

Probability

NoteBook

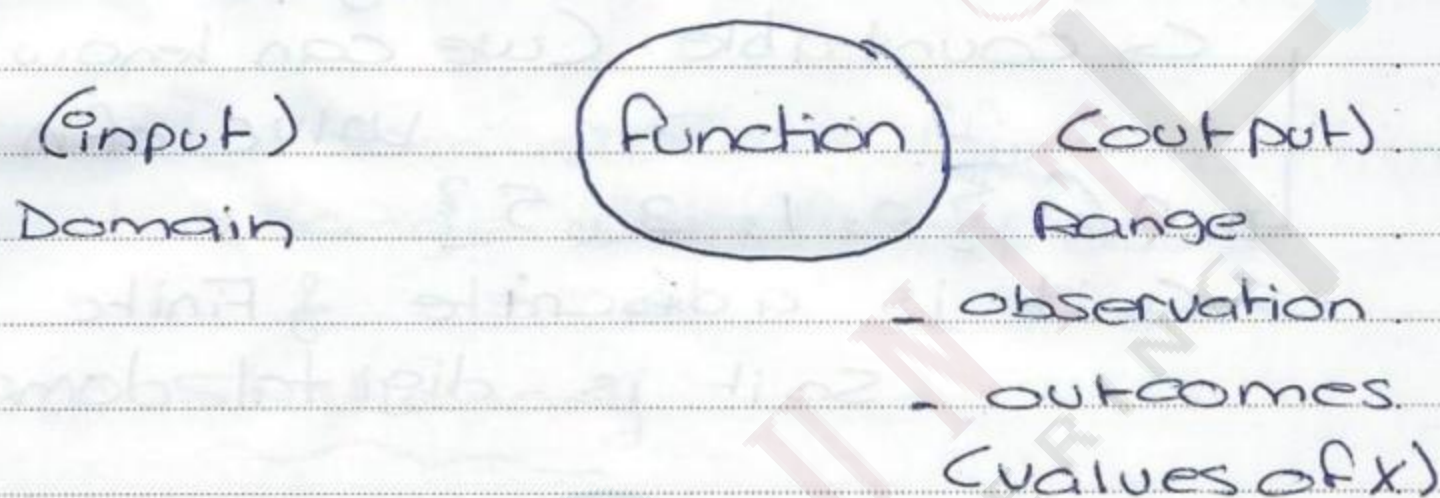
DR. Jamal Rahal

By: Farah Abuassamin



* Random Variable (R.V)

↳ a function that maps inputs into outputs



(varies) ← في الـ x inputs غير معروفة

- we have to have certain sequences to give very exact probability.

$$X \in [-10, 60]$$

X is not a variable it is a random variable.

* Describe Random variable

في الـ x → has 6 values only
(finite describe)

Random variable has at least
2 values

- like binary (Coin \rightarrow 0 or 1)

- e^n is describe of infinite

\rightarrow countable (we can know)

value of n

$n \in \{0, 1, 2, 5\}$

\rightarrow it is a discrete & Finite

So it is digital domain

- if we have an infinite Random variable but its average = 7
So, we expect most values are 7 or around 7

- Random process (function of time)
↳ change with time process.

⊕ Stationary

↳ values doesn't change with time

⊗ non-stationary

↳ values change with time.

cos & sin, the smoothest function we can use it in one point

لأنه ليس له نقطة لا يمين ولا شمال

* lec * 2

* Binary Random variable

$$X \in \{0, 1\}$$

$$X \in \{R, G\}$$

$$X \in \{5, -16\}$$

R, G are labels we can represent them as a function.

→ function → deterministic

$$if \quad X \in \{1, 2, 3\}$$

$$1 + 2 = 3 \rightsquigarrow \text{out comes}$$

$$1 + 3 = 4 \rightsquigarrow \text{measurement value}$$

كـ ليس من ديفن المجموع

* if outcomes of this function it's limits exist from right & left so it is differentiable.

* if it is infinite it is integrable

→ The Random variable R.V

R.V X

X

Statistics إحصائيات

correlation

Higher order

statistics

→ statistics

→ correlation



Auto correlation



PSD

F.T → Fourier transformer
we applied it

to random var.

منه خرج دالة

→ Higher order statistics

هي في الحقيقة جزء

من ال Statistics بس كنا فطنا

لأن الطريقة
أولوية } Higher order statistics }

* Probability density function (PDF)

→ measure the outcomes of the random variable & approximate the outcome frequency of each element in the Range



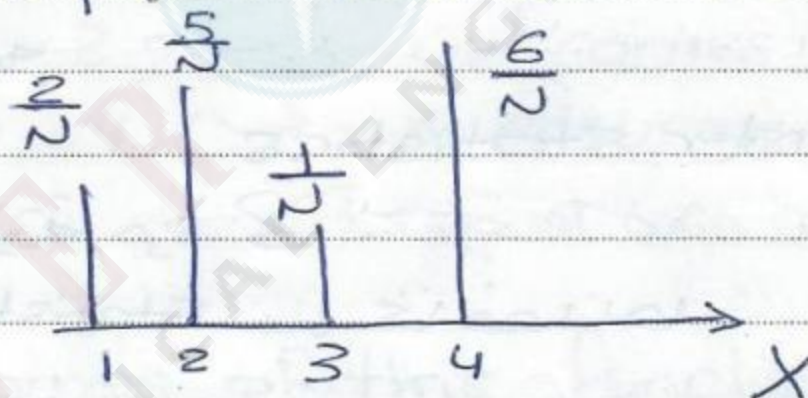


⇒ 14 outcomes

← كل ما في التجربة
stable is less

Normalize → become such that
the area under the curve
equal 1

ننظمه Normalize بمساحة تحت المنحنى = 1



⊗ if I have discrete R.V → The curve will
be discrete

⊗ if I have contin. R.V → The curve will
be conti.

(منه لو انا كم توقع انه يطلع رقم معين في التجربة)
الpercentage يعني انا كيت مجموع الpercentage
نسبتي 100%

⊗ Example 8-

X pdf

$f_X(x)$

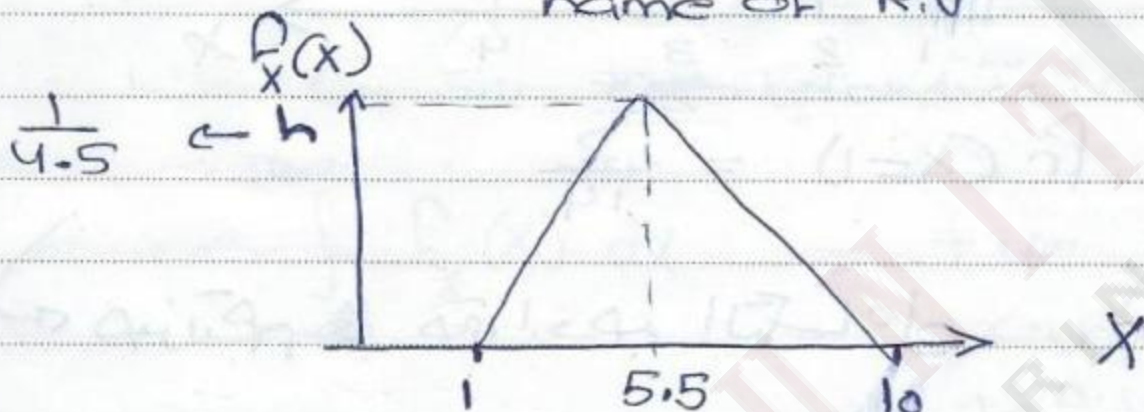
(x)

free variable

outcome

or x

name of R.V



to find h ?

$$\boxed{I} \int_{-\infty}^{\infty} f_X(x) dx = 1$$

$$4.5 \times h = 1 \rightarrow h = \frac{1}{4.5}$$

إذا كنا نريد نقطة واحدة كم ال x value ؟
 Prob. بعد اعرف كسايه اوجد ال

$$\left(\int f_X(x) dx \rightarrow f_X \text{ ال } \text{Prob} \right)$$

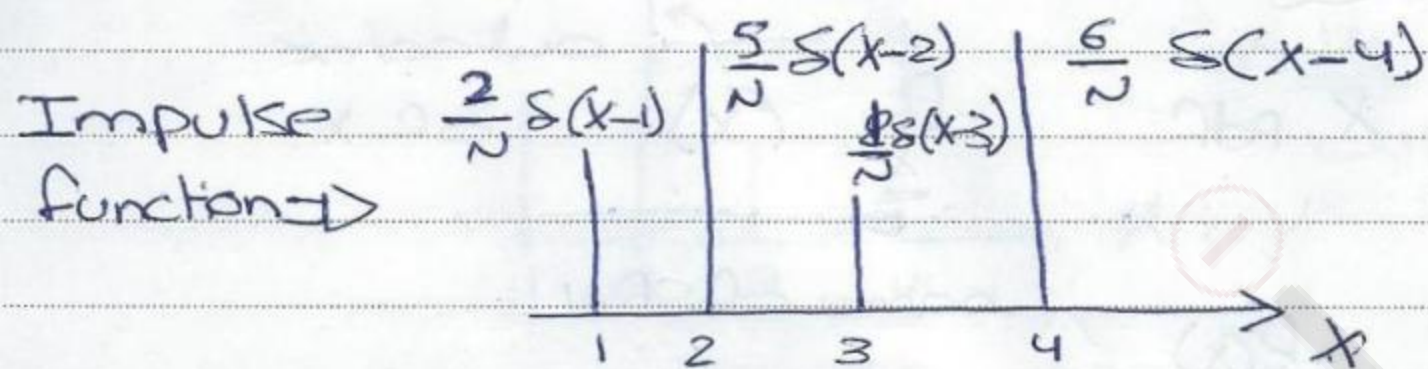
$$\boxed{2} \Pr(X = x_0) = \int_{x_0^-}^{x_0^+} f_X(x) dx$$

$$\Pr(X = x_0) = 0$$

for cont. RV

لا يفرق بين
 على رفق كبير
 بس انا
 non
 لافس
 ال
 لا
 صفر

For discrete $P_r X = X_0 \neq 0$



$$P_r(X=1) = \frac{2}{14}$$

المصفوفة الاحتمالية

Summation of discrete PDF

$$f_x(x) = \frac{2}{14} \delta(x-1) + \frac{5}{14} \delta(x-2) + \frac{1}{14} \delta(x-3) + \frac{6}{14} \delta(x-4)$$

* Probability distribution function PDF

[3] $F_x(x) = \int_{-\infty}^x f_x(x) dx$

محيط x من $-\infty$ الى x

$$\begin{aligned} P_r(X_1 \leq X \leq X_2) &= \int_{X_1}^{X_2} f_x(x) dx \\ &= \int_{-\infty}^{X_2} f_x(x) dx - \int_{-\infty}^{X_1} f_x(x) dx \\ &= F_x(X_2) - F_x(X_1) \end{aligned}$$

[4] $F_X(x_0) \geq 0$ $0 \leq F_X(x) \leq 1$

$F_X(x)$ is a non decreasing function.

→ سو تو دایمی

$\int_{-\infty}^{\infty} f_x(x) dx \rightarrow +ve$ & all quantities infinite & range.

[Always \leadsto Full is positive]

هل يقدر الله عليه

$$f_X(x) = \frac{dF_X(x)}{dx}$$

5
 certain (غير مضمّن) الأمانة
 conditions

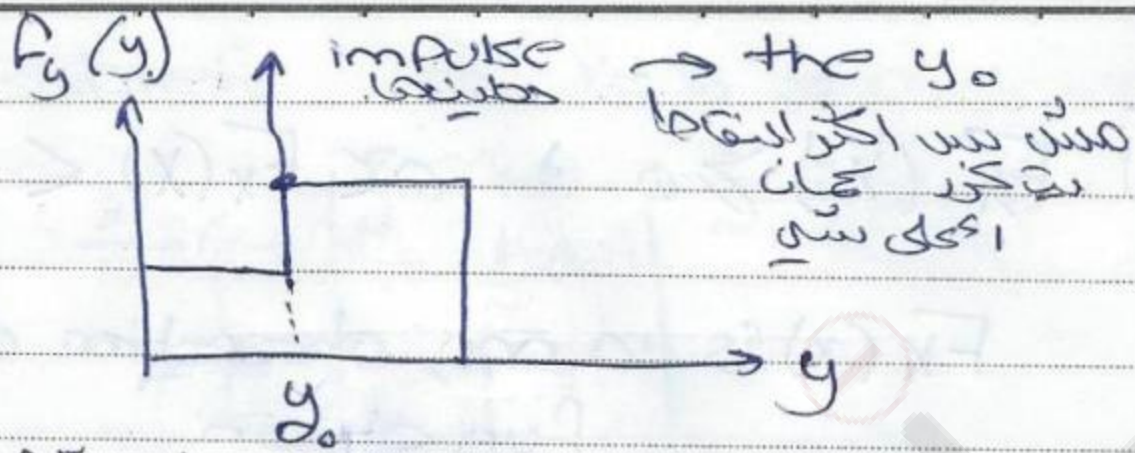
conditions

محمد بن عبد الله

↳ function μ is Σ ip \otimes
pdf

tu \leftarrow is is is

Finite range \leftarrow
bounded \leftarrow



Pure mathematics it's continuous

في اوجه من الهندسة

everywhere & not differentiable

والسبب في واحد من شي

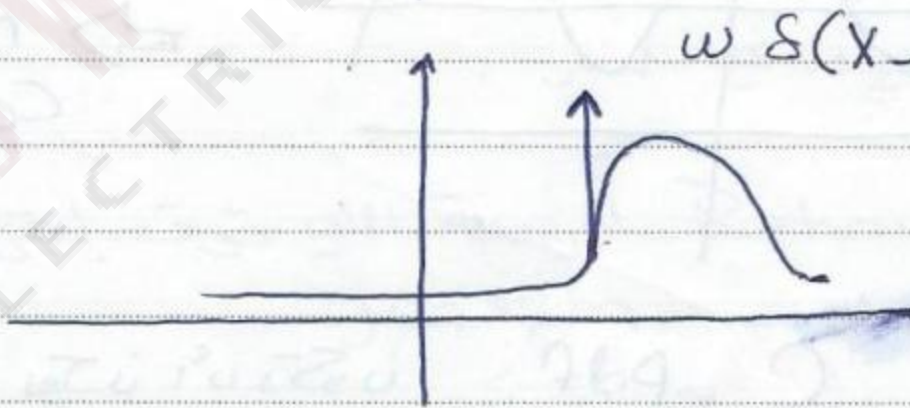
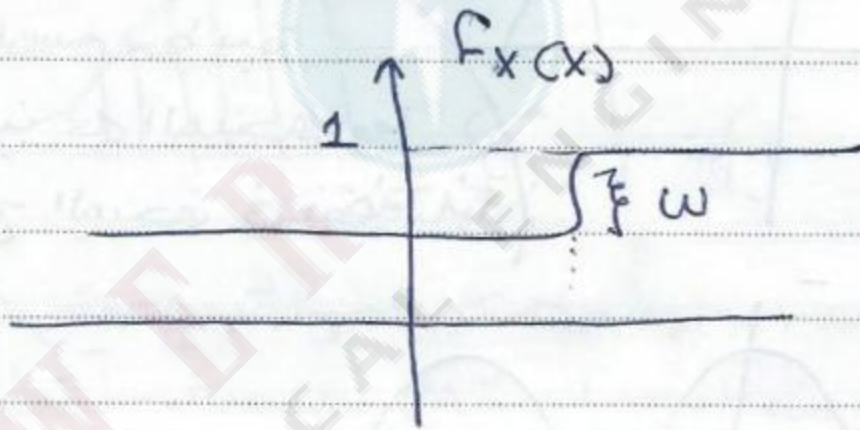
Function

$$1 - \Pr(x_0 \leq x \leq x_1) = F_x(x_1) - F_x(x_0)$$

$$F_x(-\infty) = 0$$

$$F_x(+\infty) = 1 = \int_{-\infty}^{\infty} f_x(x) dx = 1$$

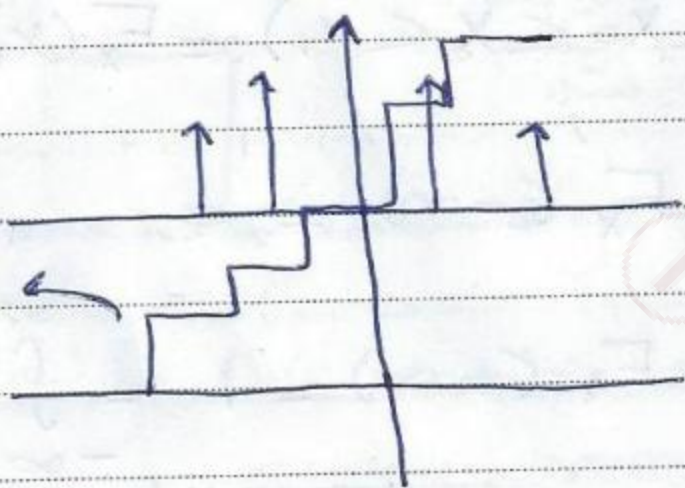
2- $F_x(x)$ is a non decreasing function
 zero or undefined في أي نقطة



المشتقة
 الثانية
 نقطة
 impulse

الرقم pdf كان يعبر ب impulse في بداية الـ
 Prob و انتقال دونه لـ weight
 الـ impulse

مُسْتَوِيَّةُ الْإِمْپُولْسِ



⇒ Convex

(الف رسم خط بين نقطتين على المنحنى وما يقع المنحنى في نقطة بينهما)



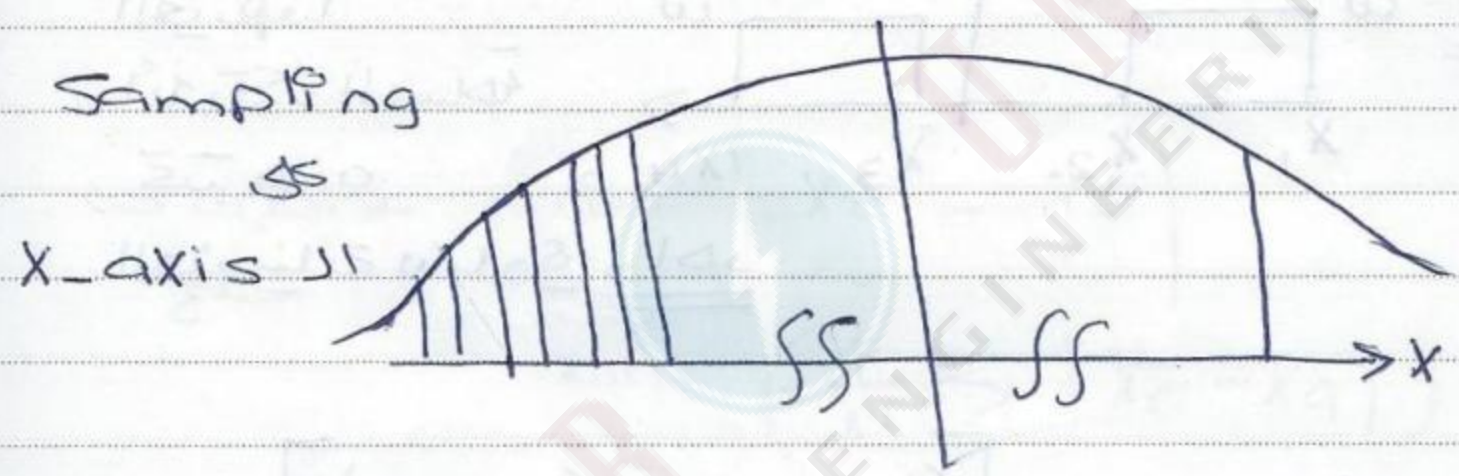
⇒ non Convex

لا يكون المنحنى PDF ؟ نعم في حالة non-convex
 انما يكون Convex

مساواة $f_x(x) = \frac{dF_x(x)}{dx}$ \Rightarrow $\frac{d^2 f_x(x)}{dx^2}$

← ينادى ال density
لانه ال Variables اللي متقاطل مداهم
ال behaviour بيقم مش رح يكون Smooth
له ال prob. مش رح تكون homogenous
طالماي مش رح تكون العلاقة خطية

(ال prob هي تكمل ال density)



← يقسم ال Cont لفترات صغيرة
لانه يعرف انه احتمال حدوث نقطة
سواء هي صفر

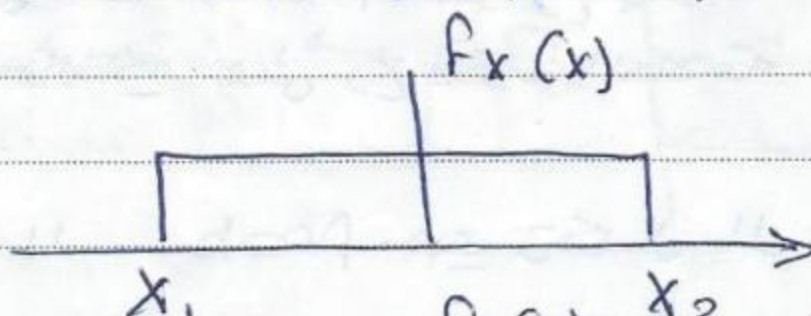
← ال Behaviour للرسعة الي فوق اقرب
اسم ال gaussian
رح نشوف بعدين كيف

* Examples

(مثال بالأمثلة Ex ليس
لأهميتهم شرحاً
كل شيء كال

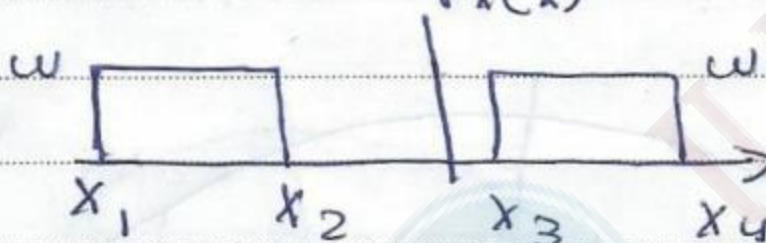
II Uniform distributed RV

Fig ①



يُجب أن
تكون
Bounded

كأن
لو كانت
مقطعة

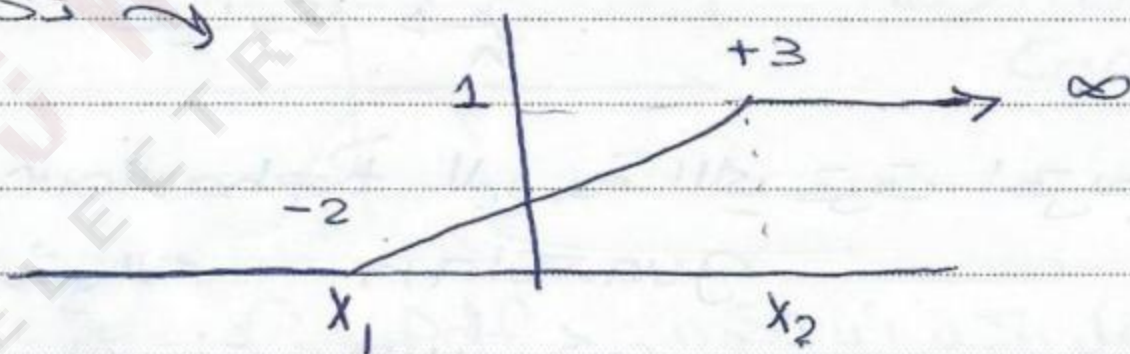


التي فيها
أن تكون المساحة
تحت هذه

المنحنيات متساوية واحد

$$\text{area} = w [(x_2 - x_1) + (x_4 - x_3)]$$

Fig ①



نسبة استجابة أقل من 5 + 9 %100

كل النسبة
التي
Pdf

$$P_X(X \leq 1) = \int_{-\infty}^1 f_X(x) dx = \int_{-2}^1 \frac{1}{5} dx$$

$$= \frac{3}{5}$$

على
الرابعة ← $\Pr(X \leq 1) = F_X(1) = 0.6$
الثانية

PDF $\Pr(-1 \leq X \leq 1.5)$

$$= F_X(1.5) - F_X(-1)$$

$$= \frac{3.5}{5} - \frac{1}{5} = \frac{2.5}{5} = 0.5$$

الفرد كن
الصح $\min |x_e - x_a|$

$$\min \left(\frac{1}{N} \sum |x_e - x_a| \right)$$

look
like
average

we called it L_∞ Norm

mean
square
error

$$mse = \frac{1}{N} \sum (x_e - x_a)^2$$

L_2 Norm

*) أكثر measure مستخدم في الهندسة *)

* Review

normalized

Probability density function
(frequency) ← مثال استمراري
لكل نقطة على outputs

وإذا كان Continuous فكل نقطة
حقيقة ال Prob = 0 توقفا Zero

So in practical → we need to find
prob to the point
in a range

Ex8

range between

x_1 & x_2

Lec # 4

I) * Uniform random variable

a - Uniform RV

b - discrete Uniform

probability density function

R.V $X \rightarrow$ دافعا على
ال Horizontal axis

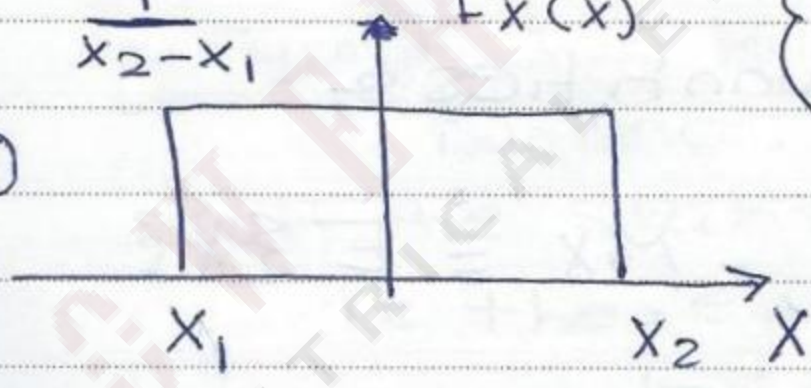
outcomes \leftarrow axis

Horizontal axis \rightarrow out comes (R.V)

vertical axis \rightarrow دافعة خاصة من
R.V خواص هاد ال

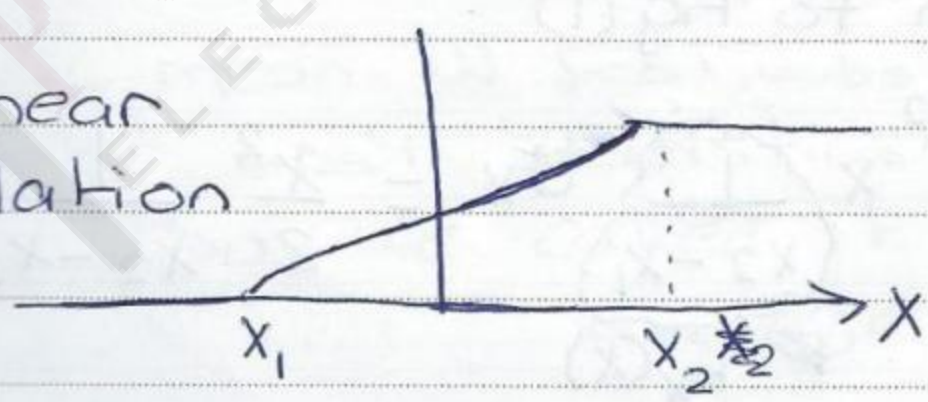
$\frac{1}{x_2 - x_1}$ $f_X(x)$ { خاصية من خاصية
الاحتمالية

Fig ①



ال Law
 \downarrow
Probability density function

linear relation



$$Pr (x_i \leq X \leq x_j)$$

$$= \int_{x_i}^{x_j} f_X(x) dx$$

\leftarrow The 1st operator
to Find
Pr of R.V

Expectation :-

← other operation

$$E\{x\} \triangleq \int_{-\infty}^{\infty} x \cdot f_x(x) dx$$

نصفها من $(-\infty \rightarrow \infty)$ range

x related to that Random Variable

R.V. x سبب بيتا نكس كارحين بانفانك

$f_x(x)$ ← x نصفها اسف

$f_y(y)$ اذا كان y بيتا سبب

* exam

* physical quantities :-

① mean $M_x = E\{x\}$

mean to Fig ①

$$M_x = \int_{x_1}^{x_2} x \cdot \frac{1}{x_2 - x_1} dx = \frac{x^2}{2} \cdot \frac{1}{x_2 - x_1}$$

$\frac{1}{x_2 - x_1} \triangleq f_x(x)$

$$= \frac{x_2^2 - x_1^2}{2(x_2 - x_1)} = \frac{x_2 + x_1}{2} \quad \dots \boxed{1}$$

$$\begin{aligned}
 \underbrace{E\{X^2\}}_{\substack{\text{Total} \\ \text{Power}}} &= \int_{x_2}^{x_1} x^2 f_x(x) dx \quad \rightarrow \text{Free variable} \\
 &= \int_{x_1}^{x_2} \frac{x^2}{x_2 - x_1} dx = \frac{x^3}{3(x_2 - x_1)} \Big|_{x_1}^{x_2} \\
 &= \frac{x_2^3 - x_1^3}{3(x_2 - x_1)} \quad \text{--- [2]}
 \end{aligned}$$

From [1] This is the statistical mean.
 لو كانا هذه الأرقام not Uniform

رج يتغير مش رج يطلع الجواب حاصل مجموع
 2

حالة إحصائية متناقص التواتر مع
 Numerical average

But the statistical average
 is the expectation of X
 (μ_X)

{
 ٥ mean وصف إحصائي لا
 ال Statistics إحصائي
 So, we called it the true
 average
 }

في حالة ال Uniform متساوية
 ما في فرق

From [2] certain outcome
of the R.V

وإحداثياتنا بالبرازيل R.V إلى ربح نقاط
{ numerical } mathematical
{ Random var. }

كشأن هيل منقدر نجردها أو نخرجها
ونطبق عليها قوانين الرياضيات إلى صفرها -
الترتيب ، تكعيب

* The expectation usually give us
a number

* what is the expectation of
something square?

Some thing $\xrightarrow{\text{عبارة}}$ number $\xrightarrow{\text{وحدات}}$ voltage
is

So, the expectation of
voltage square is power

② σ_x^2 Variance \rightarrow قوته تتوزع الى signal حول المركز تبعها

$$\sigma_x^2 = E \{ (x - \mu_x)^2 \}$$

$$mse = E \{ (x - x_e)^2 \}$$

mean square error Variance سمي به بال

إذا افترضنا $\sigma_x^2 = mse$

then النتيجة =

linear operator \leftarrow

$$E \{ \alpha \} = \frac{\int \alpha f_x(x) dx}{\int f_x(x) dx}$$

$$E \{ \alpha \} = \alpha$$

$$E \{ (x - \mu_x)^2 \} = E \{ x^2 - 2\mu_x x + \mu_x^2 \}$$

$$= E \{ x^2 \} - 2\mu_x E \{ x \} + E \{ \mu_x^2 \}$$

$$= E \{ x^2 \} - 2\mu_x^2 + \mu_x^2$$

$$\boxed{\sigma^2 = E \{ x^2 \} - \mu^2 x}$$

$$E \{ x^2 \} = \sigma_x^2 + \mu_x^2$$

\downarrow
AC
power
 V_{RMS}^2

\downarrow
d.c
Power
 V_{dc}^2

* notes

اگر شیفت دل از R.V
الکیموئی از range بقیه قلیل
میانها از Variance بقیه رنج رکن قلیل
از اکان از range بقیه از Variance بقیه

from this concept
↳ the deterministic number
کم از Variance بقیه

Zero
Random variables
فقط اکان و کان

کم از Variance

کما مکتوبه از quantity

اقریب deterministic کم از error
اقل

R.V ← لایکن Signal بقیه اقریب من

True RMS values ← Statistics بقیه

True dc value

[3] n^{th} moment $\xrightarrow[\text{super script}]{\text{subscript}}$

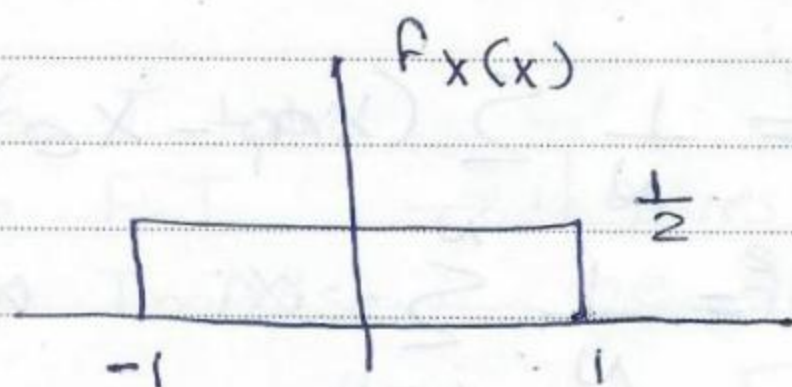
$$m_n = E \{ x^n \}$$

$$= \int_{-\infty}^{\infty} x^n f_x(x) dx$$

for uniform R.V. $X \in (-1, 1)$

المساحة الكلية

نكفي بكل المعلومات



Special case
symmetrical
around
y-axis

Find the n th moment

$$m_n = \int_{-1}^1 \frac{x^n}{2} dx = \frac{x^{n+1}}{2(n+1)} \Big|_{-1}^1$$

$$= \frac{1}{2(n+1)} - \frac{(-1)^{n+1}}{2(n+1)} = \begin{cases} 0 & n \text{ odd} \\ \frac{1}{n+1} & n \text{ even} \end{cases}$$

second moment

$$m_2 = \sigma_x^2 + \mu_x^2$$



لو غير التوزيع
بشكل الجواب الكلي

معنا صيغ

ما يعرف شي ليس الكامل
بغير اعداد

* لو كانت $f_X(x)$ not uniform

$$\sigma_x^2 = \frac{1}{3}$$

The 3rd moment, zero

original signal \leftarrow PDF
SS F.T \leftarrow

yes, we called it spectrum

$$mse = \frac{1}{N} \sum (x_{a_i} - x_e)^2$$

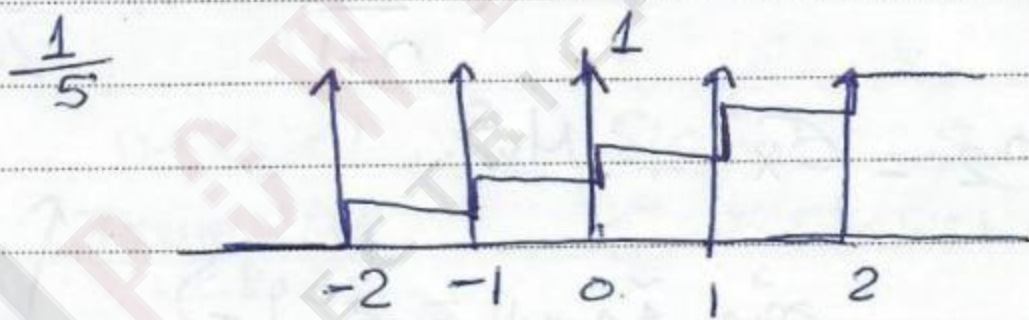
$$E^2 = \frac{1}{N} \sum_{i=1}^N \alpha_i \quad \alpha_i \geq 0$$

Find the optimal α_i 's?
الأمثل

Solution:

$$\alpha_i = \alpha_j \quad \forall i, j$$

b- discrete Uniform



$$\frac{1}{5} \delta(x+2)$$

$$M_X = E\{X\} = \int_{-2}^{+2} \frac{1}{5} x = 0$$

* Variance is the same

* the moment has changed

$$\int_{-\infty}^{\infty} \delta(x - x_0) \cdot g(x) dx = \begin{cases} g(x_0) \\ 0 \end{cases}$$

لو كانت
الفترة
كلها خارج
الـ x_0

when I take
the F.T \rightarrow it gives
to Impulse me describe
F.T

From [2] certain outcome of the R.V

وإحداثيات البداية أو R.V إلى نقطة
{ numerical } mathematical
Random var.

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Some thing $\xrightarrow{\text{عبرة عن}}$ number $\xrightarrow{\text{وهذا الرقم المميز}}$ Voltage

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mean square error \rightarrow Variance

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then النتيجة = نفس

linear operator \leftarrow

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1

$$E \{ \alpha \} = \alpha$$

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\downarrow
AC power
 V_{RMS}^2

\downarrow
D.C power
 V_{dc}^2

* notes

انکشاف دل ار R.V

الک موډل ار Range بڼه ډیر ښه

موډل ار Variance بڼه ډیر ښه ډیر ښه
ازا کان ار Range ډیر ښه Variance ډیر ښه

from this concept

the deterministic number

کم Variance بڼه ډیر ښه

Zero

Random
variables

ډیر ښه وکړم

Varianse ار ډیر ښه

کله ښه ډیر ښه Quantity

اډرډل deterministic کله ښه ار ډیر ښه

R.V له ډیر ښه Signal ډیر ښه

True RMS values Statistics بڼه ډیر ښه

True dc value

[3] n^{th} moment $\xrightarrow{\text{subscript}} \text{or} \xrightarrow{\text{super script}}$

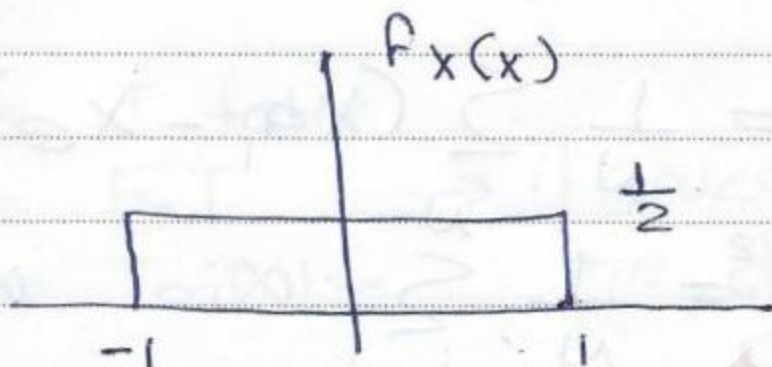
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الموتى الحقة

نكفنى بكن المعلومات



→ Special case
Symmetrical
around
Y-axis

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second moment →

$$m_2 = \sigma_x^2 + \mu_x^2$$



لو خيرة الرسمة موتى
بطل الجواب الى اليمين
معنا صفر

ما يعرف شي بس التكامل
بغير اعداد

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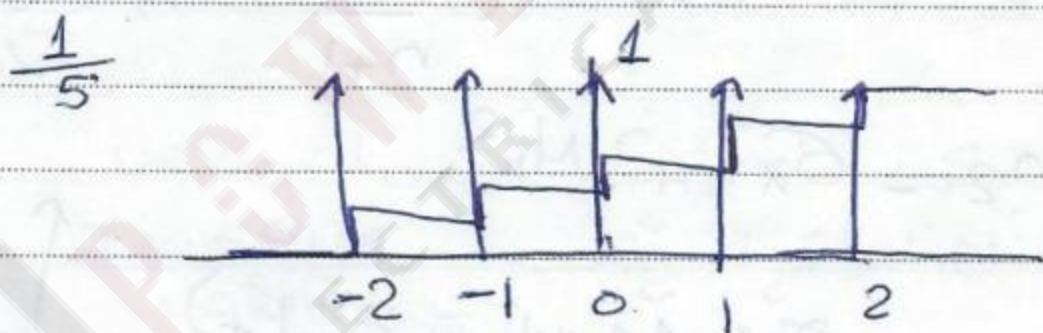
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لو كانت
الفترة
كلها خارج
الـ x_0

when I take
the F.T \rightarrow it gives
to Impulse me describe
F.T

فإنه
is data
compression
ن

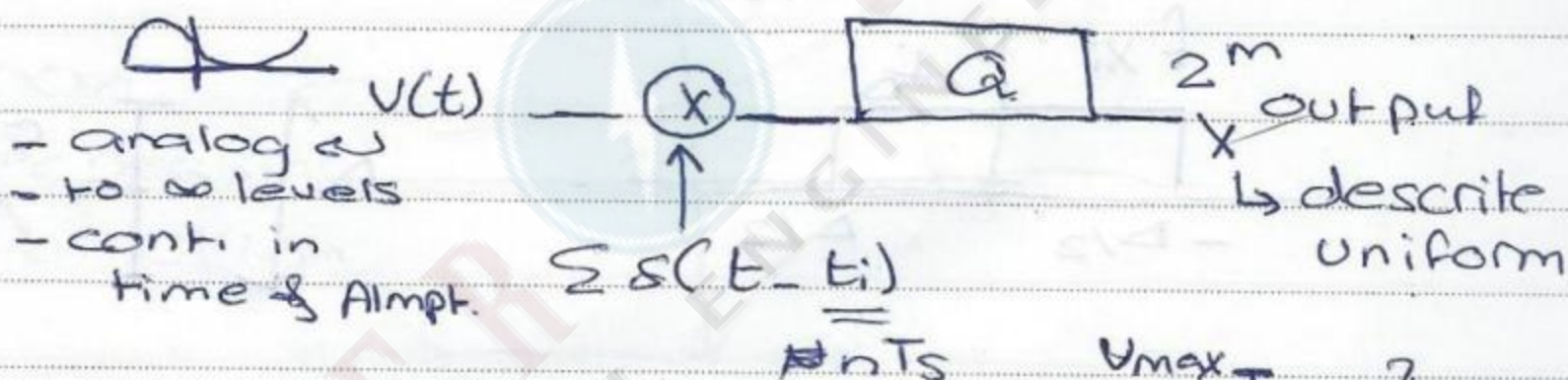
- 1 - Random Variable
- 2 - Exponential R.V

uniform \rightarrow Δf \rightarrow application on data compression

more uniform
جيد

A/D converter

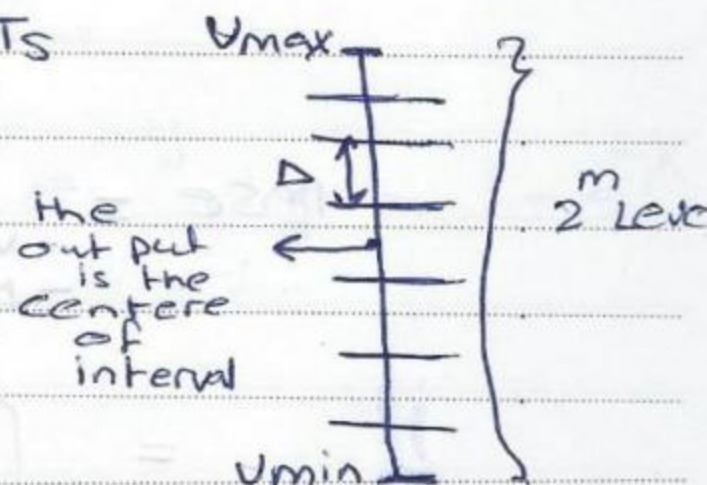
|||||



time axis \rightarrow Δt

describe Δ axis

Signal \rightarrow equal intervals



if signal random \rightarrow output random

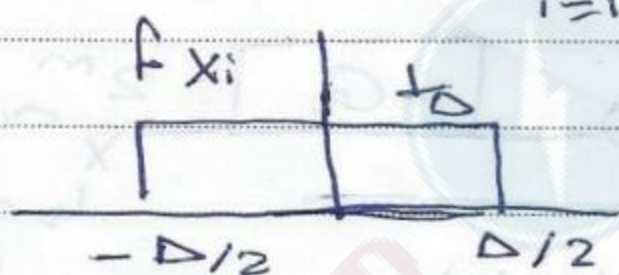
$P_X(x)$

$P_U(u)$



$$P_X(x) = \frac{1}{v_{\max} - v_{\min}}$$

$$f_X(x) = \sum_{i=1}^{2m} \frac{1}{2m} \delta(x - x_i)$$



output
 Δx

$$mse = \int_{-\Delta/2}^{\Delta/2} x^2 f_X(x) dx$$

$$= \int_{-\Delta/2}^{\Delta/2} \frac{x^2}{\Delta} dx = \frac{x^3}{3\Delta} \Big|_{-\Delta/2}^{\Delta/2} = \frac{\Delta^2}{12}$$

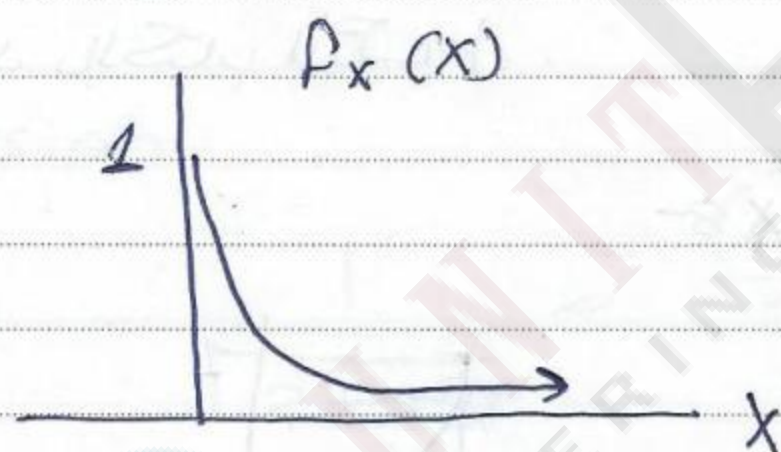
→ هــى النـتـيـجـة مـاتـمـيـوـهـا لـلمـسـئـل

$$f_X(x) = x e^{-x} u(x)$$

$$\int_0^{\infty} f_X(x) dx = 1$$

$$1 = -x e^{-x} \Big|_0^{\infty} = x$$

$$f_x(x) = e^{-x} u(x)$$



non
decreasing
function



$$F_x(x) = \int_0^x e^{-y} dy = 1 - e^{-x}$$

⊗ Application 8

→ Internal usage

→ Arrival rate of packet Transmission

تردد واستعداد

I can find Mean & variance

$$M_x = \int_0^{\infty} x e^{-x} dx$$

$$\sigma^2 = E \{ (x - \mu_x)^2 \} = m_2 - \mu_x^2$$

$$m_2 = \int_0^{\infty} x^2 e^{-x} dx$$

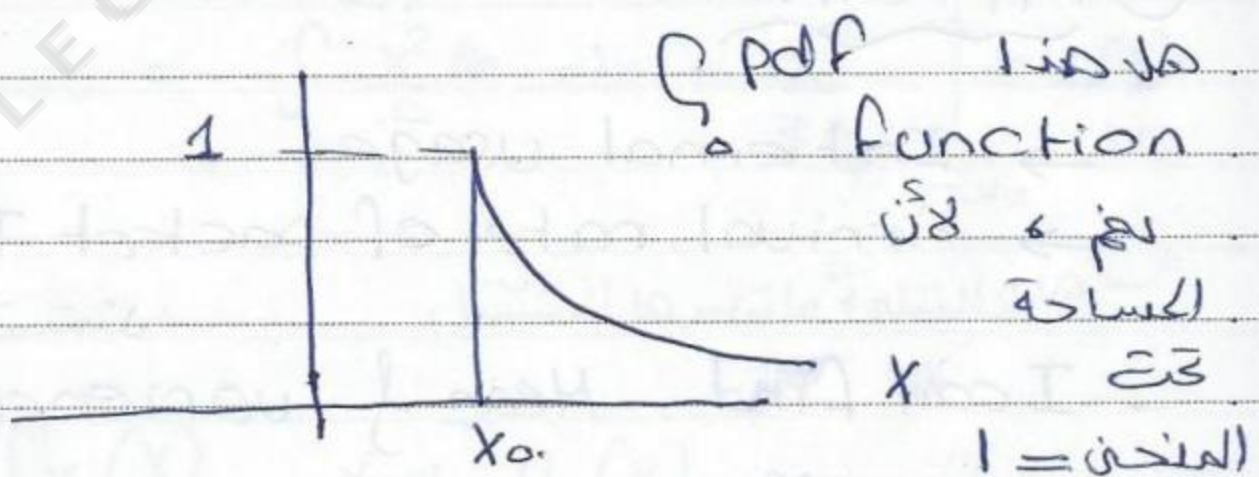
← موجود بالكتاب الفصل الأول

Ex 8



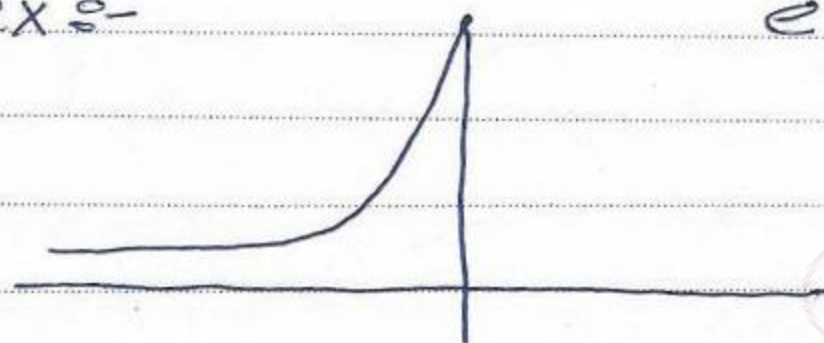
حل كل x بحد $(x - x_0)$
مستطابقاً لمنحنى موجبة

$$P_x(x) = e^{-(x-x_0)} u(x-x_0)$$



ex:-

$$e^x u(-x)$$



الفكرة انه

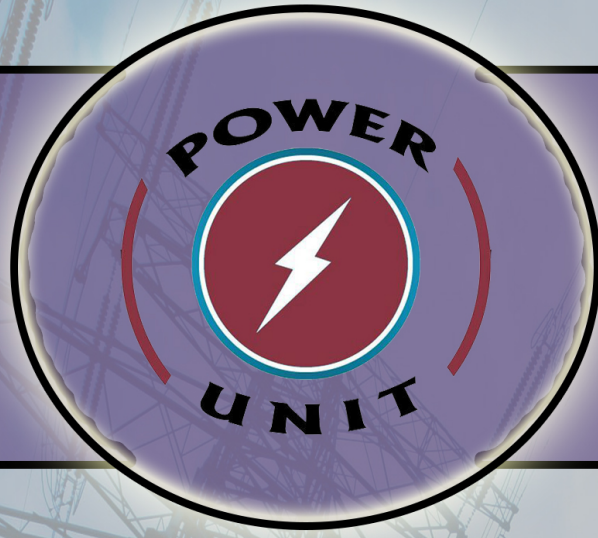
المساوية 1

3 - Gaussian

$$f_X(x) = \frac{1}{\sqrt{2\pi\sigma_x^2}} e^{-\frac{(x-\mu_x)^2}{2\sigma_x^2}}$$

⇓

حفظ



Prob Notebook Dr. Jamal Rahal

By . Farah Abussamin

بِأفكارنا نُبدع

second week

Lec * 6

Conte

[3] - Gaussian R.V

→ Pdf f_n

← مشهور

يحدد نوع

ال R.V

← كل شيء في الطبيعة إذاً شيء

Random Behavior

gaussian

Noise → The Random movement of electronics in the material (as air).

Noise (Thermal noise)

$V_m(t)$ = noise process
amplitude is gaussian

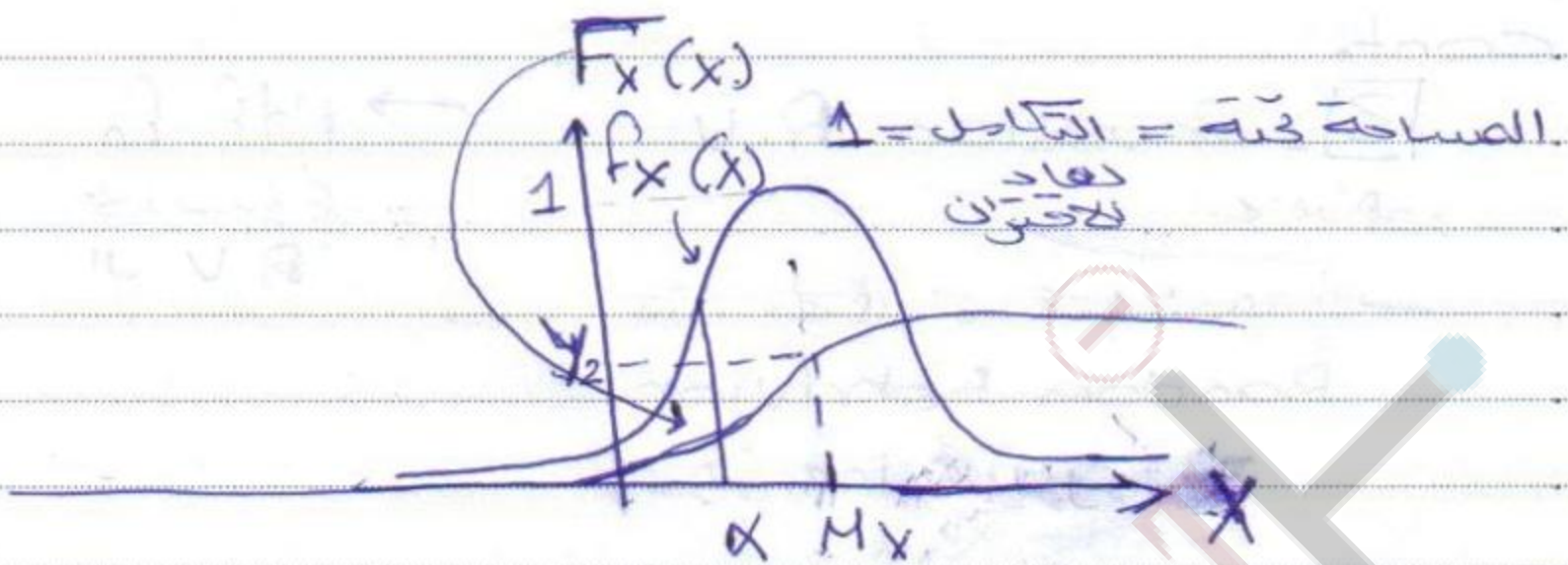
R.V.

Gaussian R.V \equiv Normal distribution

$$f_X(x) = \frac{1}{\sqrt{2\pi\sigma_X^2}} e^{-\frac{(x - \mu_X)^2}{2\sigma_X^2}}$$

$N(\sigma_X^2, \mu_X)$ → تسمى من الكمية

$N(3, -7)$ مثال



$$F_X(\alpha) = \Pr(X \leq \alpha) = \int_{-\infty}^{\alpha} f_X(x) dx$$

منطقة تحت
المنحنى
من الاحتمالات

$$Q(x) \triangleq \int_{-\infty}^x \frac{1}{\sqrt{2\pi}} e^{-\frac{t^2}{2}} dt = N(1,0)$$



special case

→ normal distribution

when $M_X = 0$ & $\sigma = 1$

$$F_X(\alpha) = \int_{-\infty}^{\alpha} \frac{1}{\sqrt{2\pi}\sigma_X} e^{-\frac{(x-M_X)^2}{2\sigma_X^2}} dx$$

let $u = \frac{x - M_X}{\sigma_X}$

$$du = \frac{dx}{\sigma_X}$$

$$F_X(\alpha) = \int_{-\infty}^{\frac{\alpha - M_X}{\sigma_X}} \frac{1}{\sqrt{2\pi}} e^{-\frac{u^2}{2}} du$$

* Usually noise is zero mean noise *

Exe Find $F_x(0.3)$?

given $\sigma x^2 = 3$, $\mu x = 0$
Standard deviation

$$F_x(0.3) = Q\left(\frac{0.3 - 0}{\sqrt{3}}\right) \\ = Q(0.1732) \\ = 0.46017$$

approximation

$$Q(x) \approx \left[\frac{1}{(1-a)x + a\sqrt{x^2 + b^2}} \right] e^{-\frac{x^2}{2}} \frac{1}{\sqrt{2\pi}}$$

* حفظ *

$$a = \frac{1}{\pi}, \quad b = 2\pi$$

* يَكُونُ اَنْق كَمَا كَانَتْ اَلْاَرْغَمَنْتَس
لَبَقَّة اَلْاَرْغَمَنْتَس اَلْاَرْغَمَنْتَس

$$Q(0) = \frac{1}{2} \rightarrow -\infty \rightarrow \infty$$

رَضَف اَلْمَسَاحَةِ

$$Q(-x) = 1 - Q(x)$$

* Remember

\bar{b}_x related to ac power

M_x related to dc power

$$m_n = E \{ x^n \} = \int_{-\infty}^{\infty} x^n \cdot f_x(x) dx$$

← با قدر الجواب

Integral ال

So

Function sinusoidal
ليس sinusoidal
موجبات

→ moment generating
function $\phi(x)$

3rd moment = 0 من أجل
حاصل

Gaussian!
التي هي
to the 2nd
order

HW # 1

$$g(t) = \frac{1}{\sigma \sqrt{2\pi}} e^{-\frac{(t - \mu)^2}{2\sigma^2}}$$

exactly

the same

لكن بترتيب مختلف

موجبات

Find $F.T \{ g(t) \} = G(f)$

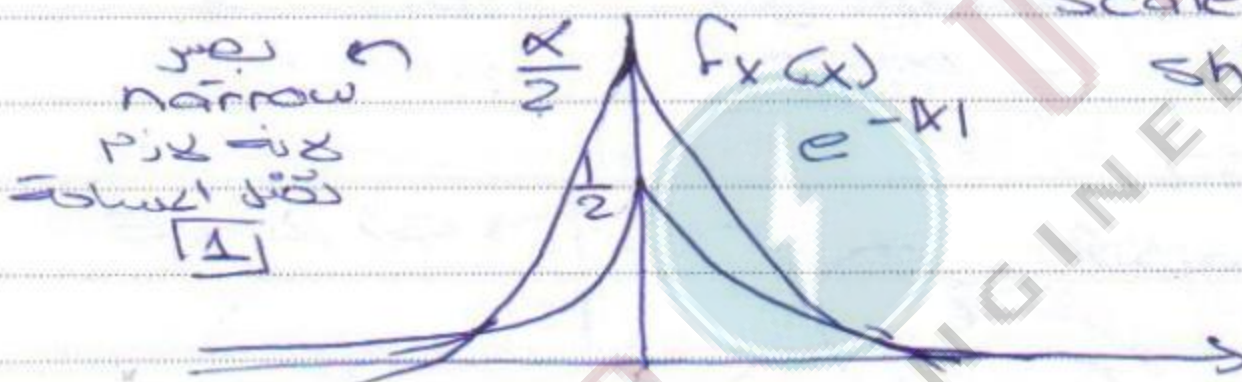
4- Laplacian

$$f_x(x) = \frac{1}{2} e^{-|x|}$$

$$f_x(x) = \frac{\alpha}{2} e^{-\alpha|x|} \rightarrow \text{this is general}$$

$$f_x(x) = \frac{\alpha}{2} e^{-\alpha|x-\mu|} \rightarrow \text{more general}$$

ليس كيرتة ال Scale
و كيرتة ال Shift



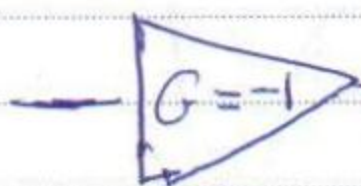
* Video signals

Audio signals \rightarrow Gaussian ليس كيرتة فيه
لكن شبيه فيه

double
sided

exponential
ليس كيرتة فيه
square

Audio



مستقيم ليس فيه
الكهرباء
التيارة
Symmetrical
around
zero

Phase ليس له اتجاه
بإشارة الصوت لكنه
بإشارة الصورة

Phase الانسار الى صفا
منظمة بال 3rd order

$$\alpha = \text{مقلوب}$$

$$\sigma_x \text{ ال}$$



لفايزيد ال correlation ← يقل ال Band width

Laplacian :-

$$f_X(x) = \frac{\lambda}{2} e^{-\lambda |x - \mu|}$$

Audio Signals

Video Signals

For outdoor

→ * Rician • Ray light • log normal gaussian

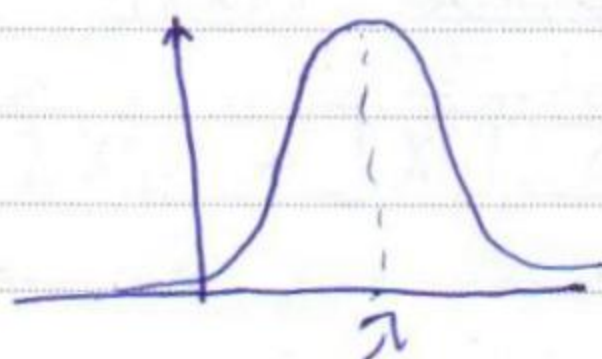


For indoor wireless

→ * Nakagami • Erlang weibul

* Poisson describe

Erlang traffic



voice

communication

خلوي أو الأرضي
أو سيرا السيارات

حزمة من
الأمور →

Packet at least zero

→ exp

Lognormal

$$y = \text{Log } |x|$$

Random variables &

$$X \rightarrow f_X(x), F_X(x)$$

$$\rightarrow \underline{Pr(X_0 \leq X \leq X_1) = F_X(X_1) - F_X(X_0)}$$

↓
This is represent subset of the total outcome set

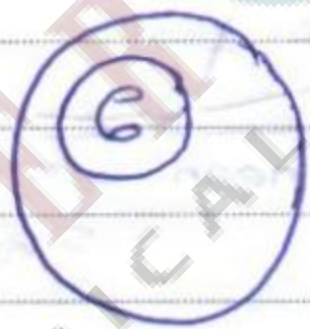
G event

Pr
تقدير
الاحتمال

أو النتيجة

كـ هـ

event



Range

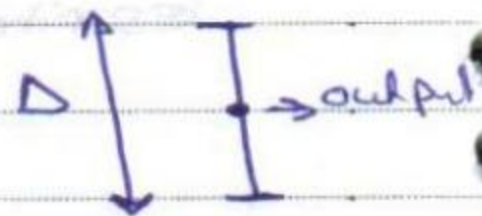
$$Pr(G) = \int_{X_0}^{X_1} f_X(x) dx$$

Local mean &

$$M_x = \int_{X_0}^{X_1} x f_X(x) dx$$

أنتج

A to D converter



$$m_1 = E\{x\} = \mu_x$$

Linear operator $\hookrightarrow E\{g(x)\} \stackrel{?}{=} g(\mu_x) \rightarrow$ yes, if $g(x)$ is linear

$$\int \frac{dF(x)}{dx} dx \stackrel{?}{=} \frac{d}{dx} \int F(x) dx$$

\rightarrow yes

$$E\{g(x)\} = \int_{-\infty}^{\infty} g(x) f_x(x) dx$$

* Exe -

$$g(x) = a + bx$$

$$E\{g(x)\} = \int (a + bx) f_x dx$$

$$= a + b \mu_x$$

if $g(x)$ is linear

$$E\{g(x)\} = g(\mu_x)$$

* Exe

$$g(x) = x^2$$

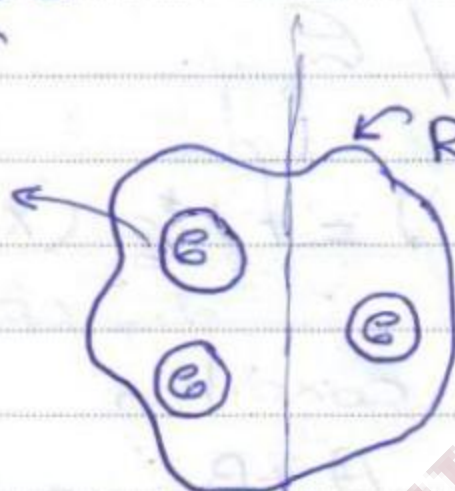
$$E\{x^2\} = \int x^2 f_x dx = m_2 \neq \mu_x^2$$

non linear.

x events :-

Single
R.V

event



Mathematical

Logical applied to the outcome

Random variable

$$X > 3$$

$$X_1 \leq X \leq X_2$$

$$X_1 \leq X \text{ } \& \text{ } X \geq X_2 \text{ overlap}$$

$$X_1 \leq X \text{ or } X \geq X_3 \text{ Union}$$

two Random Var X, Y

at same point

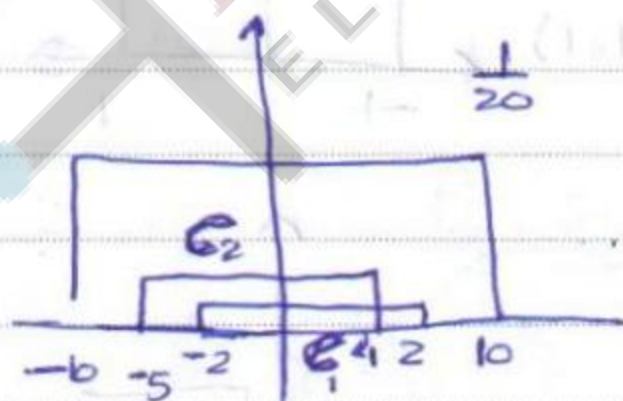
$$P_c(c) = \int_C f_X(x) dx$$

Independent

↳ no intersection
dependent

↳ Intersection

Ex:- Uniform R.V $X \in (-10, 10)$ find the Prob. of $-2 \leq X \leq +2$ OR $-3 \leq X \leq 1$



$$= \Pr(G_1 \text{ or } G_2) = \frac{5}{20}$$

$$\Pr(X \leq -5) \text{ or}$$

$$\Pr(X \geq 5)$$

$$\int_{-10}^{-5} f + \int_5^{10} f$$

نحوه R.V. جدید

Conditioned R.V

$$G_1 / G_0$$

$$f_{X'}(x') = f_{X|G_2}(x|G_2)$$



condition

$$A \cup B = A + B - A \cap B$$

$$Pr(A \cup B) = Pr(A + B) - Pr(A \cap B)$$

$$Pr(A \cup B) = Pr(A + B) - Pr(A \cap B) \rightarrow \text{joint event}$$

$$A/B = \frac{A \cap B}{B} \text{ normalized to } B$$

$$Pr(A/B) = \frac{Pr(A \cap B)}{Pr(B)} \rightarrow \text{joint event}$$

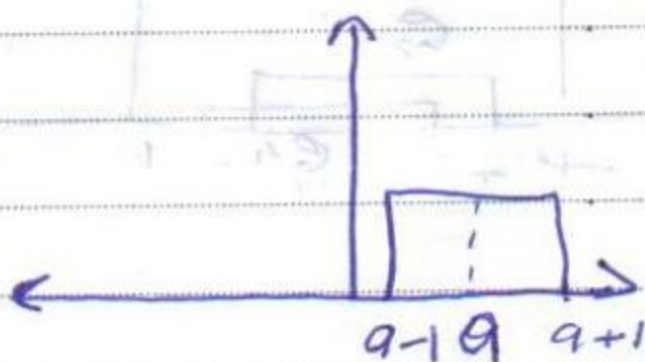
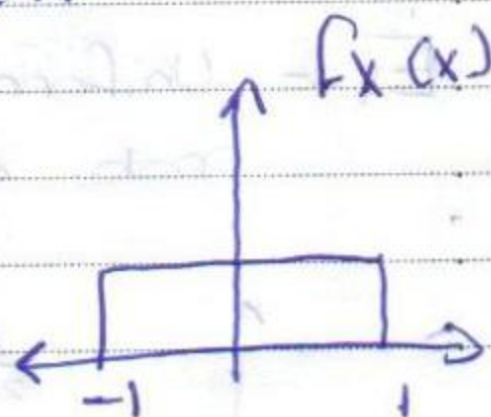
$$f_{A \cap B}(A, B) = f_1(A/B) \cdot f(B)$$

R.V. \leftarrow constant \rightarrow

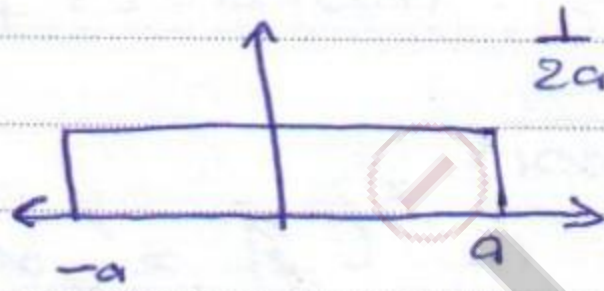
Ex: $Y = X + a$

$$f_Y(y) = f_X(x/a)$$

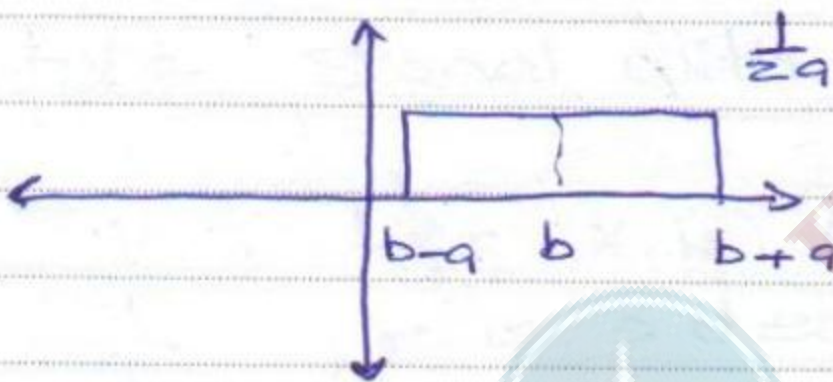
$$X \sim \text{uniform } \in (-1, 1)$$



Ex- $y = a \cdot x$



$$Z = ax + b$$



$$Pr(X(A)) = \frac{Pr(X, A)}{Pr(A)}$$

$$Pr(X, A) = Pr(X(A)) \cdot Pr(A)$$

$$A_1, A_2, A_3, \dots, A_N$$

$$\text{total Area} = \sum_{i=1}^N A_i$$

$$\sum_{i=1}^N Pr(X, A_i) = Pr(X) \Rightarrow \text{total Pr low}$$

$$Pr(t) = \sum_{i=1}^N Pr(X/A_i) \cdot Pr(A_i)$$

↪ Total probability low

noise + constant \rightarrow constant deterministic

R.V. غير معلوم $1/100$

* Ex 8 Signal with noise

Let X is $N(\sigma_x^2, 0)$

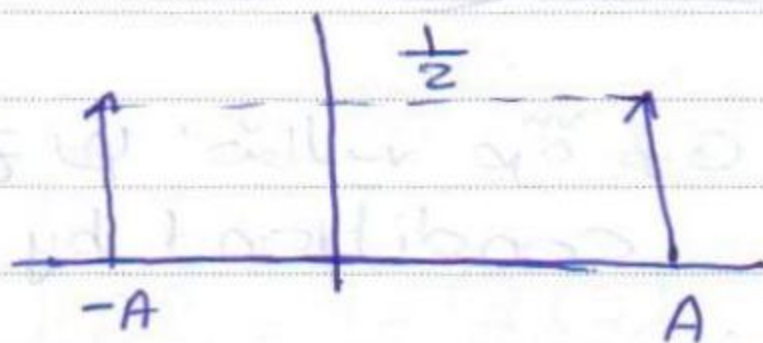
Y is a decision variable

Find the error rate of
error event

Prob. of error

Variable \rightarrow متغير
discrete - متقطع
cont: - مستمر

Let $y \in \{-A, +A\}$

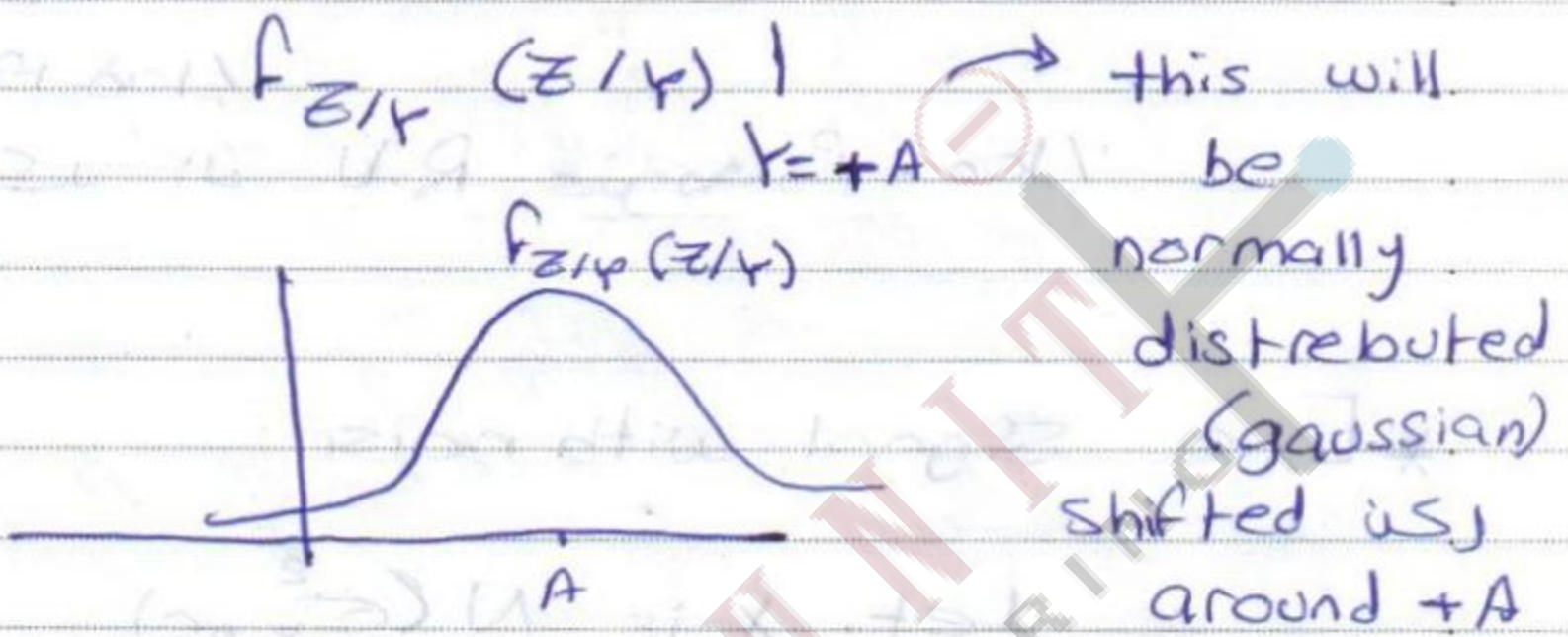


we estimate
 y from Z
such that

$$Z = Y + X$$

decision \leftarrow Y \leftarrow noise X

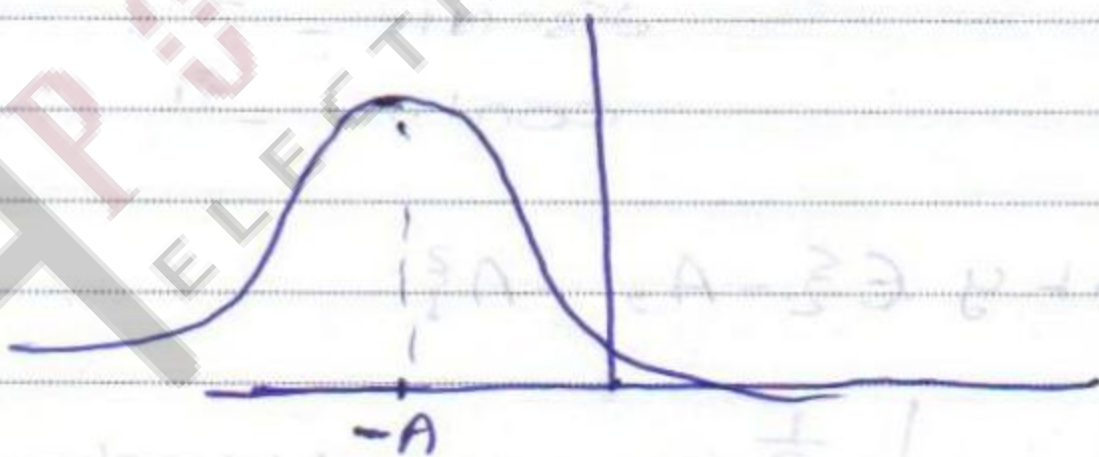
→ if $y = +A$ what is the prob?



$$f_{z/y}(z/y) |_{y=+A} = \frac{1}{\sigma_x \sqrt{2\pi}} e^{-\frac{(x-A)^2}{2\sigma_x^2}}$$

→ if $y = -A$

$$f_{z/y}(z/y) |_{y=-A} = \frac{1}{\sigma_x^2 \sqrt{2\pi}} e^{-\frac{(x+A)^2}{2\sigma_x^2}}$$



(المتغير z إما استقالتي مرة أو متزوجة مع y conditiond by y)

~> error event when $y = +A$
and x from $(-\infty$ to $-A)$

OR

when $y = -A$
and x from $(+A$ to $\infty)$

$$P_{re} = \int_{-\infty}^{-A} f_x(x) dx = P_r(y=A) + \int_{+A}^{\infty} f_x(x) dx$$

$$P_{re} = \int_{-\infty}^{-A} f_x(x) dx \cdot P_r(y=A) + \int_{+A}^{\infty} f_x(x) dx \cdot P_r(y=-A)$$

$$= \int_{-\infty}^{-A} f_x(x) dx = Q(-A/\sigma_x)$$

$$= 1 - Q(A/\sigma_x)$$

BER \uparrow
Bit error rate

* when $A = 5V$, $\sigma_x^2 = 1$

$$BER = 1 - Q(5)$$

$$= \left[\frac{1}{\alpha(1-a) + a\sqrt{\alpha^2 + b^2}} \right] \frac{e^{-\frac{\alpha^2}{2}}}{\sqrt{2\pi}} = 2.49 \times 10^{-7}$$

$$\begin{cases} a = \frac{1}{\pi} \\ b = 2\pi \\ \alpha = 5 \end{cases}$$

~

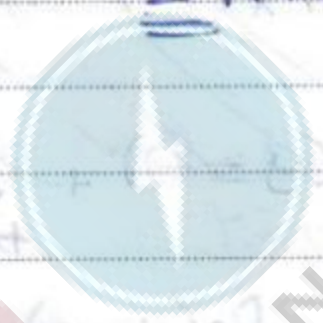
~~286~~*

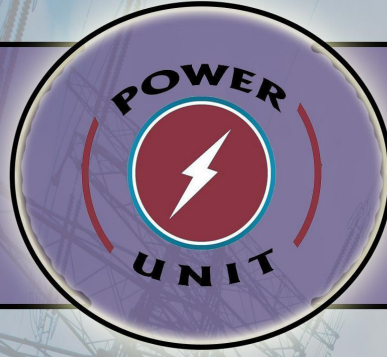
$$f(x,y) = f_{x|y}(x,y)$$

$f_y(y) \rightarrow$ constant given y

⊗ $f_{xy}(x,y)$ joint pdf

Temperature $\hat{=}$ $2R.V$
 مع الحرارة





Probability

NoteBook

Dr. Jmal Rahal

By: Farah Abu Alsamin

بأفكارنا نبدع

3rd week

Two Random variables

Joint pdf's

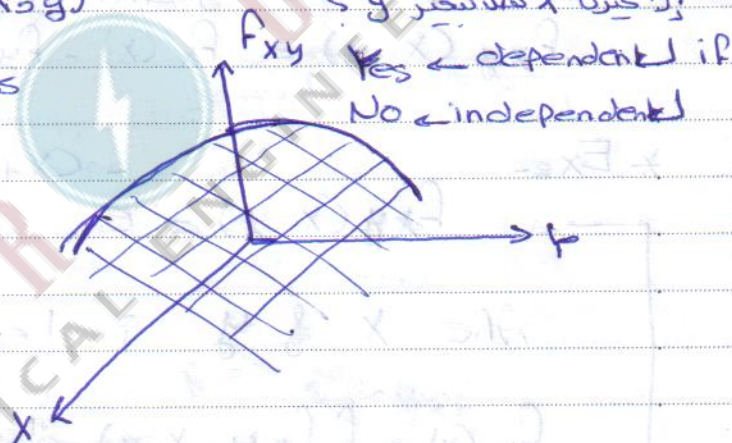
Let x & y are two random variables

$f_{xy}(x, y)$

كثافة مشتركة لمتغيرين عشوائيين

Joint
pdf

Can be written
as condition
pdf function



$$f_{xy}(x, y) = f(x/y) \cdot f_y(y) \\ = f(y/x) \cdot f_x(x)$$

dependency → متغير عشوائي يعتمد على

Volume under the surface $\int_{-\infty}^{\infty} \int_{-\infty}^{\infty} f(x, y) dx dy = 1$
the surface x, y

$$Pr(X \leq x_0, Y \leq y_0) = \int_{-\infty}^{y_0} \int_{-\infty}^{x_0} f(x, y) dx dy$$

$$\rightarrow \stackrel{\Delta}{=} F_{xy}(x_0, y_0)$$

joint
distributed
Function

Independent RV's

↳ have the joint pdf

$$f_{xy}(x, y) = f_x(x) \cdot f_y(y)$$

* Ex:-

$$f_{xy}(x, y) = e^{-(x+y)} u(x, y)$$

Are x & y independent?

$$f_x(x) = \int_{-\infty}^{\infty} f_{xy}(x, y) dy \quad \left. \begin{array}{l} \\ \end{array} \right\} \text{Marginal pdf's}$$

$$f_y(y) = \int_{-\infty}^{\infty} f(x, y) dx$$

$$f_x(x) = \int_0^{\infty} e^{-x} \cdot e^{-y} dy = e^{-x} u(x)$$

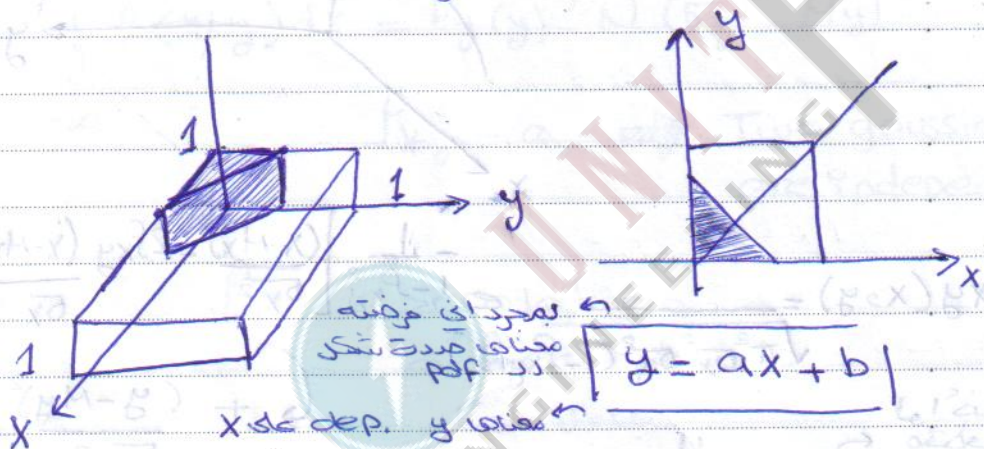
$$f_y(y) = \int_0^{\infty} e^{-x} \cdot e^{-y} dx = e^{-y} u(y)$$

$$f_x \cdot f_y = e^{-x} e^{-y} u(x) \cdot u(y) = e^{-(x+y)} u(x, y)$$

X & y are independent

* إذا كان كل المتغيرين مستقلين
Independent variables

* Ex: X, y are independent uniform
 $X, y \in (0, 1)$

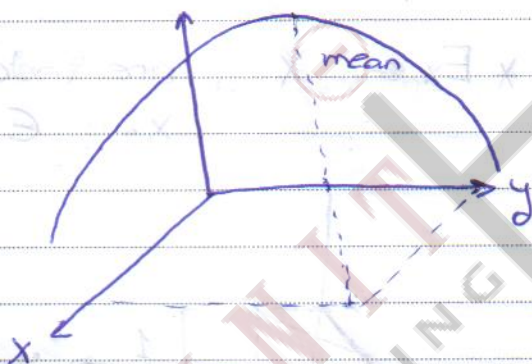


$$Pr(0.1 \leq X \leq 0.3, 0.5 \leq y)$$

$$Pr = \iint_R f_{xy}(x, y) dx dy$$

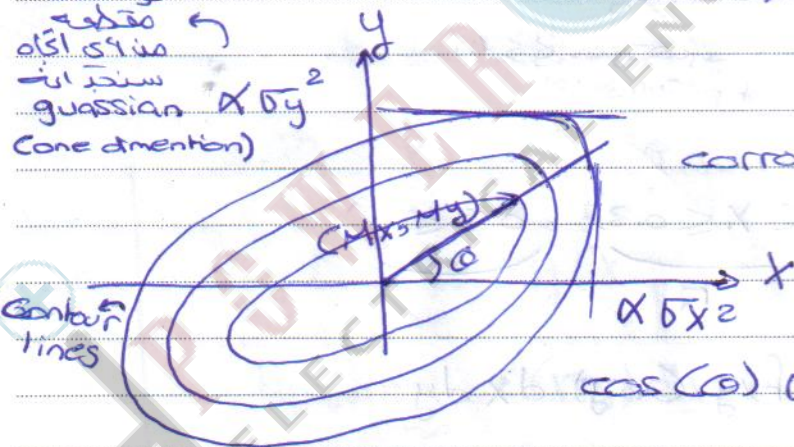
$R \in x-y \text{ plan}$

2-D Gaussian R.V



$$f_{xy}(x, y) = \frac{1}{\sqrt{\pi^2 \sigma_x^2 \sigma_y^2 (1 - \rho_{xy}^2)}} e^{-\frac{1}{2(1 - \rho_{xy}^2)} \left[\frac{(x - \mu_x)^2}{\sigma_x^2} - \frac{2\rho_{xy}(x - \mu_x)(y - \mu_y)}{\sigma_x \sigma_y} + \frac{(y - \mu_y)^2}{\sigma_y^2} \right]}$$

لو اكدنا
مقلوبة
منه الى اكد
سند ان
gaussian
(one dimension)



الميل بين correlation

$$\cos(\theta) \propto \rho_{xy}$$

→ if the relation between x & y
non-linear → usually they are
not gaussian

← إذا التشتت بأكبر x أكبر منها y
و كذلك بالعكس ل y

← الخ المستقيم الذي رسمته بفيل
new Random variables

من z

$$\int_{-\infty}^{\infty} f(x, y) dx = f_y(y) \quad N(\sigma_y^2, \mu_y)$$

$\rho_{xy} = 0 \Rightarrow$ Two gaussian are independent

ρ = correlation coefficient
معامل الارتباط

Random variable prediction

[1] Modelling \rightarrow we expect a certain Model

this model should expressed in close form.

* Ex: $X = t^2 - 5t + \log(t)$
deterministic

$$\hat{X} = X t^2 - \beta / \ln(t-1)$$

X
actual
Data

\hat{X}
model

[2] Fit the model

How to measure the goodness of this model? Find mse

$$mse = E \{ |X - \hat{X}|^2 \}$$

$$E \{ |X - \underbrace{t^2 - 5t + \log(t)}_{\text{model}}|^2 \}$$

→ minimizing the error

لـ بـشـئـة و بـسـا و بـ

بالـمـنـر و بـوـجـد قـوـة
بـوـجـد فـي m s e

Linear is the best
لـبـسـأ و بـسـأ و بـ

→ Find normalized mse

$$\text{normalized error} = \frac{\bar{E}^2}{\sigma_x^2}$$

$$y(x) = ax + b$$

mean μ
First order moment

→ Variance σ^2
Second order moment

→ From gaussian distributed we cannot predict any higher

لـ بـشـئـة و بـسـأ و بـ

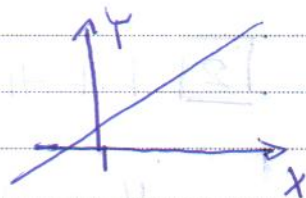
ρ = correlation coefficient

$$\rho_{xy} = \frac{E\{xy\}}{\sigma_x \sigma_y}$$

normalized

بـسـأ و بـسـأ و بـ
بـسـأ و بـسـأ و بـ
بـسـأ و بـسـأ و بـ

$$|\rho_{xy}| \leq 1$$



if $\rho_{xy} = +1$ or $-1 \rightarrow$ They are exactly correlated
Linearly dependent
 $y = x$ or $y = -x$

if $\rho_{xy} = 0 \rightarrow$ joint pdf equals Marginals
 X & y are uncorrelated
it means that they are independent

if $M_x = 0 \rightarrow$

$$\rho_{xy} = \frac{E\{x[ax+b]\}}{\sigma_x \sigma_y}$$

if $M_x \neq 0$
مركبة لا تساوي صفر

$$E\{ax^2 + bx\} = \rho_{xy} \sigma_x \sigma_y$$

$$a E\{x^2\} + b E\{x\} = \rho_{xy} \sigma_x \sigma_y$$

$$a \sigma_x^2 = \rho_{xy} \sigma_x \sigma_y$$

$$\boxed{a = \rho_{xy} \left(\frac{\sigma_y}{\sigma_x} \right)}$$

$$\boxed{\rho_{xy} = a \frac{\sigma_x}{\sigma_y}}$$

Slope کی

لوکان ۱۱

 $\sigma_{x_1} \sigma_{x_2} \sigma_{x_3}$

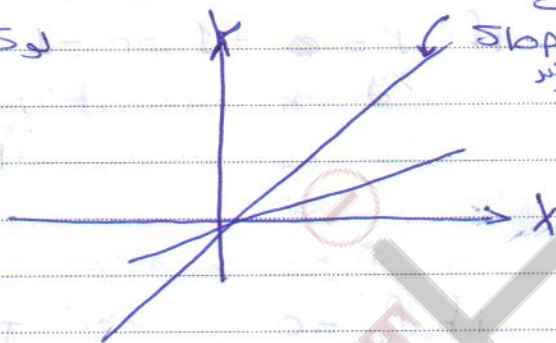
15120

۹. کبریا

محبتا

مقامات رکنی

محکمہ



* ρ في حالة ال 1st

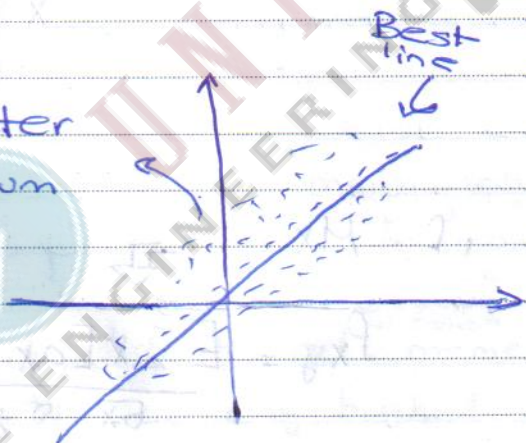
order

we can

expect in scatter

a curve with minimum

error



* Two RV's

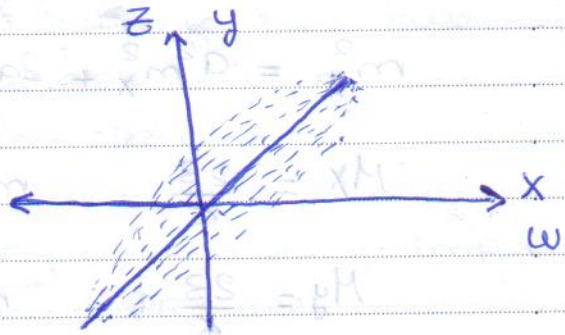
$$\begin{aligned}
 &X, Y \\
 &f_{xy}(x, y) \\
 &f_x(x) = \int_y f_{xy} dy \\
 &f_y(y) = \int_x f_{xy} dx
 \end{aligned}$$

correlation just measure the 1st order

assume

$$\begin{aligned}
 y &= ax + b \\
 a &\propto \rho_{xy}
 \end{aligned}$$

$$\rho_{xy} = \frac{E\{X \cdot Y\}}{\sigma_x \sigma_y} \quad \text{Normalization}$$



ρ_{xy} correlation coefficient
 correlation coefficient
 correlation coefficient
 correlation coefficient

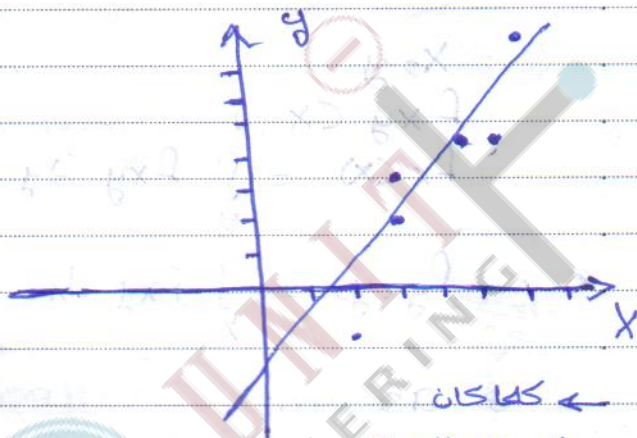
correlation coefficient

$$\begin{aligned}
 y &= g(x) \quad P(x) \\
 &\downarrow \quad \downarrow \\
 &\text{exp} \quad \text{poly}
 \end{aligned}$$

Set of points
in the space

* Ex:- given the scatter, find the relation between x & y .

| x | y |
|-----|-----|
| 2 | -1 |
| 3 | 2 |
| 5 | 5 |
| 6 | 9 |
| 4 | 5 |
| 3 | 3 |



$$y = ax + b$$

$$M_y = E\{y\} = a M_x + b \quad \text{--- ①}$$

$$m_y^2 = E\{y^2\} = E\{(ax+b)(ax+b)\}$$

$$= a^2 E\{x^2\} + 2ab E\{x\} + b^2$$

$$m_y^2 = a^2 m_x^2 + 2ab M_x + b^2 \quad \text{--- ②}$$

$$M_x = \frac{23}{6}$$

$$m_x^2 = \frac{99}{6}$$

$$M_y = \frac{23}{6}$$

$$m_y^2 = \frac{145}{6}$$

Sub into ① $\Rightarrow \frac{23}{6} = a \times \frac{23}{6} + b$

Sub into ② $\frac{145}{6} = \frac{99}{6} a^2 + \frac{46}{6} \times a \left(\frac{23}{6} - \frac{23a}{6} \right) + \frac{23^2}{6}$

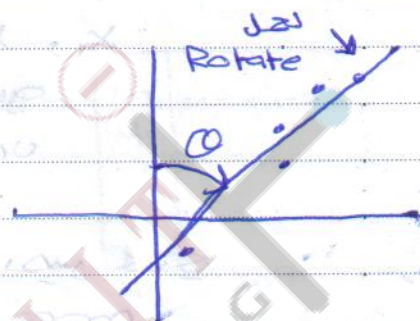
take
the
+ve

$$a = 2.29$$

$$a = -2.29 \quad \times$$

* Vectors of Random variables

$$X = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ \vdots \\ x_n \end{bmatrix}$$



N-Dimensional R.V

$$\begin{bmatrix} x' \\ y' \end{bmatrix} = \begin{bmatrix} R \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

Rotation matrix

* We can decorrelate two Random variables using Rotation operator.

decorrelation is a very important Process
أفضل الأساس إلى كذا
مفهوم يوضح

so I can remove the dependency within two Random variables with rotating, especially if the RV's were gaussian R.V

المقادير

Identically distributed R.V's

$x_1, x_2, x_3, \dots, x_n$

Gaussian " " " "

Uniform " " " "

Since R.V. is identical

more accurate to the prediction

$$E\{\vec{x}\} = \vec{\mu}_x = \begin{bmatrix} \mu_{x1} \\ \mu_{x2} \\ \vdots \\ \mu_{xN} \end{bmatrix}$$

$$\hat{x}^2 = E\{x^n\}$$

$$\hat{x}^2 = E\{x x^H\} \rightarrow \text{Hermite}$$

* Vector R.V's (Continue)

$$X = \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_N \end{bmatrix}$$

$$Mx = \begin{bmatrix} Mx_1 \\ Mx_2 \\ \vdots \\ Mx_N \end{bmatrix}$$

$$C_{xx} = E \left\{ \sum_{i,j} x_i x_j^H \right\} \quad \text{Covariance Matrix}$$

↑
transpose complex conjugate

$$= \begin{bmatrix} x_1 x_1 & x_1 x_2 & \dots & x_1 x_N \\ x_2 x_1 & & & \\ \vdots & & & \\ x_N x_1 & & & x_N x_N \end{bmatrix} \quad N \times N$$

$$= E \left\{ \begin{bmatrix} x_1 x_1 & x_1 x_2 & \dots & x_1 x_N \\ x_2 x_1 & & & \\ \vdots & & & \\ x_N x_1 & & & x_N x_N \end{bmatrix} \right\} \quad N \times N$$

↓

$$= \begin{bmatrix} \sigma_x^2 & \sigma_x^2 \rho_{12} & \dots & \sigma_x^2 \rho_{1N} \\ & \ddots & & \\ & & \sigma_x^2 & \\ & & & \ddots \\ & & & & \sigma_x^2 \end{bmatrix}$$

assume $Mx = \vec{0}$

$$\rho_{12} = \frac{E \{ x_1 x_2 \}}{\sigma_x^2}$$

نلاحظ σ_x^2 مشترك

$$\sigma_x^2 \begin{bmatrix} 1 & p_{12} & \dots & p_{1N} \\ p_{21} & & & \\ \vdots & & & \\ p_{N1} & & & 1 \end{bmatrix}$$

$$| p_{ij} = p_{ji} |$$

→ If we applied certain transformation of R.V's (function of R.V's)

Special case

$$\vec{Y} = A\vec{X} + b \quad b=0$$

$$y = ax + b \quad \text{linear Transformation}$$

(التحويل الخطي)

For DFT

$$A = \begin{matrix} \xrightarrow{m} \\ \downarrow n \end{matrix} \begin{bmatrix} -j2\pi nm \\ e^{\frac{j2\pi nm}{N \cdot M}} \end{bmatrix}$$

If $N=M$
square transformation

$$n = 0, 1, 2, 3, \dots, N-1$$

$$m = 0, 1, 2, \dots, M-1$$

Generally $M=N$

$$A_{4 \times 4} = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & e^{-\frac{2\pi}{16}} & e^{-\frac{j4\pi}{16}} & e^{-\frac{j6\pi}{16}} \\ 1 & e^{-\frac{2\pi}{16}} & e^{-\frac{j4\pi}{16}} & e^{-\frac{j6\pi}{16}} \\ 1 & e^{-\frac{2\pi}{16}} & e^{-\frac{j4\pi}{16}} & e^{-\frac{j6\pi}{16}} \end{bmatrix}$$

\vec{z}_{eff}

\vec{z}_{eff}

application

especially

in images

$$H_4 = \begin{bmatrix} H_2 & H_2 \\ H_2 & -H_2 \end{bmatrix}$$

$$H_8 = \begin{bmatrix} H_4 & H_4 \\ H_4 & -H_4 \end{bmatrix}$$

$\vec{Y} = A\vec{X}$ is a projection transform
project \vec{X} into the axis of A

→ to define the space, I need to
define unit vector.

$$\Phi = \text{Eig}[A]$$

→ to decorrelate \vec{X} we project \vec{X}
into $A = \text{Eig}[C_{xx}]$



σ_y is the

to preserve

$$C_{yy} = \sigma_y^2 \mathbf{I}_{N \times N}$$

Identity
Matrix

the energy

Eigen vector $\Phi = [\Phi_1 \ \Phi_2 \ \dots \ \Phi_N]$

متجه ذاتي $\leftarrow \begin{matrix} \uparrow & \uparrow & \uparrow & \uparrow \\ a_x & a_y & a_z & a_4 \end{matrix}$

$$\det(\Phi) = 1$$

\hookrightarrow orthonormal space

متجه ذاتي \leftarrow Vector \leftarrow متجه ذاتي

$$\langle \Phi_i, \Phi_j \rangle = \begin{cases} 1 & i=j \\ 0 & \text{otherwise} \end{cases}$$

$\Phi_i^H \Phi_j$ هذا ال space

Norm of the vector
المتجه \leftarrow (inner product)

Quiz1

Find the correlation coefficient between x, y where

$$f_{xy}(x, y) = \alpha e^{-(x+y-2xy)} u(x, y)$$

$$\rho_{x,y} = \frac{E\{xy\}}{\sigma_x \sigma_y}$$

\Downarrow

$$E\{xy\} = \int_0^{\infty} \int_0^{\infty} xy f_{xy}(x, y) dx dy$$

$$\rightarrow y = ax + b$$

$$\rho_{xy} = a \frac{\sigma_x}{\sigma_y}$$

$$x + y - 2xy = 0 \Rightarrow y = 2xy - x = x(2y - 1)$$

$$\boxed{\frac{x}{2x-1} = y}$$

$$\boxed{\frac{y}{2y-1} = x}$$

$$y = \frac{x}{2x-1} \approx x=1$$

$$1 = a + b$$

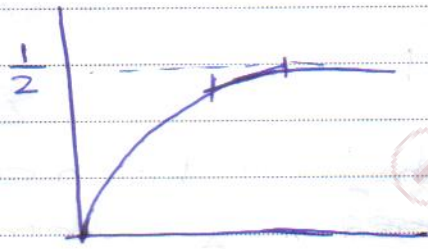
$$y = ax + b$$

$$x=2$$

$$\frac{2}{3} = 2a + b = 2a + 1 - a$$

$$= 2a + 1 - a$$

We can Linearize



$$1 - e^{-\beta x} = 1 - \alpha x$$



POWER ENGINEERING

$$1 - \mu^2$$

$$\frac{y}{-x^2}$$

14

* Special case of function of Random variables

$$\vec{y} = A\vec{x} + \vec{b}$$

مصفوفة
متجه

1. Forier transform
 2. Cosine transform
 3. w-H transform
 4. K-L transform
- دوال
متجه
متجه
متجه

$$E\{yy^H\} = C_{yy} = I$$

identity matrix

K-L \rightarrow
Transform

$$\begin{aligned} C_{yy} &= E\{Ax \cdot (Ax)^H\} \\ &= E\{Axx^T A^T\} \\ &= A E\{xx^T\} A^T \end{aligned}$$

$$I = A C_{xx} A^T$$

General

Eigen matrix
equation

$$A C_{xx} A^T - I = 0 \quad \text{--- (*)}$$

$$a C_{xx} a^T - \lambda = 0$$

$(B - \lambda I) = 0 \rightarrow$ is a special case of equation (*)

$$A = \text{Eig} \{C_{xx}\}$$

[H.W] assume

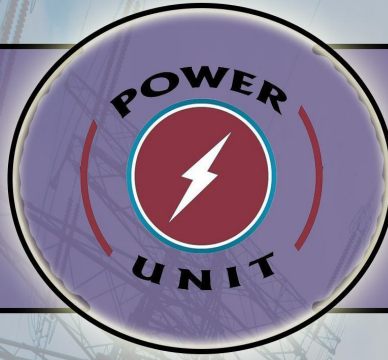
$$\textcircled{1} \quad C_{xx} = \begin{bmatrix} 2 & 0.9 & 0.1 \\ 0.1 & 2 & 0.1 \\ 0.1 & 0.9 & 2 \end{bmatrix}$$

Find A? using matlab

$$\textcircled{2} \quad C_{xx} = \begin{bmatrix} 1 & 0.8 \\ 0.8 & 1 \end{bmatrix}$$

Find A?

$$T A T^{-1} = I$$



Probability

NoteBook

Dr. Jamal Rahal

By: Farah AbuAlssamin

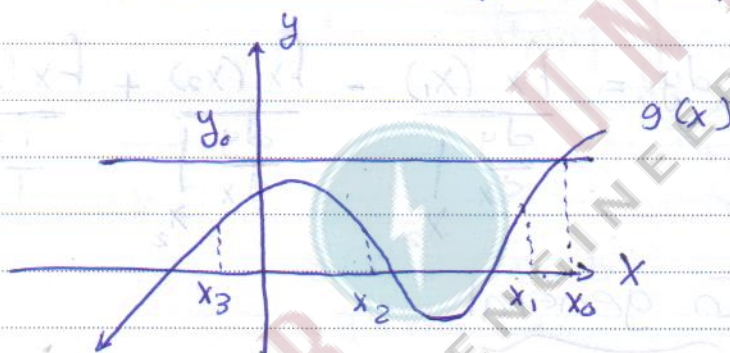
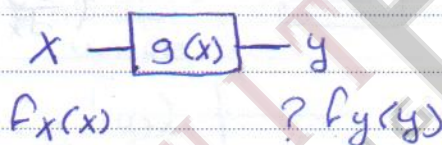
بأفكارنا نبدع

4th week

* Functions of Random variables

→ Decatoblation :

① $y = g(x)$



$$Pr(y \leq y_0) = Pr(x \leq x_0) - Pr(x \leq x_2) + Pr(x \leq x_3)$$

$$\hookrightarrow Pr(x \leq x_0) \longleftrightarrow Pr(y \leq y_0)$$

$$Pr(y \leq y_0) = Pr(x \leq x_0)$$

$$F_Y(y) \Big|_{y=y_0=g(x)} = F_X(x) \Big|_{x=x_0}$$

$$y_0 = g(x_0)$$

$$f_y(y) dy = f_x(x) dx$$

$$f_y(y) = f_x(x) \cdot \frac{dx}{dy}$$

$$f_y(y) = \frac{f_x(x)}{\left(\frac{dy}{dx}\right)}$$

$$x = g^{-1}(y)$$

$$f_y(y) dy = \frac{f_x(x_1)}{\left|\frac{dy}{dx}\right|_{x_1}} - \frac{f_x(x_2)}{\left|\frac{dy}{dx}\right|_{x_2}} + \frac{f_x(x_3)}{\left|\frac{dy}{dx}\right|_{x_3}}$$

In general

$$\left\{ f_y(y) = \sum \frac{f_x(x_i)}{\left|\frac{dy}{dx}\right|_{x_i}} \right\}$$

①

* Ex: $y = g(x) = ax$, $y = ax$
 $g' = \frac{dy}{dx} = a$, $x = \frac{y}{a}$

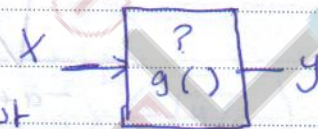
So, $f_y(y) = \frac{f_x(x)}{|a|}$ $x = g^{-1}(y)$
 $= \frac{f_x\left(\frac{y}{a}\right)}{|a|}$

Cont.

Functions of Random variables

$$y = g(x)$$

Full wave rectifier \rightarrow absolute value



$$f_y(y) = \sum_{i=1}^2 f_x \left(\frac{g^{-1}(y)}{|g'(y)|} \right) \quad \left| \quad x = g^{-1}(y) \right.$$

* Ex 8-

(2)

$$g(x) = ax + b$$

$$g'(x) = a$$

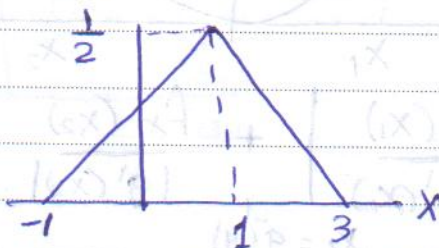
$$y = ax + b \Rightarrow x = \frac{y - b}{a}$$

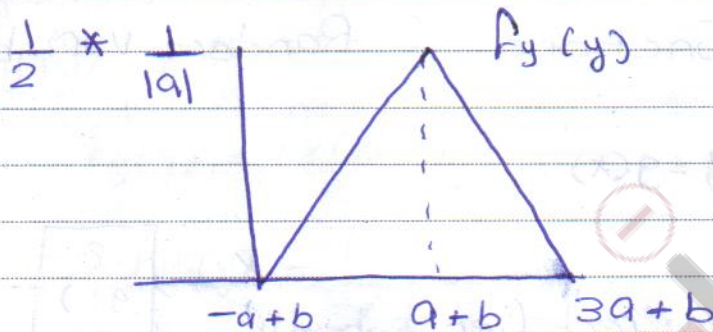
$$f_y(y) = \frac{f_x \left(\frac{y - b}{a} \right)}{|a|} \quad \begin{matrix} \rightarrow \text{shift} \\ \rightarrow \text{scale} \end{matrix}$$

f_y
gaussian

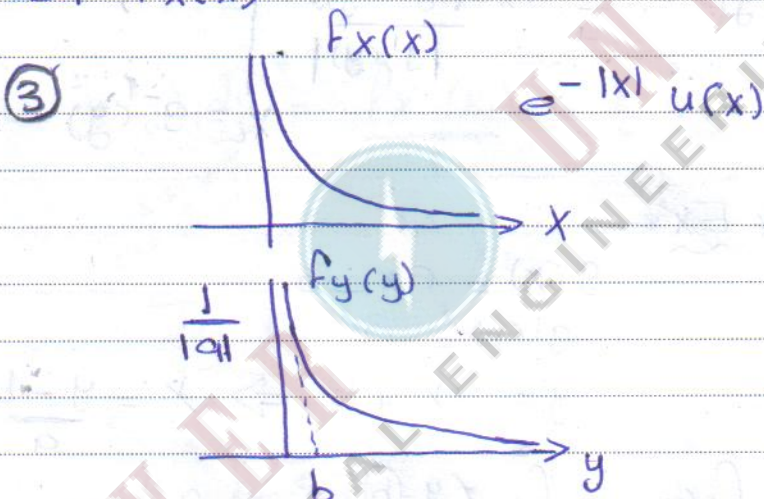
f_x gaussian

\rightarrow Let $f_x(x)$

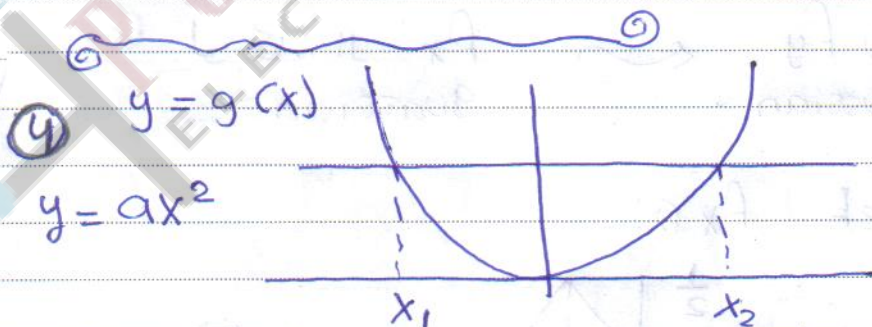
 \Rightarrow



→ Let $f_x(x)$



$$f_y(y) = \frac{1}{|a|} e^{-\frac{(y-b)}{a}} u(y-b)$$



$$f_y(y) = \frac{f_x(x_1)}{|g'(x_1)|} + \frac{f_x(x_2)}{|g'(x_2)|}$$

$x_1 = g^{-1}(y)$ $x_2 = g^{-1}(y)$

$$y = ax^2 \quad y' = 2ax$$

$$x = \pm \sqrt{\frac{y}{a}}$$

$$f_y(y) = \frac{f_x(+\sqrt{y/a})}{2|a|\sqrt{y/a}} + \frac{f_x(-\sqrt{y/a})}{2|a|\sqrt{y/a}} \quad *$$

$y \cdot a > 0$
 هذا يمكن حساب
 صفره؟

توزيع
 zero

Let $f_x(x)$



$$y = ax^2$$

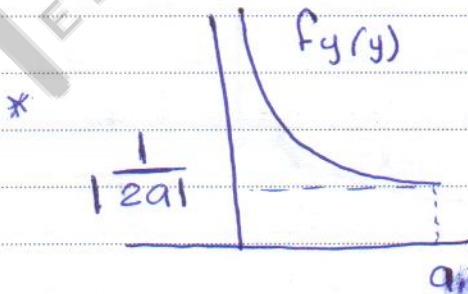
$$x=0 \rightarrow y=0$$

$$x=1 \rightarrow y=a$$

$$f_y(y) = \frac{1}{|2a\sqrt{y/a}|}$$

$$0 < y \leq a$$

$y=0$ is
 undefined
 (Pole)



Let

$$f_x(x) = \frac{1}{2} e^{-|x|}$$

$$f_y(y) = \frac{1}{2} \frac{e^{-|y/a|}}{|2a\sqrt{y/a}|} + \frac{1}{2} \frac{e^{-|y/a|}}{|2a\sqrt{y/a}|}$$

$$= \frac{e^{-|y/a|}}{|2a\sqrt{y/a}|} \begin{cases} y > 0 & , a > 0 \\ y < 0 & \text{for } a < 0 \end{cases}$$

الدالة
فاندية
a
+ve



(-ve a لو
كس يمين
y سلبه)

cont.

Functions of Random variables

⑤

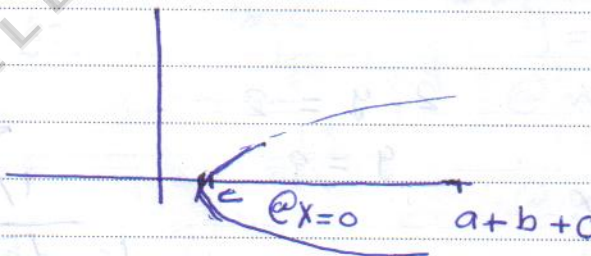
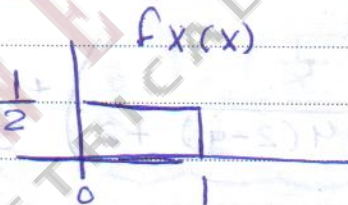
$$y = ax^2 + bx + c$$

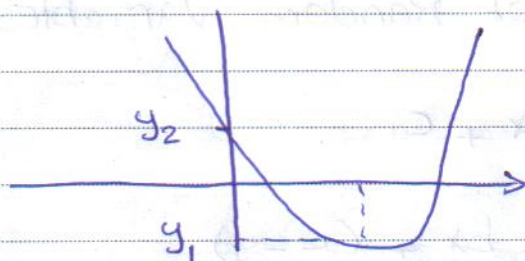
$$0 = ax^2 + bx + (c - y)$$

$$y' = 2ax + b$$

$$x_{1,2} = \frac{-b \pm \sqrt{b^2 - 4a(c-y)}}{2a}$$

$$f_y(y) = \frac{f_x(x_1)}{|2ax_1 + b|} + \frac{f_x(x_2)}{|2ax_2 + b|}$$

Let $a =$ 



Range ال
المساحة

$$y_1 \rightarrow y_2$$

y_2 من شرط تكون

عن x_2

$$y = x^2 - 3x + 2$$

$$= (x-1)(x-2)$$

$$x_{1,2} = \frac{3 \pm \sqrt{9 - 4(2-y)}}{2}$$



$$y_1 = (1.5)^2 - 3 \times 1.5 + 2 = -\frac{1}{4}$$

$$y_2 = 2 \rightarrow 0 = x$$

$$f_y(y) = \left(\frac{1/2}{2(3 - \sqrt{9 - 4(2-y)}) + 2} \right) + \frac{f_x(x_2)}{3 + \sqrt{9 - 4(2-y)} + 2}$$

أبغ
في حد
 $y = +2$
(طالعت
الفترة)

$0 \leq y \leq 2$ Term ال
الحد

Term ال
الحد
 $-\frac{1}{4} \leq y \leq 0$

$$2 - y = 2$$

$$y = 0$$



$$-\frac{1}{4} \geq y \geq 0$$

Two ال

terms

موجودين

$$\frac{1/2}{13 + \sqrt{9 - 4(2-y)} + 2}$$

$$y = e^{\alpha x}$$

هل يمكن أن تكون
is True y

$$y' = \alpha e^{\alpha x}$$

No

$$0 = y - e^{\alpha x}$$

exp = True

was y

True

$$x = \frac{1}{\alpha} \ln(y)$$

$$f_y(y) = \frac{f\left(\frac{1}{\alpha} \ln(y)\right)}{|\alpha| e^{\alpha x}}$$

x

b

$$\frac{1}{\alpha} \ln(y)$$

$$= \frac{f_x\left(\frac{1}{\alpha} \ln(y)\right)}{|\alpha| e^{\alpha \frac{1}{\alpha} \ln(y)}}$$

$$= \frac{f_x\left(\frac{1}{\alpha} \ln(y)\right)}{|\alpha| y}$$

y > 0



$$f_y(y) = \frac{1/2}{2y} = \frac{1}{4y}$$

$$y = e^{3x}$$

$$@ x = 0$$

$$y = 1$$

$$@ x = 2$$

$$y = e^6$$

$$1 \leq y \leq e^6$$

لو كانت

$F_X(x) = e^{-x} u(x) \rightarrow$ دالة موجبة x متناهية

" $F_Y(y) = \frac{F_X(\ln y)}{y}$ $y > 0$
 \rightarrow $\frac{-y}{y} = -1$ ؟ $u(y) ??$

هنا مشكلة خارج مجال !!

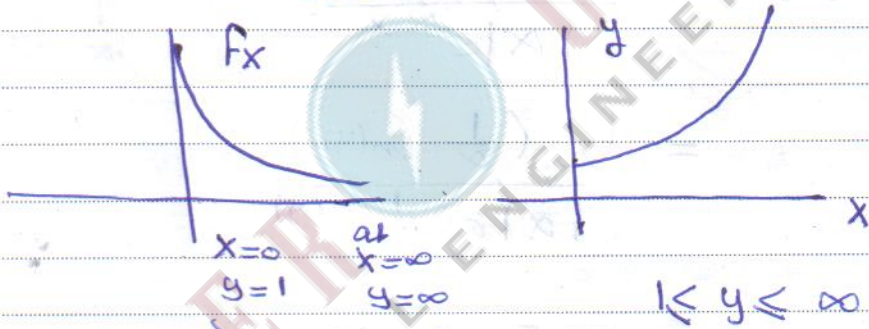


Table Data
 x and
 Function

$P(y \leq y_0) = P(x \leq x_0)$

$F_Y(y) = F_X(x)$

$F_Y(y) = \frac{F_X(x)}{dy/dx}$

$e^{-x} = \frac{1}{e^x} = \frac{1}{e^{\ln y}} = \frac{1}{y}$

→ cont.

then: $f_y(y) = \frac{f_x(x)}{|y'|} = \frac{1}{y^2} \quad y \geq 1$
 $x = \ln y$

⑥

$$y = \ln(x)$$

$$x > 0$$

$$x = e^y$$

$$|y'| = \left| \frac{1}{x} \right|$$

$$f_y(y) = e^y f_x(e^y) \quad -\infty < y < \infty$$

* Ex 8

$$y = \ln(x)$$

$$f_x(x) = e^{-x} u(x)$$

$$f_y(y) = e^y e^{-x} \quad x = e^y$$

$$= e^y e^{-e^y} \quad -\infty < y < \infty$$

$$\text{let } e^y = z$$

$$f_y(y) = z e^{-z}$$

z
مستبدل
(-ve)
مستبدل
z > 0
لكي يكون
z → ∞

لو كانت

$$f_X(x) = e^{-x} u(x) \rightarrow \text{دالة موجبة} \quad x \text{ موجبة}$$

$$f_Y(y) = \frac{f_X(\ln y)}{y}$$

$$= \frac{-y}{y} = -1 \quad ? \quad u(y) ??$$

!! هناك مشكلة ما جبر سال !!

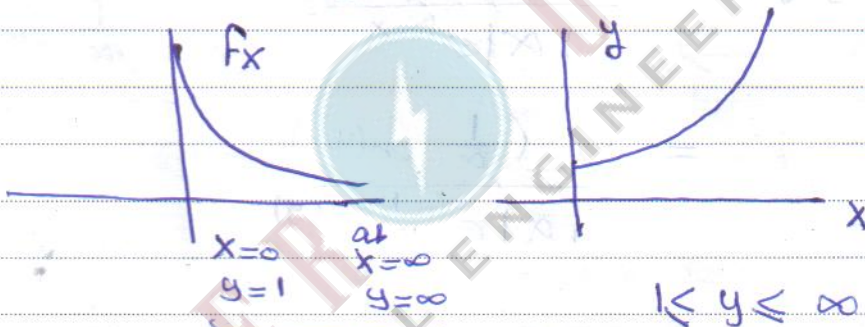


table of transformation
x y
Function

$$P(Y \leq y_0) = P(X \leq x_0)$$

$$F_Y(y) = F_X(x)$$

$$f_Y(y) = \frac{f_X(x)}{dy/dx}$$

$$e^{-x} = \frac{1}{e^x} = \frac{1}{e^{\ln y}} = \frac{1}{y}$$

→ cont.

then: $f_y(y) = \frac{f_x(x)}{|y'|} = \frac{1}{y^2} \quad y \geq 1$
 $x = \ln y$

⑥

$$y = \ln(x)$$

$$x > 0$$

$$x = e^y$$

$$|y'| = \left| \frac{1}{x} \right|$$

$$f_y(y) = e^y f_x(e^y) \quad -\infty < y < \infty$$

* Ex 8 -

$$y = \ln(x)$$

$$f_x(x) = e^{-x} u(x)$$

$$f_y(y) = e^y e^{-x}$$

$$x = e^y$$

$$= e^y e^{-e^y} \quad -\infty < y < \infty$$

$$\text{let } e^y = z$$

$$f_y(y) = z e^{-z}$$

z
مستند
(-∞)
مستند
(+∞)
نقطة
z → ∞

$$f_y(y) = \sum_{i=1}^? \frac{f_x(g^{-1}(x))}{|g'(x)|} \quad \therefore [\text{general form}]$$

* Ex- $y = \ln(ax^2)$

find $f_y(y)$?

المرحلة الأولى $\left\{ \begin{array}{l} z = ax^2 \\ f_z(z) = f_x(?) \end{array} \right.$

المرحلة الثانية $\left\{ \begin{array}{l} f_y(y) = \frac{f_z(z)}{|g'(z)|} \\ y = \ln(z) \end{array} \right.$

$$f_x(x) = e^{-x} u(x)$$

$$z = ax^2$$

$$f_z(z) = \frac{f_x(\sqrt{z/a})}{|2a\sqrt{z/a}|} + \frac{f_x(-\sqrt{z/a})}{|2a\sqrt{z/a}|}$$

zero because of $u(x)$ 0

let $a=1$

$$f_z(z) = \frac{f_x(\sqrt{z})}{2\sqrt{z}} = \frac{e^{-\sqrt{z}}}{2\sqrt{z}} \quad z > 0$$

$$\sim y = \ln(z)$$

$$f_y(y) = e^y f_z(e^y)$$

$$f_y(y) = \frac{e^{y/2} - e^{-y/2}}{2}$$

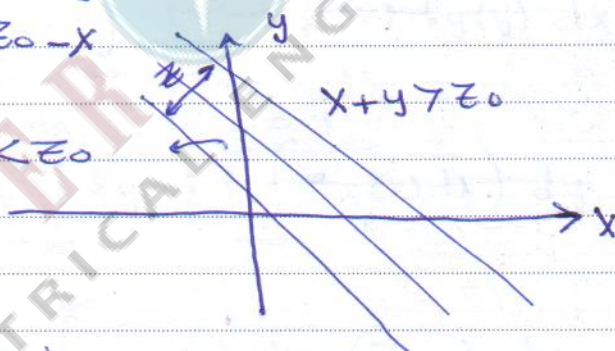
* Functions of Two R.V's

$$Z = X + Y \quad (\text{only})$$

$$Z_0 = X + Y$$

$$Y = Z_0 - X$$

$$X + Y < Z_0$$



$$Pr(Z \leq Z_0) =$$

$$= \iint_{x,y} f_{xy}(x,y) dx dy$$

Left half
plane

$$= \int_{-\infty}^{\infty} \int_{-\infty}^{Z_0 - y} f_{xy} dx dy = F_Z(Z)$$

→

$$\boxed{f_z(z) = \frac{d}{dz} F_z(z)}$$

z = x

* Ex 3

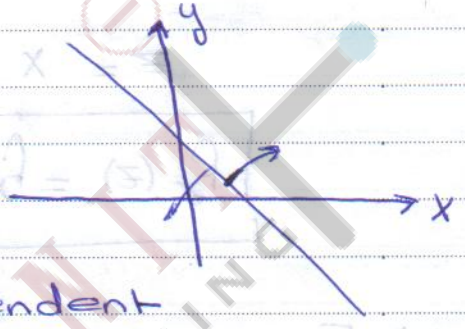
$$z = x + y$$

$$f_x(x, y) = e^{-(x+y)} u(x, y)$$

→ Functions of two R.v's

$$Z = X + Y$$

$$F_Z(z) = \int_{-\infty}^{\infty} \int_{-\infty}^{z-y} f_{X,Y}(x,y) dx dy$$



if X & Y are independent

$$f_{X,Y} = f_X \cdot f_Y$$

$$F_Z(z) = \int_{-\infty}^{\infty} \int_{-\infty}^{z-y} f_X(x) f_Y(y) dx dy$$

$$F_Z(z) = \int_{-\infty}^{\infty} f_Y(y) \left(\int_{-\infty}^{z-y} f_X(x) dx \right) dy$$

$$F_Z(z) = \int_{-\infty}^{\infty} f_Y(y) F_X(z-y) dy$$

$$\begin{aligned} \int_{-\infty}^{\infty} f_Z(z) dz &= \int_{-\infty}^{\infty} f_Y(y) \cdot F_X(z-y) dy \\ &= f_Y * F_X \end{aligned}$$

2. For independent R.V's

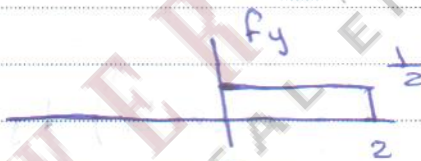
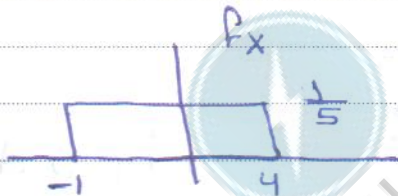
x & y

$$z = x + y$$

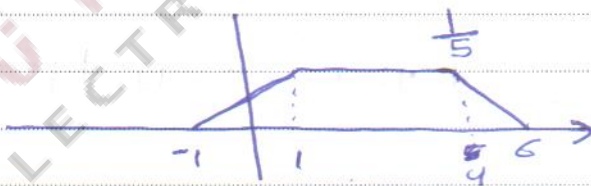
$$f_z(z) = f_x(x) * f_y(y)$$

the pdf of their sum is the convolution

* Exe-



$z = x + y$
Find $f_z(z)$?

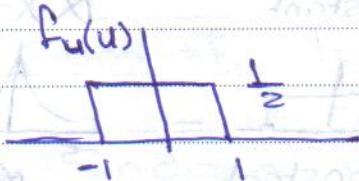


*Exa-

$$W = Z + U$$

$$Z = X + Y$$

نفساً في المثال السابق



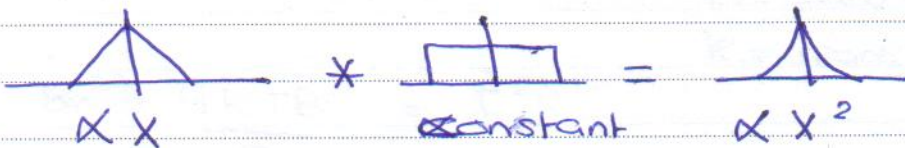
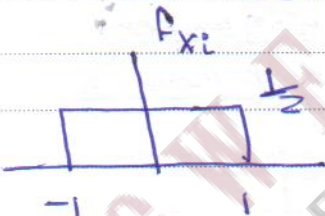
$$W = X + Y + U$$

$$f_W(w) = f_{X_1} * f_{X_2} * f_{X_3} \dots * f_{X_N}$$

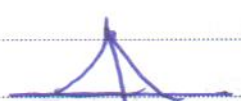


*Exa

Let $N \rightarrow \infty$ (99d)

independent
identically
distributed

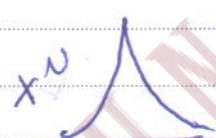


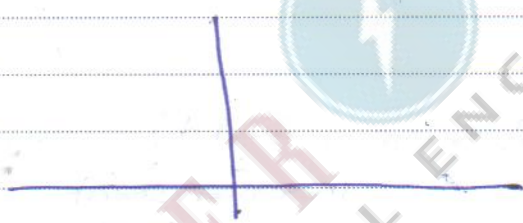
~

$$\propto x^2 * \text{constant} = \propto x^3$$




$$\propto x^3 * \text{constant} = \propto x^4$$




$$\propto x^4$$




* Central Limit Theorem :

- ⊗ Sum of too many independent
infinite
Random variables is a
Gaussian Random Variable.

Thermal noise

$$\sum_{i=1}^{\infty} e_i \rightarrow \text{gaussian RV}$$

الكمونات يتوزع عشوائياً
Average value

$$\left\{ \begin{array}{l} M_n = \sum M e_i = 0 \\ \sigma_n^2 = \sum \sigma e_i^2 \equiv \text{power} \end{array} \right.$$

$$\boxed{\sigma_n^2 = 4 k T B}$$

$$\boxed{V_{rms} = \sqrt{4 k T B}}$$

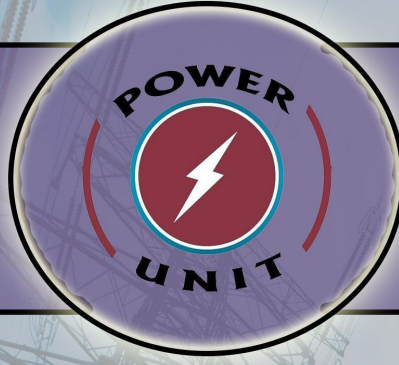
T = Temp.

in kelvin

B = Band width

k = constant

$$\frac{4 k T B}{R} = I^2 R$$



Probability

NoteBook

By: Farah Abu Alssamin
Dr. Jamal Rahal

بِأفكارنا نبدع

5th Week

⑦

$$y = \sqrt{x}$$

$$x = y^2$$

$$x, y > 0$$

$$y' = \frac{+1}{2\sqrt{x}}$$

$$f_y(y) = f_x(y^2) \cdot 2y \quad y > 0$$

⑧

$$y = \frac{1}{x}$$

$$y' = \frac{-1}{x^2}$$

$$x = \frac{1}{y}$$

$$f_y(y) = \frac{f_x(\frac{1}{y})}{y^2} \quad y \neq 0$$

abs value of $\frac{1}{x}$
PDF value

⑥

Quiz

given x uniform $\in (0,1)$

$$y = (x+1)^2$$

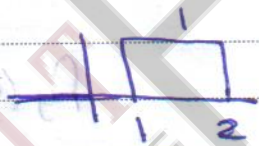
Find $f_y(y)$?

$$w = x+1$$

$$f_w(w) = f_x(w-1)$$

$$y = w^2$$

$$f_y(y) = \frac{1}{2\sqrt{y}} \quad 1 \leq y \leq 4$$



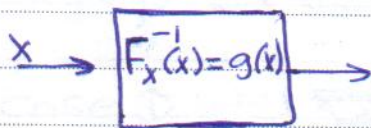
⊗ ملاحظة ان P_n نظام سائل ⊗

هيك
نوع
الاسئلة
في
الامتحان

case 1

$$y = F_x^{-1}(x)$$

x is RV with
 $f_x(x) \rightarrow F_x(x)$



$$x = F_x(y)$$

$$y' = g'(x)$$

$$f_y(y) = \frac{f_x(F_x(y))}{|g'(F_x(y))|}$$

another case case 2

$$y = F_x(x)$$

$$y' = f_x(x)$$

$$x = F_x^{-1}(y)$$

$$f_y(y) = \frac{f_x(F_x^{-1}(y))}{f_x(x)} \Big|_{x=F_x^{-1}(y)}$$

Case B

$$y = F_y(x)$$

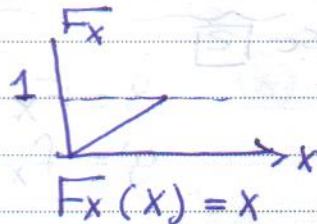
$$y' = f_y(x)$$

$$x = F_y^{-1}(y)$$

$$f_y(y) = \frac{f_x(F_y^{-1}(y))}{f_y(F_y^{-1}(y))}$$

For case II

if $x \in (0,1)$



$$f_y(y) = 1 \quad 0 \leq y \leq 1$$

So, In uniform the input is equal to out put

For case [2]

$$f_Y(y) = 1 \quad 0 \leq y \leq 1$$

case ① : نفس النتيجة

For case [3]

$$f_Y(y) = \frac{1}{f_Y(F_Y(y))}$$

⊗ From uniform we can find another pdf if we ~~take~~ take $y = F_Y(x)$

Case [4]

$$y = F_Y^{-1}(x) \Rightarrow x = F_Y(y)$$

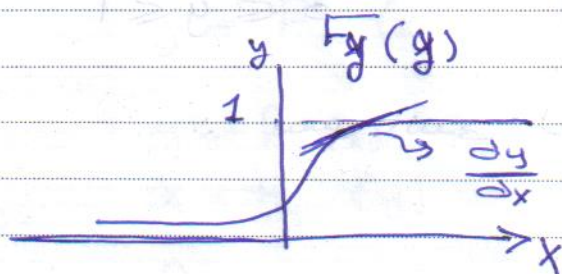
$$y' = \frac{d F_Y^{-1}(x)}{dx}$$

$$f_Y(y) = \frac{f_X(F_Y(y))}{\frac{d}{dx}(y)}$$

For uniform :

$$f_Y(y) = \frac{1}{|g'(F_Y(y))|}$$

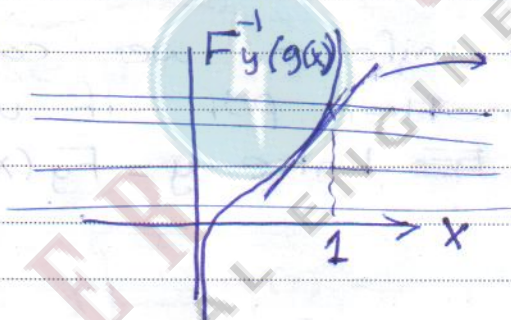
~> Now, Can we generate R.v for uniform?



أي شيء
Capital
تقريباً
هذه تكون
شكله
(Non)
(dec)

$$x = F_Y^{-1}(x) \Rightarrow x = F_Y(y)$$

$y = g(x)$
دالة واحد
بسيطة



مبدأ العكس
(مستقيمة)
 $\frac{dx}{dy}$

$$x' = \frac{1}{f_Y(y)}$$

$$f_Y(y) = \frac{1}{g'(x)} = \frac{1}{\frac{1}{f_Y(y)}} = f_Y(y)$$

Result

~>

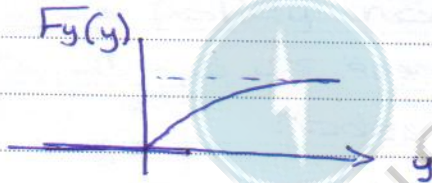
⊗ If we implement a device to perform the function $F_Y^{-1}(x)$
 → we can generate an arbitrary Random variable with $F_Y(y)$ using uniform $x \in (0,1)$.

* Ex 2

$x \rightarrow \boxed{g = F_Y^{-1}(x)} \rightarrow y$

$$F_Y(y) = e^{-y} u(y)$$

$$F_Y(y) = 1 - e^{-y}$$



$$g(x) = F_Y^{-1}(x) = -\ln(1-x)$$

$$1 - e^{-y} = x$$

$$1 - x = e^{-y}$$

$$\boxed{y = \ln(1-x)}$$

* لَمَّا كُنَّا فِي الْمَدِينَةِ الْمَكِينَةِ *

* Simulation

case I

* Ex computer network simulation :-

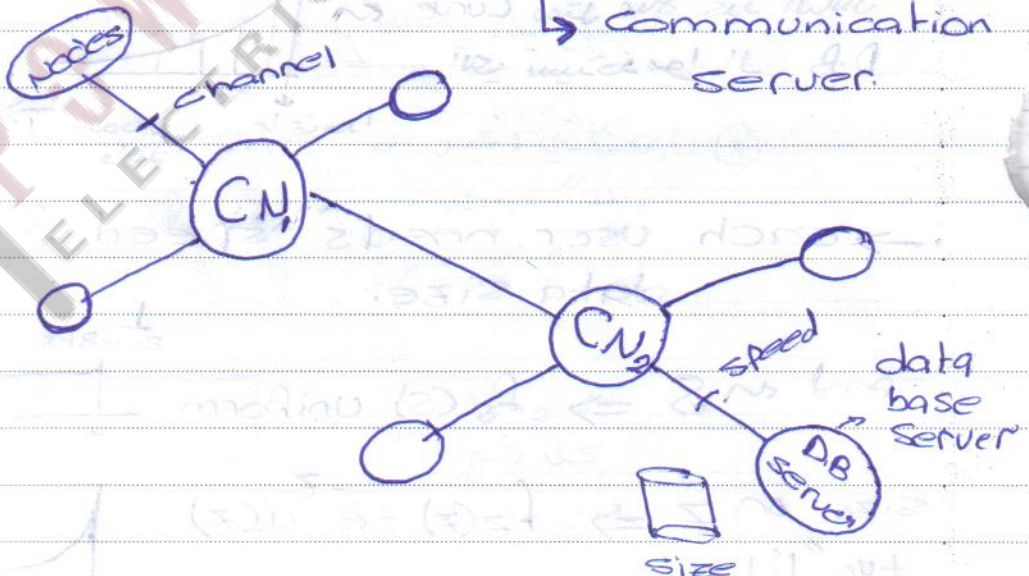
- channels of data, each with certain capacity
- we have nodes connected with channels.
- Policy nodes. بتقرر اي نوع (أي device موجودة على هذه الـ network) nodes تختار

(*) Policy nodes could be :-

(If statement)

(Control node) CN

- Servers
- Router
- communication server



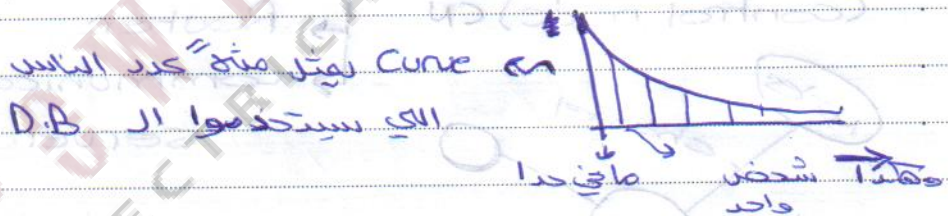
* we need to simulate the network shown (as example) to operate a D.B server.

time out → يعني نقص الاتصال بين Client و Server

* we need to find the size and link speed as a function of network users.

* every user uses the D.B randomly with pdf (email)

demand $f_x(x) = e^{-x} u(x)$
(Uniform pdf في D.B)



→ each user needs speed of data size.

speed in $S \Rightarrow f_s(s)$ uniform

size in $z \Rightarrow f_z(z) = e^{-z} u(z)$
توزيع "ت" (exponential distribution)

* Simulation 8-

1- each loop will represent a Δt .

So, start.

↓
(Initialize variables)

Loop: Generate X out put

$$V = \text{Rand}$$

$$X = -\ln(1-v) \rightarrow \text{represent demand (الطلب)}$$

$$f_x = e^{-x}$$

$$F_x = 1 - e^{-x}$$

$$F_x^{-1} = -\ln(1-y)$$

$$S = \text{Rand} \times 20k$$

$$u = \text{Rand}$$

$$Z = -\ln(1-u)$$

Result Array:

$$\text{Speed (iteration)} = X \cdot S$$

$$\text{Size (iteration)} = X \cdot Z$$

Loop: - برمج لنفسه التي فوق

*) بإمكانني أخذ ال Variance

$$f_z = \beta e^{-\beta z}$$

$$f_x = \alpha e^{-\alpha x}$$

65

→

لأخذ

كل شيء

لأنه كل القياسات

نفسها .

speed = 120 kbps ~ total speed
for server

5 speed = 10 kbps

→ ~~Link~~ Link speed 6Σ
 $= 120 + 6 \times 10 = 180 \text{ kbps}$

Case II

Common channel simulation

Tx

deterministic signal (number=A)

→ ch → Add R.V. x where x is
 $N(0, \sigma^2)$ multiply by y where y
uniform $\in (0, 1)$

① Rx we receive

$$z = yA + x$$

$$z = y_i A_i + x_i + \epsilon$$

$$mse = E\{|z - A|^2\} = E\{|yA + x - A|^2\}$$

$$= E\{|A(y-1) + x|^2\}$$

$$= \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} |A(y-1) + x|^2 f_{xy}(x, y) dx dy$$



* Initial condition $\Rightarrow A_t$

Generate Arbitrary

For $A = 100$

Loop ε . $N =$ Number of loops
 N times

Generate y

Generate x

$Z = 100 y - x$

$mse = |Z - A|^2$

goto Loop

$$mse = \frac{\sum mse_i}{N}$$

Simulation accuracy ε

10 Readings

\rightarrow each has an error of ε

$$\text{Average error} = \frac{NE}{N} = N \Rightarrow ??$$

Reading A True

error x

$$Z = A + x \Rightarrow \text{error}$$



* After N readings :-

$$\text{Total} = \sum_{A=1}^N A + x_n$$

$$\text{Avg} = \frac{1}{N} \sum_{n=1}^N A + x_n$$

$$\boxed{\text{Average} = A + \tilde{M}_x}$$

⊗ By default Uniform ⊗

$$\tilde{M}_x = \frac{1}{N} \sum_{n=1}^N x_n \rightarrow \text{Estimate of the mean}$$

of \tilde{M}_x as $N \rightarrow \infty$

↳ then the estimate is unbiased.

* Variance of the estimate

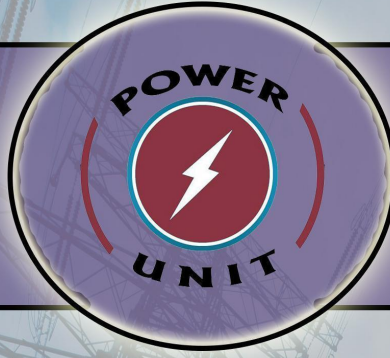
$$\sigma_x^2 = E \{ |\hat{M}_x - M_x|^2 \}$$

Best linear unbiased estimate
↳ BLUE

Minimum Variance Estimate

MVE

(Must algorithm) DSP??



Probability

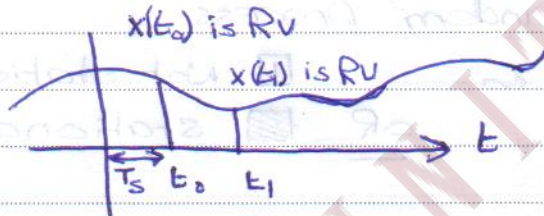
NoteBook

Dr. Jamal Rahal

By: Farah Abu Alsamin

بأفكارنا_نبدع

* Random Process :-

 $X(t)$ 

$$X(t_0) \rightarrow f_{X(t_0)}(X(t_0))$$

$$X(t_1) \rightarrow f_{X(t_1)}(X(t_1))$$



إشارة عشوائية
مثال على

Random
Process

شكلها كمنه
بغير

$$f_s \geq 2 f_m$$

sampling

$$T_s \leq \frac{T_m}{2}$$

$$\text{data rate} = m \cdot f_s$$

A/D

ex: 4-bits A/D

* Standards

$$F_s = 8 \text{ kbps}$$

$$\text{rate} = 8 \times 8 = 64 \text{ kbps}$$

→ Random process

من الخصائص انه لا يمكن
تنبؤ الإشارة

1 Not stationary

OR stationary

2 Ergodic

OR Not Ergodic

Stationary

Strict sense

wide sense

Strict → Independent with time.

لا يتغير

Ergodic

$$\sin(\omega t + \phi)$$

↑
R.V

Function 1

Random

Any change in R.V
will be reflected
to the same
shape
(sin wave)

$$M = \int x f_x(x) dx$$

$$= \frac{1}{T} \int_{-T/2}^{T/2} x(t) dt$$

Ergodic \rightarrow Time = Statistical
Average $\int dt \equiv \int dx$



POWER

ELECTRICAL ENGINEERING

Quiz * 4

$$f_{xy}(x,y) = e^{-(x+y)} u(x,y)$$

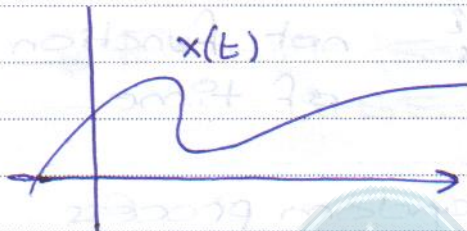
are x & y independent?

أخيراً بالله سبحانه

* Random processes

 $x(t)$

→ wide sense stationary
→ ident. distributed



$$x(t) = A \text{ rect}(t)$$

$$1- M_x(t) = E\{x(t)\} = \int_{-\infty}^{\infty} x(t) f_x(x) dx$$

if Ergodic

$$M_x(t) = \frac{1}{T} \int_{-T/2}^{T/2} x(t) dt$$

$$m_x^2 = E\{x^2\} = \int x^2 f_x dx$$

if Ergodic

$$= \frac{1}{T} \int |x(t)|^2 dt \quad \therefore \text{Total Average}$$

Power
→

$$m_x^2 = \underbrace{\sigma_x^2}_{\text{A.C Power}} + \underbrace{M_x^2}_{\text{D.C Power}}$$

For stationary random process

$$m_x^i(t) = m_x^i \quad \text{not function of time}$$

Stationary Random process
 $F_x(x)$ is not function of time
 \rightarrow strict sense stationary

\rightarrow For stationary \rightarrow not a function of time but relative to time

$$M_x(t) = M_x$$

$$m_x^i(t) = m_x^i$$

\rightarrow Only the Auto correlation function.

$$R_{xx}(t_1, t_2) \triangleq E \{ X(t_1) \cdot X^*(t_2) \}$$

\hookrightarrow In general For zero mean

$$R_{xx}(t_1, t_2) \triangleq E\{(x(t_1) - \mu_x)(x(t_2) - \mu_x)^T\}$$

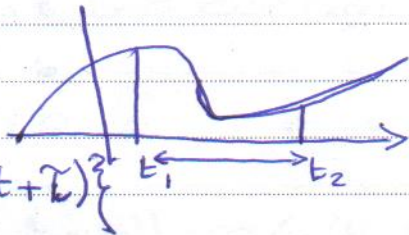
* لو كانت $t_2 = t_1$ ← لا يتغير الجهد
 Total: \rightarrow
 Power:

→ For wide sense stationary WSS

$$R_{xx}(t_1, t_2) = R_{xx}(t_2 - t_1) = R_{xx}(\tau)$$

* لو كانت $t_2 = t_1$ ← تكون الارتباط coefficient

in 1960s



$$R_{xx}(\tau) = E \{ x(t) \cdot x^*(t+\tau) \}$$

* Characteristics of $R_{xx}(\tau)$

$$\textcircled{1} R_{xx}(\tau) = R_{xx}(-\tau)$$

$$\textcircled{2} R_{xx}(0) = \overline{5x^2} + 4x^2$$

③ $R_{XX}(\tau_1) \leq R_{XX}(\tau_2) \quad \tau_2 < \tau_1$

cont. Random process :-

* Auto correlation function :-

* Ex :-

if $y = a \cos(\omega t)$

where a is a uniform $a \in (0,1)$

is y WSS ?

$$R_{yy}(t_1, t_2) = E\{y(t_1) \cdot y^*(t_2)\}$$

$$= \int_0^1 a \cos(\omega t_1) \cdot a \cos(\omega t_2) da$$

$$E\{g(x)\} = \int g(x) f_x dx$$

$$= \int_0^1 a^2 \frac{1}{2} [\cos(\omega(t_1 + t_2)) + \cos(\omega(t_1 - t_2))] da$$

$$R_{yy}(t_1, t_2) = \frac{1}{6} [\cos(\omega(t_1 + t_2)) + \cos(\omega \tau)]$$

$$\tau = t_2 - t_1$$

so y is not WSS

* Ex 2e

if $y = 5 \cos(\omega t + \theta)$

θ is uniform $\in (-\pi, \pi)$

is y WSS?

$$= \frac{1}{2\pi} \int_{-\pi}^{\pi} \frac{25}{2} \cos$$

$$R_{yy}(t_1, t_2) = \int_{-\pi}^{\pi} \frac{1}{2} \{ 5 \cos(\omega t_1 + \theta) \cdot 5 \cos(\omega t_2 + \theta) \} d\theta$$

$$= \frac{1}{2\pi} \int_{-\pi}^{\pi} \frac{25}{2} [\cos(\omega(t_1 + t_2) + 2\theta) + \cos(\omega(t_2 - t_1))] d\theta$$

$$= \frac{25}{2} \cos(\omega(t_2 - t_1))$$

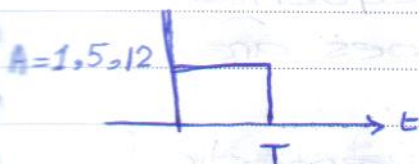
$$= \frac{25}{2} \cos(\omega \tau_1) = R_{yy}(\tau)$$

$\therefore y$ is WSS

* Ex 3e

Binary signal

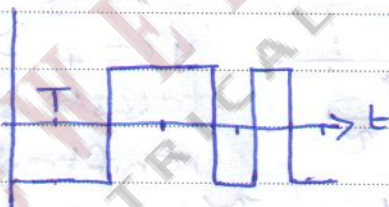
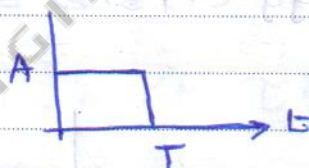
R.V $X \in \{-1, 1\} \rightarrow$ uniformly distributed signal $w(t)$



له يعني انتقال الى -1 و 1
لكل واحد منها $\frac{1}{2}$

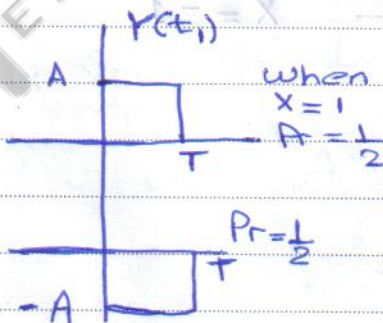
$$y = X \cdot w(t)$$

In general



("1 و -1")

find $R_{yy}(t_1, t_2)$



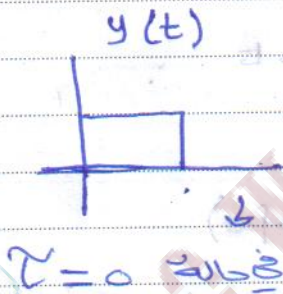
$$R_{yy}(t_1, t_2) = E \{ y(t_1) \cdot y^*(t_2) \}$$

$$= \iint y(t_1) y(t_2) \cdot f(y(t_1) y(t_2)) dy(t_1) dy(t_2)$$

1] assume the sequence of one's & zeroes are independent

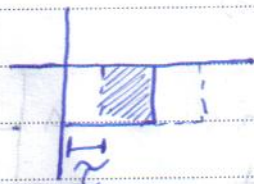
2] assume y is ergodic R.P

$$R_{yy}(t_1, t_2) = R_{yy}(t_1, t_1 + \tau)$$

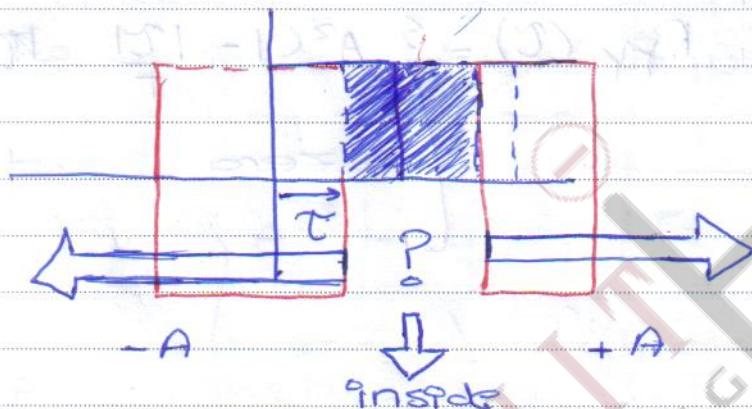


shifted
 $y(t + \tau)$
 shifted
 τ original

$X = +1$



$X = -1$



$$R_{yy}(t_1, t_2) = R_{yy}(t_0, t_0 + \tau)$$

$$E\{y(t) \cdot y(t + \tau)\}$$

$$= \frac{1}{T} \int_{-T/2}^{T/2} y(t) \cdot y(t + \tau) dt$$

Expectation outside the overlapped

$$R_{yy}(t_0, t_0 + \tau)$$

$$\Rightarrow = A \times A \times \frac{1}{4} + -A \times A \times \frac{1}{4} + A \times -A \times \frac{1}{4} + -A \times -A \times \frac{1}{4} = 0$$

Inside
Area

$$\frac{1}{T} A^2 (T - \tau) \quad \tau < T$$

$$A^2 \left(1 - \frac{\tau}{T}\right) \quad \tau < T \quad \tau > 0$$

$$A^2 \left(1 + \frac{\tau}{T}\right) \quad \tau \leq 0$$

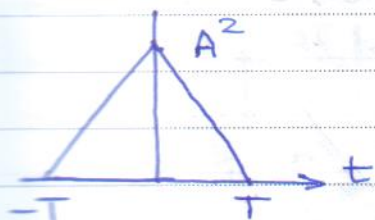
$$R_{TT}(z) = \begin{cases} A^2 C \left(1 - \frac{|z|}{T}\right) & |z| \leq T \\ 0 & \text{otherwise} \end{cases}$$

zero

otherwise

→ * Binary independent sequence

$$R_{yy}(\tau) = \begin{cases} A^2 \left(1 - \frac{|\tau|}{T}\right) & |\tau| \leq T \\ 0 & \text{otherwise} \end{cases}$$



$$\begin{aligned} R_{yy}(\tau) &= R_{yy}(-\tau) \\ R_{yy}(0) &= \underbrace{\sigma_y^2}_{\text{Ac power}} + \underbrace{M_y^2}_{\text{dc power}} \end{aligned} \quad \left. \begin{array}{l} \text{characteristics} \\ \text{of auto} \\ \text{correlation} \end{array} \right\}$$

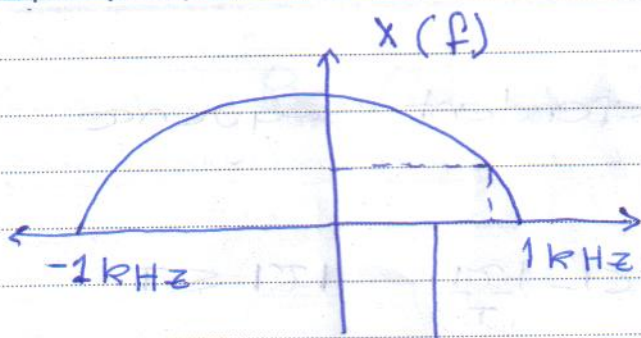
$$\lim_{T \rightarrow \infty} |R_{yy}(\tau)| = M_y^2$$

$$\text{if } M_y^2 \neq 0 \quad A^2 = \sigma_y$$



$$S_{yy}(F) = F.T \{ R_{yy}(\tau) \}$$

Power spectral density



→ Band limited signal

→ if it pass through filter it will be the same $j2\pi ft$

any point here in f it represent $e^{j2\pi ft}$

$$X(f) = \int_{-\infty}^{\infty} x(t) e^{-j2\pi ft} dt$$

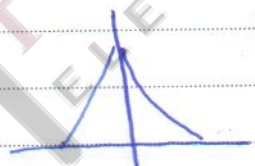
all time

$$x(t) = \int_{-\infty}^{\infty} X(f) e^{j2\pi ft} df$$

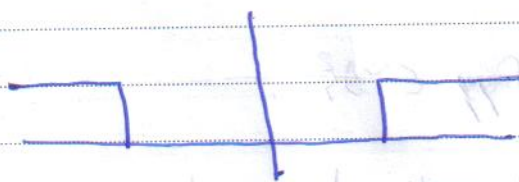
$$X(f) \xrightarrow{H(f)} Y(f) = X(f) \cdot H(f)$$

convolution in time domain = multiply in frequency domain

Filter



Filter



High pass filter

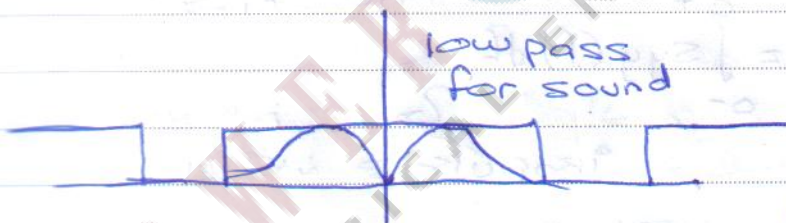


Low pass filter



Band pass filter

noise ↓ Signal ↓ is Filter ↓ is in
 to insulate signals
 → in mobile (signal)



low pass
for sound

high pass
for DSL
Signal

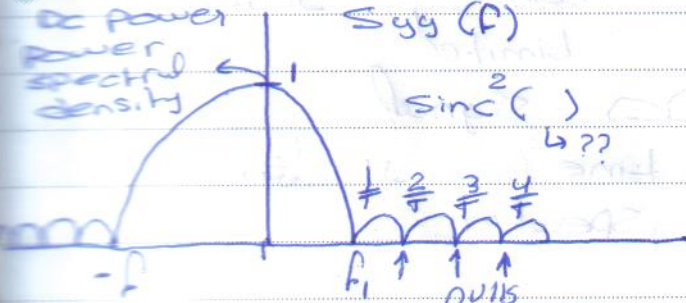
these 2 signals arrive together
 I can insulate them by
 filters.

at $f=0$
 DC power
 power
 spectral
 density

$S_{yy}(f)$

$\text{sinc}^2(\cdot)$
 $b??$

$$= \frac{\sin(\pi b)}{\pi b}$$



null
 to null
 bandwidth $\int_{-f_1}^{f_1} S_{yy}(f) df \approx 95\%$ from σ_y^2
 power 95%

3rd null 2nd null * انڈا بیس اگر باجی

$$P_{yy}(0) = \sigma_y^2 + M_y^2 = \text{total power}$$

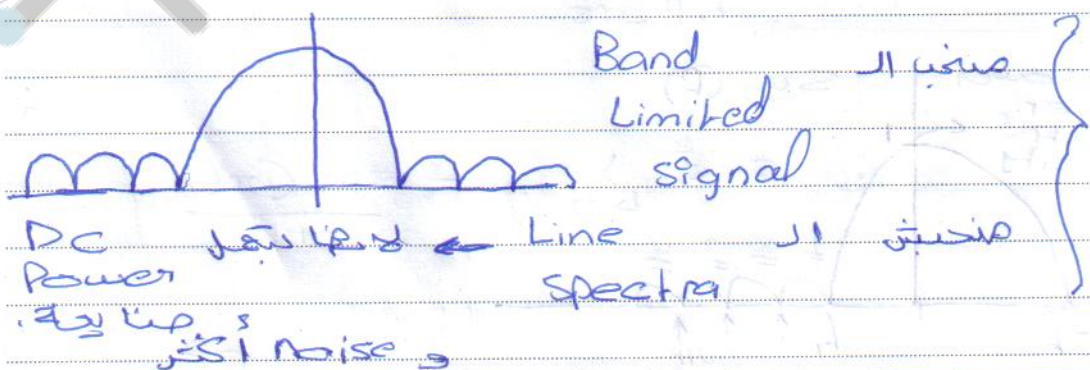
$$= \int_{-\infty}^{\infty} S_{yy}(f) df$$

$$\int_{f_1}^{f_2} S_{yy}(f) df = \text{power inside the range } f_1 \rightarrow f_2$$

$$M_y^2 = \int_{-\infty}^{\infty} S_{yy}(f) df$$

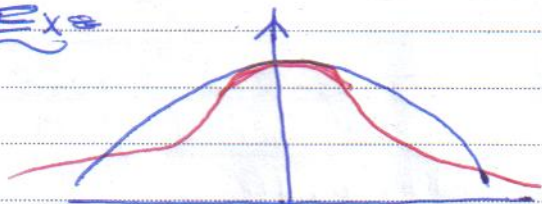
یعنی یہ
 ایک انڈا بیس ہے impulse

if $M_y \neq 0$ → time spectral impulse
 zero nulls and peak

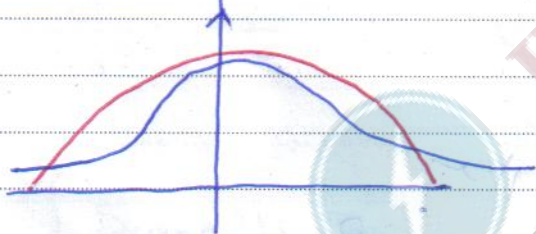


* we study the Random Process
in frequency to know the
characteristic of the signal

* Ex



High correlation
Low bandwidth



high
correlated

→ less bandwidth

Encoding
~ Encryption



* Information measure

Entropy

$$H_i = -P_i \log_2 P_i$$

symbol x_i with probability P_i

carries H_i information.

* Auto correlation & power spectral density

Signal في المجال
in time domain

not stationary in small time
short terms

Stationary \rightarrow
وكان

we do auto correlation and wss
aply mathematics to find optimal
bandwidth for example



divide
them

for example
the signal
for yes



this for No

أغلب شيء في المجال
wss \rightarrow

$$R_{xx}(\tau) = E \{ x(t) \cdot x^*(t+\tau) \} \text{ in cont. domain}$$

$$F.T [R_{xx}(\tau)] \rightarrow S_{xx}(f) \text{ power spectral density}$$

$$R_{xx}[m] = E\{x[n] \cdot x^*[n+m]\}$$

$$FT [R_{xx}[m]] \rightarrow S_{xx}[k]$$

energy spectral density

If binary signal $p(t)$ if it multiply by $g(t)$

$$x(t) = \underbrace{p(t)}_{\text{Random}} \cdot \underbrace{g(t)}_{\text{constant (not random) deterministic signal}}$$

$p(t)$ is random $\rightarrow x(t)$ random
if $p(t)$ is WSS $\rightarrow x(t)$ is WSS

F.T is linear transform

$$\begin{array}{ccc} x(t) & \xrightarrow{\text{F.T}} & x(f) \text{ also WSS and R.P} \\ \text{R.P} & & \downarrow \end{array}$$

$$R_{xx}(\tau, \Delta f) = E\{x(f) \cdot x^*(f + \Delta f)\}$$

$$S_{xx}(f) = FT(R_{xx}(\tau))$$

$$= FT(E\{x(t) \cdot x^*(t + \tau)\})$$

حليلة
Signal

$$= E\{ \{x(f) \cdot x^*(f)\} e^{j2\pi f\tau} \}$$

ازادی اوج PSD
 signal
 Freq Domain ← Intime = $[n]$ X

F.T

defeminshic

$$X(f) \rightarrow [H(f)] \rightarrow Y(f)$$

$$X(t) \rightarrow [H(t)] \rightarrow Y(t)$$

$$S_{XX}(X(f)) \quad H(f) \quad S_{YY}(f)$$

we must have the power spectral density

filtering

$$X(t) = \frac{P(t)}{A, P} * h(t) \rightarrow \text{det}$$

DFT $R_{xx}[m] = E \{ x[n] \cdot x^*[n-m] \}$

$$x[n] = \begin{bmatrix} x_0 \\ x_1 \\ \vdots \\ x_n \\ 0 \\ 0 \\ 0 \end{bmatrix} \quad m = \begin{bmatrix} 0 \\ 0 \\ 0 \\ x_m \\ x_{n+m} \end{bmatrix}$$

$\vec{x} \cdot \vec{x}_m$
to find the
expectation
above

column vector = window

$$R_{xx}[m] = \begin{bmatrix} 0 \\ 0 \\ 0 \\ x \\ x \\ x \\ 0 \\ 0 \end{bmatrix} \quad \left. \begin{matrix} x \\ x \\ x \end{matrix} \right\} \text{ values}$$

x_{total}

$$w = [1 \ 1 \ 1 \ 1 \ 1 \ 1 \ 1 \ 1]$$

$$\bar{x} = x_T \cdot \bar{w}$$

$$\bar{x}_m = x_T \cdot \bar{w}_m$$

↳ window shifted

as window length decrease measurement resolution increase

$$R_{xx}[m] = E \{ x[n] x^*[n+m] \}$$

Exa-

$$x[0] = x(t=0)$$

$$x[1] = x(t=1T_s)$$

$$x[n] = x(t=nT_s)$$



$$x[n]$$

$$X[z] = \sum x[n] z^{-n} \quad \text{plus} \rightarrow \text{delay one } T_s$$

$$\begin{bmatrix} x[0] \\ x[1] \\ x[2] \\ \vdots \\ x[n-1] \end{bmatrix}$$

Exa

$$x[0] = 1$$

$$x[1] = 5$$

$$x[2] = 3$$

$$X[z] = x[0]z^0 + x[1]z^{-1} + x[2]z^{-2} + \dots$$

$$X[z] = 1 + 5z^{-1} + 3z^{-2}$$

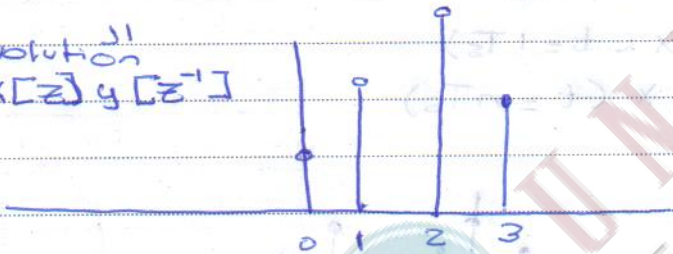
$$\rightarrow y[z] = 1 + 2z$$

$$X[z] y[z] = (1 + 5z + 3z^2) + 2z + 10z^2 + 6z^3$$

$$= 1 + 7z + 13z^2 + 6z^3$$

correlation

convolution
 $X[z] y[z^{-1}]$



correlation

$$\int X(t) \cdot y(t+\tau) dt$$

convolution

$$\int X(t) \cdot y(\tau-t) dt$$

* Exe

Let $R_{xx}[m] = \begin{bmatrix} 1 \\ -2 \\ 5 \end{bmatrix}$ \rightarrow Power $R_{xx}[0]$
not practical \rightarrow \leftarrow

$$\begin{bmatrix} 1.5 \\ 0.3 \\ 0.1 \end{bmatrix}$$

\rightarrow more
Practical

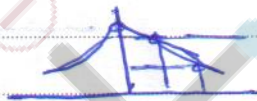
$$|R_{xx}(0)| \geq |R_{xx}(\tau)|$$

Power \rightarrow $R_{xx}(0) = 5$ is in \rightarrow

* Practical signals

$$R_{xx}(\tau_1) \geq R_{xx}(\tau_2)$$

$$\tau_1 < \tau_2$$



⊗ For periodic signal the autocorrelation is also periodic

⊗ Periodic signal is a power signal
can't carry information

⊗ Energy signal can carry information

$$\lim_{T \rightarrow \infty} |R_{xx}(\tau)| = M_x^2$$

(Auto correlation function is a real & even function)

⊗ No phase information can be obtained from 2nd order statistics.

⊗ Audio signal has no phase information

Video signal has phase information

$$R_{xx}[m] = \begin{bmatrix} 1.5 \\ 0.3 \\ 0.1 \\ 0.08 \\ 0.05 \end{bmatrix}$$

Size N

3 points \leftarrow s_j
Zero \leftarrow s_j

Zero \leftarrow s_j
Zero \leftarrow s_j

$$\begin{bmatrix} 1.5 \\ 0.3 \\ 0.1 \\ 0 \\ 0 \\ \vdots \\ 0 \end{bmatrix}$$

* Q. - find $S_{xx}[k]$?

$$S_{xx}[k] = \frac{1}{N} \sum_{n=0}^{N-1} x[n] e^{-jkn \cdot \frac{2\pi}{N}}$$

resolution \rightarrow

$$\Delta f = \frac{f_s}{N}$$

frequency resolution

(as N goes to zero $\Delta f \rightarrow \infty$)
 \rightarrow continuous

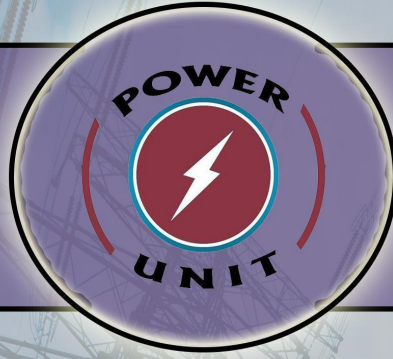
$$S_{xx}[0] = \frac{1.9}{3}$$

$$S_{xx}[1] = \frac{1.5}{3} e^{+j2\pi \frac{1}{3}} + \frac{0.3}{3} e^{+j4\pi \frac{1}{3}} + \frac{0.1}{3}$$

$$S_{xx}[2] = \frac{1.5}{3} e^{+j4\pi \frac{2}{3}} + \frac{0.3}{3} e^{+j8\pi \frac{2}{3}} + \frac{0.1}{3}$$

دالة

$$R_{xx}[m] = R_{xx}[-m] \text{ (even)}$$



Probability

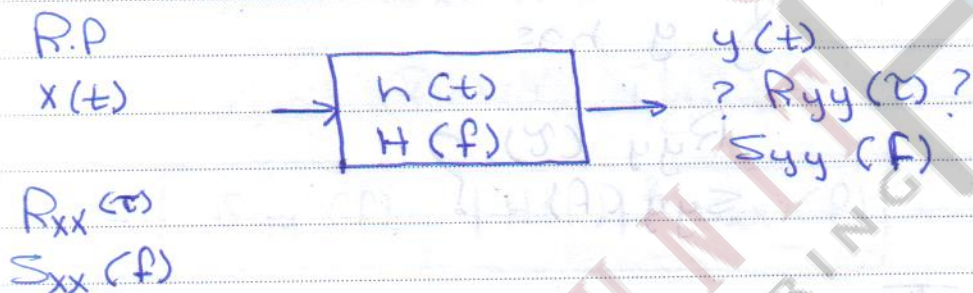
NoteBook

Dr. Jamal Rahal

By: Farah Abo Alssamin

بِأفكارنا نبدع

* System Response to R.P :-



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

x & y are dependent

$y(t)$ could be uncorrelated

⊗ Using a certain system, we can decorrelate x

$$R_{yy}(\tau) = \delta(\tau)$$

$$S_{yy}(f) = A \quad -\infty \leq f \leq \infty$$

⌈ This system is called Whitening Filter

white \rightarrow بيضاء

البيضاء من $-\infty$ إلى $+\infty$

x could be colored process
 & we generate a white
 process by whitening
 process.

if $R_{xx}(\tau) = B S(\tau)$
 $S_{xx}(f) = B \quad -\infty \leq f \leq \infty$

y has

$R_{yy}(\tau)$?
 $S_{yy}(f)$?

↳ This filter we called it Innovation Filter

$$R_{yy}(\tau) = E \{ y(t) \cdot y^*(t+\tau) \}$$

$$= E \{ (x(t) * h(t)) \cdot (x(t+\tau) * h(t+\tau)) \}$$

Constant

(تذكر ان x و h هما دالتان ثابتتان)

$$= E \{ \left(\int x(v) h(t+\tau) dv \right) \left(\int x(u+\tau) h(u-\tau-v) du \right) \}$$

Linear operator → convolution

$$R_{yy}(\tau) = h(t) * R_{xx}(\tau) * h^*(t) \quad \text{معادلة (*)}$$

(*) In digital form

$$R_{xx}[m] = E \{ \vec{x} \cdot \vec{x}_m \}$$

$$\vec{y} = H \cdot \vec{x}$$

$$R_{yy} = E \{ H \bar{x} \cdot (H \bar{x})^* \}$$

$$= H E \{ \bar{x} \bar{x}^* \} H^*$$

$$\rightarrow R_{yy} = H R_{xx} H^*$$

الرجوع لقاعدة (*) بتغيير

SLD
STU
LAPU

$$S_{yy}(f) = |H(f)|^2 S_{xx}(f)$$

$$R_{yy} = H R_{xx} H^*$$

$$h = [h_1, h_2, \dots, h_N]$$

$$H = \begin{bmatrix} h_0 & h_1 & \dots & h_N & 0 & 0 & 0 \\ 0 & h_0 & h_1 & \dots & h_N & 0 & 0 \\ \vdots & \vdots & \ddots & \ddots & \ddots & \ddots & \ddots \\ 0 & 0 & 0 & h_0 & h_1 & \dots & h_N \end{bmatrix}$$

* Whitening filter

$$\rightarrow \checkmark S_{yy}(f) = \text{constant} = |H(f)|^2 \cdot S_{xx}(f)$$

$$\Rightarrow |H(f)|^2 = \frac{k}{S_{xx}(f)}$$

$$\rightarrow \checkmark R_{yy}(\tau) = k \cdot \delta(\tau) \quad \text{Uncorrelated R.P.}$$

white noise

Thermal noise in electronic ckt's
is a white noise with
pdf $N(\sigma^2, 0)$

$$|H(f)|^2 = H(f) \cdot H^*(f)$$

* Innovation Filter

white noise

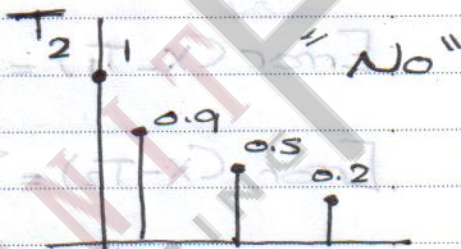
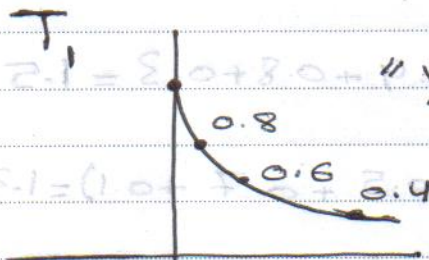
$$\begin{cases} S_{xx}(f) = K \\ R_{xx}(\tau) = K \delta(\tau) \end{cases}$$

$$S_{yy}(f) = |H(f)|^2 \cdot K$$

$$\begin{aligned} R_{yy}(\tau) &= K \text{FT}^{-1}(|H(f)|^2) \\ &= K h(\tau) * h^*(\tau) \end{aligned}$$

* Exe

$$X = [1 \ 2 \ 3 \ -1 \ -5 \ 3 \ 7 \ 2 \ 1 \ 2 \ 3 \ 4]$$



$$R_{xx}[m] = E \{ X[n] \cdot X[n+m] \}$$

$$R_{xx}[0] = \frac{1}{12} \sum_{n=0}^{12} X[n] X[n+0] = \frac{132}{12} = 11 \Rightarrow \frac{11}{11}$$

Normalized

$$R_{xx}[1] = \frac{+52}{12} = \frac{4-33}{11}$$

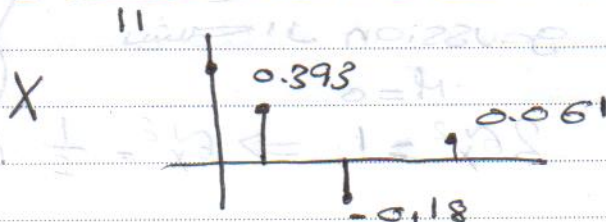
$$\Rightarrow [0 \ 0 \ 1 \ 2 \ 3 \ -1 \ -5 \ 3 \ 7 \ 2 \ 1 \ 2 \ 3 \ 4]$$

↑

$$R_{xx}[2]$$

$$R_{xx}[2] = \frac{-24}{12} = -2$$

$$R_{xx}[3] = \frac{0.67}{11} \Rightarrow [0 \ 0 \ 0 \ 1 \ 2 \ 3 \ -1 \ -5 \ 3 \ 7 \ 2 \ 1 \ 2 \ 3 \ 4]$$



* Fitness ?!

$$\text{Error} = \sum |R_{\text{template}}[m] - R_{xx}[m]|^2$$

$$\text{Error}(x-T_1) = \sum 0 + 0.4 + 0.8 + 0.3 = 1.5$$

$$\text{Error}(x-T_2) = \sum (0 + 0.5 + 0.7 + 0.1) = 1.3$$

Threshold $ex = 0.5$ ~ both values have to eq. 0.5 or if we have to choose between them choose less ex.
 \rightarrow better to divide by $(N-M)$ not N

* For small data & small m

$$R_{xx}[m] = \frac{1}{N-m} \sum_{i=1}^N x[i] x[i+m]$$

↑
biased

IF $N \rightarrow \infty$ unbiased (For large data)

$$* \text{Gaussian} \Rightarrow \frac{1}{\sigma \sqrt{2\pi}} e^{-x^2/2\sigma^2}$$

gaussian $\mu=0$

$$2\sigma^2 x^2 = 1 \Rightarrow \sigma^2 = \frac{1}{2}$$

$$\sum_{n=0}^{\infty} \frac{3^n}{n!} = ?$$