



Assignment 2 [DC]

Name: علياء عبدالعزيز على عبدالله

Section: 1

Bench Number: 26

Part 1

 Hand Analysis

Math

Blocks

 Simulation output

 Code

Constants

Functions

Simulation

Plotting

Part 2

 Hand Analysis

Final Answer (written in latex ❤️)

 Simulation

output from filters + comment

BER (Simulation / Comment on problem 🤔)

Comments on Q5, Q6

Q5) Is the BER an increasing or a decreasing function of E/N_0 ? Why?

Q6) Which case has the lowest BER? Why?

 Code

Generation Functions

Functions (More done)

Drawing output of each Matched Filter

BER Calculation & Plotting

Functions
Calculations
Plotting

Part 1

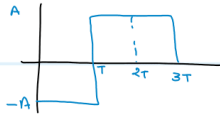
 **Hand Analysis**

Math

Part ①



a)

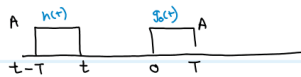


$$b) \quad h(t) = K g(T-t) = g(T-t) \quad \text{let } K=1 \Rightarrow g_{11}(t) = \begin{cases} A & 0 \leq t \leq T \\ 0 & \text{otherwise} \end{cases} = A \cdot \text{rect}\left(\frac{t-T/2}{T}\right)$$

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

$$= g_0(t) + n(t) \quad \text{due to 1 pulse}$$

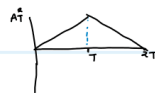
→ when '1' was sent



$$\text{① For } 0 < t < T: \quad g_0(t) = \int_0^t A^2 dt = A^2 t$$

$$\text{② For } T < t < 2T: \quad g_0(t) = \int_{t-T}^T A^2 dt = A^2 [2T - t]$$

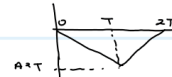
$$g_0(t) = \begin{cases} A^2 t & 0 < t < T \\ A^2 [2T - t] & T < t < 2T \end{cases}$$


 $y(t) = g_0(t)$ ignore noise when "1" sent

→ when "0" sent

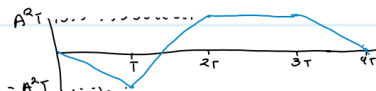
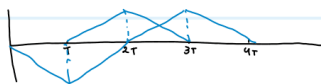
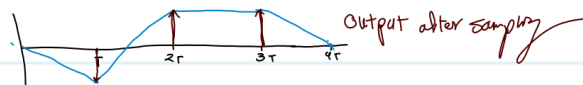
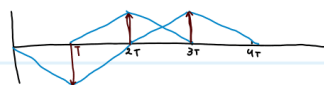
$$\Rightarrow g_{00}(t) = -g_{11}(t)$$

$$\Rightarrow g_{00}(t) = -g_{11}(t) * h(t) = -g_0(t) = \begin{cases} -A^2 t & 0 < t < T \\ A^2 [2T - t] & T < t < 2T \end{cases}$$



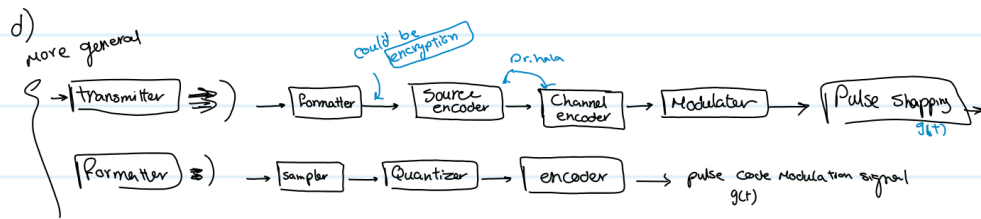
→ Final Output Signal ignoring noise

y(t)

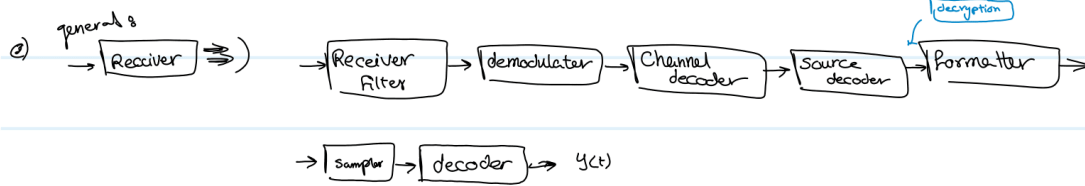
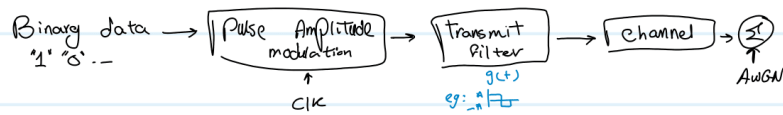
c) will sample at $T, 2T, 3T$ 

Output after sampling

Blocks



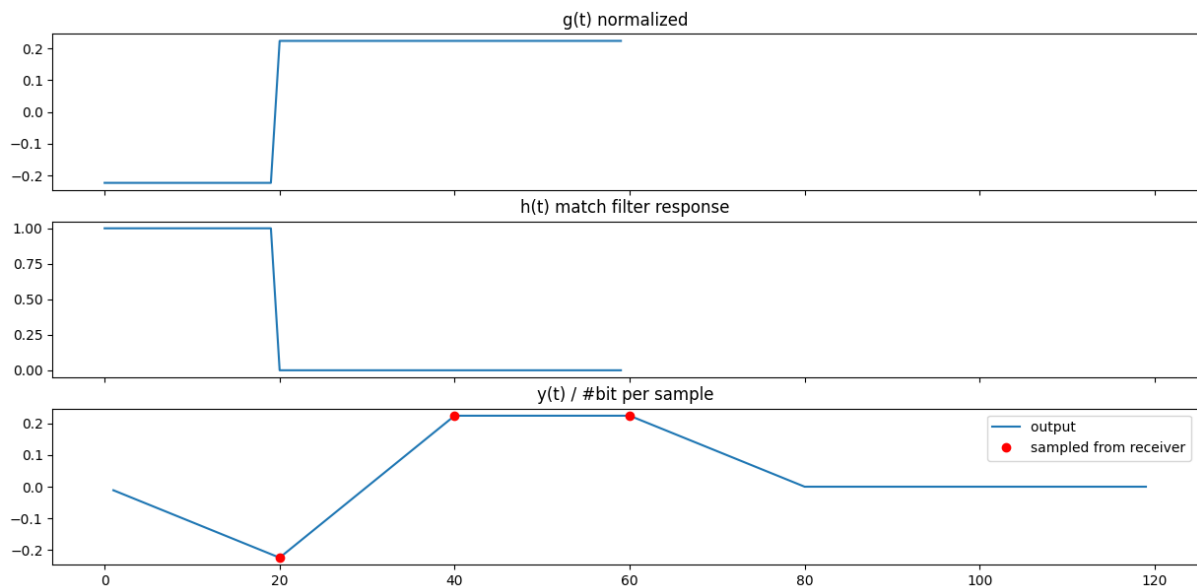
in assignment



assignment



Simulation output



🕶 Code

Constants

```
import numpy as np
import matplotlib.pyplot as plt
from scipy.signal import convolve, fftconvolve
from scipy.special import erfc
```

```
num_bits = 100          # number of bits will send
num_samples_per_bit = 20 # number of sample to convert it to cont
Ts = 1                  # discrete sampling time
A = 1                   # amplitude of signal
g1_t = A * np.ones(num_samples_per_bit) # pulse shape when "1" was s
g1_t_norm = np.linalg.norm(g1_t, axis=0) # for normalizaton 1/sqrt(n)
print(g1_t_norm) #4.47213595499958
```

Functions

```
def generate_bipolar_NRT_sig(data: np.ndarray, num_samples_per_bit =
    """
    parameters:
        data: binary array of shape num_bits
    return:
        time: numpy array represent time axis
        g_t : output signal from transmitter
```

```

"""
g_t = np.repeat(data, num_samples_per_bit) # repeat every data p
g_t = ((g_t * 2) - 1) # convert 0 -> -A | 1 -> A
return g_t / g1_t_norm

def generate_match_filter(g1_t: np.ndarray, num_bits = num_bits, num
# g1_t : impulse shape when sending "1" must be in shape (num_sa
h_t = g1_t[::-1] # just reverse it
h_t = np.concatenate([h_t, np.zeros((num_bits - 1) * num_samples
return h_t

```

Simulation

```

data = np.array([0, 1, 1])
g_t = generate_bipolar_NRT_sig(data)
h_t = generate_match_filter(np.ones(num_samples_per_bit) * A, 3)
y_t = convolve(g_t, h_t) # ignoring noise return the same shape of g

```

Plotting

```

fig, axs = plt.subplots(3, 1, figsize=(15, 7), sharex=True)
clock = (np.arange(3) + 1) * num_samples_per_bit # for sampling

axs[0].set_title("g(t) normalized")
axs[0].plot(g_t)

axs[1].set_title("h(t) match filter response")
axs[1].plot(h_t)

axs[2].set_title("y(t) / #bit per sample")
axs[2].plot(np.arange(1, len(y_t)+1), y_t / num_samples_per_bit, lab
axs[2].plot(clock, y_t[clock-1] / num_samples_per_bit, "ro", label =

plt.legend()
plt.show()

```

Part 2

🖋️ Hand Analysis

3

part II

$$\sigma^2 T = 1, \quad w(t) \sim N(0, \frac{N_0}{2}) \quad g(t) = \begin{cases} 1 \\ -1 \end{cases} \text{ or } \begin{cases} 1 \\ -1 \end{cases}$$

a) Matched Filter

$$h(t) = K g(T-t) \quad / \quad \text{Energy of Filter} = 1 = \frac{N_0}{2} \Rightarrow N_0 = 2$$

$$g(t) = 1 \quad \text{for } 0 < t < 1$$

$$y(t) = r(t) * h(t) = \underbrace{g(t) * h(t)}_{g_0(t)} + \underbrace{w(t) * h(t)}_{n(t)}$$

$$g_0(T) = \int_{-\infty}^{\infty} g(\tau) \cdot h(T-\tau) d\tau = \int_0^1 g(\tau) \cdot g_0(\tau) d\tau = \begin{cases} 1 & \text{"1" was sent} \\ -1 & \text{"0" was sent} \end{cases} = \begin{cases} A^T \\ -A^T \end{cases}$$

$$y(t) = \begin{cases} 1 + n(t) & \text{"1" was sent} \\ -1 + n(t) & \text{"0" was sent} \end{cases}$$

$$E[n(t)] = E\left(\int_{-\infty}^{\infty} w(\tau) h(T-\tau) d\tau\right) = \int_{-\infty}^{\infty} E[w(\tau)] E[h(T-\tau)] d\tau = 0$$

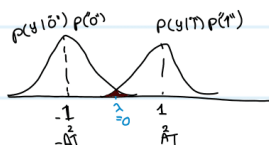
$$\text{Var}[n(t)] = E[n^2(t)] - (E[n(t)])^2 = R_n(0) = \int_{-\infty}^{\infty} Q_n(f) df = \int_{-\infty}^{\infty} Q_w(f) |H(f)|^2 df$$

$$= \frac{N_0}{2} \int_{-\infty}^{\infty} |h(f)|^2 df$$

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

$$p(y | '1') \sim N(A^T, \frac{N_0 A^2 T}{2}) \quad \text{"1" was sent}$$

$$p(y | '0') \sim N(-A^T, \frac{N_0 A^2 T}{2}) \quad \text{"0" was sent}$$



By symmetry $\lambda = 0$
Same Variance

$$P(\text{error}) = P(\text{err} | '1') P('1') + P(\text{err} | '0') P('0')$$

$$\text{as } P('1') = P('0') = 0.5$$

$$\text{as } P(y = '1' | '0') = P(\text{error} | '0') = P(y > 0 | '0')$$

$$\text{By symmetry } P(\text{error} | '1') = P(\text{error} | '0')$$

$$\therefore P(\text{error}) = P(\text{error} | '0') = P_r(y > 0 | 0) = P_r\left(z > \frac{0 + A\sqrt{T}}{\sqrt{\frac{N_0}{2} A T}}\right)$$

$$\text{so } E = g_s(T)$$

$$= Q\left(\frac{\sqrt{A} A \sqrt{T}}{\sqrt{N_0}}\right) = \frac{1}{2} \operatorname{erfc}\left(A \sqrt{\frac{T}{N_0}}\right) \\ = \frac{1}{2} \operatorname{erfc}\left(\sqrt{\frac{E}{N_0}}\right)$$

$$\operatorname{erfc}(x) = 2 Q(\sqrt{2}x) \\ Q(x) = \frac{1}{2} \operatorname{erfc}\left(\frac{1}{\sqrt{2}}x\right)$$

$$b) h(t) = \delta(t) \uparrow$$

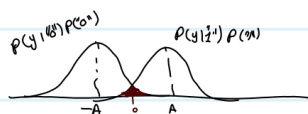
$$\text{as } y(t) = \underbrace{g(t) * h(t)}_{g(t)} + \underbrace{w(t) * h(t)}_{h(t)}$$

$$g_0(t) = g(t) * h(t) = g(t) * \delta(t) = g(t) = \begin{cases} A & \text{'1' was sent} \\ -A & \text{'0' was sent} \end{cases} \quad \text{for } 0 < t < 1$$

$$n(t) = w(t) * \delta(t) = w(t) \sim N(0, \frac{N_0}{2})$$

$$P(y | '1') \sim N(A, \frac{N_0}{2}) \quad \text{'1' was sent}$$

$$P(y | '0') \sim N(-A, \frac{N_0}{2}) \quad \text{'0' was sent}$$



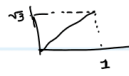
By symmetry $\lambda = 0$

$$\text{as } P('1') = P('0') = \frac{1}{2}, \quad \text{By symmetry } P(\text{err} | '1') = P(\text{err} | '0')$$

$$\text{so } P(\text{error}) = P(\text{err} | 1) P(1) + P(\text{err} | 0) P(0)$$

$$= P(\text{err} | 0) = P(y > 0 | 0) = P\left(z > \frac{0 + A}{\sqrt{\frac{N_0}{2}}}\right) = Q\left(\frac{A\sqrt{2}}{\sqrt{N_0}}\right) = \frac{1}{2} \operatorname{erfc}\left(\frac{A}{\sqrt{N_0}}\right) = \frac{1}{2} \operatorname{erfc}\left(\frac{E}{N_0}\right)$$

$$e) h(t) = \begin{cases} \frac{\sqrt{3}}{2}t & 0 < t < \frac{1}{T} \\ 0 & \text{otherwise} \end{cases}$$



$$y(t) = \underbrace{g(t) * h(t)}_{g_0(t)} + \underbrace{w(t) * h(t)}_{n(t)}$$

$$- g_0(T) = \int_{-\infty}^{\infty} g(\tau) h(T-\tau) d\tau = \text{Area} \left(\begin{array}{c} \text{triangle} \\ \text{with height } \frac{\sqrt{3}}{2} \text{ and base } T \end{array} \right)$$

$$= \frac{\sqrt{3}}{2} T A \quad \Rightarrow \text{"1" was sent}$$

$$g_0(T) = \begin{cases} \frac{\sqrt{3}}{2} AT & \text{"1" was sent} \\ -\frac{\sqrt{3}}{2} AT & \text{"0" was sent} \end{cases}$$

since $g_0(T) = -g_0(T) = -A$
 $\Rightarrow g_0(T) = g_0(T)$

$$- n(T) = \int_{-\infty}^{\infty} w(\tau) h(T-\tau) d\tau$$

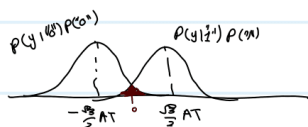
$$E(n(T)) = E\left(\int_{-\infty}^{\infty} w(\tau) h(T-\tau) d\tau\right) = \int_{-\infty}^{\infty} E(w(\tau)) E(h(T-\tau)) d\tau = 0$$

$$\text{Var}(n(t)) = E(n(t)^2) - E(n(t))^2 = E(n(t)^2) = R_n(0) =$$

$$= \int_{-\infty}^{\infty} G_n(f) df = \int_{-\infty}^{\infty} G_w(f) |H(f)|^2 df$$

$$= \frac{N_0}{2} \int_{-\infty}^{\infty} |h(f)|^2 df = \frac{N_0}{2} \frac{3}{T^2} \int_0^T t^2 dt = \frac{N_0}{2} T$$

$$\text{so } P(y | \text{"1"}) \sim N\left(\frac{\sqrt{3}}{2} AT, \frac{N_0 T}{2}\right), \quad P(y | \text{"0"}) \sim N\left(-\frac{\sqrt{3}}{2} AT, \frac{N_0 T}{2}\right)$$



By symmetry $\lambda=0$

$$\text{so } P(\text{"1"}) = P(\text{"0"}) = \frac{1}{2}, \quad \text{By symmetry } P(\text{err} | \text{"1"}) = P(\text{err} | \text{"0"})$$

$$\text{so } P(\text{error}) = P(\text{err} | 1) P(1) + P(\text{err} | 0) P(0)$$

$$= P(\text{err} | 0) = P(y > 0 | 0) = P\left(z > \frac{0 + \frac{\sqrt{3}}{2} AT}{\sqrt{\frac{N_0 T}{2}}}\right) = Q\left(\frac{\frac{\sqrt{3}}{2} AT}{\sqrt{\frac{N_0 T}{2}}}\right) = \frac{1}{2} \text{erfc}\left(\frac{\frac{\sqrt{3}}{2} AT}{\sqrt{\frac{N_0 T}{2}}}\right)$$

$$= \frac{1}{2} \text{erfc}\left(\frac{E}{\sqrt{T N_0}}\right)$$

Final Answer (written in latex ♥)

Matched Filter

$$P(\text{error}) = 0.5 * \operatorname{erfc}\left(A\sqrt{\frac{T}{N_o}}\right) = 0.5 * \operatorname{erfc}\left(\sqrt{\frac{E}{N_o}}\right)$$

$$E = A^2 * T$$

No Filter

$$P(\text{error}) = 0.5 * \operatorname{erfc}\left(\frac{A}{\sqrt{N_o}}\right) = 0.5 * \operatorname{erfc}\left(\frac{E}{\sqrt{N_o}}\right)$$

$$E = A$$

Ramp Filter

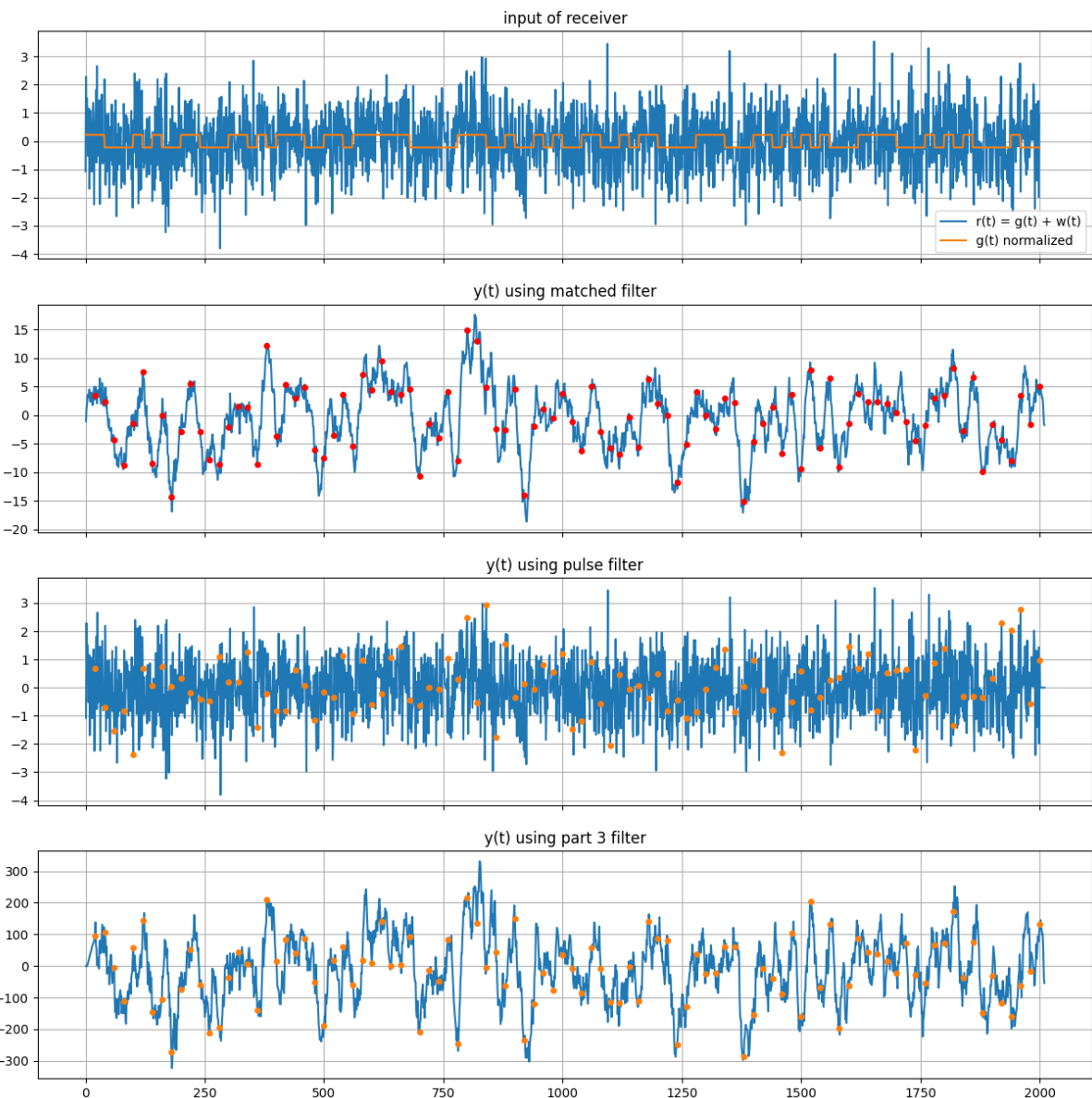
$$P(\text{error}) = 0.5 * \operatorname{erfc}\left(\frac{\sqrt{3}A}{2} \cdot \sqrt{\frac{T}{N_o}}\right) = 0.5 * \operatorname{erfc}\left(\frac{E}{\sqrt{TN_o}}\right)$$

$$E = \frac{\sqrt{3}}{2} \cdot A \cdot T$$



Simulation

output from filters + comment



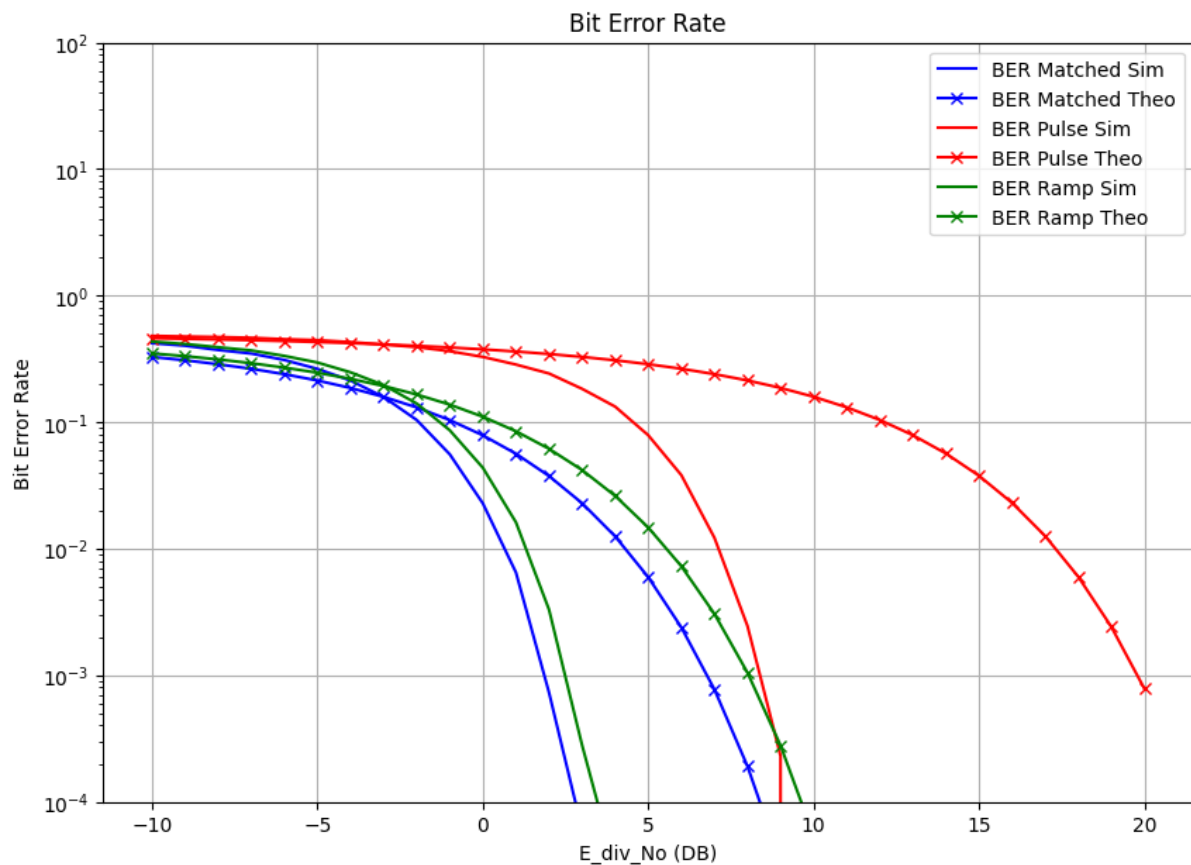
x-axis \Rightarrow Time * samples per bit

without any needed calculation for BER it's obvious Matched Filter work the best and no Filter (pulse) work worse

BER (Simulation / Comment on problem 🤔)

I know I kind of missed up with theoretical calculation due to upscaling I tried to look on energy on how it change the equation during upscaling (still don't what I mess)

the theoretical distribution \approx the simulated but shifted



Comments on Q5, Q6

Q5) Is the BER an increasing or a decreasing function of E/N_o ? Why?

answer simply \Rightarrow BER is **decreasing** function of E/N_o

as we increase E/N_o we increase transmitted signal energy related to noise energy

if energy of noise close to transmitted signal energy $\Rightarrow E/N_o \approx 1 \Rightarrow$ noise will destroy signal easy

if energy of noise smaller to transmitted signal energy \Rightarrow signal won't feel noise

Q6) Which case has the lowest BER? Why?

answer simply \Rightarrow **Matched Filter**

as matched filter multiply high values in signal by high values in filter than in thresholding

step then you can easily detect it is high value same thing done in low values

but other filters don't multiply signal values with suitable values.



Code

Generation Functions

functions that generate different type of filters, AWGN

```
def generate_match_filter(g1_t: np.ndarray, num_bits = num_bits, num_samples_per_bit = num_samples_per_bit):
    # g1_t : impulse shape when sending "1" must be in shape (num_bits * num_samples_per_bit)
    h_t = g1_t[::-1] # just reverse it
    h_t = np.concatenate([h_t, np.zeros((num_bits - 1) * num_samples_per_bit)])
    return h_t

def generate_pulse_filter(num_bits = num_bits, num_samples_per_bit = num_samples_per_bit):
    h_t = np.zeros((num_bits * num_samples_per_bit)) # just reverse
    h_t[0] = 1
    return h_t

def generate_filter_p3(num_bits = num_bits, num_samples_per_bit = num_samples_per_bit):
    h_t = np.arange(0, num_samples_per_bit, dtype=np.float64)
    h_t *= np.sqrt(3)
    h_t = np.concatenate([h_t, np.zeros((num_bits - 1) * num_samples_per_bit)])
    return h_t

def generate_AWGN(No: int, num_bits = num_bits, num_samples_per_bit = num_samples_per_bit):
    noise = np.random.normal(0, No/2, size=(num_bits * num_samples_per_bit))
    return noise
```

Functions (More done)

```
# channel jop
def generate_random_signal(num_bits, No = 2, num_samples_per_bit = num_samples_per_bit):
    data = np.random.choice([0, 1], size=(num_bits), p=[1./2, 1./2])
    g_t = generate_bipolar_NRT_sig(data, num_samples_per_bit)
    w_t = generate_AWGN(No, num_bits, num_samples_per_bit)

    return data, g_t, w_t

# receiver jop
def get_reciver_ouput(r_t, filter_type = "match", num_samples_per_bit = num_samples_per_bit):
    h_t = None

    if filter_type == "match":
        h_t = generate_match_filter(g1_t, num_bits, num_samples_per_bit)
```

```

elif filter_type == "pulse":
    h_t = generate_pulse_filter(num_bits, num_samples_per_bit)
else:
    h_t = generate_filter_p3(num_bits, num_samples_per_bit)

y_t = convolve(r_t, h_t)

return h_t, y_t

```

Drawing output of each Matched Filter

1. calculation of random signal and output

```

data, g_t, w_t = generate_random_signal(num_bits, No = 2)
r_t = g_t + w_t
h_t_match, y_t_match = get_reciver_ouput(r_t, "match")
h_t_pulse, y_t_pulse = get_reciver_ouput(r_t, "pulse")
h_t_p3, y_t_p3 = get_reciver_ouput(r_t, "p3")

```

2. sampling

```

clock = (np.arange(num_bits) + 1) * num_samples_per_bit
y_t_match_sampled = y_t_match[clock-1]
y_t_pulse_sampled = y_t_pulse[clock-1]
y_t_p3_sampled = y_t_p3[clock-1]

```

3. plotting

```

fig, axs = plt.subplots(4, 1, figsize=(15, 15), sharex=True)
show_bound = len(g_t) + 10

axs[0].set_title("input of receiver")
axs[0].plot(r_t, label="r(t) = g(t) + w(t)")
axs[0].plot(g_t, label="g(t) normalized")
axs[0].grid(True)
axs[0].legend()

axs[1].set_title("y(t) using matched filter")
axs[1].plot(np.arange(1, show_bound + 1), y_t_match[:show_bound]) #
axs[1].plot(clock, y_t_match_sampled, "ro", markersize=4)

```

```

axs[1].grid(True)

axs[2].set_title("y(t) using pulse filter")
axs[2].plot(np.arange(1, show_bound + 1), y_t_pulse[:show_bound] ) #
axs[2].plot(clock, y_t_pulse_sampled, "o", markersize=4)
axs[2].grid(True)

axs[3].set_title("y(t) using part 3 filter")
axs[3].plot(np.arange(1, show_bound + 1), y_t_p3[:show_bound]) # con
axs[3].plot(clock, y_t_p3_sampled, "o", markersize=4)
axs[3].grid(True)

plt.show()

```

BER Calculation & Plotting

Functions

```

def calc_sim_BER(data, sampled_received):
    error_prob = np.sum(data != sampled_received)
    error_prob /= data.shape[0]
    return error_prob

def calc_theo_BER(A, No, T, filter_type="match"):
    if filter_type == "match":
        return 0.5 * erfc( A * np.sqrt(T / No ) )
    elif filter_type == "pulse":
        return 0.5 * erfc( A / np.sqrt(No ) )
    else:
        return 0.5 * erfc( (np.sqrt(3) / 2) * A * ( np.sqrt(T / No))

```

Calculations

```

num_bits = 10**5

BER_simulated_match = []
BER_theoretical_match = []

BER_simulated_pulse = []
BER_theoretical_pulse = []

```

```

BER_simulated_p3 = []
BER_theoretical_p3 = []

E = 1

data = np.random.choice([0, 1], size=(num_bits), p=[1./2, 1./2])
g_t = generate_bipolar_NRT_sig(data)
AA = 1 / g1_t_norm          # amplitude after upsampling normalization
TT = num_samples_per_bit    # sampling time after upsampling

for E_div_No_db in range(-10, 21):
    E_div_No = 10 ** (E_div_No_db/10)
    No = E / E_div_No

    w_t = generate_AWGN(No, num_bits, num_samples_per_bit)
    r_t = g_t + w_t

    h_t_match, y_t_match = get_reciver_output(r_t, "match", num_samples_per_bit)
    h_t_pulse, y_t_pulse = get_reciver_output(r_t, "pulse", num_samples_per_bit)
    h_t_p3, y_t_p3 = get_reciver_output(r_t, "p3", num_samples_per_bit)

    # sampling
    clock = (np.arange(num_bits) + 1) * num_samples_per_bit
    y_t_match_sampled = (y_t_match[clock-1] > 0).astype(int)
    y_t_pulse_sampled = (y_t_pulse[clock-1] > 0).astype(int)
    y_t_p3_sampled = (y_t_p3[clock-1] > 0).astype(int)

    # print(f"===== for E/No = {E_div_No_db} =====")
    # print(y_t_match_sampled, calc_sim_BER(data, y_t_match_sampled))
    # print(y_t_pulse_sampled, calc_sim_BER(data, y_t_pulse_sampled))
    # print(y_t_p3_sampled, calc_sim_BER(data, y_t_p3_sampled), calc_theo_BER(AA, No, TT, "match"))
    BER_simulated_match.append(calc_sim_BER(data, y_t_match_sampled))
    BER_theoretical_match.append(calc_theo_BER(AA, No, TT, "match"))

    BER_simulated_pulse.append(calc_sim_BER(data, y_t_pulse_sampled))
    BER_theoretical_pulse.append(calc_theo_BER(AA, No, TT, "pulse"))

    BER_simulated_p3.append(calc_sim_BER(data, y_t_p3_sampled))
    BER_theoretical_p3.append(calc_theo_BER(AA, No, TT, "p3"))

```


Plotting

```
plt.figure(figsize=(10, 7))
plt.plot(range(-10, 21), BER_simulated_match, 'b', label="BER Matched")
plt.plot(range(-10, 21), BER_theoretical_match, 'x-b', label="BER Matched")

plt.plot(range(-10, 21), BER_simulated_pulse, 'r', label="BER Pulse")
plt.plot(range(-10, 21), BER_theoretical_pulse, 'x-r', label="BER Pulse")

plt.plot(range(-10, 21), BER_simulated_p3, 'g', label="BER Ramp Sim")
plt.plot(range(-10, 21), BER_theoretical_p3, 'x-g', label="BER Ramp Theoretical")

plt.xlabel('E_div_No (DB)')
plt.ylabel('Bit Error Rate')
plt.yscale('log')
plt.ylim(10**(-4), 10**2)
plt.title('Bit Error Rate')
plt.legend()
plt.grid()
plt.show()
```