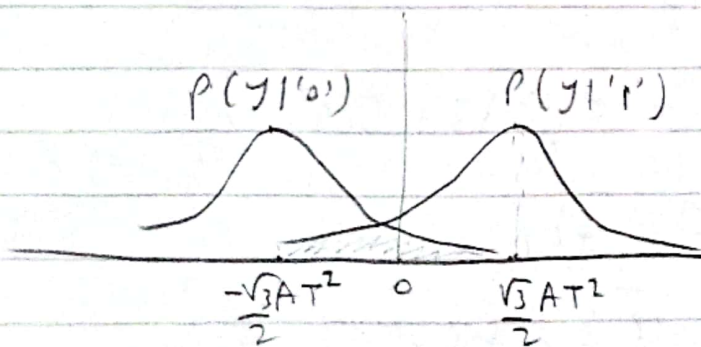
$$\sigma_y^2 = \frac{N_0}{2} \int_0^T 3 t^2 dt = \frac{N_0}{2} \left[3 \frac{t^3}{3} \right]_0^T = \frac{N_0}{2} T^3$$

$$P(y) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(y-N)^2}{2\sigma^2}}$$

$$P(y|'0') = \frac{1}{\sqrt{2\pi \times \frac{N_0 T^3}{2}}} e^{-\frac{(y + \frac{\sqrt{3}}{2} AT^2)^2}{N_0 T^3}}$$

$$P(y|'0') = \frac{1}{\sqrt{\pi N_0 T^3}} e^{-\frac{(y + \frac{\sqrt{3}}{2} AT^2)^2}{N_0 T^3}}$$

$$P(y|'1') = \frac{1}{\sqrt{\pi N_0 T^3}} e^{-\frac{(y - \frac{\sqrt{3}}{2} AT^2)^2}{N_0 T^3}}$$



$$p(e|'o') = \int_0^{\infty} \frac{1}{\sqrt{\pi N_0 T^3}} e^{-\left(1 + \frac{\sqrt{3}}{2} AT^2\right) \frac{y^2}{N_0 T^3}} dy$$

$$\text{let } z = \frac{y + \frac{\sqrt{3}}{2} AT^2}{\sqrt{N_0 T^3}}$$

$$dz = \frac{dy}{\sqrt{N_0 T^3}}$$

$$p(e|'o') = \int_0^{\infty} \frac{1}{\frac{\sqrt{3}}{2} AT^2 \sqrt{\pi} \sqrt{N_0 T^3}} e^{-z^2} \sqrt{N_0 T^3} dz$$

$$= \frac{1}{2} \operatorname{erfc}\left(\frac{\frac{\sqrt{3}}{2} AT^2}{\sqrt{N_0 T^3}}\right)$$

$$\text{assume } p('o') = p('1')$$

$$p(e) = p(e|'o') = \frac{1}{2} \operatorname{erfc}\left(\frac{\frac{\sqrt{3}}{2} AT^2}{\sqrt{N_0 T^3}}\right)$$

$$A=1, T=1$$

$$p(e) = p(e|'o') = \frac{1}{2} \operatorname{erfc}\left(\frac{\frac{\sqrt{3}}{2}}{\sqrt{N_0}}\right)$$