

DIGITAL SIGNAL PROCESSING NOTES



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Digital Signal Processing Notes, First Edition

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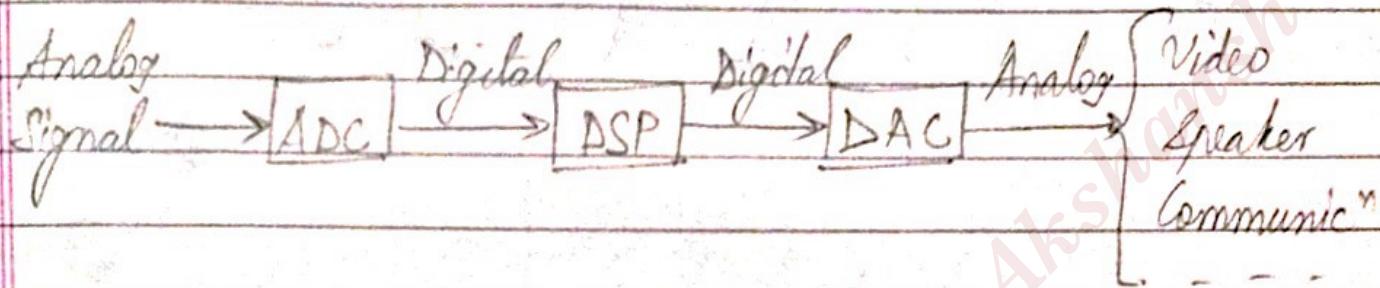
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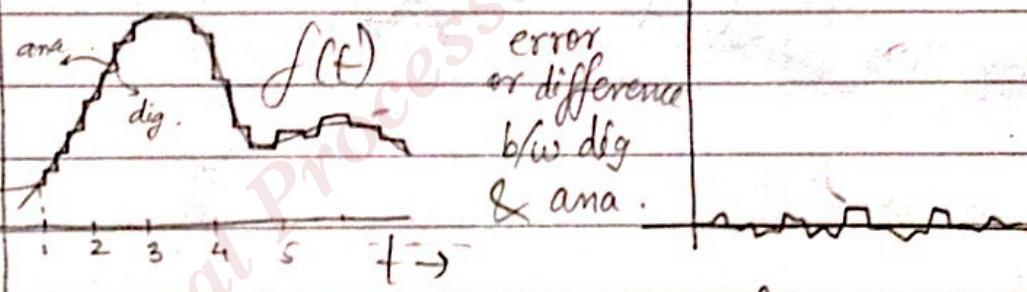
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Introduction



- * Consider an analog signal & its digital signal.
Aim :- find 2 component in the given $f(t)$



$$\text{Analog} = \text{Digital} + \text{error}$$

We have a time domain & want to use frequency

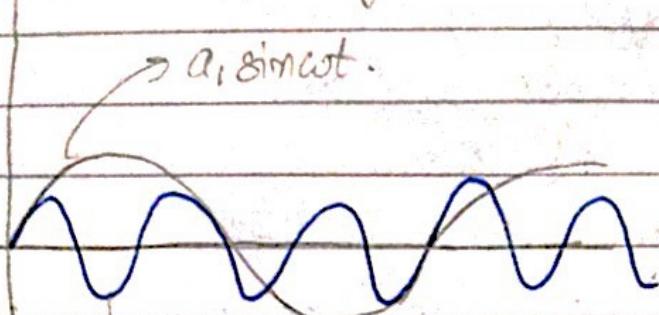
↓
USE FOURIER SERIES.

$$f(t) = a_0 + \sum (a_n \cos nt + b_n \sin nt)$$

DC component
in the given
electrical signal.

harmonic
components

* Idea : Consider 2 signals :-

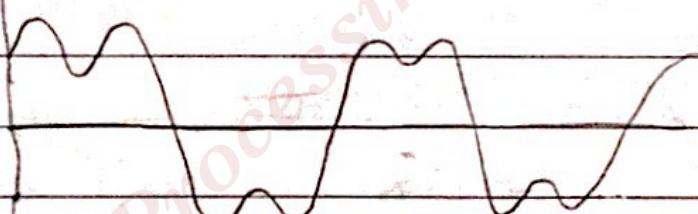


$$a_3 \sin 3\omega t$$

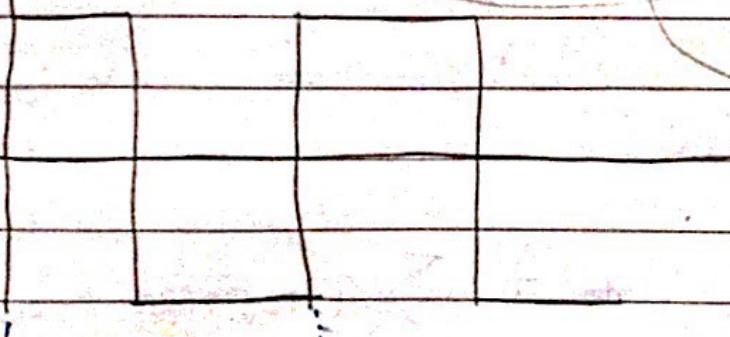
$$\omega = \pi/2$$

3rd harmonic

Adding above 2 fns



If further harmonics are taken & added
Going to ∞ frequencies, we get



fundamental \rightarrow
frequency

This pulse
cannot be
exact, because
physically, ∞
freq. can't be
realized.

* Discrete electrical components :- R, L, C.

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* Note :-

A capacitor consists of 2 II plates. These 2 are the conducting mediums. Whenever \exists conducting medium, \exists resistance; whenever \exists resistance, \exists delay.

So, capacitors have delays & ideal square pulses can't be physically realized.

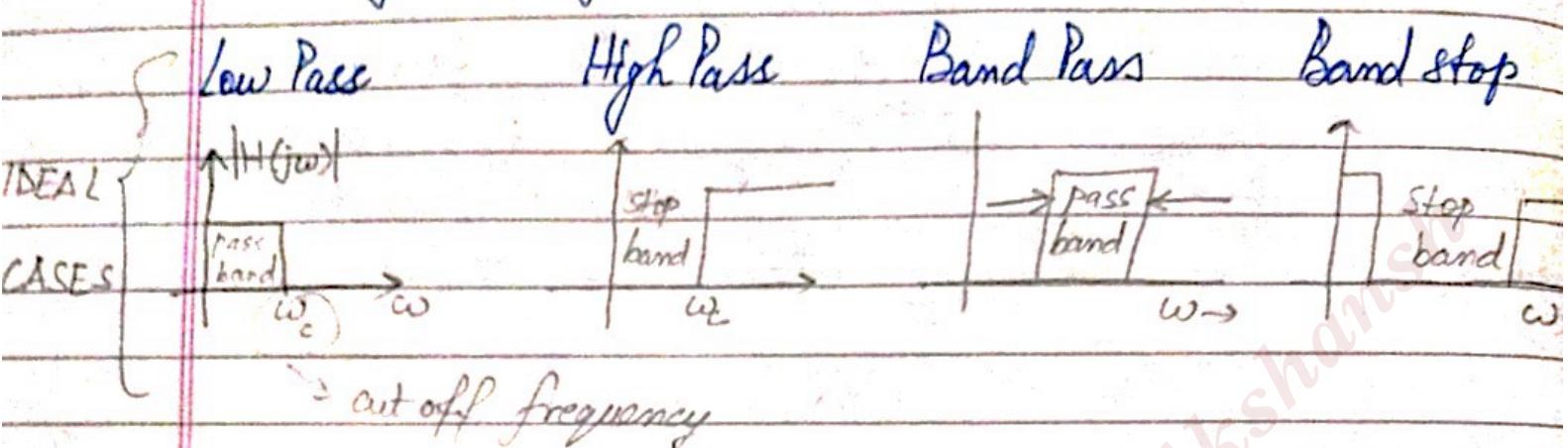
* Note :- We saw that analog signal is converted to digital by using 'many freq.' in terms of harmonics.

So, manually, while converting analog to dig, we are intentionally adding some extra freq. Same goes true when we change from dig. to analog. These extra freq. can be termed as errors in the signal.

So, in any physical applicn, to retain the actual signal, these errors need to be removed. This removal is called FILTERING THE FREQUENCY.

Various filters such as Band pass, Band stop, High pass & low pass \exists .

* Analog & Digital filters :-

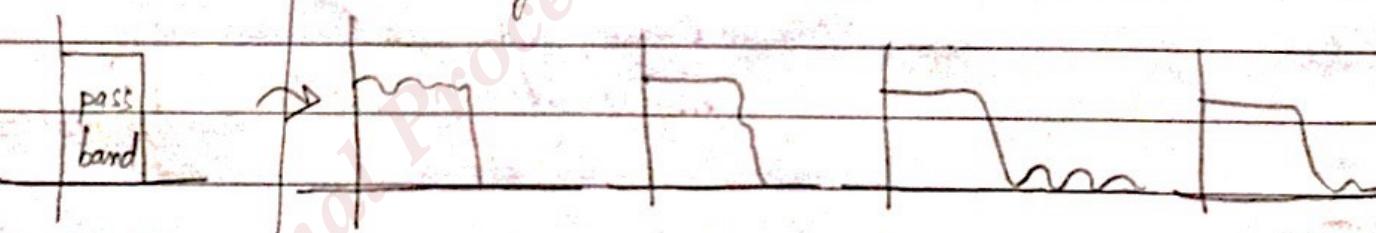


* Widely used low Pass Filters :-

- (a) Butterworth filter
- (b) Chebyshev filter
- (c) Elliptical

Ideal LPF

Changes that can come in real



- Properties of ideal filter :-
- group delay
- phase delay : -

Let $\gamma(H)$ be a distortionless filter

$\text{o/p } y(t) = G_1 g(t - \tau)$: change in amp. & phase shift

$$\begin{aligned} \text{Taking Fourier transform, } H(j\omega) &= \frac{Y(j\omega)}{R(j\omega)} \\ &= G_1 \cdot e^{-j\omega\tau} \end{aligned}$$

wrt frequency

$$\therefore A(\omega) = G \quad \text{&} \quad \phi(\omega) = -\omega T$$

Amplitude response Phase response

GROUP DELAY :-

$$-\frac{d\phi(\omega)}{dw} = T_g(\omega) = T$$

↳ for a distortionless filter, gain & group delay are const over non-zero range of ip spectrum.

- * let $x(t) = A \cos \omega t$ → a single spectral component
 $y(t) = B \cos(\omega t + \phi) = B \cos \omega(t - t_0)$; $t_0 = -\frac{\phi}{\omega}$

(ϕ : phase shift, the delay in transferring signal from ip to op)

PHASE DELAY : $-\frac{\phi(\omega)}{\omega} = t_0$

↳ $\phi(\omega)$ is phase shift of filter.



IDEAL filters : • non causal -- physically unrealizable.
 Hence, characteristics or TF approxim. is reqd.

- * Distortion from Ampl. char. is called Amplitude distortion
 Distortion from Phase char. is called Phase distortion

* For communication applicns:-

- Amp. distortion should be min.
- Phase distortion should be tolerable to some extent

* Image, video applicns:-

- Linear phase char. is imp.
- Amp. distortion can be tolerated to some extent

if not, then
pixel distortion
will happen

if not,
quality/color can
change; no overall change of image

* Approximn' of ideal filters :-

nominal Ap amplitude	permissible variation		
A_{s_n}	pass band	trans ⁿ band	stop band
amplitude/attenuation in stop band			

(a) * BUTTERWORTH FILTER (BF)

↳ monotonically ↑ char. ; no oscill.

$$|H_{Bn}(j\omega)| = \frac{1}{\sqrt{1 + \left(\frac{\omega}{\omega_c}\right)^{2n}}} \quad \begin{matrix} \rightarrow n: \text{+ve integer} \\ \omega_c: 3 \text{ dB cut off freq} \end{matrix}$$

3 dB : Also called $\frac{1}{2}$ power pt

Puffin

Bad Day

* WHAT ARE WE DOING?

For any signal applicⁿ, a particular type of signal is reqd. So, a particular type of freq is reqd.

These filters have specific charac & we want to choose a specific filter for our reqd charac

Normalising :-

$$|H_{Bn}(j\omega)| = \frac{1}{\sqrt{[1 + (\frac{\omega}{\omega_n})^{2n}]}}$$

Note * Increase order, increase ideality

* S-domain TF of BF is $|H_{Bn}(j\omega)|^2 = \frac{1}{1+\omega^{2n}}$

$$j\omega = s$$

$$|H_{Bn}(s)|^2 = \frac{1}{1 + (s/j)^{2n}} = \frac{1}{1 + (-s^2)}$$

Considering LHS & RHS of s-plane $\left\{ \text{or } H_{Bn}(s) \cdot H_{Bn}(-s) = \frac{1}{1 + (-1)^n s^{2n}} \right.$

$D_n(s)$: factorise, consider roots in LHS for physically realisable filter fⁿ.

* Polynomials corresponding to each order

$$n = 1,$$

$$H_{B1}(s) H_{B1}(-s) = \frac{1}{1-s^2} = \frac{1}{(1+s)(1-s)}$$

\equiv Butterworth
TF for $n=1$

$$\Rightarrow H_{B1}(s) = \frac{1}{1+s}$$

$$(n=2)$$

$$H_{B2}(s) H_{B2}(-s) = \frac{1}{1+s^4} = \frac{1}{(1+\sqrt{2}s+s^2)(1-\sqrt{2}s+s^2)}$$

$$\Rightarrow H_{B2}(s) = \frac{1}{(s^2 + \sqrt{2}s + 1)}$$

likewise, $n=3$,

$$H_{B3}(s) = \frac{1}{(1+s)(1+s+s^2)}$$

----- & so on

butterworth

Q Design a filter for a signal with amp. 1 dB & cut off freq 2 kHz
stop band attenuation should be ≤ 1 dB at 1 kHz
pass band attenuation should be > 60 dB at 8 kHz

Idea: We have 3 pts. We want to find the order of filter which will fit the box given by these 3 pts.

Corresponding to order, we can get the normalised polynomial.

has normalised freq.

so, we have to denormalise it to suit our freq.

Butterworth filters

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Order

Polynomial

1

$$s+1$$

2

$$s^2 + 1.414s + 1$$

3

$$(s+1)(s^2 + s + 1)$$

4

$$(s^2 + 0.7654s + 1)(s^2 + 1.8478s + 1)$$

5

$$(s+1)(s^2 + 0.618s + 1)(s^2 + 1.618s + 1)$$

6

$$(s^2 + 0.5176s + 1)(s^2 + 1.4142s + 1)(s^2 + 1.939s + 1)$$

* Finding pole locⁿs

$$\text{Loc}^n \text{ of } m^{\text{th}} \text{ pole, } S_m = e^{j(2m-1)\frac{\pi}{2n}} \cdot e^{j\frac{\pi}{2}} \quad (\because s^k = m, s = m^{\frac{1}{k}})$$

$$= j e^{j(2m-1)\frac{\pi}{2n}} \quad \text{or} \quad e^{j(2m-1)\frac{\pi}{2n} + \frac{\pi}{2}}$$

$$= \sqrt{m} + j \omega_m$$

Solving & : $\downarrow \left[\begin{array}{c} (2m-1) \frac{\pi}{2n} + \frac{\pi}{8} \\ \hline m = 1, 2, \dots, 2n \end{array} \right]$
 getting
 by Euler's thm.

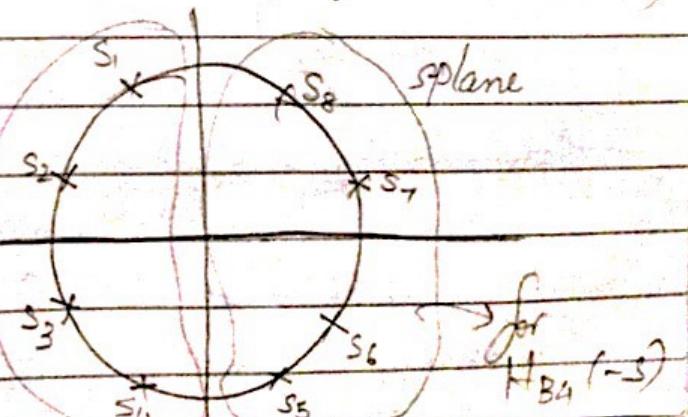
diff⁺ values of m gives
 diff⁺ locⁿ of poles.

(generally, order of sys = no. of poles)

* Consider n (order = 4)

Locⁿ of poles :

for $H_B(s)$



* BF Design: Filter design means determining the coeffs of polynomial of filter $H(s)$ which will satisfy the specific "n".

- Q. Specific "n": ① Attenuation atleast 10dB at $2\omega_c$
 ② cut off freq, $f_c = 300 \text{ kHz}$

$$\text{Soln: } -20 \log_{10} |H_{Bn}(j\omega)| = -20 \log_{10} (1+\omega^{2n})^{-1/2} \\ = 10 \log (1+\omega^{2n})$$

As per specs,

$$10 \log (1+\omega^{2n}) \geq 10 \text{ or } \log (1+\omega^{2n}) \geq 1$$

For normalised, make $\omega = 1$

As per specs, $\omega \rightarrow 2\omega_c$ So, make $\omega = 2$.

$$\therefore (1+\omega^{2n}) \geq 10 \text{ at } 2\omega_c \text{ (Normalised, } f=2\text{)}$$

$$\therefore (1+2^{2n}) \geq 10 \Rightarrow n=1.584$$

↳ should be \mathbb{Z} .

So, $n=2$ (assume)

So, order of filter = 2

for order = 2, polynomial (normalised)

$$H_{B2}(s) = \frac{1}{s^2 + \sqrt{2}s + 1}$$

As per spec(2), $f_c = 300 \text{ kHz}$,
 $\omega_c = 1.89 \times 10^3 \text{ rad/s}$

Changing $s \rightarrow s/\omega_c$ (denormalising it),

$$\Rightarrow H_{B2}(s/\omega_c) = \frac{1}{(s/\omega_c)^2 + \sqrt{2}(s/\omega_c) + 1} = \frac{1}{2.8 \times 10^7 s^2 + 7482 \times 10^3 s + 1}$$

Say, coeff. are $A = 2.8 \times 10^{-7}$
 $B = 0.7482 \times 10^{-8}$

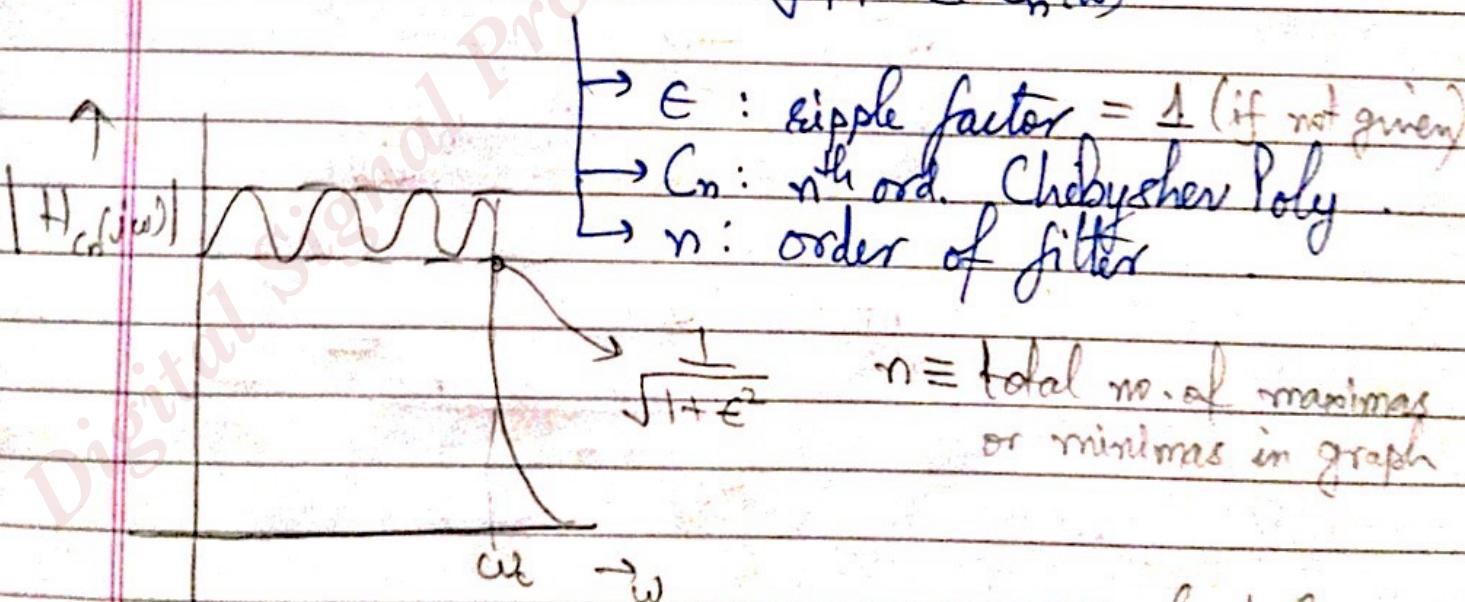
(b) CHEBYSHEV FILTERS:- (CF)

BF gives better amplitude response at nearly $w=0$, but poor response at the cut off freq.
 → Pass band : Oscillatory response \Rightarrow sine/cos

Stop band : Monotonic response \Rightarrow flat linear
 On the other hand, CF gives better cut off freq. response but poor (oscillating) amplitude response below cut off freq.

CF is given by :-

$$|H_{Cn}(j\omega)| = \frac{1}{\sqrt{1 + \epsilon^2 C_n^2(\omega)}}$$



Amp. response of CF
 for pass band

Polynomial : $C_n(\omega) = \cosh(n \cosh^{-1}\omega)$; $0.5\omega \leq 1$ below ω_c
 for stop band $= \cosh(n \cosh^{-1}\omega)$; $\omega \geq 1$ above ω_c

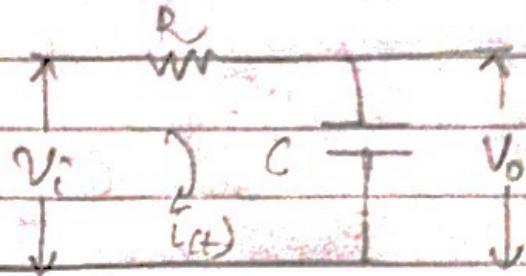
* For zero ord. filter :- \exists only resistance

Puffin

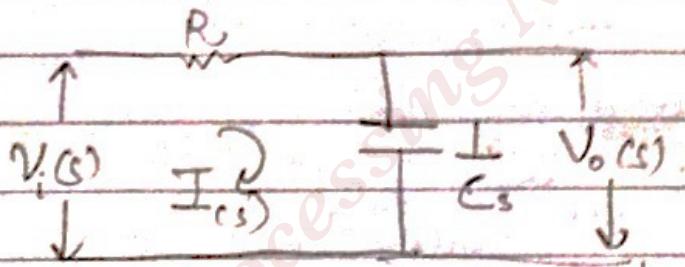
One
Day

Idea: find coeff. of the polynomial in s (denominator)
 → Make poly. of each order, make TF, relate w/ original TF, find coeff.

* Examp :- Consider a ckt



→ convert to s domain



$$\text{So, } V_o = I_{(s)}$$

$$V_i = \left(R + \frac{1}{C_s} \right) I_{(s)}$$

$$\text{So, TF} = \frac{I_{(s)}}{\frac{C_s}{I_{(s)} \left(R + \frac{1}{C_s} \right)}} = \frac{1}{1 + RC_s} = \frac{1}{1 + Ts}$$

(time const form)

* Polynomials corresponding to each order:-

- ~~(i)~~ (i) Let $\cos^{-1}\omega = \theta$; $\omega = \cos\theta$ below ω_c .
 $C_n(\omega) = \cos^n\theta$ i.e. n can be zero also.

* Time constt form

$$(2s^2 + 1)^{n-1} \cdot (Cs + \frac{1}{2})$$

DEA

$$\text{eq: } TF = \frac{1}{1 + 0.2s}$$

Puffin

Dia
Puffin

$$\Rightarrow T = 0.2 = RC$$

↳ assume any value of R & C
↳ what to take?

R=1, C=0.2 or anything else?

C=0.2F is very big. So, not practical. So, we deal with ckt of R=1 k Ω or 1 M Ω .

Here, R=1 Ω , very less, not good.

$$\therefore C_0(\omega) = 1 ; C_1(\omega) = \cos\theta = \omega ,$$

$$C_2(\omega) = \cos 2\theta = 2\cos^2\theta - 1 = 2\omega^2 - 1$$

& so on, - - -

* Chebyshov's Poly.

Order(n)

3

4

5

6

7

$C_n(\omega)$ Poly

$$4\omega^3 - 3\omega$$

$$8\omega^4 - 8\omega^2 + 1$$

$$16\omega^6 - 20\omega^3 + 5\omega$$

$$32\omega^6 - 48\omega^4 + 18\omega^2 - 1$$

$$74\omega^7 - 112\omega^5 + 57\omega^3 - 7\omega$$

Steps: find order, see polynomial from alone table,
find TF from formula

Under
Normalised

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* When $\omega > \omega_c$

$$\cosh^{-1}\omega = \alpha ; \omega = \cosh \alpha = e^{\alpha} + e^{-\alpha}$$

$$\text{for } \alpha \gg 1, \omega = e^{\frac{\alpha}{2}}$$

$$\text{or } 2\omega = e^{\alpha}$$

$$\Rightarrow \alpha = \ln(2\omega) ; C_n(\omega) = \cosh(n \cosh^{-1}\omega) = \cosh n$$

$$= \cosh(n \ln 2\omega) = \cosh(\ln(2\omega)^n)$$

$$\text{for } \omega \gg 1 ; C_n(\omega) = e^{\frac{\ln(2\omega)^n}{2}} = (2\omega)^{\frac{n}{2}}$$

e.g. Design a filter s.t.

$$|H_{Cn}(j\omega)|^2 = \frac{1}{1 + \epsilon^2 C_n^2(\omega)}$$

$$\left|H_{Cn}(s)\right|^2 = \frac{1}{1 + \epsilon^2 C_n^2(s/j)} = H_{Cn}(s) \cdot H_{Cn}(s)$$

Chebyshev Poly. is. $1 + \epsilon^2 C_n^2(s/j) = 0$ $\rightarrow s = j\omega$
 $\text{or } C_n(s/j) = \pm j/\epsilon$

For pass band, $0 \leq \omega \leq 1$; $\cos[n \cos^{-1}(s)] = \pm \frac{j}{\epsilon}$

$$\text{Let } \cos^{-1}(j) = \alpha - j\beta \quad \therefore \cos(n\alpha - j n\beta) = \pm j$$

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$$\text{Real} + j\text{Imaginary} = \pm j$$

Now,

$$\cos j\theta = \cosh \theta \quad \& \quad \sin j\theta = j \sinh \theta$$

$$\therefore 0 + j\left(\pm \frac{1}{e}\right) = \pm j$$

Hence, $\cos n\alpha \cosh n\beta + j \sin n\alpha \sinh n\beta = \pm j$

equating real & imaginary parts -

$$\Rightarrow \cos n\alpha \cosh n\beta = 0 \quad \& \quad \sin n\alpha \sinh n\beta = \pm j$$

But $\cosh n\beta \neq 0$.

$$\Rightarrow \cos n\alpha = 0 \quad \therefore 2\alpha = (2m-1)\frac{\pi}{2} \quad \Rightarrow \alpha = \frac{(2m-1)\pi}{2n}$$

$$\& \quad \sin n\alpha = \sin\left(\frac{(2m-1)\pi}{2}\right), \quad m = \mathbb{Z}^+ \\ (1, 2, 3, \dots)$$

$$\Rightarrow \sinh n\beta = \pm \frac{1}{e}$$

$$\therefore \beta = \pm \frac{1}{n} \sinh^{-1}\left(\frac{1}{e}\right)$$

Roots of Cheby. Poly is $\cos^{-1}(j) = \alpha - j\beta$.

$$\begin{aligned} \text{or } f_n &= j \cos(\alpha - j\beta) \\ &= -\sin \alpha \sinh \beta + j \cos \alpha \cosh \beta \end{aligned}$$

Substituting for α & β -

$$S_m = - \left[\underbrace{\frac{8^m (2m-1)\pi}{2^n} \cdot \sinh\left(\frac{1}{n} \sinh^{-1}\left(\frac{1}{e}\right)\right)}_{T_m} + \right.$$

$$\left. \underbrace{\int \cos(2m-1)\frac{\pi}{2^n} \cdot \cosh\left(\frac{1}{n} \sinh^{-1}\left(\frac{1}{e}\right)\right)}_{W_m} \right]$$

$$\Rightarrow S_m = T_m + jW_m$$

real pole is given by this eqn

Hence, TF, $H(s) = \frac{C_n}{s - s_m}$

$$= \frac{(-1)^n \pi}{m=1} \left(\frac{s}{s_m} - 1 \right)$$

in normalised w or s .
 $\therefore C_0 = 1$

Prev. Knowledge:-

Time constt. form

$$\frac{1}{(s-a)(s-b)} = \frac{1}{abc} \left(\frac{s}{a} - 1 \right) \left(\frac{s}{b} - 1 \right) \dots = \frac{1}{abc} (T_1 s - 1) (T_2 s - 1) \dots$$

Pole zero form

open loop gain

Denormalising,

If ω is other than $\omega_c = 1$

$$H_{C_n}(s) = \frac{k}{(-1)^n \prod_{m=1}^n \left(\frac{s}{S_m \omega_c} - 1 \right)} \quad \begin{array}{l} \text{(Replacing } s \rightarrow s/\omega_c \text{)} \\ \text{in prev. formula} \end{array}$$

Within passband, $C_n(\omega)$ will have maxima & minima values at $+1$ & -1 . & beyond ω_c , the response monotonically decreases.

∴ Irrespective of order 'n',

$$\left| C_n(\omega) \right|_{\max} = 1 \quad \therefore \min. \text{ value of } \left| H_{C_n}(j\omega) \right| = \frac{1}{\sqrt{1+\epsilon^2}}$$

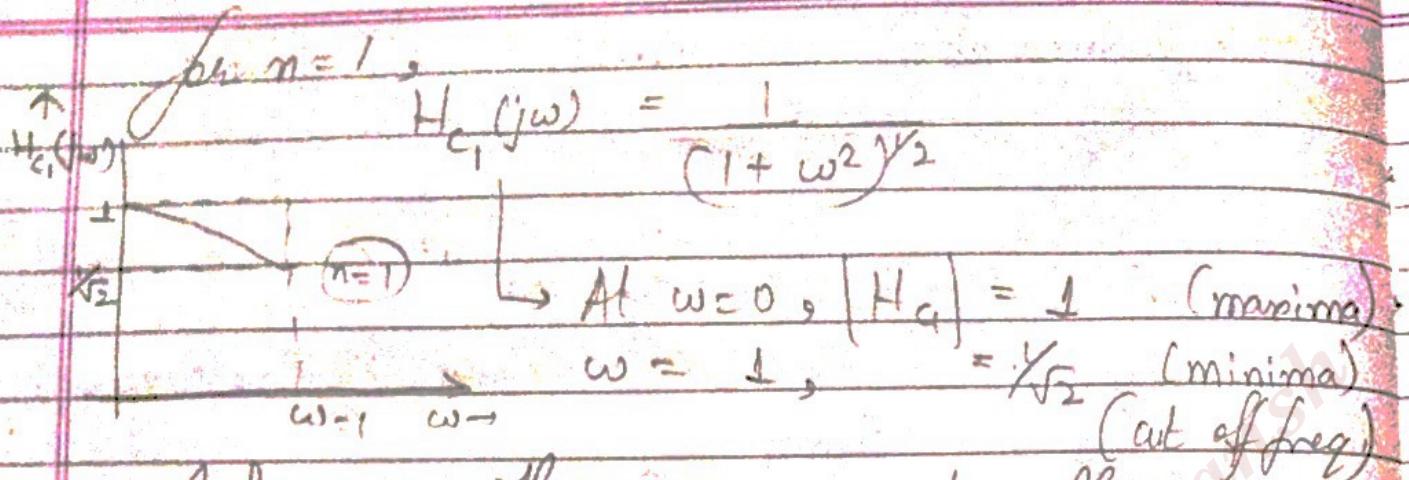
$$\therefore \text{Ripple}_{P-P} = 1 - \frac{1}{\sqrt{1+\epsilon^2}} \rightarrow \text{in dB}(\gamma), 20 \log(1+\epsilon^2)^{\frac{1}{2}}$$

$$\Rightarrow \boxed{\text{Ripple}_{P-P} = -10 \log(1+\epsilon^2)}$$

For a change of y dB, ripple factor can be found as: $y = -10 \log(1+\epsilon^2)$

* No. of ripples: i.e. no. of maxima & minima is equal to order of the filter and independent of ϵ .

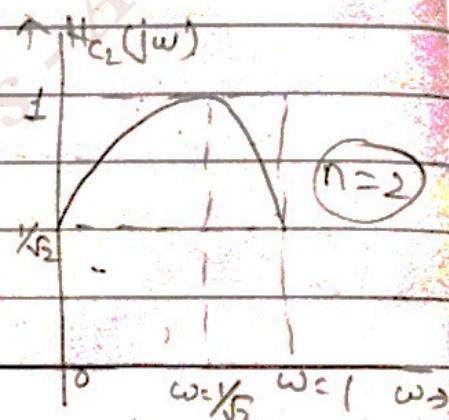
$$\text{Let } \epsilon = 1, \text{ so, } \left| H_{C_n}(j\omega) \right| = \frac{1}{\sqrt{1+C_n^2(\omega)}}$$



Inference : The response monotonically attenuates from 1 to $\frac{1}{\sqrt{2}}$. \Rightarrow one ripple for $n=1$!

for $n=2$, $C_2 = 2\omega^2 - 1$

$$|H_{C_2}(j\omega)| = \frac{1}{\sqrt{1 + (2\omega^2 - 1)^2}}$$



$\omega=0$, $H_{C_2} = \frac{1}{\sqrt{2}}$ (minima)
 $\omega=1$, $= \frac{1}{\sqrt{2}}$ minima

Its max. value occurs at $\omega = \sqrt{\frac{1}{2}}$ (\because den. becomes 0 at that pt.)

\Rightarrow one maxima & one minima at $n=2$

So, from the curve given, order of Chebyshev's poly. can be known.

$$\text{Normalised freq } \omega = \frac{\omega}{\omega_c}$$

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- eq Specific :- (i) Ripple in pass band ≈ 1 dB.
 Given (ii) $\omega_c = 3$ kHz
 (iii) Amplitude attenuation at least 20 dB at 6 kHz
- To find : Design chebyshev Filter for spec given

Idea : Find ϵ, n .
 Then, TF ✓

Spec. 1

$$10 \log(1 + \epsilon^2) = 1 \Rightarrow \epsilon = 0.51$$

Spec. 2

$$\omega_c = 3 \text{ kHz}$$

$$\therefore \text{Normalised, } \omega = \frac{6}{3} = 2$$

Spec. 3

$$|H_{Cn}(j\omega)| \text{ dB} = 10 \log [1 + 0.51^2 C_n^2(2)] > 20 \text{ dB}$$

$$\Rightarrow C_n^2(2) > 382$$

$$\left\{ \begin{array}{l} \rightarrow n=1, C_1 = \omega \\ \Rightarrow \omega^2 = 2^2 = 4 \end{array} \right.$$

$$\times 382$$

$$\rightarrow n=2$$

$$C_2 = 49 \times 382$$

$$\rightarrow n=3$$

$$C_3 = (4w^3 - 3w)^2$$

$$= (4 \times 8 - 3 \times 2)^2 = 676$$

> 382

So, order = 3. ✓

New TF $H_{C_3}(s)$ is to be found out from
 $s_1, s_2 \& s_3$

$$s_m = -\sin((2m-1)\pi) \operatorname{asinh}\left(\frac{1}{3}\right) \operatorname{sech}^{-1}\left(\frac{1}{0.5}\right)$$

$$+ j \cos((2m-1)\pi) \operatorname{cosh}\left[\frac{1}{3}\right] \operatorname{sech}\left(\frac{1}{0.5}\right)$$

$$s_1 = -0.2471 + j(0.955)$$

$$s_2 = -0.4942$$

$$s_3 = -0.2471 - j0.955$$

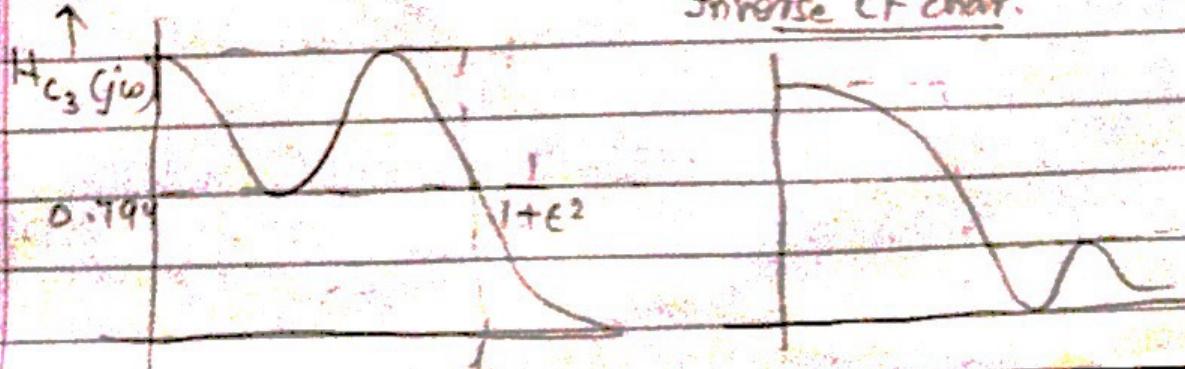
$$\therefore H(s) = \frac{k}{(-1)^n \prod_{m=1}^n \left(\frac{s}{s_m} - 1 \right)}$$

$$\text{for } k = 1, \omega_c = 2\pi \times 3 \times 10^3 \text{ rad/s}$$

$$H_{C_3}\left(\frac{s}{\omega_c}\right) = \frac{0.4913}{\left(\frac{s}{6\pi \times 10^3} + 0.988\left(\frac{s}{6\pi \times 10^3}\right)^2 + 1.23618\left(\frac{s}{6\pi \times 10^3}\right)^3 + 0.4913\right)}$$

So, the normalized magnitude of $H_{C_3}(s)$ will be shown below :-

Inverse CF char.



- * Change in freq. from pass band to stop band
 - ↳ easy in Chebyshev
 - ↳ not that possible in Butterworth

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* BESSEL FILTER

↳ which gives max. linear phase response
In all pole filter with

$$TF, H(s) = \frac{1}{BE_n} = \frac{1}{BESSEl Poly.}$$

$$\rightarrow BE_n(s) = \sum_{k=0}^n \frac{(2n-k)! s^k}{2^{n-k} \cdot k! (n-k)!}$$

$$\text{, where } \sum_{k=0}^n \frac{(2n-k)!}{2^{n-k} \cdot k! (n-k)!} = a_k$$

$$\therefore BE_n(s) = \sum_{k=0}^n a_k s^k$$

$$\rightarrow BE_0(s) = 1$$

$$\rightarrow BE_1(s) = s+1$$

$$\rightarrow BE_2(s) = s^2 + 2s + 3$$

$$\rightarrow BE_3(s) = s^3 + 6s^2 + 15s + 15 \quad \dots \text{etc}$$

* 1st ord. Bessel filter TF is $H_{BE_1}(s) = \frac{1}{1+s}$

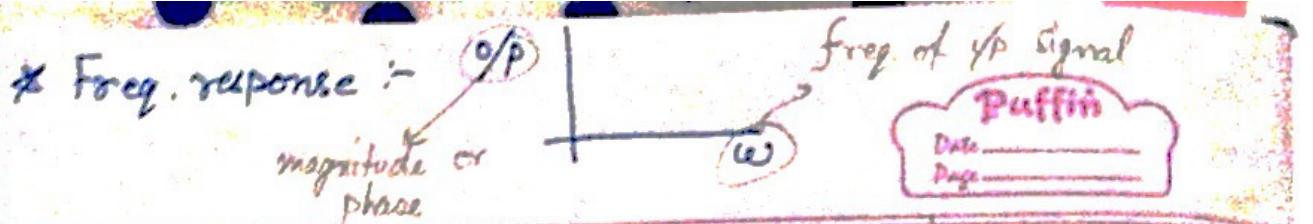
$$\Rightarrow H_{BE_1}(j\omega) = \frac{1}{1+j\omega} \times \frac{(1-j\omega)}{(1-j\omega)}$$

$$= \frac{1}{1+\omega^2} - j \left(\frac{\omega}{1+\omega^2} \right)$$

$$\text{Phase angle} = \phi_1(\omega) \in \tan^{-1}(-\omega) \in -\tan(\omega)$$

\downarrow
 $\text{Im}(\omega)$
 $\text{Re}(\omega)$

$$\text{Phase delay} = -(\text{Phase angle}) = \frac{\text{Im}(\omega)}{\omega}$$



$$\text{Group delay or time delay} = -\frac{d\phi(\omega)}{d\omega}$$

$$= \frac{d}{d\omega} (-\tan^{-1}(\omega))$$

$$\Rightarrow \text{Group Delay} = \frac{1}{1+\omega^2}$$

↳ for a TF = $\frac{1}{1+s}$

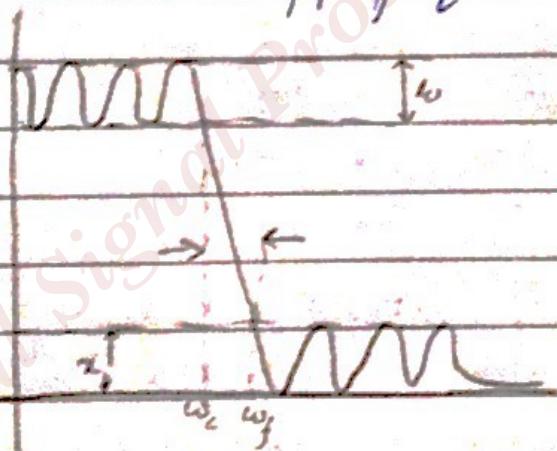
1/f_{pass}

Phase delay & group delay can be known
+ TF.

continued →

3) * ELLIPTICAL FILTER

↳ variation both in pass band & in stop band \Rightarrow transition band is less \Rightarrow ideal toward cut-off freq.



Note

Order $\uparrow \Rightarrow$ no. of energy storage devices (L, C) \uparrow
 \Rightarrow Cost \uparrow

* Butterworth Chebyshev Elliptical Bessel

Order(n)	Charr. b/w elliptical & Bessel (BF > CF)	lowest \rightarrow (min cost)	Max.
----------	---	------------------------------------	------

Phy. Char.	linear over $3/4$ th freq range	Highly sluggish	Max.
------------	---------------------------------	-----------------	------

Trans. band	b/w elliptical & Bessel (BF > CF)	Min	Max
-------------	--------------------------------------	-----	-----

* Nyquist theorem :- Sampling freq. for any signal (with freq., f) = Sampling freq. = $2f$

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Considering 2nd ord. Bessel's f_n :

$$H_{BE_2}(s) = \frac{1}{s^2 + 3s + 3}$$

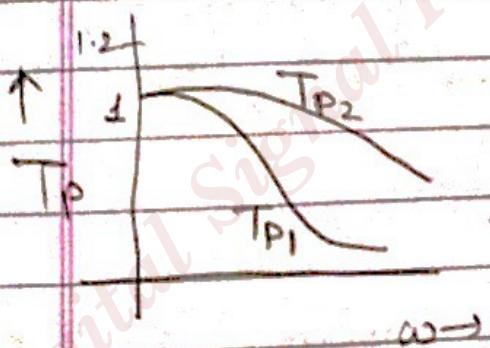
S1) $s \rightarrow j\omega$

S2) Divide into real & imaginary part

$$\therefore H_{BE_2}(j\omega) = \frac{1}{(3-\omega^2) + j(3\omega)} = \frac{3-\omega^2 - j3\omega}{(3-\omega^2)^2 + 9\omega^2} \\ = \frac{(3-\omega^2)}{(3-\omega^2)^2 + 9\omega^2} - j \frac{(3\omega)}{(3-\omega^2)^2 + 9\omega^2}$$

$$-\phi_2(\omega) = \tan^{-1}\left(\frac{3\omega}{3-\omega^2}\right)$$

$$\therefore T_{P_2} = \text{group delay} = \frac{d}{d\omega} \phi_2(\omega)$$



$$= \left[\frac{1}{1 + \left(\frac{3\omega}{3-\omega^2}\right)^2} \right] \frac{(3-\omega^2)(3) - (-2\omega)}{(3\omega)(3-\omega^2)} \\ \Rightarrow T_{P_2} = \frac{9 + 3\omega^2}{9 + 3\omega^2 + \omega^4}$$

* FREQUENCY TRANSFORMATION

The normalised freq (s) used so far was the prototype.

$$\text{Actual} = s_T$$

prototype

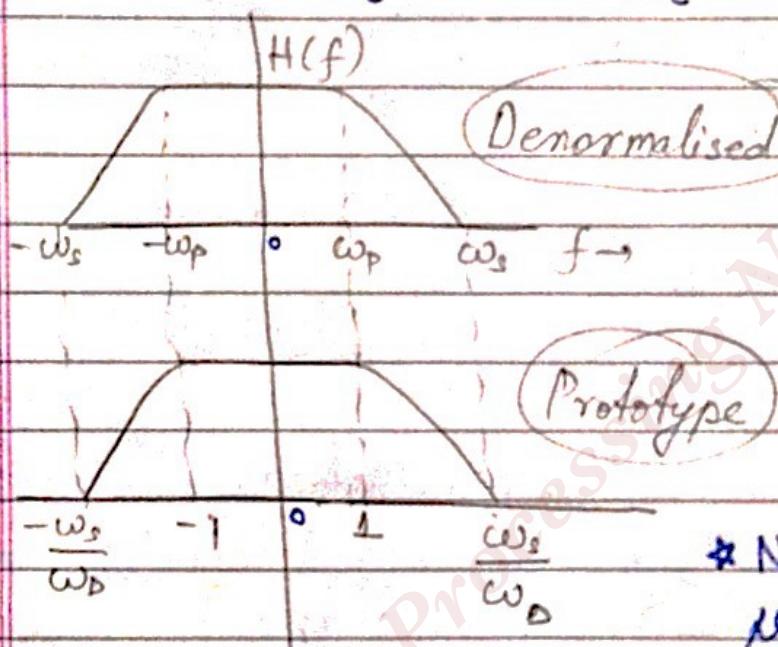
Case ① :- LP to LP

$$s = \frac{s_T}{\omega_c} ; \omega = \frac{\omega_T}{\omega_c}$$

$$\omega_{LP} = 0 \rightarrow \omega^P = 0$$

$\omega_{LP} \rightarrow$ LDW pass

$$\omega_{LP} = \omega_P \rightarrow \omega^P = 1$$



$$\omega_{LP} = \omega_p \rightarrow \omega^P = \frac{\omega_p}{\omega_p}$$

(where pass band & stop band edge freq. are $-w_s$ & w_s)

* Note: Critical freqs. of prototype filters are $0, 1, \frac{\omega_p}{\omega_p}$

Case ② : LP to HP

can be obtained by replacing $s \rightarrow \frac{1}{s}$ in the TF. $\therefore H(s) = G(s)$

transforms

$$s = \frac{1}{s_T} \rightarrow \frac{1}{s}$$

* HP filter freq ω_{hp} , prototype LP filter ω^P .
Reln b/w ω_{hp} prototype freq. & dimensional ω_p

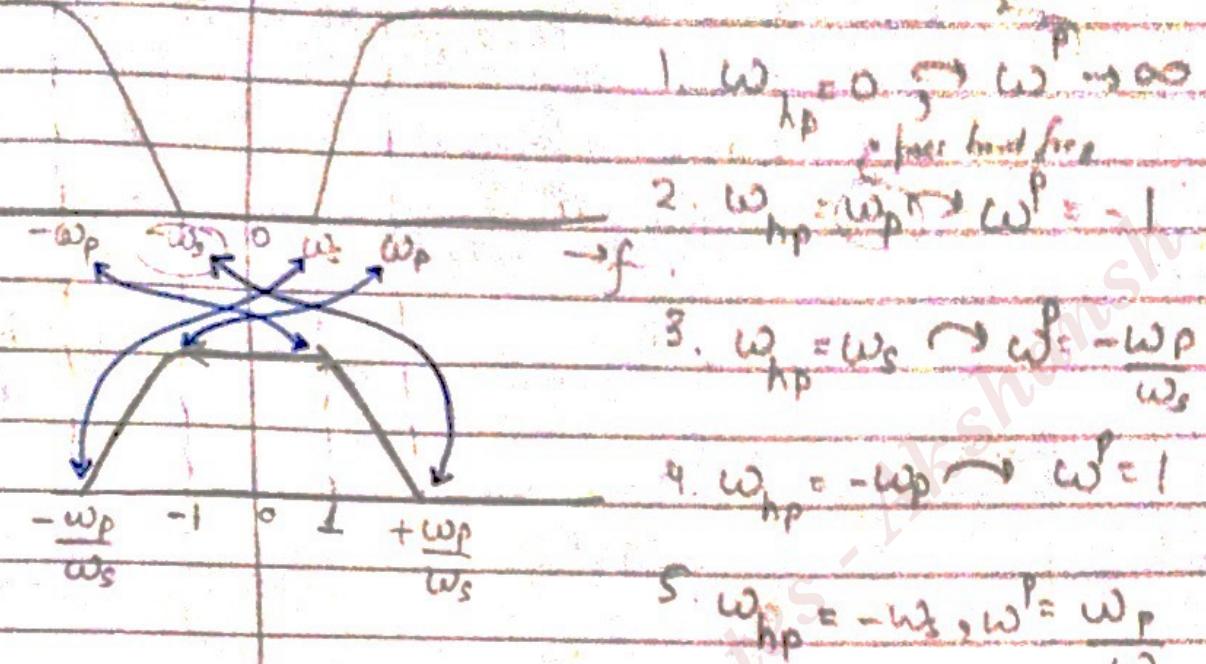
* For passing low \Rightarrow use $X_L (\propto \omega)$

For passing high \Rightarrow use $X_C (\propto \frac{1}{\omega})$

$$R = \omega L = X_L \rightarrow \text{Series.} \rightarrow \text{low pass}$$

$$= X_C \rightarrow \text{in parallel}$$

(are) $|H(f)|$



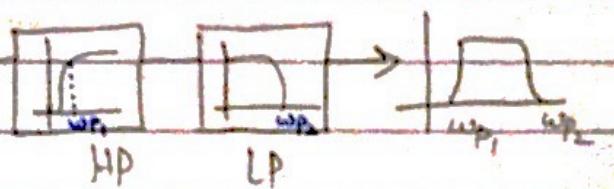
* Note $\frac{1}{s} = \frac{1}{j\omega} = -\frac{j}{\omega}$

So, +ve pass band edge \rightarrow correspond to -ve prototype \rightarrow & vice versa

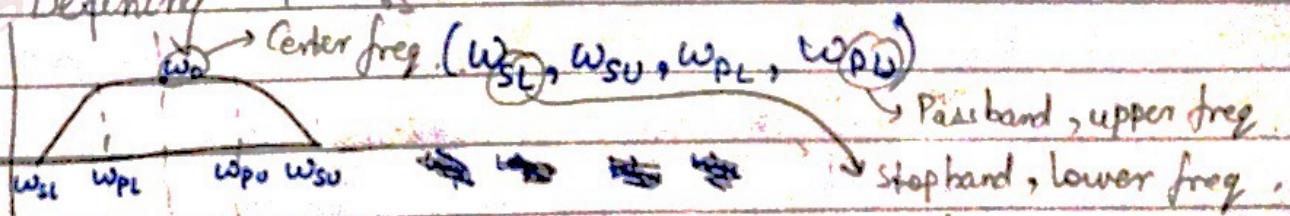
Case (3): LP \nleftrightarrow Band Pass filters

* Designing Band pass filter :-

combination of HP & LP



Defining 4 f_s :



$\leftarrow BW \rightarrow$

$$S = \frac{w_0 (S_T + w_0)}{w_b (w_0 - S_T)}$$

$$= S_T^2 + w_0^2$$

$$w_b \neq$$

• w_{PL} : lower cut off freq. of pass band

w_b : center freq.

S_T : transformed s.

$$\& w_0^2 = w_{PL} \cdot w_{PU} \quad \Rightarrow j^2 = -1$$

i.e., $w = \frac{w_T^2 - w_b^2}{w_T \cdot w_b}$

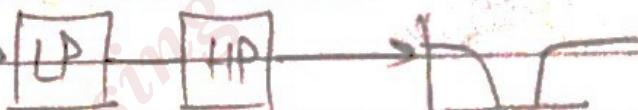
$$w_b = BW$$

$$= w_{PU} - w_{PL}$$

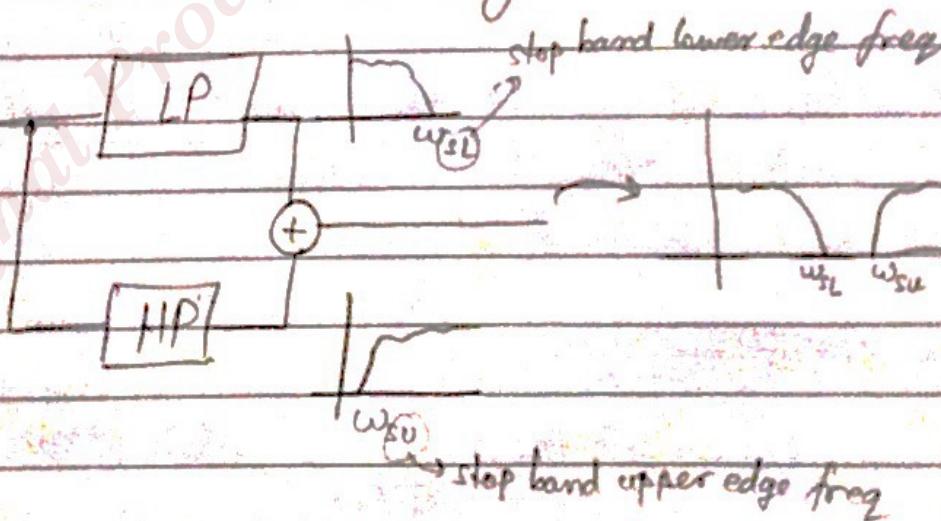
comes from $S_T = jw_T$

Case (4) :- Band Stop filter from (HP & LP).

Idea :-



Connect LP & HP filter in PARALLEL

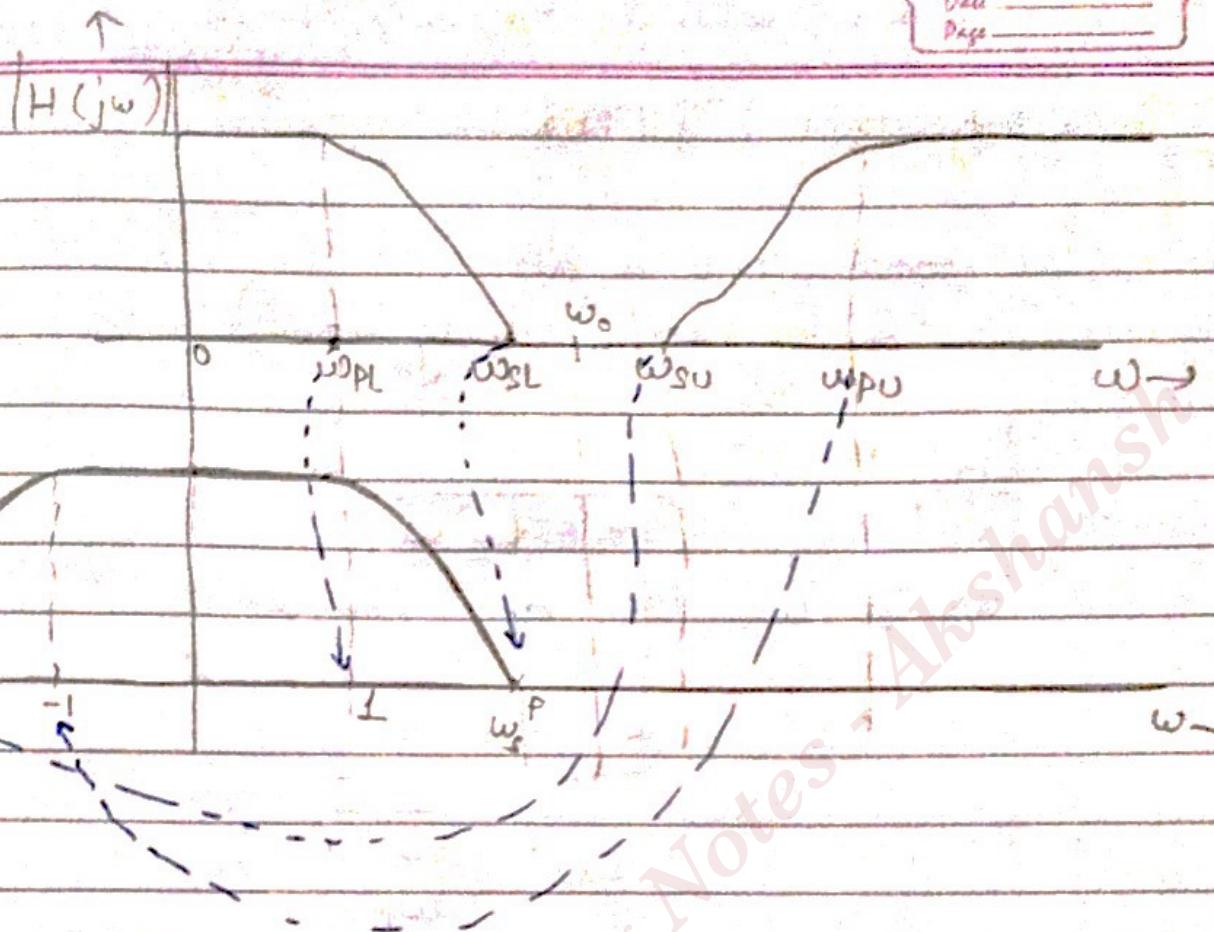


* LP to Band stop transform

$$S \rightarrow S_T \frac{w_b}{\sqrt{S_T^2 + w_b^2}} ; \quad jw^P = \frac{jw_T w_b}{(jw_T)^2 + w_b^2}$$

$$w^P = w_b \cdot w_{bs} \quad \text{band stop}$$

$$w_0^2 - w_{bs}^2$$



* SUMMARY

I) BUTTERWORTH FILTER

$$|H(j\omega)|^2 = \frac{1}{1 + \omega^{2n}} ; \quad N \geq \log \left(\frac{\frac{A_s}{10^{10}} - 1}{\frac{A_p}{10^{10}} - 1} \right)$$

For normalised filter:

$$S_k = e^{j \frac{\pi(2k-1+N)}{2N}} = \cos \theta + j \sin \theta$$

$\hookrightarrow k = 1, 2, \dots, N$

$\hookrightarrow \theta = \frac{\pi(2k-1+N)}{2N}$

$$2 \log \left(\frac{\omega_s}{\omega_p} \right)$$

Note

* If asked to design a filter, design a LP filter first (choosing from Butterworth, Cheby...) then denormalise it → finally, convert to reqd filter

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2) CHEBYSHEV'S FILTER

Pass band ripple in dB

$$= -20 \log_{10} (1 - S_p) = 10 \log_{10} (1 + \epsilon^2)$$

$$|H(j\omega)| = \frac{1}{\sqrt{1 + \epsilon^2 C_n^2 \omega}} ;$$

$$N \geq \cosh^{-1} \left[\frac{\frac{A_s}{10^{10}} - 1}{\frac{10^{A_p/10}}{10} - 1} \right] \cosh^{-1} \left(\frac{\omega_s}{\omega_p} \right)$$

For normalized filter :-

$$S_k = \sinh(\alpha) \cos(\beta_k) + j \cosh(\alpha) \sin(\beta_k)$$

$$\alpha = \frac{1}{N} \sinh^{-1} \left(\frac{1}{\epsilon} \right)$$

$$\beta_k = \frac{\pi(2k+N)}{2N}$$

↪ k = 1, 2, ..., N

Note * If asked to design a filter, design a LP filter first (choosing from Butterworth, Cheby...) then denormalise it → finally, convert to reqd filter

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2) CHEBYSHEV'S FILTER

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$$|H(j\omega)| = \frac{1}{\sqrt{1 + \epsilon^2 C_n^2 \omega^2}} ;$$

$$N \geq \cosh^{-1} \left[\frac{\frac{A_s}{10^{10}} - 1}{\frac{A_P}{10} - 1} \right] / \cosh^{-1} \left(\frac{\omega_s}{\omega_p} \right)$$

For normalized filter :-

$$S_k = \sinh(\alpha) \cos(\beta_k) + j \cosh(\alpha) \sin(\beta_k)$$

$$\alpha = \frac{1}{N} \sinh^{-1} \left(\frac{1}{\epsilon} \right)$$

$$\beta_k = \frac{\pi(2k+N-1)}{2N}$$

↪ k = 1, 2, ..., N

e.g. Design a BP filter to meet the following specs:

- (a) 3 dB attenuation at 10 k rad/s & 15 k rad/s.
- (b) Attenuation more than 25 dB for freq. less than 5 k rad/s & more than 20 k rad/s.

Idea:- look for pass band & stop band edge freq.

For 3 dB attenuation, its pass band freq

$$\text{So, } \omega_{pl} = 10 \text{ k rad/s}$$

$$\omega_{pu} = 15 \text{ k rad/s}$$

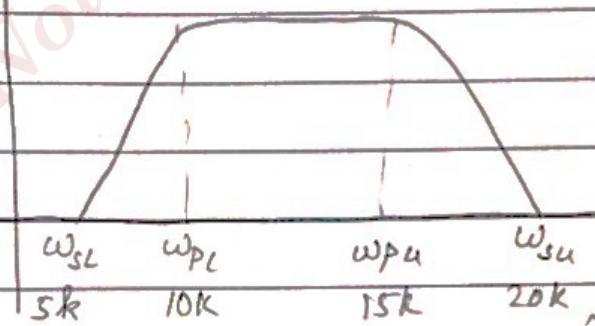
25 dB freq tells stop band freq

$$\Rightarrow \omega_{sl} = 5 \text{ k rad/s}$$

$$\omega_{su} = 20 \text{ k rad/s}$$

Now,

Freq. response :-



$$\omega_0^2 = \omega_{pl} \times \omega_{pu} = 10 \times 15 \times 10^3 \text{ rad/s}$$

$$= 150 \times 10^6$$

$$\omega_b = \omega_{sl} = 5 \text{ k rad/s}$$

$$\omega = \frac{\omega_T^2 - \omega_0^2}{\omega_T \cdot \omega_b} = \omega_T^2 - (150 \times 10^6)$$

$$\omega_T (5 \times 10^3)$$

2nd spec. says:- for $\omega_T > \omega_{su}$ & $\omega_T < \omega_{sl}$,
attenuation is more than 25 dB

ω is assumed to be min. of the given
stop band freq. (\because for higher freq, attenuation
will be more than that of lesser freq.)

So,

$$\text{normalised } \omega_s^p = \min \left\{ \frac{(20 \times 10^3)^2 - 150 \times 10^6}{(20 \times 10^3)(5 \times 10^3)}, \frac{(5 \times 10^3)^2 - 150 \times 10^6}{(5 \times 10^3)(5 \times 10^3)} \right\}$$

$$\Rightarrow \omega_s^p = 5 \text{ rad/s.}$$

Assuming a Butterworth filter (for simplicity), the order has to be determined by TRIAL & ERROR i.e., taking $n = 1$.

$$HB_1(s) = \frac{1}{1+s} \Rightarrow HB_1(j\omega) = \frac{1}{1+j\omega} = \frac{1}{1+j(\zeta s)}$$

Taking in dB

$$\Rightarrow |HB_1(j5)| = 20 \log_{10} \left(\frac{1}{\sqrt{1+25}} \right)$$

taking $n = 2$.

$$HB_2(s) = \frac{1}{s^2 + \sqrt{2}s + 1}; HB_2(j\omega) = \frac{1}{(1-\omega^2) + j\sqrt{2}\omega}$$

for $\omega = 5$

$$HB_2(j5) = \frac{1}{(1-25) + j\sqrt{25} + 1}$$

in (dB) :-

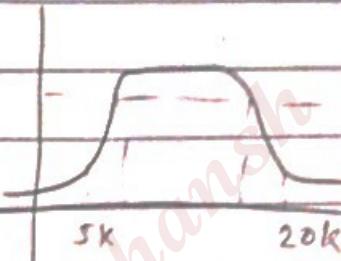
$$|HB_2(j5)| = 20 \log_{10} \left(\frac{1}{\sqrt{1+25}} \right) = 30 \text{ dB}$$

∴ It's satisfying 25 dB requirement

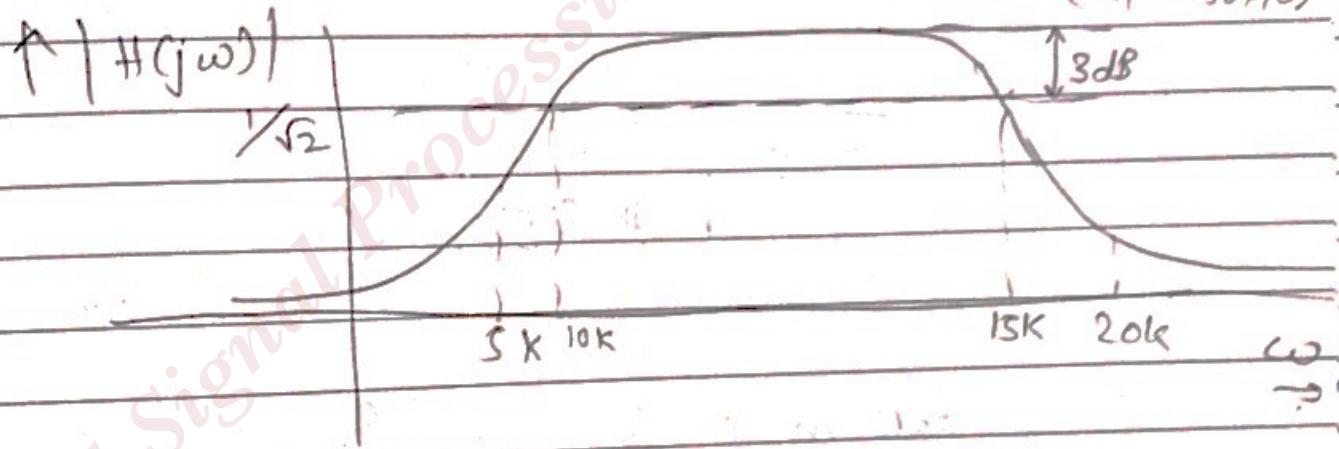
Now,

$$H_{B2T}(j\omega_T) = \frac{1}{(1-\omega^2) + j\sqrt{2}\omega}$$

$$= \frac{1}{1}$$



$$= \frac{1 - \left(\frac{\omega_T^2 - 150 \times 10^6}{5 \times 10^3 \times \omega_T}\right)^2 + j\sqrt{2} \cdot \left(\frac{\omega_T^2 - 150 \times 10^6}{5 \times 10^3 \times \omega_T}\right)}{\omega_T^4 + 275 \times 10^6 \omega_T^2 - (150 \times 10^6)^2 + j\sqrt{2} \times 5 \times 10^3 \cdot (\omega_T^2 - 150 \times 10^6)}$$



Observn :-

We took BF of ord. = 2

(When transformed to BP filter, we get ord. = 4)

(High Pass + low pass)

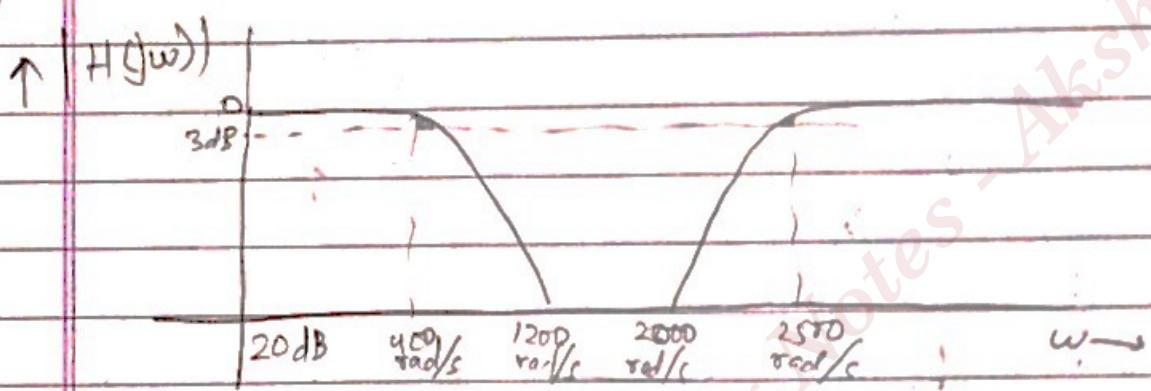
So, order is doubled.

eg Design a Band stop filter for following specs:

Stop \checkmark (a) Attenuation between 1200 rad/s & 2000 rad/s
must be atleast 20 dB

(b) Attenuation for less than 400 rad/s & higher
than 2500 rad/s must be less than 3 dB

Pass \checkmark



"Transform" is done for the specs:-

$$\omega = \frac{\omega_T (2000 - 1200) \omega_p}{-\omega_T^2 + (2000 \times 1200)}$$

$$\Rightarrow \omega = \frac{800 \omega_T \cdot \omega_p}{-\omega_T^2 + (2 \cdot 4 \times 10^6)}$$

ω_p : pass band edge freq. of BP filter (critical freq)
w.r.t prototype LP filter. To determine the
order of filter satisfying attenuation and

Transforming 2500 & 400 to prototype freq :-

$$\omega(2500) = -0.5195 \omega_p$$

$$\omega(400) = 0.1429 \omega_p$$

Attenuation has to be less than 3 dB for $\omega > 0.5195 \omega_p$
& $\omega < 0.1429 \omega_p$.

Choose ω_c of LP filter,

$$\omega_c = 0.5195 \omega_p$$

prototype, $\omega_c < 1 \therefore \omega_p$ of filter (BP) $= 1 - 1.925 \text{ rad/s}$

$$0.5195$$

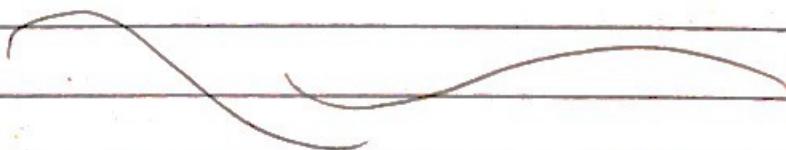
Also, prototype of filter should have an attenuation of more than 20 dB for $\omega \geq 1.925 \text{ rad/s}$. Based on this, determine the order of LP Butterworth filter i.e. $n=4$ (after checking for given attenuation)

From table $\therefore H(s) = \frac{1}{s^4 + 0.7654s^3 + 1.8478s^2 + 0.7654s + 1}$

Substitute i:-

$$\omega = \frac{800 \times 1.925 \omega_p}{2.4 \times 10^6 - \omega_p^2}$$

$$\Rightarrow H(s) = \frac{1}{s^4 + 5.62 \times 10^{12} s^4 + 9.55 \times 10^7 s^3 + 3.36 \times 10^9 s^2 + 1464 s + 1}$$



* For converting analog \rightarrow digital signal
(approx.)

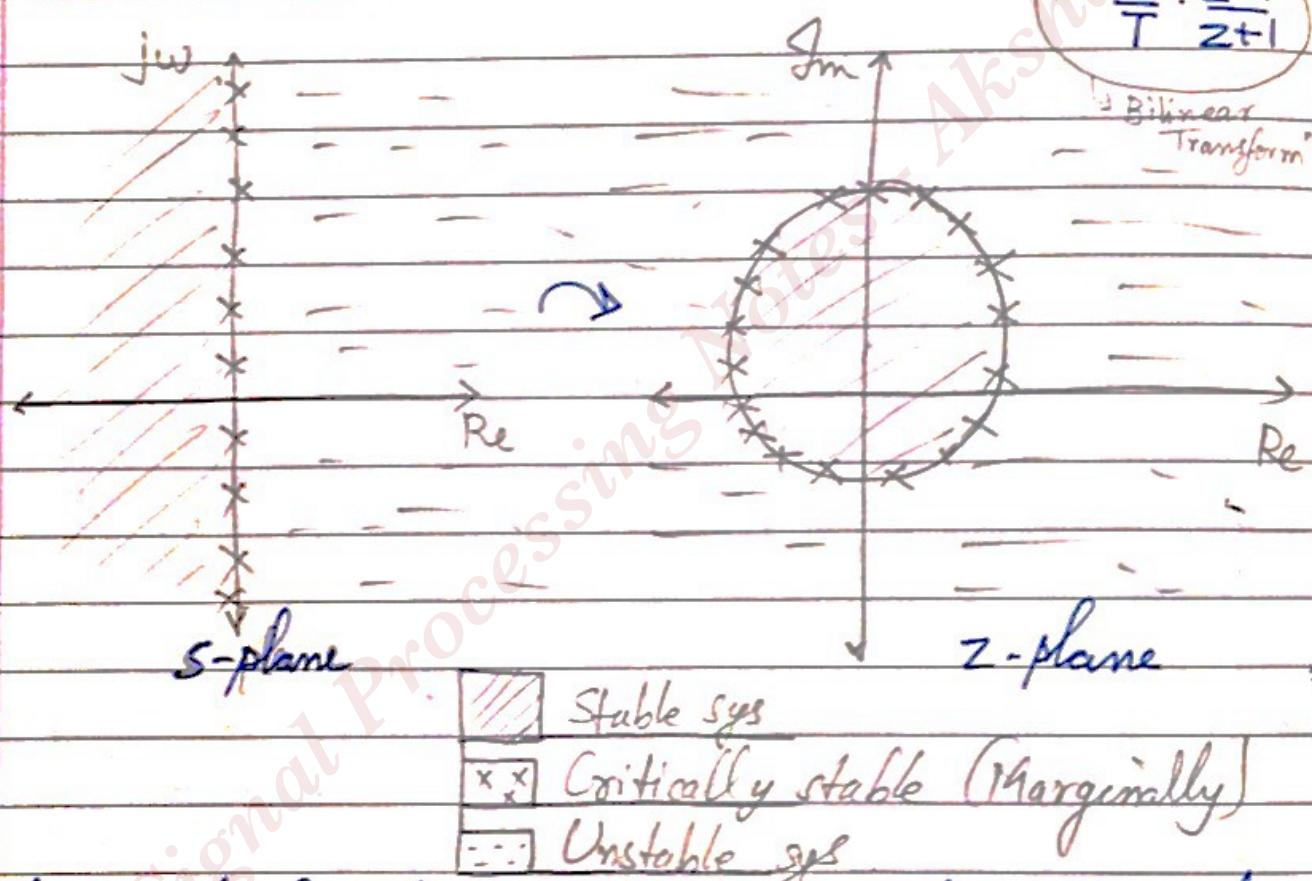
Sampling freq $\rightarrow \infty$.

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DESIGNING A DIGITAL FILTER

BILINEAR Z-TRANSFORM (BZT) METHOD:

Convert $H(s) \rightarrow H(z)$ by $H(z) = H(s)$ | Samp.



* In digital domain, TF is written in z-domain
(by z-transform)

* S-plane to z-plane mapping by Bilinear z-transform

$$Z = e^{j\omega t}; \quad s = j\omega' ; \quad \omega': \text{analog freq.}$$

ω_T = digital freq: represented as ω_1 .

TP corresponding to sampling freq

$$= \frac{1}{f_s}$$

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Substituting in $s = \frac{2}{T} \left(\frac{z-1}{z+1} \right) \Rightarrow \omega' = \frac{2}{T} \tan\left(\frac{\omega T}{2}\right)$

Whole of the left half of s-plane freq. is mapped to inside of unit circle i.e., digital freq. will be crunched up. This effect is compensated by Prewarping the analog filter freq. before the Bilinear Transform.

eg for a LP filter, either the cut-off freq. or band edge freq. as follows:-

$$\omega_p'$$

* Steps to BZT & Methods :-

S1. Use digital filter specs. and design a normalised prototype analog low pass filter, $H(s)$.

S2. Determine the prewarp edge freq. of the desired filter. ω_c for LPF or HPF & for BPF & BSF, ω_s & ω_p .

$$\text{as } \omega_c = \tan\left(\frac{\omega_c T}{2}\right) \text{ & } \omega' = \tan\left(\frac{\omega_p T}{2}\right)$$

$$\omega'_s = \tan\left(\frac{\omega_s T}{2}\right)$$

(Not using $\times \frac{2}{T}$)

* Z-transform : $\mathcal{Z}[x(n)] = X(z)$

$$\mathcal{Z}[x(n-1)] = z^{-1} X(z)$$

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- S3) Denormalise the analog prototype filter by replacing s in $H(s)$ with one of the transformⁿ depending on the type of desired filter.

LPF to LPF

$$s = \frac{s}{\omega_p'}$$

LPF to HPF

$$s = \frac{\omega_p'}{s}$$

LPF to BPF

$$s = \frac{s^2 + \omega_0^2}{B(bw) \cdot s}$$

LPF to BSF

$$s = \frac{(bw)s}{s^2 + \omega_0^2}$$

- S4) Apply BZT to obtain $H(z)$ by replacing s , in the denormalised TF $H'(s)$ as :-

$$H(z) = H'(s) \Big|_{s = \frac{z-1}{z+1}}$$

e.g Given a 2nd order LPF TF (analog)
 $H(s) = \frac{1}{s^2 + \sqrt{2}s + 1}$

Design a digital 2nd LPF TF

Using BZT method, obtain $TF = H(z)$ of digital filter, assuming 3 dB cut off freq. of 150 Hz & a sampling freq of 1.28 kHz

Time-domain

Z-domain

& $x(n)$ is one instant.
 $x(n-1)$ is prev. instant $\Rightarrow z^{-1}x(z)$ gives prev instant
 $x(n+1)$ is next instant $\Rightarrow z^{+1}x(z)$ gives next instant

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f_c :- Critical freq ; $\omega_p = 2\pi \times 150 \text{ rad/s}$.

$$F_s = \frac{1}{T} = 1.28 \text{ kHz}$$

\Rightarrow Prewarped critical freq :-

$$\omega_p' = \tan\left(\frac{\omega_p T}{2}\right) = 0.3857$$

The freq : scaled analog filter is given by

$$\begin{aligned} H(z) &= H(s) \Big|_{s=\frac{s}{\omega_p'}} = \frac{1}{(s - \frac{s}{\omega_p'})^2 + \sqrt{2}(s/\omega_p') + 1} \\ &= \frac{(\omega_p')^2}{s^2 + \sqrt{2}\omega_p's + (\omega_p')^2} \\ &= \frac{0.1488}{s^2 + 0.5455s + 0.1488} \end{aligned}$$

Applying BZT, gives

$$\begin{aligned} H(z) &\approx H'(s) \Big|_{s=\frac{z-1}{z+1}} = \frac{0.0878z^2 + 0.1756z + 0.0878}{z^2 - 1.0048z + 0.3561} \end{aligned}$$

$$\Rightarrow H(z) = \frac{0.0878(1 - 2z^{-1} + z^{-2})}{1 - 1.0048z^{-1} + 0.3561z^{-2}}$$

* $z^{(+ve no.)}$ = future prediction

$z^{(-ve no.)}$ = past instant \Rightarrow Physically realisable

So, it's necessary to convert to $z^{(-ve)}$

Note :- $Z^{-1}(Y(z)) = \{Y(k)\}$ any notation
 Drop T. So, 1, 2, 3 are samples \rightarrow discrete nos.
 \rightarrow samples or $Y(n)$ \rightarrow discrete nos.

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e.g An analog LP RC filter's normalised TF

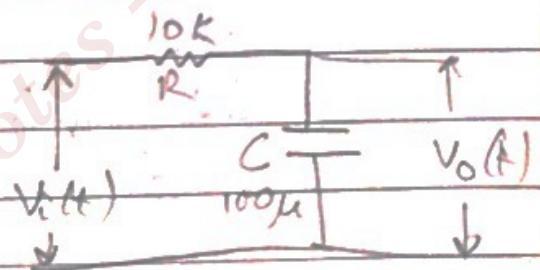
$$H(s) = \frac{1}{1+s}$$

Starting from s-plane eqn, determine (BZT method)
 TF of equivalent discrete-time biquad filter
 Assume sampling freq. of 150 Hz & cut-off freq of 30 Hz.

Critical freq, $\omega_p = 2\pi \times 30$.

$$\omega_p' = \frac{1}{2} \tan(\frac{\omega_p T}{2})$$

$$T = \frac{1}{150 \text{ Hz}}$$



$$\omega_p' = \frac{1}{2} \tan(\frac{\pi}{5})$$

$$H'(cs) = H(s) = \frac{1}{s + \frac{\omega_p'}{s}} = \frac{1}{(s + \frac{\omega_p'}{s}) + 1} = \frac{s}{s + 0.7265}$$

LP to
HP transform

Applying BZT

$$H(z) = H(cs) \Big|_{s = \frac{z-1}{2+1}} = \frac{(z-1)/(z+1)}{(z-1)/(z+1) + 0.7265}$$

$$\text{Simplifying, } H(z) = 0.5792 \left(\frac{1-z^{-1}}{1+0.1584z^{-1}} \right)$$

Coeff. of discrete time filter are

$$b_0 = 0.5792, a_1 = 0.1584$$

$$b_1 = -0.5792$$

9f

 $x(n)$ = present i/p, say $x(n-1)$ = one step back i/p $x(n-2)$ = two step back i/p

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DIGITAL FILTERS

Devices that transform a set of input sequence ($x(n)$) into a set of o/p sequence without loss of info.

Finite Impulse Response

~~FE~~ FIR

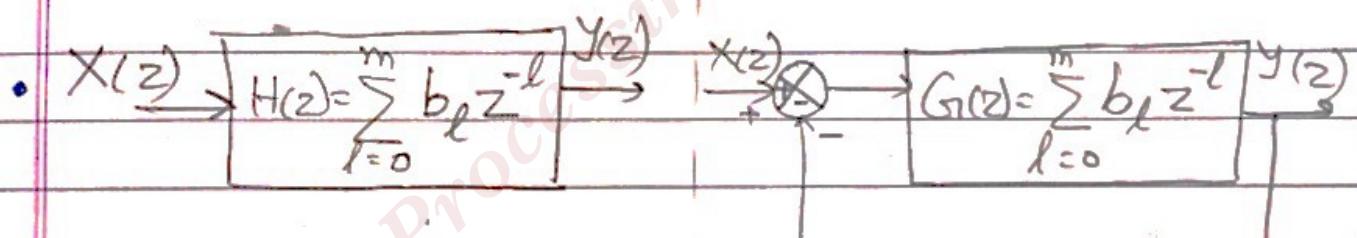
(finite duration)

Infinite Impulse Response

IIR

(Infinite durⁿ)

- An open loop filter whose o/p depends only on present & past i/p.
- Its closed loop filter whose o/p depends not only on present & past i/p, but also on PAST OUTPUTS



$$\frac{TF}{X(z)} = H(z) = \frac{Y(z)}{X(z)}$$

$$= \sum_{l=0}^m b_l z^{-l}$$

$$TF = H(z) = \frac{Y(z)}{X(z)} = \frac{G(z)}{1+G(z)}$$

$$H(z) = \frac{\sum_{l=0}^m b_l z^{-l}}{1 + \sum_{l=1}^m a_l z^{-l}}$$

• nonfeedback

• nonrecursive

• Needs more coeff. for same set of specificⁿ.

• Less chances of instability.

non feedback

non recursive

Merit: It needs fewer coeff.

Demerit: \exists chances that sys. may go in unstable mode (\because f/b sys).

* $z^{-1}(b, z^{-1}) = b$, $\alpha(n-i)$: i.e., considering one instant before present i/p & sampling it at that time; fraction of that sample is taken as b_1

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* Concepts of Digital Filter Design.

FIR

$$y(n) = \sum_{k=0}^{\infty} h(k) x(n-k)$$

$$= \sum_{k=0}^N b_k x(n-k) - \sum_{k=1}^M a_k y(n-k)$$

Reason:-

$$H(z) = Y(z) = b_0 + b_1 z^{-1} + \dots + b_N z^{-N}$$

$$\Rightarrow z^{-1}(Y(z) [1 + a_1 z^{-1} + a_2 z^{-2} + \dots + a_M z^{-M}])$$

$$= z^{-1}([b_0 + b_1 z^{-1} + \dots + b_N z^{-N}] X(z))$$

$$\Rightarrow y(n) + a_1 y(n-1) + \dots + a_M y(0)$$

$$= b_0 x(n) + b_1 x(n-1) + \dots + b_N x(0)$$

$$\Rightarrow y(n) = -[a_1 y(n-1) + \dots + a_M y(0)]$$

$$+ [b_0 x(n) + b_1 x(n-1) + \dots + b_N x(0)]$$

$$= \sum_{k=0}^N b_k x(n-k) - \sum_{k=1}^M a_k y(n-k)$$

\Rightarrow * Designing any filter \Rightarrow find coeffs a_k & b_k of num. & den.

* For a stable sys,

All poles must be inside unit circle or coincident with zeros on unit circle.
No restriction on zero loc.

* 5 Main STAGES of IIR filter Design

1. Filter specific

2. Determinⁿ of a_k, b_k of $H(z)$

3. Realizⁿ (parallel / cascade) using first order or second order filter section.

'Any higher ord. sys can be implemented in series/parallel connection using different first order or 2nd order different sections.'

e.g. :- $H(z) = \underbrace{H_1(z)}_{\text{ord } 2} \cdot \underbrace{H_2(z)}_{\text{ord } 1} \cdot \underbrace{H_3(z)}_{\text{ord } 1}$

'why only 1st & 2nd ord. division is possible? → self'

4. Analysis of errors based on representⁿ of coeff & arithmetic using limited no. of bits.

5. Implementation : Building hardware or software.

Suppose coeff are 0.93879. This in binary has to be represented by some fixed no. of bits.

If we make 2 bit representⁿ for

$$\frac{1}{4} = 0.25 :$$

If, say we have a coeff = 0.27 and 0.28

Then, using 2 bits, the representation by '00'

will give '0 - 0.25' range. Hence, the

representⁿ for coeff. 0.27 & 0.28 will be same i.e. '00'. In such case, error will occur.

If coeff are > 1 , write it as $0.4 \times \underline{\underline{e}}^1$ (say).

0 - 0.25	00
0.25 - 0.5	01
0.5 - 0.75	10
0.75 - 1	11

*pole: freq. at which TF is max.

Buffin

Date _____

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* Stage 2: finding coeffs (a_n & b_n) for IIR filter

Methods

(M1) Pole-zero placement: simple filter where filter specs need not be specified precisely
eg: notch filters

(M2) Converting an apt analog filter TF to that of digital filter

(a) Impulse invariant

(b) Matched Z-transform

(c) Bilinear Z-transform

(M1) Pole-zero placement

Corresponding to a zero :- freq response is zero

Pole :- freq response will give a peak

Points closer to unit circle will give rise to large peaks whereas zeros near unit circle will lead to a minima.

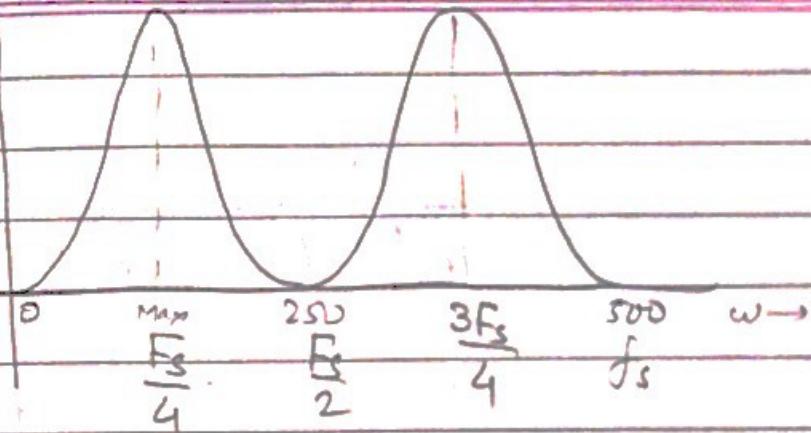
Assuming coeff. to be real, poles & zeros must either be real or complex conjugate pairs.

Q Design a band pass filter with

Specs } (a) Complete signal rejection at 0 & 250 Hz
} (b) a narrow pass band centered at 125 Hz

(c) a 3 dB BW of 10 Hz

Assume sampling freq, $f_s = 500$ Hz



Keeping a zero anywhere \equiv min response
pole " \equiv max response.

Now, placing a pole / zero anywhere on unit circle is seen by the freq. of the poles / zeros.

So, Zeros at 0 Hz. $\rightarrow \frac{0}{500 \text{ Hz}} \times 360^\circ = 0^\circ$
 $250 \text{ Hz} \rightarrow \frac{250}{500} \times 360^\circ = 180^\circ$

Poles at $\pm \frac{125}{500} \times 360^\circ = \pm 90^\circ$.

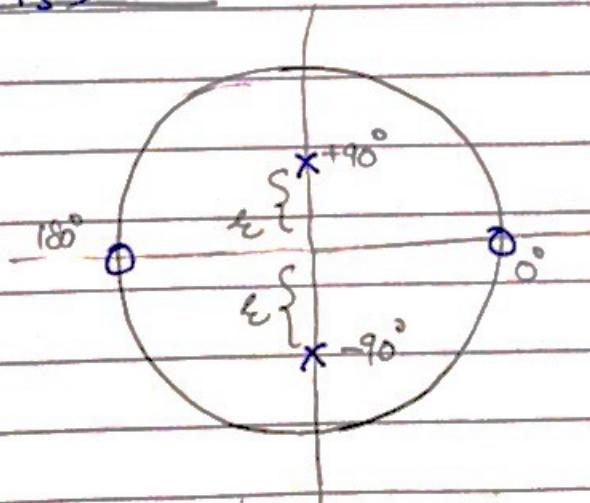
Determining radius of pole :-

$$r \approx 1 - \left(\frac{\text{BW}}{F_s} \right) \pi$$

Given BW = 10 Hz.

$F_s = 500 \text{ Hz}$

$$\Rightarrow r \approx 0.937$$



Writing TF

$$H(z) = \frac{(z-1)(z+1)}{(z - re^{j\pi/2})(z - re^{-j\pi/2})}$$

$$\Rightarrow H(z) = \frac{z^2 - 1}{z^2 + 0.8779}$$

Convert to -ve power of z

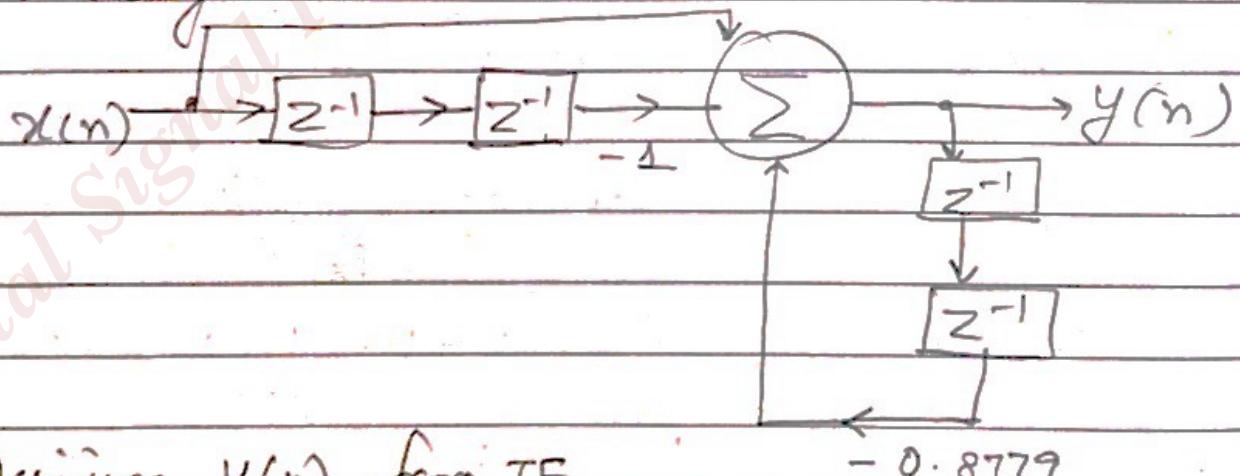
$$\Rightarrow H(z) = \frac{1 - z^{-2}}{1 + 0.8779 z^{-2}}$$

$$\left(\equiv \frac{b_0 z^0 + b_1 z^{-1} + b_2 z^{-2}}{1 + a_1 z^{-1} + a_2 z^{-2}} \right)$$

$$\Rightarrow b_0 = 1, b_1 = 0, b_2 = -1$$

$$a_1 = 0, a_2 = 0.8779$$

Block diagram :-



Deriving $y(n)$ from TF

$$y(n) = x(n) - x(n-2) - 0.8779 y(n-2)$$

* Narrow Bandstop filter : NOTCH filter

Puffin

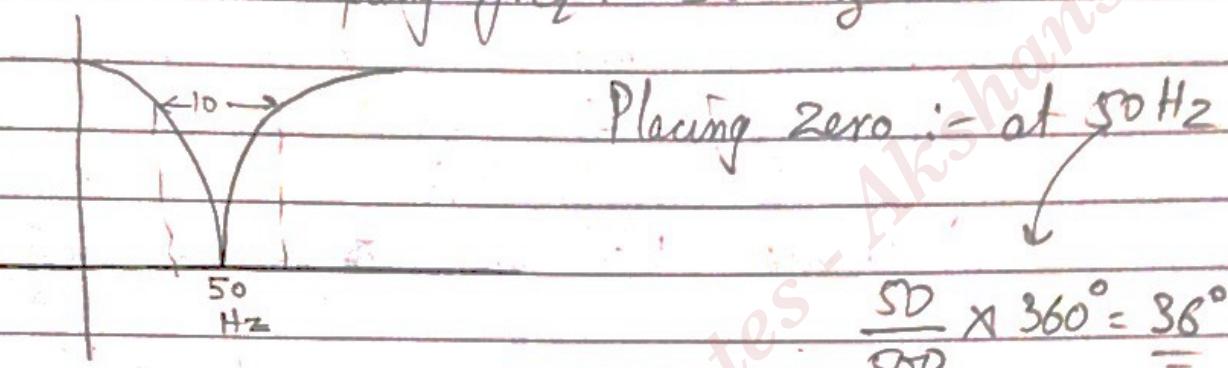
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e.g.: Design a Notch filter.

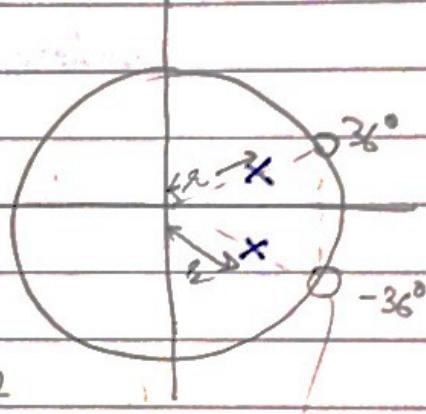
specs \rightarrow (a) Notch freq : 50 Hz

3 dB width of notch : ± 3 Hz

sampling freq : 500 Hz



To achieve a sharp notch, a pair of complex conj. poles at radius of $r < 1$ has to be placed.



$$\text{Finding } \mu \approx 1 - \left(\frac{bw}{Fs}\right)^{\pi} \rightarrow 0.9372$$

Making TF :-

$$H(z) = \frac{(z - e^{-j36^\circ})(z - e^{j36^\circ})}{(z - 0.937e^{-j36^\circ})(z - 0.937e^{j36^\circ})}$$

(for physically realising)

$$= \frac{z^2 - 1.618z + 1}{z^2 - 1.5164z + 0.8783}$$

$\xrightarrow[\text{(-ve)}]{z}$

$$\frac{1 - 1.618z^{-1} + z^{-2}}{1 - 1.5164z^{-1} + 0.8783z^{-2}}$$

Comparing gain, we see the coeff :-

$$b_0 = 1 \quad q_1 = 1.5164$$

$$b_1 = -1.618 \quad q_2 = 0.8783,$$

$$b_2 = 1$$

M2) Translating Analog to Digital

(a) Impulse Invariant Method

\Rightarrow Impulse response remains same for analog TF & digital TF

Steps

- S1) Obtain an apt. analog TF in S-domain
- S2) Determine the impulse response by applying LT & obtain $h(t)$
- S3) Sample $h(t)$ so as to produce $h(nT)$
- S4) Derive $H(z)$ by z -transforming discrete no. $h(nT)$ where T is sampling period.

e.g.: $H(s) = \frac{C}{s-p}$ (given TF)

$$\Rightarrow L^{-1}(H(s)) = h(t) = C e^{pt}$$

Now, converting $h(nT) \rightarrow$ discrete impulse response (of digital filter)

Replace $t \rightarrow nT$.

$$\Rightarrow h(nT) = C e^{PnT};$$

Doing z-transform

$$H(z) = \sum_{n=0}^{\infty} h(nT) z^{-n}$$

\therefore its discrete

(for cts, use integration)

$$= \sum_{n=0}^{\infty} C e^{PnT} z^{-n}$$

Sum of ∞ terms $= \frac{1}{1-z^{-P}}$

* Complex qty cannot be physically realised.
 Coeff. have to be real. So, if they are imaginary \rightarrow have to be in pair to represent real.

$$\text{So, } h_{(nT)} = c \left(\frac{1}{1 - e^{PT} z^{-1}} \right)$$

For higher odd filters, $H(s)$ has to be factorized using partial fraction as simple pole sums:-

$$H(s) = \frac{C_1}{s - P_1} + \frac{C_2}{s - P_2} + \dots + \frac{C_m}{s - P_m} = \sum_{k=1}^m \frac{C_k}{s - P_k}$$

$$\therefore H(z) = \sum_{k=1}^m \frac{C_k}{1 - e^{P_k T} z^{-1}}$$

* If poles P_1 & P_2 are complex conj, C_1 & C_2 will also be complex conj.

So,

$$\begin{aligned} & \frac{C_1}{1 - e^{P_1 T} z^{-1}} + \frac{C_1^*}{1 - e^{P_1^* T} z^{-1}} \\ &= \frac{2C_1 - [C_1 \cos(P_1 T) + C_1^* \sin(P_1 T)] \cdot 2e^{P_1 T} z^{-1}}{1 - 2e^{P_1 T} \cos(P_1 T) z^{-1} + e^{2P_1 T} z^{-2}} \end{aligned}$$

$\hookrightarrow C_1$ & C_1^* are real & imaginary parts of C_1

$\hookrightarrow P_r$ & P_i are that of P_1

Jump
formula
(Learn)

$$\text{eg } H(s) = \frac{1}{s^2 + \sqrt{2}s + 1}, \text{ assuming } 3\text{dB cut off}$$

freq of 150Hz & $f_s = 1.28\text{ kHz}$

Checking if poles are complex & then using steps

$$\textcircled{1} \quad \omega_c = 2\pi \times 150 = 942.4778 \text{ rad}$$

$$\textcircled{2} \quad \text{denormalised TF: } H'(s) = H(s) \Big|_{s=\frac{s}{\omega_c}}$$

$$= \omega_c^2$$

$$= \frac{C_1}{s-P_1} + \frac{C_2}{s-P_2}$$

Doing Partial fraction

$$\Rightarrow P_1 = -\sqrt{2}\omega_c(1-j) = -666.4324(1-j)$$

$$P_2 = \overline{P_1} = -\sqrt{2}\omega_c(1+j) = -666.4324(1+j)$$

$$\& C_1 = \frac{-\omega_c^2 j}{\sqrt{2}} = -666.4324 j$$

$$C_2 = \overline{C_1} \text{ or } C_2 = +\frac{\omega_c^2 j}{\sqrt{2}} = 666.4324 j$$

Now, see:-

P_r, P_i, C_r, C_i & substitute in eq^n

$$H(z) = \frac{(393.9264)z^{-1}}{1 - 1.0508z^{-1} + 0.3530z^{-2}}$$

$$\boxed{b_0 = 0}$$

Now, these coeff. have to be represented using an 8 bit processor, say

So, representn has to be done from value 0.35 to 393 (≈ 400)

$$\frac{1}{2^8} = \frac{1}{256} \approx 0$$

sensitivity

So, value of $0.3530 \approx 0$ } their values won't
 $1.0308 \approx 0$ come correctly

So, take TF separately & normalize it

So, instead of using w_c (as 400) we use w_h (≈ 0.3078)

w_s

So, range goes from $0.3078 - 0.35$

Now, easy.

To avoid high gain to prevent overflow, the TF gain can be normalised by sampling freq.

$$w_s = 2\pi f_s$$

$$= 2\pi \times 1.2 \times 10^3$$

$$\Rightarrow H(z) = \frac{0.3078 z^{-1}}{1 - 1.0308 z^{-1} + 0.3530 z^{-2}}$$

Or,
 w_0 can be normalised with w_s and $H(z)$ &
 resulting will be same.

* Comments :-

1. Filter response is same at discrete intervals & hence, the name impulse invariant.
2. f_s affects the response like a similar freq. response of analog filter, f_s has to be very high.
3. At multiple of f_s , $H(z)$ is repeated & hence, aliasing will result. ∴ Anti aliasing filter has to be used along with the filter.
4. Can be used for analog filter whose freq. is stop or band limited before applying Impulse Invariant method.
5. Suitable for very sharp cut-off low pass filter with little aliasing & reasonably high sampling freq. not suitable for high pass or band stop filters.

ex Given :- Bandpass filter with Butterworth char.
spec. - pass band 200 - 300 Hz

$$f_c = \text{sampling freq} = 2 \text{ KHz}$$

$$\text{Filter ord} = N = 2$$

→ instead of order, sometimes we are given stop band attenuation & pass band ripple.

Obtain coeff. of filter using BZT method

$$\text{Note : } \text{ord (LP)} = \frac{1}{2} \text{ ord (BP)}$$

$$\Rightarrow \text{Low pass order} = \frac{1}{2} (2) = 1$$

$$\Rightarrow \text{TF}_{\text{LPF}} = H(s) = \frac{1}{s+1}$$

Doing prewarping of critical freqs.

$$\omega_{p_1}' = \tan\left(\frac{\omega_p T}{2}\right) = \tan\left(\frac{2\pi \times 250}{2 \times 2000}\right) = 0.3249$$

$$\omega_{p_2}' = \tan\left(\frac{\omega_p T}{2}\right) = \tan\left(\frac{2\pi \times 300}{2 \times 2000}\right) = 0.3095$$

$$\omega_0^2 = \omega_{p_1}' \quad \omega_{p_2}' = 0.1655$$

$$W = \omega_{p_2}' - \omega_{p_1}' = 0.1846$$

LP \rightarrow BP transform:

$$\begin{aligned} H'(s) &= H(s) \\ s &= \frac{s^2 + \omega_0^2}{\omega_0 s} \quad = \frac{1}{s^2 + \omega_0^2 + 1} \\ &= \frac{\omega_0}{s^2 + \omega_0 s + \omega_0^2} \end{aligned}$$

Substituting values & finding value of P_1, P_2

$$\omega_0 = -0.0923 \pm j(0.3962)$$

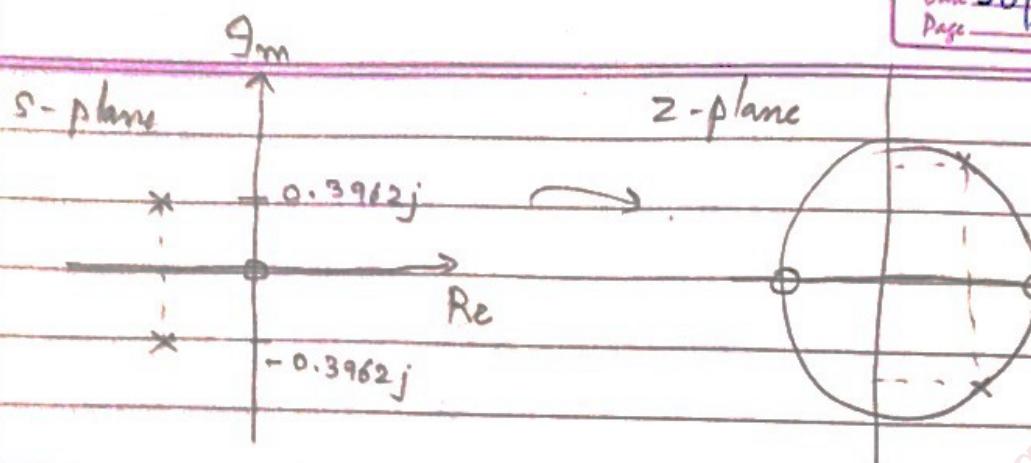
Now $Z \rightarrow \frac{z-1}{2z+1}$ (BZT) analog domain

$$\text{TF} = H(z) = \frac{0.1367(1-z^{-1})}{1 - 1.2362z^{-1} + 0.7265z^{-2}}$$

$$\Rightarrow P_1, P_2 = 0.6040 \pm j(0.6015)$$

fig 2.11
↳ Pole zero diagram

digital domain



DIGITAL FILTER STRUCTURE

- Imp., ∵ of computational complexities
looking for min. no. of multiplications, delay units
or registers
- No. of delay units = time delay memory
- registers :- for storing past outputs ; A_i 's & B_i 's
(coeff. of filter)
- Another imp. pt. : Word length (register size)

* Most commonly used structures :

1. Direct form
2. Cascade form
3. Parallel form

Notations

$$a_i \rightarrow \begin{array}{c} y_n = a_i x(n) \\ \nearrow \searrow \end{array}$$

$$x(n) \rightarrow \boxed{z^{-1}} \rightarrow x(n-1)$$

* Realization of IIR Filter

Assume :- $H(z) = \frac{\sum_{l=0}^m a_l z^{-l}}{1 + \sum_{l=1}^m b_l z^{-l}}$

(i) Digital form I realization :-

$$\frac{H(z)}{D(z)} = \frac{N(z)}{X(z)} = \frac{[a_0 + a_1 z^{-1} + \dots + a_n z^{-n}]}{[1 + b_1 z^{-1} + \dots + b_m z^{-m}]}$$

Cross multiplying

$$\Rightarrow Y(z)[1 + b_1 z^{-1} + \dots + b_m z^{-m}] = X(z)[a_0 + a_1 z^{-1} + \dots + a_n z^{-n}]$$

Idea: Trying to find $Y(n) = z^{-1}(Y(z))$

Taking z^{-1}

$$\Rightarrow Y(n) + b_1 Y(n-1) + \dots + b_m Y(n-m) = [a_0 X(n) + a_1 X(n-1) + \dots + a_n X(n-m)]$$

$$\Rightarrow Y(n) = [a_0 x(n) + a_1 x(n-1) + \dots + a_n x(n-m)] - [b_1 y(n-1) + \dots + b_m y(n-m)]$$

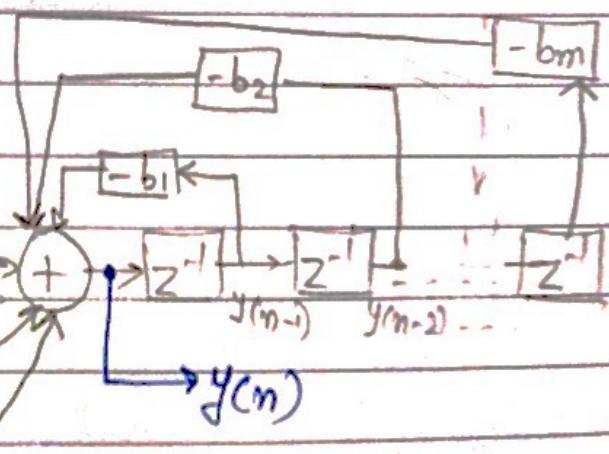
$$- [b_1 y(n-1) + \dots + b_m y(n-m)]$$

* Representⁿ of above eqn.

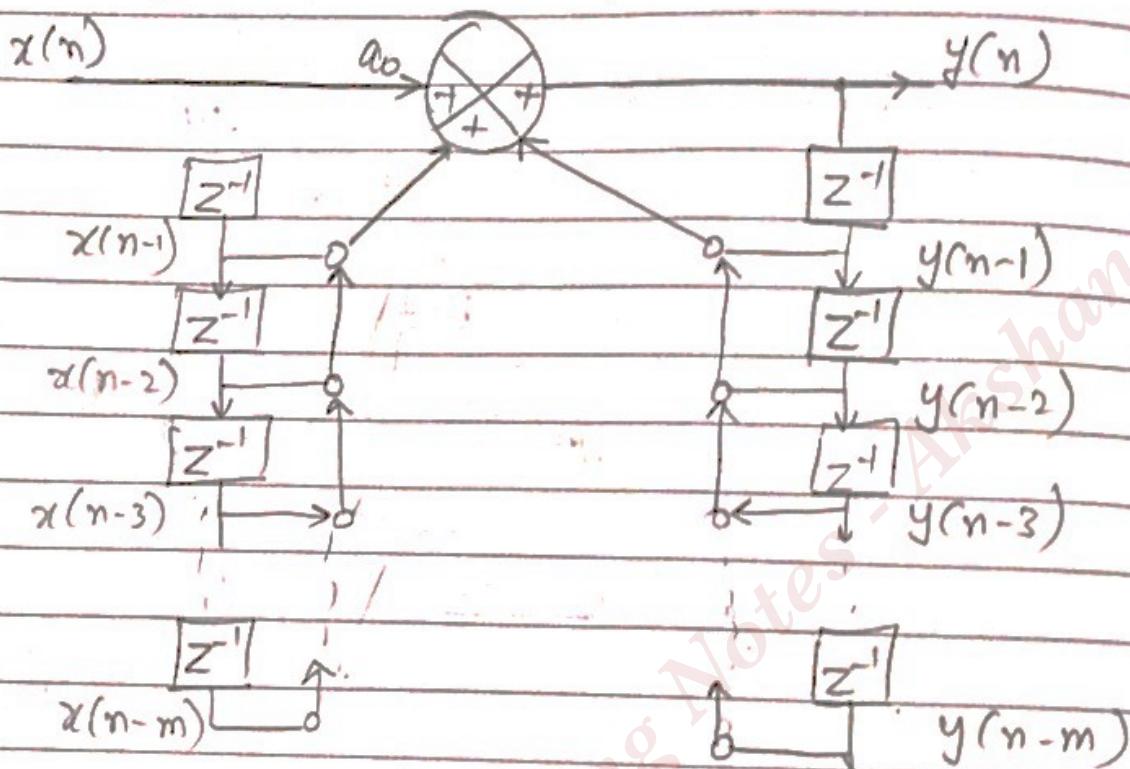
Direct
form I
IIR

$$x(n) \rightarrow [z^{-1}] \rightarrow [z^{-1}] \dots \rightarrow [a_m] \rightarrow +$$

$$[a_0]$$



Another form



* No. of additions = $2(m-1)$
multiplications = $2n$

★ (ii) Direct form (II) realization :-
(also called Canonical form)

$$H(z) = \frac{N(z)}{D(z)} = \frac{Y(z)}{X(z)} ; Y(z) = \frac{N(z)}{D(z)} \cdot X(z) \\ = N(z) \cdot W(z)$$

Assuming $W(z) = X(z) : X(z) = W(z) \cdot D(z)$

Now,

$$N(z) = a_0 + a_1 z^{-1} + a_2 z^{-2} + \dots + a_m z^{-m}$$

$$D(z) = 1 + b_1 z^{-1} + b_2 z^{-2} + \dots + b_m z^{-m}$$

6,

$$X(z) = W(z) [1 + b_1 z^{-1} + \dots + b_m z^{-m}]$$

$$\Rightarrow x(n) = w(n) + b_1 w(n-1) + \dots + b_m w(n-m)$$

$$\Rightarrow w(n) = x(n) - [b_1 w(n-1) + b_2 w(n-2) + \dots + b_m w(n-m)]$$

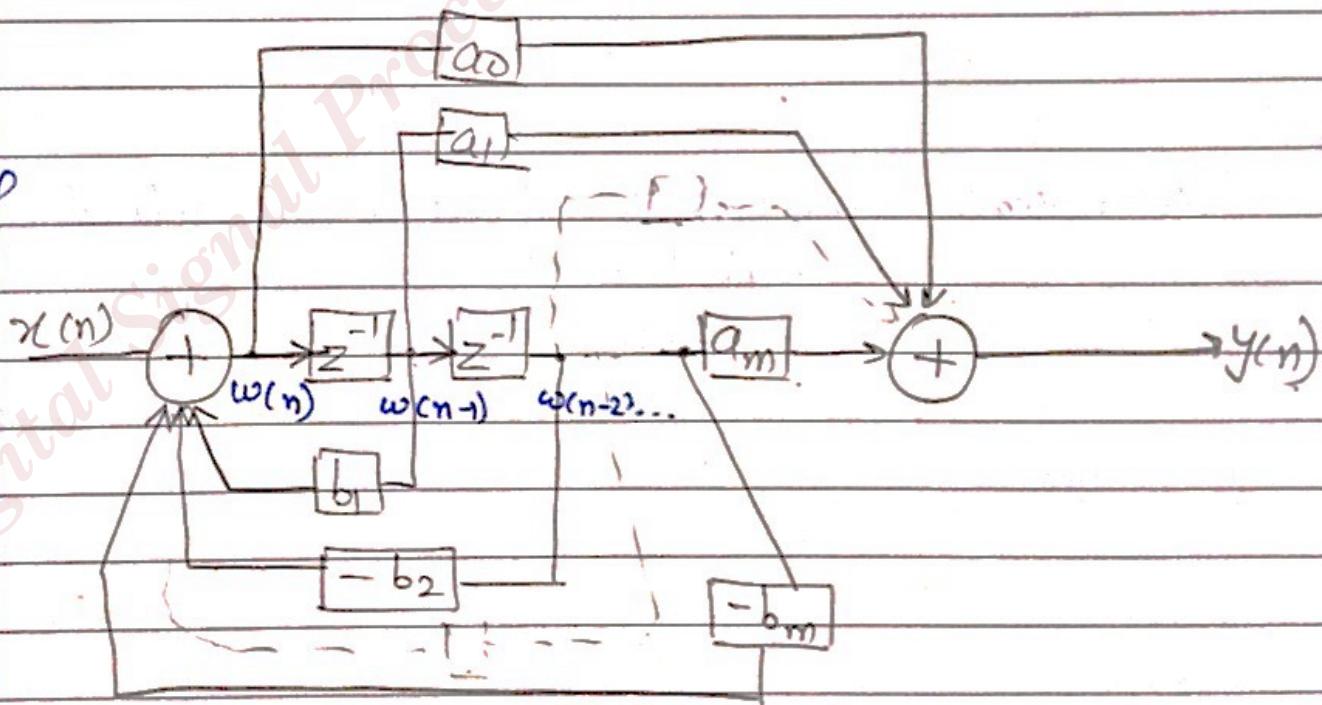
$$Y(z) = W(z) [a_0 + a_1 z^{-1} + a_2 z^{-2} + \dots + a_m z^{-m}]$$

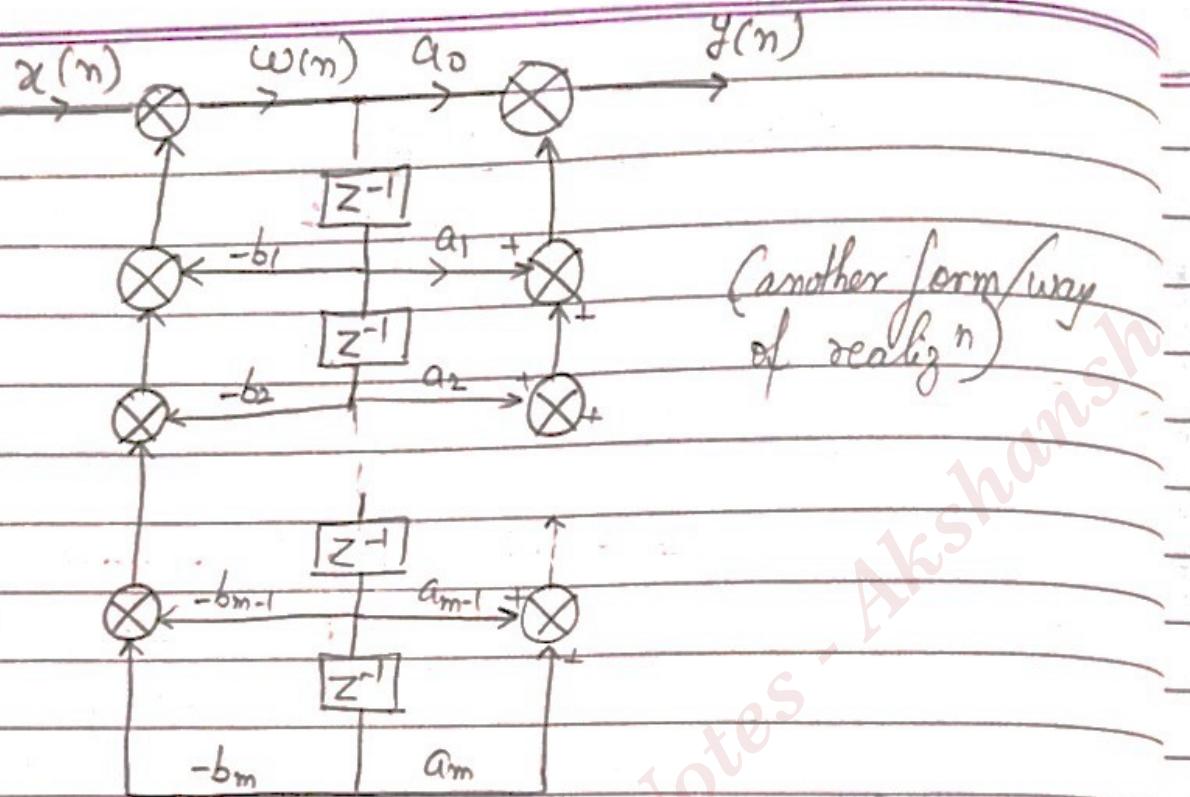
$$\Rightarrow y(n) = a_0 w(n) + a_1 w(n-1) + \dots + a_m w(n-m)$$

Reason for doing this? \rightarrow both $x(n)$ & $y(n)$ are now in terms of one variable (w). So, no need to store them separately.

Represent n:

Direct
form II
realisⁿ of
IIR
filters





(iii) Cascade form: $H(z)$ TF is to be factored first
so that $H(z) = k \cdot H_1(z)H_2(z)\dots H_m(z)$

m is a +ve integer & each $H_m(z)$
can be either a first order or second
order TF

$$H(z) = k \prod_{i=1}^p (1-a_i z^{-1}) \prod_{i=1}^q (1-b_i z^{-1})(1-b_i^* z^{-1}) \\ \prod_{l=1}^r (1-c_l z^{-1}) \prod_{i=1}^t (1-d_i z^{-1})(1-d_i^* z^{-1})$$

→ Total no. of zeroes :- $p+2q$
poles :- $r+2t$.

eg:- TF =

$$H(z) = 0.7(z^2 - 0.36)$$

$$z^2 + 0.1z - 0.72$$

factorizing :-

$$= \frac{(0.7)(z - 0.6)(z + 0.6)}{(z - 0.8)(z + 0.9)}$$

$$= (0.7) \left[\frac{z - 0.6}{z - 0.8} \right] \left[\frac{z + 0.6}{z + 0.9} \right]$$

" $H_1(z)$ $H_2(z)$, say .

So, overall TF, $H(z)$ can look like :-



How to choose $H_1(z)$ & $H_2(z)$ from given factors of $H(z)$?

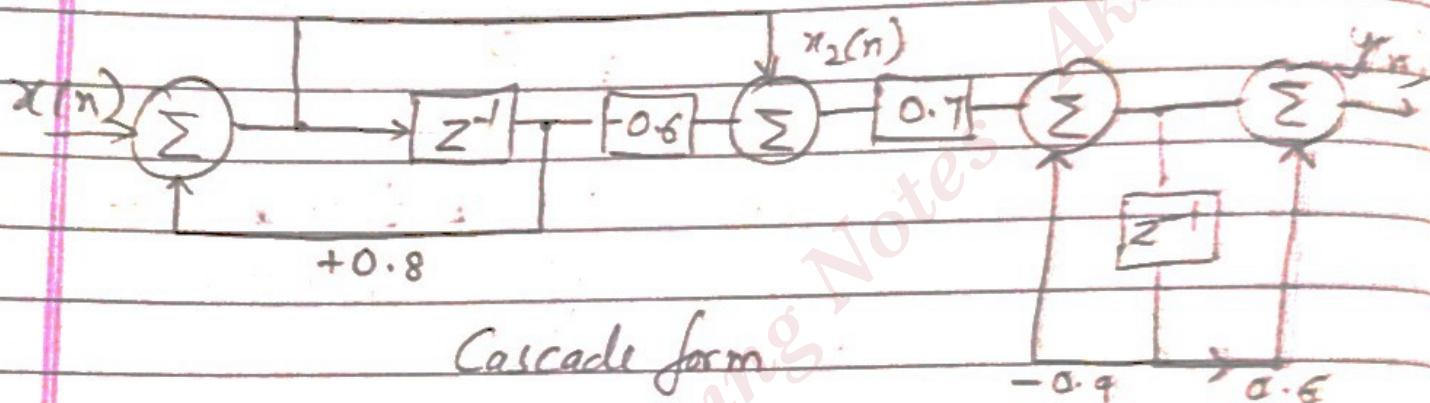
$\hookrightarrow z - (?)$ terms : Take together
 $z + (?)$ terms : Take together

These coeff have to be implemented in binary. Now, for a -ve coeff, one extra bit for sign will be used. So, if represent " is done in 4 bits, one bit used in sign & 3 bits left to represent the coeff. in digital. So, -ve coeff. together makes similar things together.

If all coeff. are +ve, then take those pairs s.t difference in their values is min.

$$k = 0.7, H_1(z) = \frac{z+0.6}{z+0.9}, H_2(z) = \frac{z-0.6}{z-0.8}$$

$$= \frac{1+0.6z^{-1}}{1+0.9z^{-1}} \quad = \frac{1-0.6z^{-1}}{1-0.8z^{-1}}$$



$$Y(z) = k \cdot H_1(z) \cdot H_2(z) \cdot X(z)$$

$$\underbrace{H_2(z)}_{X_2(z)}$$

$$= k \cdot H_1(z) X_2(z)$$

$$H_2(z) = \frac{X_2(z)}{X(z)}, \quad H_1(z) = \frac{Y(z)}{k \cdot X_2(z)}$$

$$x_2(n) = x_n - 0.6x_{n-1} + 0.8x_{n-1}$$

$$y(n) = k z^{-1} [H_1(z) X_2(z)]$$

$$= k [x_2(n) + 0.6x_2(n-1) - 0.9y(n-1)]$$

Parallel form of realization:-

Doing partial fraction to given TF

$$\Rightarrow H(z) = \frac{0.7(z-0.6)(z+0.6)}{(z-0.8)(z+0.9)}$$

$$= \frac{A}{z-0.8} + \frac{B}{z+0.9}$$

$$\Rightarrow (z+0.9)A + (z-0.8)B = (0.7)(z-0.6)(z+0.6)$$

$$\Rightarrow (1.7)A = (0.7)(0.2)(1.4)$$

$$\Rightarrow A = 0.144$$

$$\text{Hence, } B = 0.206$$

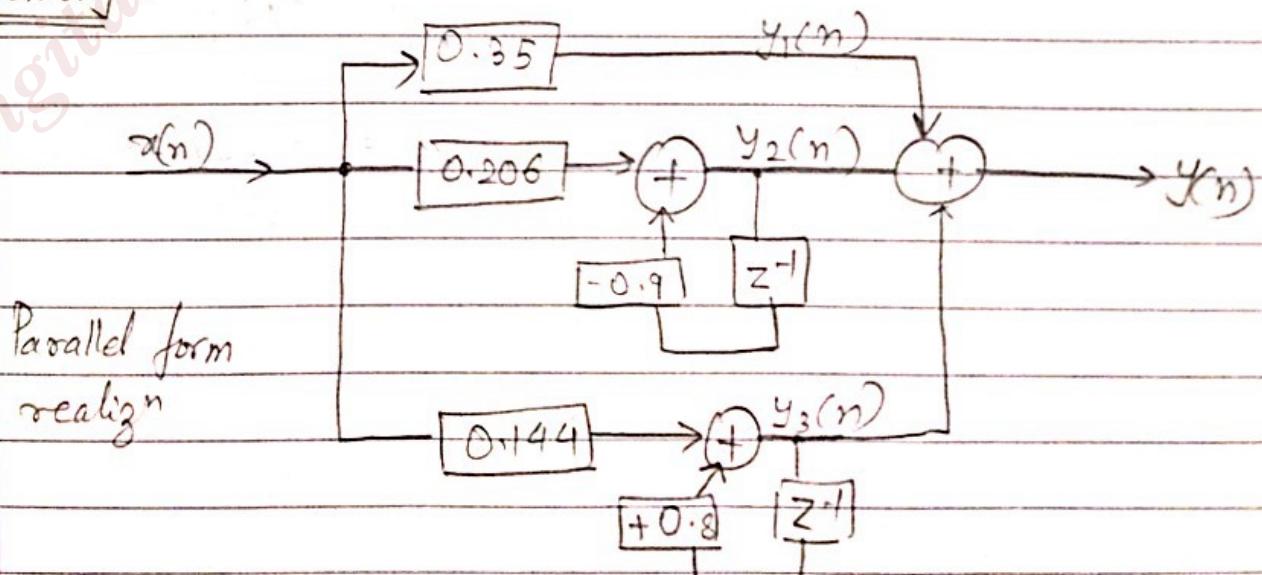
$$\text{So, } H(z) = 0.35 + \frac{0.206}{1+0.9z^{-1}} + \frac{0.144}{1-0.8z^{-1}}$$

So,

$$Y(z) = 0.35 X(z) + \frac{0.206}{1+0.9z^{-1}} X(z) + \frac{0.144}{1-0.8z^{-1}} X(z)$$

$$Y_1(z) \quad Y_2(z) \quad Y_3(z)$$

Implementing:



FIR FILTER DESIGN

* Key features of FIR filters

1. $y(n) = \sum_{k=0}^{n-1} h(k) x(n-k)$

$TF = H(z) = \sum_{k=0}^{n-1} h(k) z^{-k}$

- ↳ always stable (no of dependent)
- ↳ less coeff. have to be implemented
($\because \exists$ no feedback)

2. Gives linear phase response (exact)

↳ advantageous over IIR.

3. Simple to implement, suffers less from word length if more.

Linear phase response & its implications:

phase delay, $T_p = -\frac{\Theta(\omega)}{\omega}$

group delay, $T_g = -\frac{d\Theta(\omega)}{d\omega}$

result of non linear phase char. in phase distortion which is undesirable in music, video and biomedicine etc. It can be avoided by filters with linear phase characteristics.

+ve symmetry : symm about y-axis
 -ve symmetry : symm about line $y = x$
 phase DELAY

Puffin
 Date 6/10/13
 Page

For linear phase response,

$$\Theta(\omega) = -\alpha \cdot \omega \text{ or } \beta - \alpha \cdot \omega. \\ (\equiv y = mx + c)$$

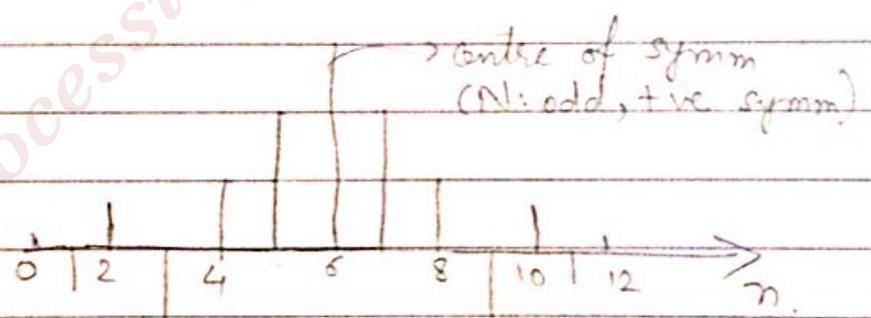
If $\Theta(\omega) = -\alpha \cdot \omega$: filter will have const T_p & T_q
 Also, for this impulse response must have positive symmetry

$$\therefore h(n) = h(N-n-i) \begin{cases} n=0, 1, \dots, \frac{(N-1)}{2}; N=\text{odd} \\ n=0, 1, \dots, \frac{N-1}{2}; N=\text{even} \end{cases}$$

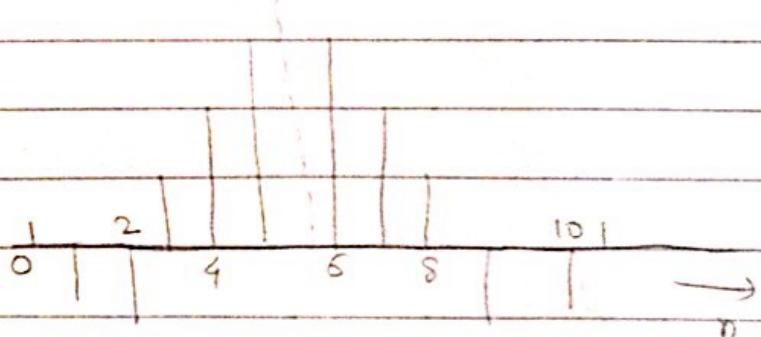
$$L = \frac{N-1}{2}] T_p \text{ is } \frac{1}{2} \text{ of filter length}$$

* Represent of signals:

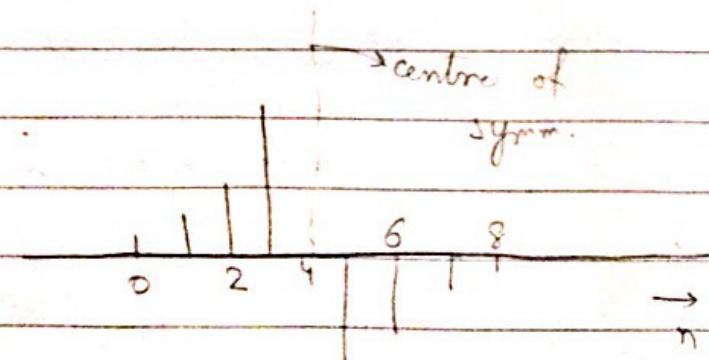
$$N=13 \text{ (odd)}$$



$$N=12 \text{ (even)}$$

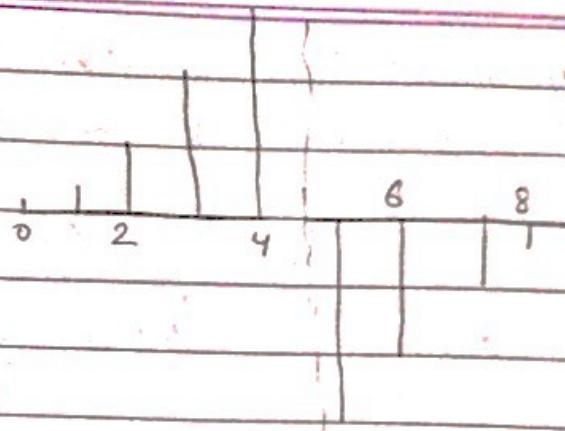


$$N=9 \text{ (odd)}$$



$$N = 10 \text{ (even)}$$

- ve symm.



* For an FIR filter, we can have a group of 4 (combinations)

Length : odd/even

Symmetry : +ve/-ve

Using this, type - 1, 2, 3 & 4 are made

Design a digital FIR filter defined over interval

$$0 \leq n \leq N-1$$

If $N=7$ & $h(n)$ satisfies symm. cond ":

$h(n) = h(N-n-1)$, show that filter has linear phase char

+ve symm.

Also repeat for $N=8$

(If $h(n) = (-1)^n h(N-n-1)$)

-ve symm

For linear phase response :- necessary & sufficient cond ":- impulse response is symm.

$$\therefore \text{if } N=7 \Rightarrow h(0)=h(6)$$

$$h(1)=h(5)$$

$$h(2)=h(4)$$

$h(3)$: center sample

Solve :- Find $\Theta(\omega)$ & phone $\Theta(\omega) \propto \omega$
 done ($y \propto x$ or $y = mx$: linear)

$$H(\omega) = H(e^{j\omega t})$$

$$= \sum_{k=0}^6 h(k)e^{-j\omega T} = h(0) + h(1)e^{-j\omega T} + \dots + h(6)e^{-j6\omega T}$$

$$= e^{-j3\omega T} [h(0)e^{j3\omega T} + h(1)e^{j2\omega T} + h(2)e^{j\omega T} \\ + h(3) + h(6)e^{-j3\omega T} + h(5)e^{-j2\omega T} \\ \rightarrow h(4)e^{-j\omega T}]$$

$$a_0 = \frac{e^{j\omega T} + e^{-j\omega T}}{2}$$

$$= e^{-j3\omega T} [h(0)e^{j3\omega T} + h(6)e^{-j3\omega T} \\ + h(1)e^{j2\omega T} + h(5)e^{-j2\omega T} \\ + h(2)e^{j\omega T} + h(4)e^{-j\omega T} \\ + h(3)]$$

$$a_0 = 2h\left(\frac{N-1}{2} - n\right)$$

$$a_0 = h\left(\frac{N-1}{2}\right) = e^{-j3\omega T} [h(0)[2\cos 3\omega T] + h(1)[2\cos 2\omega T] \\ + h(2)[2\cos \omega T] + h(3)]$$

$$\text{if } (a_0) = h(3), a_k = 2h(3-k)$$

$\hookrightarrow k=1, 2, 3,$

then,

$$\star H(\omega) = \sum_{k=0}^3 a_k \cos k\omega T e^{-j3\omega T}$$

$$= \pm (H(\omega)) \cdot e^{j\Theta(\omega)}$$

\hookrightarrow where, $\pm |H(\omega)| = \sum_{k=0}^3 a_k \cos k\omega T$ &

$$\Theta(\omega) = -3\omega T$$

$\therefore \theta(\omega) \propto \omega . (= -3\omega T)$

So, linear phase response.

If $N=8$ (even)

$$\Rightarrow h(0) = h(7)$$

$$h(1) = h(6)$$

$$h(2) = h(5)$$

$$h(3) = h(4)$$

&

$$H(\omega) = \sum_{k=0}^7 h(k) e^{-j k \omega T}$$

$$= h(0) + h(1)e^{-j\omega T} + h(2)e^{-j2\omega T}$$

$$+ \dots + h(6)e^{-j6\omega T} + h(7)e^{-j7\omega T}$$

$$= e^{-j\frac{7\omega T}{2}} [h(0)(e^{\frac{j7\omega T}{2}} + e^{-\frac{j7\omega T}{2}})]$$

$$+ h(1)(e^{j\frac{5\omega T}{2}} + e^{-j\frac{5\omega T}{2}})$$

$$+ h(2)(e^{\frac{j3\omega T}{2}} + e^{-\frac{j3\omega T}{2}})]$$

$$+ h(3)(e^{j\frac{\omega T}{2}} + e^{-j\frac{\omega T}{2}})]$$

$$= e^{-j\frac{7\omega T}{2}} \left[2h(0)\cos\frac{7\omega T}{2} + 2h(1)\cos\frac{5\omega T}{2} \right. \\ \left. + 2h(2)\cos\frac{3\omega T}{2} + 2h(3)\cos\frac{\omega T}{2} \right]$$

Polar form

$$= \pm |H(\omega)| e^{j\theta(\omega)}$$

linear

$$\therefore \pm |H(\omega)| = \sum_{k=1}^4 h(k) \cos[\omega T(k-\frac{1}{2})] ; \theta(\omega) = -\frac{7\omega T}{2}$$

$$\hookrightarrow h(k) = 2h(\frac{N}{2}-k), k=1, 2, \dots, N/2$$

- ★ Cos : +ve symm.
- ★ Sin : -ve symm.

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* Summary of key points about 4 types of linear phase FIR filter

Impulse response Symm	No. of coeff. (N)	Freq. response $H(\omega)$	Type of linear phase
-----------------------	-------------------	----------------------------	----------------------

• +ve symm.
 T_p, T_g $h(n) = h(N-1-n)$ odd $e^{j\omega\left(\frac{N-1}{2}\right)\left(\frac{N-1}{2}\right)} \sum_{n=0}^{N-1} a_n \cos(\omega n)$ 1 → most versatile of the four

• " even $e^{-j\omega\left(\frac{N-1}{2}\right)\frac{N}{2}} \sum_{n=1}^{\frac{N}{2}} b_n \cos\left[\omega\left(n-\frac{1}{2}\right)\right]$ 2

• -ve symm. T_g odd $e^{-j\omega\left(\frac{N-1}{2}\right)-\frac{\pi}{2}} \sum_{n=1}^{\frac{N-1}{2}} a_n \sin(\omega n)$ 3.

• " even $e^{-j\left[\omega\left(\frac{N-1}{2}\right)-\frac{\pi}{2}\right]\frac{N}{2}} \sum_{n=1}^{\frac{N}{2}} b_n \sin\left[\omega\left(n-\frac{1}{2}\right)\right]$ 4.

$$\rightarrow a(0) = h\left(\frac{N-1}{2}\right); a_n = 2h\left(\frac{N-1}{2} - n\right)$$

$$\rightarrow b(n) = 2h\left(\frac{N}{2} - n\right)$$

for type 2 & 3 :-

freq Resp. at $\omega = 0.5\pi$ is always 0. &
unsuitable for high pass.

for type 3 :-

at $\omega = 0$, freq = 0. So, cannot be used
for low pass filter

Phase shift : $\frac{\pi}{2}$

* FIR Coefficient Calculation .

$$y(m) = \sum_{n=0}^{N-1} h(n) x(m-n)$$

- Impulse response coeff. of FIR filter

$$H(z) = \sum_{n=0}^{N-1} h(n) z^{-n} : z \text{ transform of } h(n)$$

* Designing FIR filter \Rightarrow finding coeff \Rightarrow finding $h(n)$ values

- Methods to find coeff :-

M 1) \rightarrow Window method

M 2) \rightarrow Optical method

M 3) \rightarrow Freq Sampling method

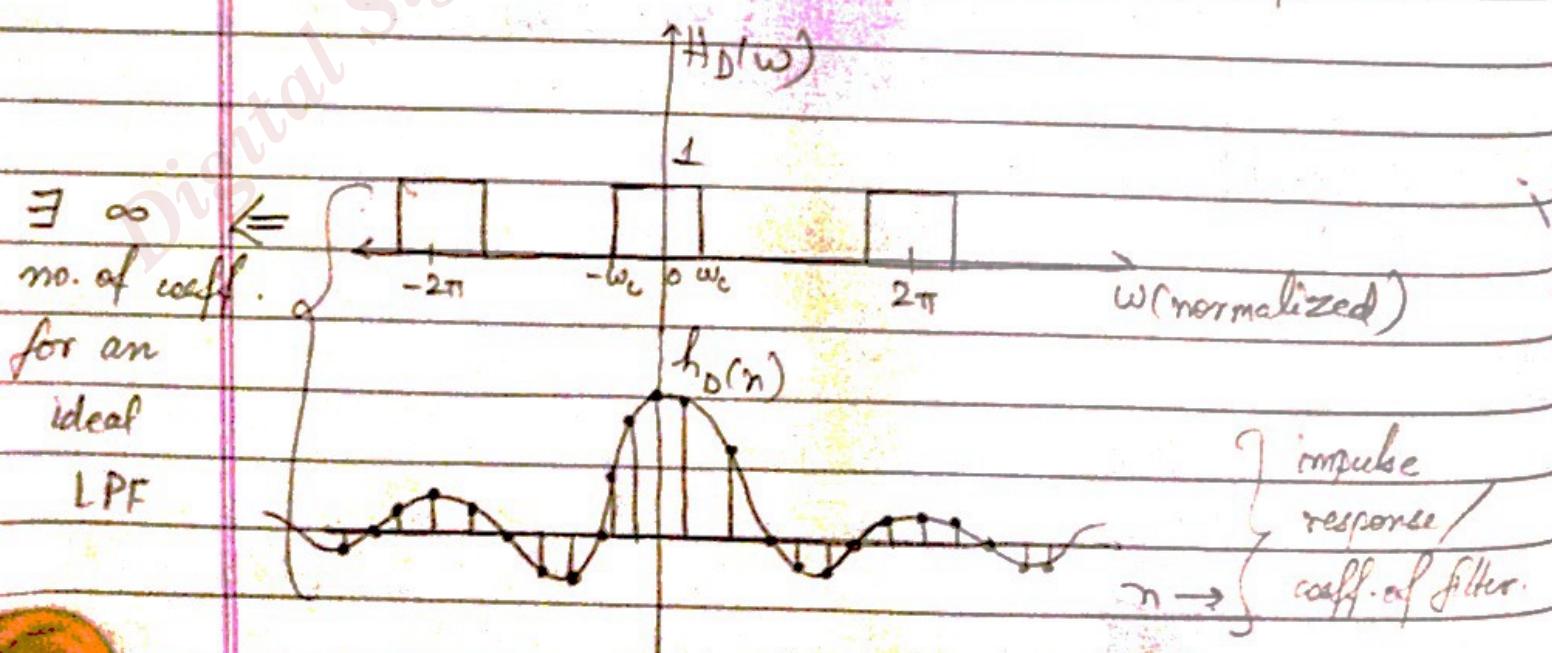
$$h_D(n) = \frac{1}{2\pi} \int_{-\pi}^{\pi} 1 \cdot e^{jwn} d\omega = \frac{1}{2\pi} \int_{-\omega_c}^{\omega_c} e^{jwn} d\omega$$

comes from graph below

\leftarrow desired or ideal sinc function

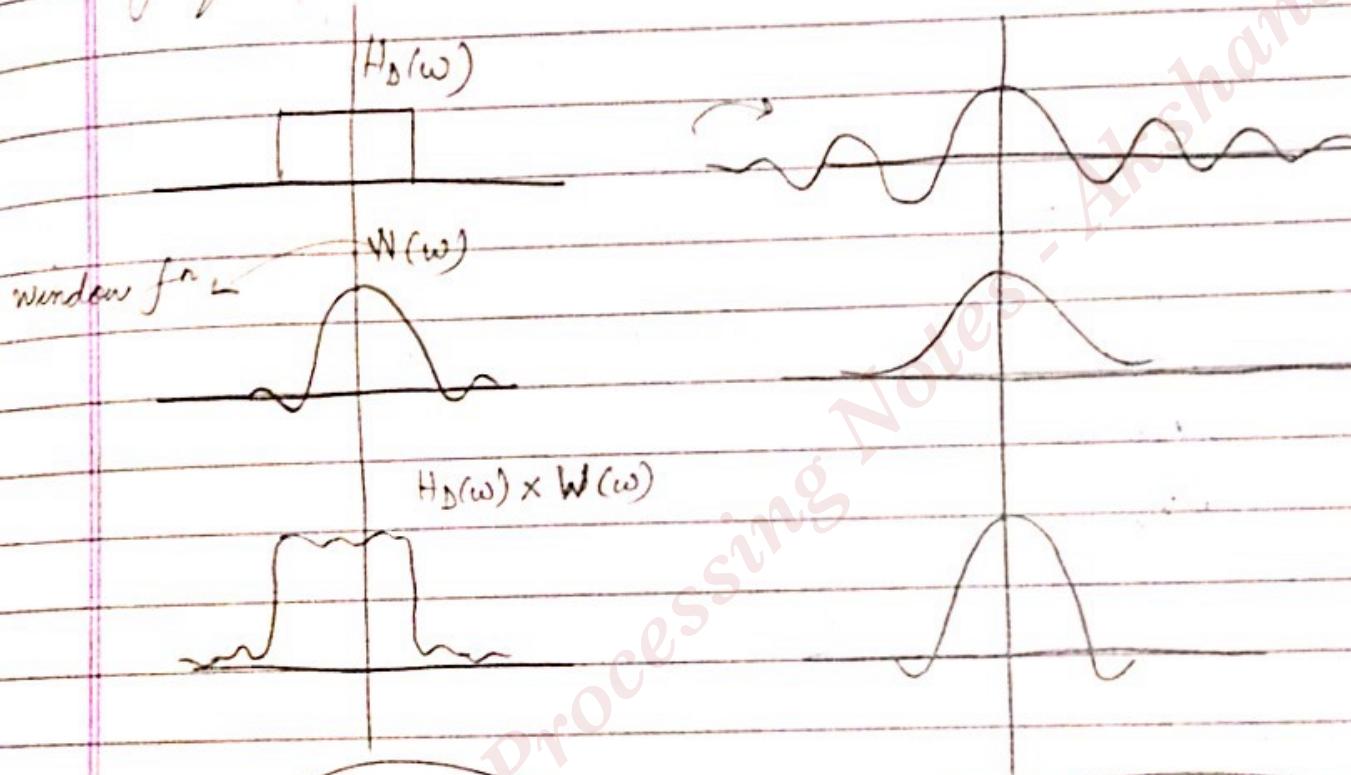
$$= \begin{cases} 2f_c \sin(n\omega_c) & ; n \neq 0, -\infty \leq n \leq \infty. \\ f_c & ; n = 0 \end{cases}$$

($n\omega_c$) ; $n = 0$ (L'Hospital's)



$$h_D(n) = \frac{1}{2\pi} \int_{-\pi}^{\pi} H_D(\omega) e^{j\omega n} d\omega \rightarrow \text{IFT}$$

Now,
If no. of coeff. are limited (Given), how does the frequency response becomes?



* Summary of ideal impulse responses for std. I selective filters
 $h_D(n), n \neq 0$ $h_D(n); n=0$

- Low Pass filter

$$\frac{2f_c \sin(n\omega_c)}{n\omega_c}$$

$$2f_c$$

- High Pass

$$-\frac{2f_c \sin(n\omega_c)}{n\omega_c}$$

$$1-2f_c$$

- Bandpass

$$\frac{2f_2 \sin(n\omega_2) - 2f_1 \sin(n\omega_1)}{n\omega_2}$$

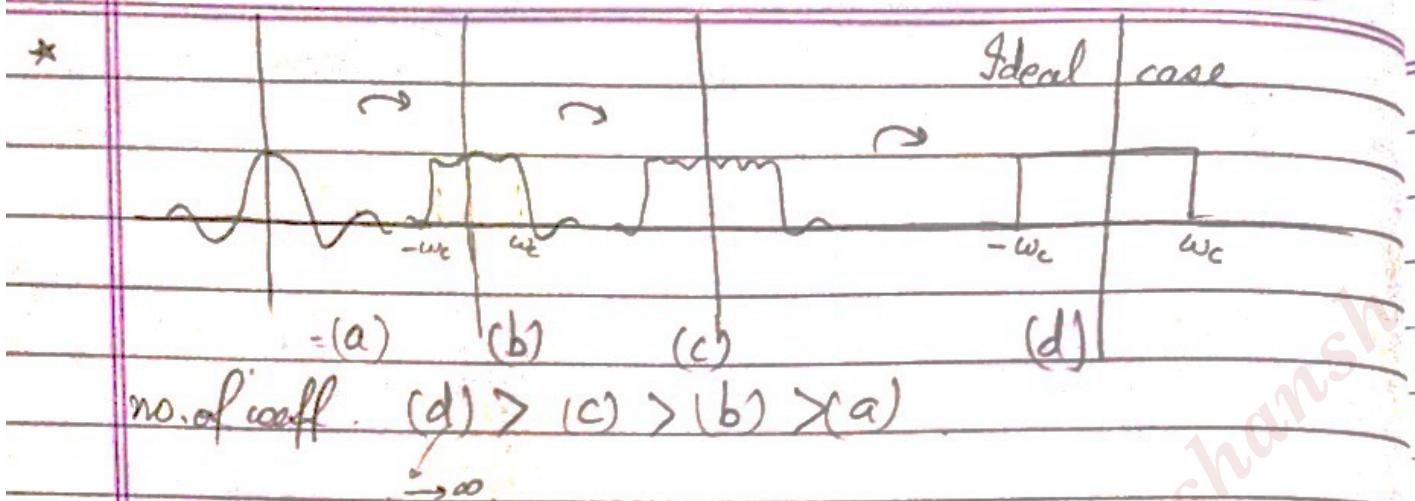
$$2(f_2-f_1)$$

- Bandstop

$$\frac{2f_1 \sin(n\omega_1) - 2f_2 \sin(n\omega_2)}{n\omega_1}$$

$$1-2(f_2-f_1)$$

$$\rightarrow \begin{cases} 1 & \omega_1 < \omega < \omega_2 \\ 0 & \text{else} \end{cases} \rightarrow \frac{1}{2\pi} \int_{\omega_1}^{\omega_2} 1 \cdot e^{j\omega n} d\omega \rightarrow \begin{cases} 1 & \omega_1 < \omega < \omega_2 \\ 0 & \text{else} \end{cases}$$

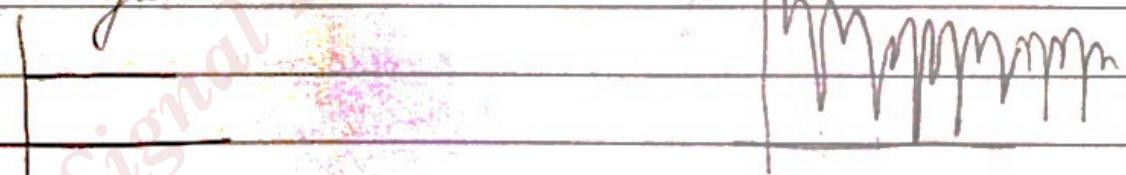


* how to reduce no. of coeffs?

→ M1) Create a window f^n (basically a box of unit=1 which gets multiplied by my f^n) for desired no. of coeffs.

* Window f^n Attenuation (dB)

- Rectangular



- Hamming window



- Blackman window



More ideal : Blackman > Hamming > Hanning > Rectangular

Window

Difficult implement

" < " < " < "

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\therefore of
complex
window fn

Window	Transit width	Passband ripple (Hz)	M main lobe relative to side lobe (normalized)	Stopband attenuation (dB)	Window fn
					$w(n) = 1/n$

1) Rectangular	$\frac{0.9}{N}$	0.7416	13	21	
2) Hanning	$\frac{3.1}{N}$	0.0546	31	44	$0.5 + 0.5 \cos\left(\frac{2\pi n}{N}\right)$
3) Hamming	$\frac{3.3}{N}$	0.0194	41	53	$0.54 + 0.46 \cos\left(\frac{2\pi n}{N}\right)$
4) Blackman	$\frac{5.5}{N}$	0.0017	57	75	$0.42 + 0.5 \cos\left(\frac{2\pi n}{N-1}\right)$

* length of filter : mainly responsible for change in freq. response

* Idea : - find N from above table (using transit width cond). Use that to find window fn $w(n)$. Then, $h_D(n)$ is known.

So, the fn $h_D(n) \times w(n)$ can be obtained (which window to choose? → see the cond given)

Continued

5) Kaiser	$\frac{4.32}{N} (\beta = 6.76)$	0.00275	50	$I_0(\beta) [1 - \frac{2n}{(N-1)^2}]$
	$\frac{5.71}{N} (\beta = 8.96)$	0.000275	70	"

* Always choose the window which has the simplest complex

From table,

$$\text{Kaiser } f_n, w(n) = I_0 \left\{ \beta \left[1 - \left(\frac{2n}{N-1} \right)^2 \right]^{\frac{1}{2}} \right\}$$

$I_0(\beta)$

if $N = \text{odd} \leftarrow ; -(N-1) \leq n \leq (N-1)$

if $N = \text{even} \leftarrow ; -\left(\frac{N}{2}-1\right) \leq n \leq \left(\frac{N}{2}-1\right)$

= 0

; elsewhere

$I_0(x)$ is a modified Bessel f_n of 1st kind.

β : control factor b/w transⁿ band & pass band ripple.

$I_0(x)$ is evaluated using power series ..

$$I_0(x) = 1 + \sum_{k=1}^L \left[\frac{\left(\frac{x}{2}\right)^k}{k!} \right]^2 ; \text{ typically, } L \leq 25.$$

→ when $\beta = 0$

Kaiser window corresponds to rectangular window

→ when $\beta = 5.44$

Kaiser window is very similar to Hamming window

→ β : determined based on stop band attenuation requirements .

* Empirical formula to estimate β

→ $\beta = 0$ if $A \leq 21$ (corresponding to rectangular window)

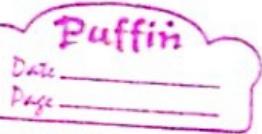
$$\beta = 0.5842(A-21)^{0.4} + 0.07886(A-21)$$

if $21 < A < 50 \text{ dB}$

(for Hamming window)

* Linear phase char. get only when $h[n]$ is symm.

So, only half the length of filter coeff will be needed to compute.



$$\hookrightarrow \beta = 0.1102(A - 8.7) \quad \text{if } A > 50 \text{ dB}$$

* where, $A = -20 \log_{10}(\delta)$

$$\hookrightarrow \delta = \min(\delta_s, \delta_p)$$

stepband ripple passband ripple

• computing coeff. for filter coeff. (Kaiser window)

$$\hookrightarrow N \geq \frac{A - 7.95}{14.36 \Delta f}$$

Δf : normalized transition width

• Note:

values of B & N are to be used to compute Kaiser window coeff $w[n]$

* Idea: for any given question & we have to use window $f[n]$,

- ① See stopband attenuation using data given in question. Compare using data given in table. Decide the apt. window.

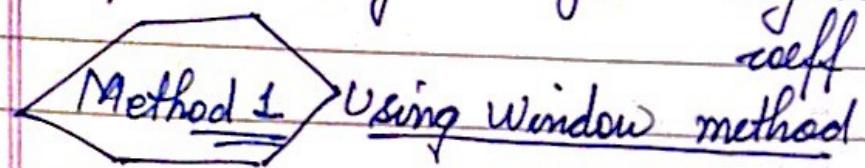
- ② Note the transition width from question. Use that in table to find N .

- ③ Using respective formulae, find $h_0(n)$ from 0 to $N-1$

$w[n]$ from 0 to $N-1$

- ④ Now, $h[n] = h_0(n) \times w[n]$

* Steps to design FIR filter : by calculating FIR coeff.



- s1) Specify the desired freq. response $H_D(\omega)$
- s2) Obtain the impulse response $h_D(n)$ by IFT.
- s3) Select window fn that specifies attenuation specs.
~~Determine N using apt. relⁿ bw N & df~~
(Transn width)
- s4) Obtain values of w_n & hence $h(n)$ by

$$h(n) = h_D(n) \cdot w_n$$

method is straight forward but not optimal

Q. Obtain low pass FIR filter coeff. to meet the following specifications using window method.

- ① Passband edge freq = 1.5 kHz
- ② $A_f = 0.5 \text{ kHz}$
- ③ $\Rightarrow \text{Trans}^n \text{ width} = 0.5 \text{ kHz}$
- ④ Stop band attenuation $\geq 50 \text{ dB}$.
- ⑤ $f_c = 8 \text{ kHz}$

We choose Hamming ② (\because of condⁿ ③)

Now,

$$\frac{3.1}{N} = \frac{0.5 \text{ kHz}}{8 \text{ kHz}} = 0.625 \Rightarrow N = 52.8$$

\rightarrow normalising

From table

$$h_D(n) \text{ for LPF} = \begin{cases} 2f_c \frac{\sin(n\omega_c)}{(n\omega_c)} & n \neq 0 \\ 2f_c & n=0 \end{cases}$$

From cond n (3),

Hannning, Blackman or Kaiser satisfy.

(2)

Use Hannning (2) for simplicity.

Now, $N = 52.8$

$\Rightarrow n$ varies from -26 to 26.

Now,

$$w(n) = 0.54 + 0.46 \cos\left(\frac{2\pi n}{53}\right); -26 \leq n \leq 26.$$

Because of smearing effect of window, cut off freq of resultant filter will be diff from spec.

To compensate this,

$$f_c' = f_c + \frac{\Delta f}{2} = 1.75 \text{ kHz} = \frac{1.75}{8} = 0.21875$$

Since $h(n)$ is symmetrical, we need to compute values for $h(0)$ to $h(26)$ only.

$$\therefore h_D(0) = 2f_c = 0.4375; w(0) = 1; h(0) = (0.4375)(1)$$

$$h_D(1) = 2f_c \sin(nw_c) = 0.31219$$

$$(nw_c) \quad w(1) = 0.54 + 0.46 \cos\left(\frac{2\pi(1)}{53}\right)$$

$$w(1) = 0.99677.$$

$$h(1) = 0.31118 \\ = h(-1)$$

$$h(2) = 2f_c \sin(2w_c) = 0.06013$$

$$(2w_c) \quad w(2) = 0.98713$$

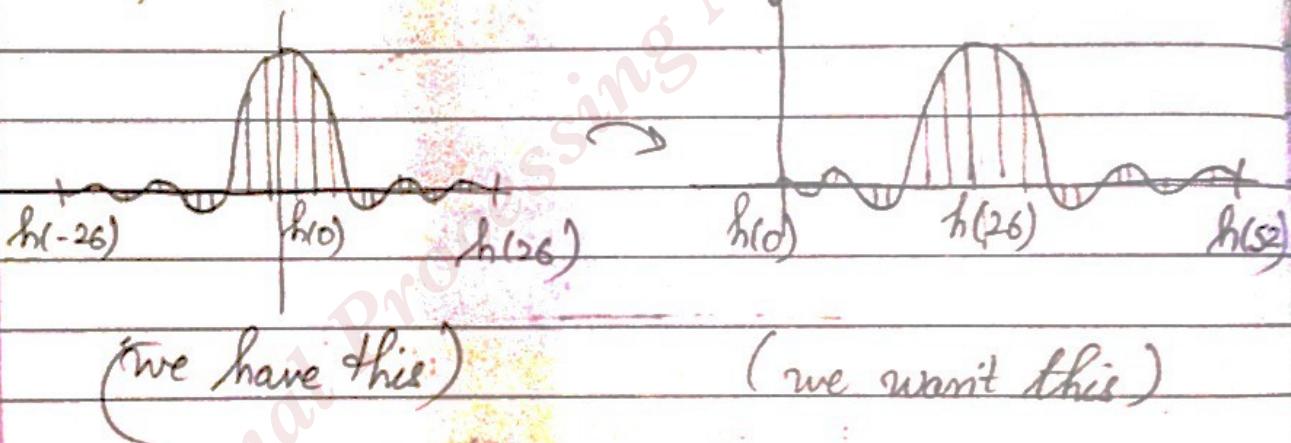
$$h(2) = 0.06012 \\ = h(-2)$$

$$\text{H}(26) = h_0(-26) = -0.000914$$

we did for -26 to 26 .

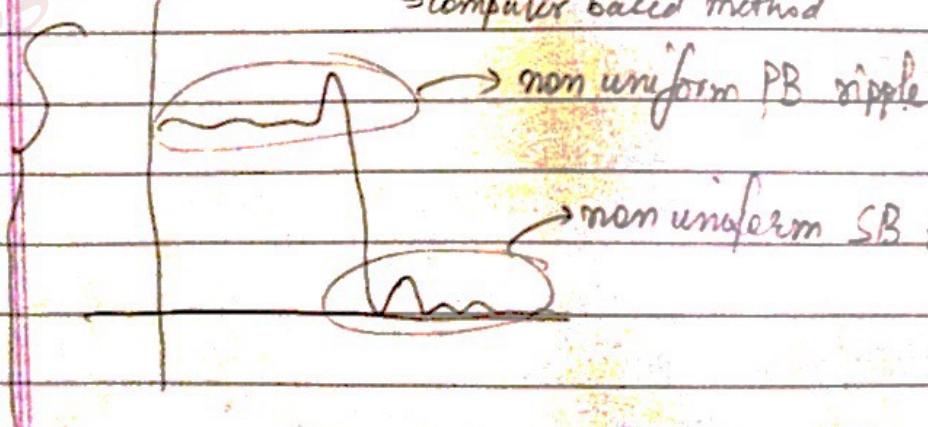
Now, we need to implement for 0 to 52 .
So, we have to shift it
hence, for 53 coeff. of filter to be implemented,
index has to be modified by adding 26 to
each index.

Graphically (what are we doing)



Method 2: OPTIMAL METHOD for filter design
computer based method (FIR)

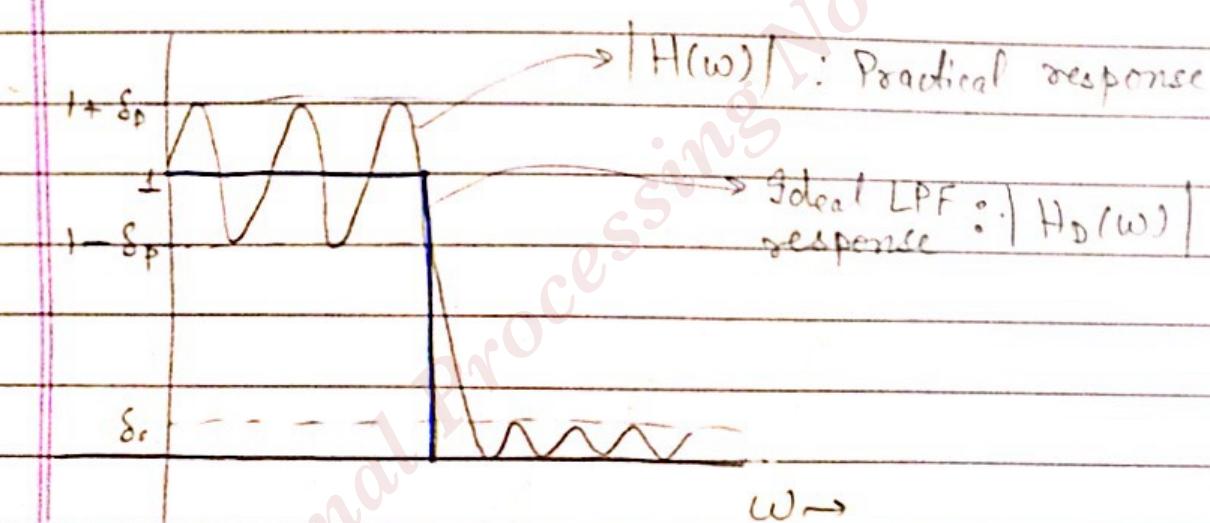
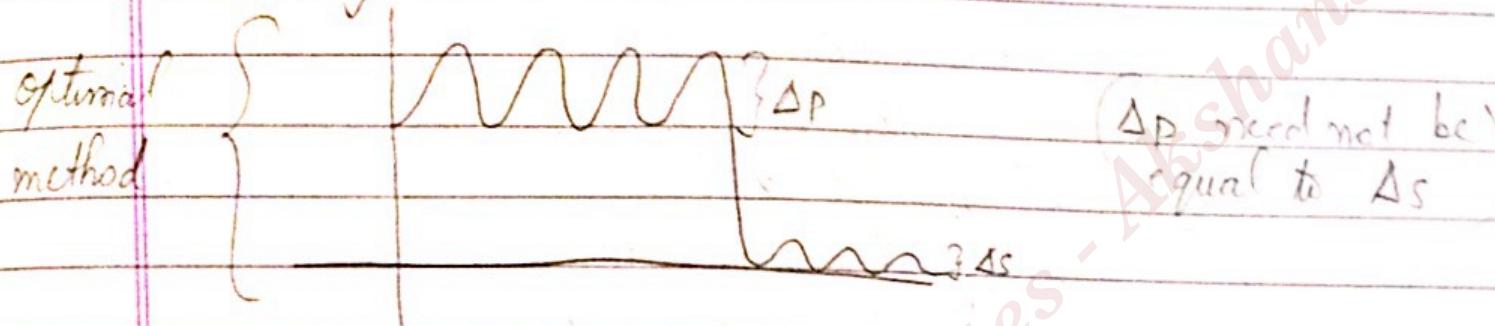
this is
window
method.



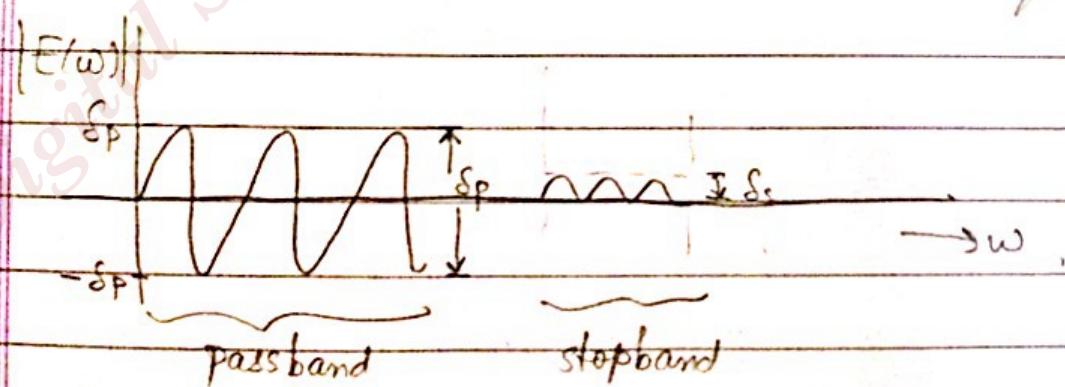
non uniform PB ripple

non uniform SB ripple

In optimal method, we want to find FIR coeffs,
 s.t. PB & SB ripple is UNIFORM.
 (We are trying to equalize the variations in
 something like :-)

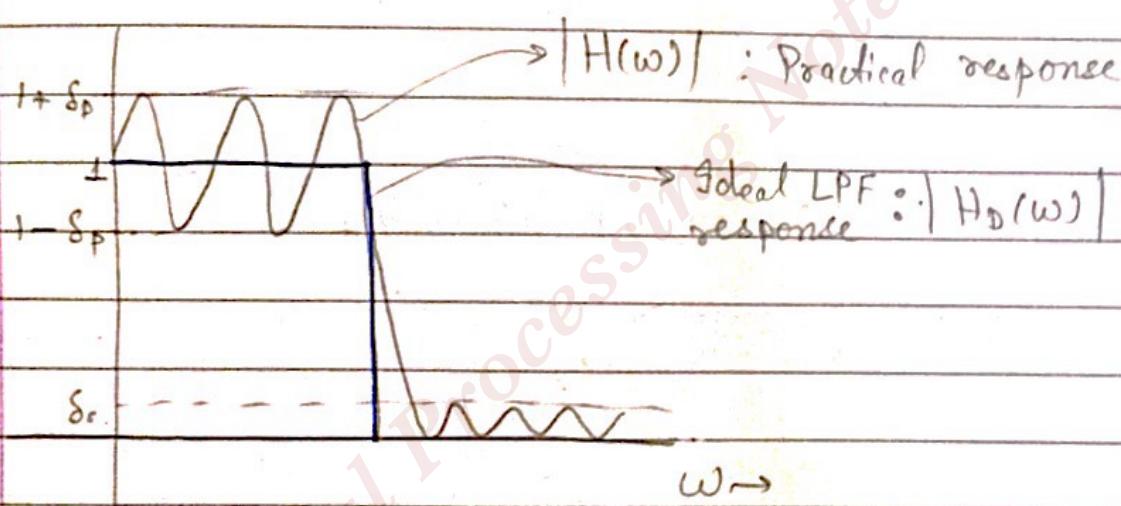
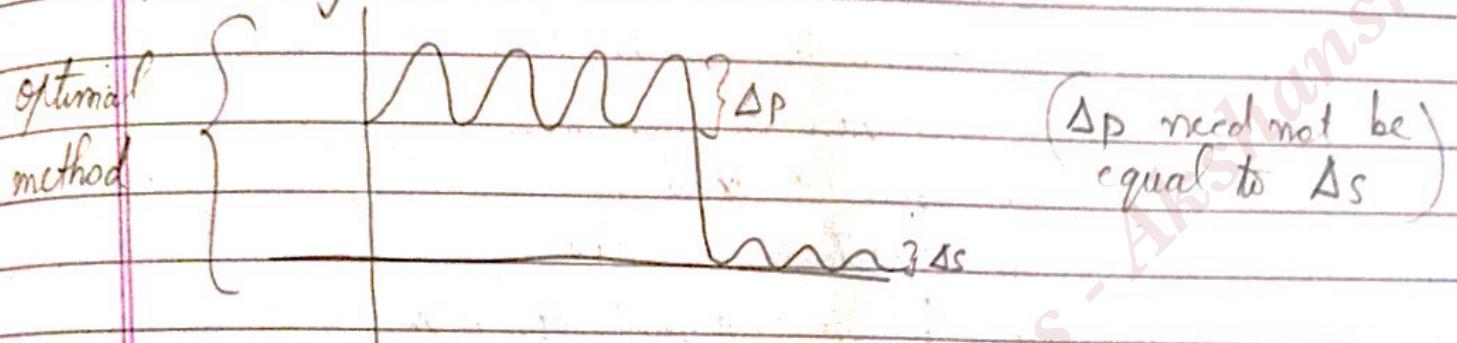


We need to reduce error s.t. \exists equal ripples

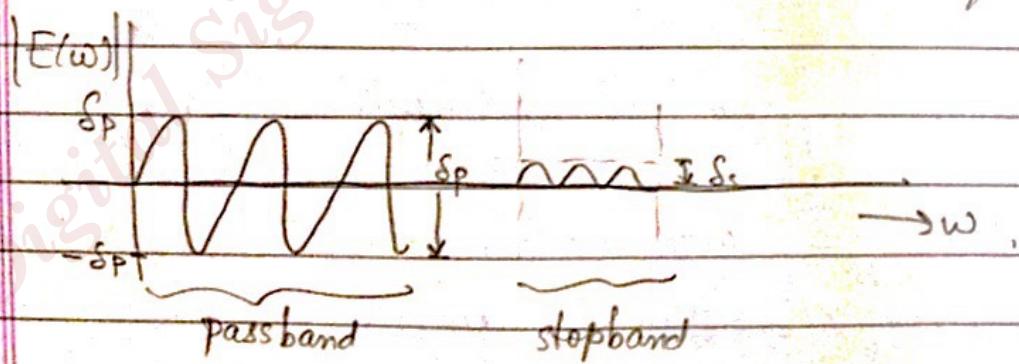


In optimal method, we want to find FIR coeffs,
 s.t. PB & SB ripple is UNIFORM.

(We are trying to equalise the variations).
 something like :-



We need to reduce error s.t. \exists equal ripples



Computer Program Steps

Specify filter & determine program inputs.

A computational method

Initial guess of $n+1$ extrema.

Determine $|F(w)|$ & its largest $n+1$ extrema

Extrema changed?

No

Obtain the impulse response

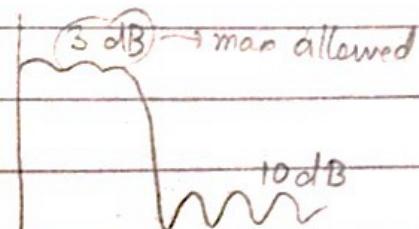
• Parameters req'd to use optimal program:

N : no. of filter coeff., i.e., filter length

J type: specifies type of filter ($J = 1, 2, 3$)

$W(w)$: Weighting fn

We see, how weight ratio is given.



So, more weight has to be applied to PB. So, ratio = 10:3

N grid : no. of pt. we are using to plot freq response

Edge : the edge freq.

e.g. A linear phase BP filter is to be designed
 ↓
 FIR

Given :- PB 900-1100 Hz

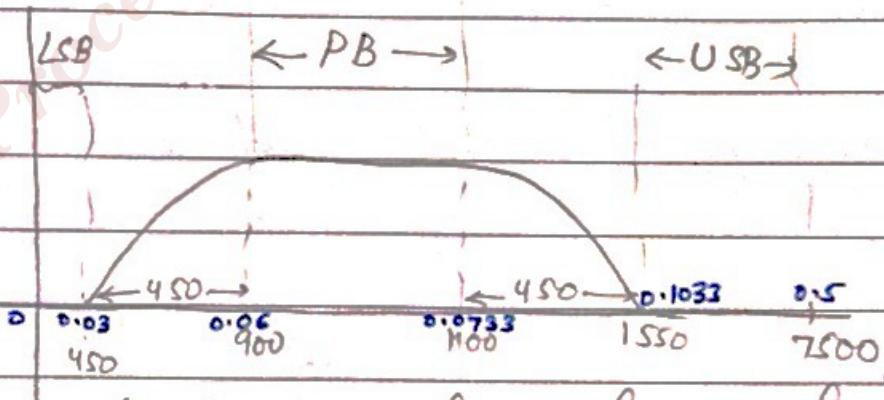
PB ripple < 0.87 dB

SB attenuation > 30 dB

sampling freq 15 kHz

trans" freq 450 Hz

So, we have



Values given to computer in normalised form, always

$$\text{So, } 450 \rightarrow 450/15000 = 0.03$$

$$900 \rightarrow 900/15000 = 0.06$$

$$1100 \rightarrow 1100/15000 = 0.0733$$

$$1550 \rightarrow 1550/15000 = 0.1033$$

$$7500 \rightarrow 7500/15000 = 0.5$$

Now, choose weights : depending on PB & SB deviation
 Weight : found by PB ripple & SB attenuation

$$0.87 \text{ dB Ripple} : 20 \log(1 + S_p) \Rightarrow S_p = 0.10535$$

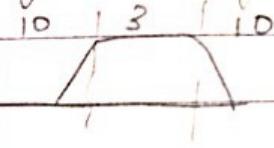
$$30 \text{ dB attenuation} : -20 \log(S_s) \Rightarrow S_s = 0.031623$$

$$S_p \times 100 \approx 10$$

$$S_s \times 100 \approx 3$$

Idea So, ripple in PB is more (10), so, apply less weight(s)
 & attenuation in SB is less (3), so, apply more weight(s)

$$\text{So, ratio } S_p : S_s = 10 : 3$$



Using these values & computing ?

Filter length, found as 40; for making odd,
 let $N = 41$

$$T \text{ type } = 1$$

$$\text{Weights } w(n) = 10, 3, 10$$

$$N_{\text{grid}} = 32$$

$$\text{edge freqs.} : 0, 0.03, 0.06, 0.0733, 0.1033, 0.5$$

\Rightarrow tre symm.
 So, compute only
 20 samples
 + center sample.

What do we get ?

Impulse
 response
 coeff.

$$h(1) = \dots = h(41)$$

$$h(2) = \dots = h(40)$$

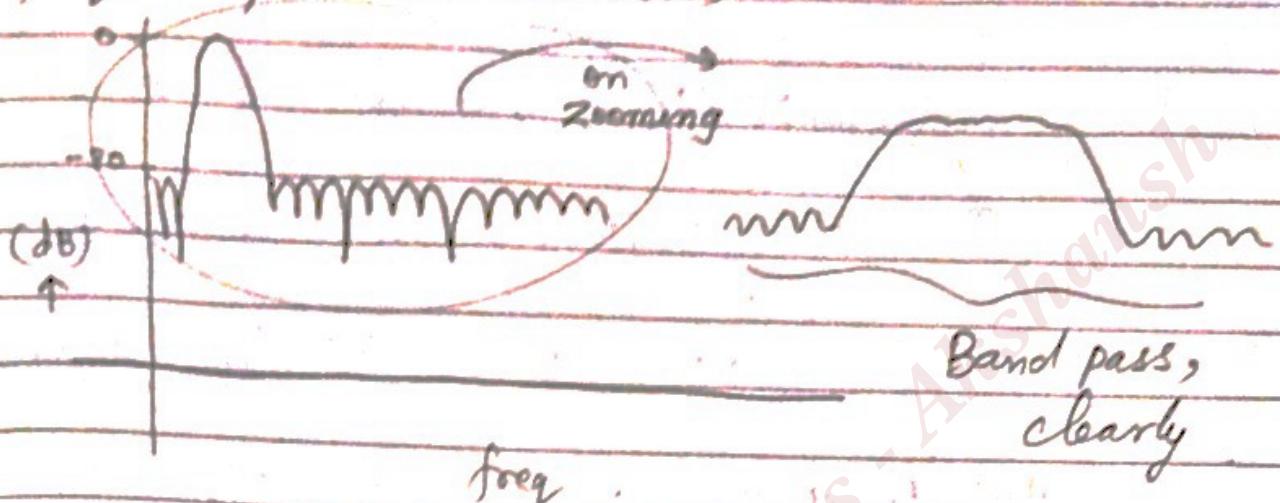
& corresponding
 extrema frequencies.

$$h(12) = \dots = h(21)$$

* N grid: can be seen on processor's grid.
(16, or 32 or 64)

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Date
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Corresponding to impulse response coeff, one find freq. response (normalised).



Now, we have 2 SB & 1 PB.

let SB₁ = Band 1

PB = Band 2

SB₂ = Band 3

Now, we calculated deviation values

$$\delta_p = 0.1033$$

$$\delta_s = 0.031$$

After computing & getting result, we get o/p showing summary of all the values (& deviations in graph got above)

OPTIMAL METHOD FOR DESIGNING FIR FILTER

① * for a LPF, empirical formula for finding N, using optimal method:

$$\text{no. of coeffs. } N \approx \frac{D_0(\delta_p, \delta_s)}{\Delta F} - f(\delta_p, \delta_s) \Delta F + 1$$

wipple in PB

wipple in stopband (SB)

continued

ΔF : width of trans" band normalised to sampling freq.

$$D_\infty(S_p, S_s) = \log_{10} S_s [a_1 (\log_{10} S_p)^2 + a_2 \log_{10} S_p + a_3] \\ + [a_4 (\log_{10} S_p)^2 + a_5 \log_{10} S_p + a_6]$$

$$f(S_p, S_s) = 11.01217 + 0.51244 [\log_{10} S_p - \log_{10} S_s]$$

$$a_1 = 5.309 \times 10^{-3}$$

$$a_4 = -2.66 \times 10^{-3}$$

$$a_2 = 7.114 \times 10^{-2}$$

$$a_5 = -5.941 \times 10^{-1}$$

$$a_3 = -4.761 \times 10^{-1}$$

$$a_6 = -4.278 \times 10^{-1}$$

② for BPF, empirical formula:

$$N \approx \frac{C_\infty(S_p, S_s)}{\Delta F} + g(S_p, S_s) \Delta F + I$$

where

$$C_\infty(S_p, S_s) = \log_{10} S_s [b_1 (\log_{10} S_p)^2 + b_2 \log_{10} S_p + b_3]$$

$$+ [b_4 (\log_{10} S_p)^2 + b_5 \log_{10} S_p + b_6]$$

$$g(S_p, S_s) = -14.6 \log \left(\frac{S_p}{S_s} \right) - 16.9$$

$$b_1 = 0.01201$$

$$b_2 = 0.09664$$

Method (3)

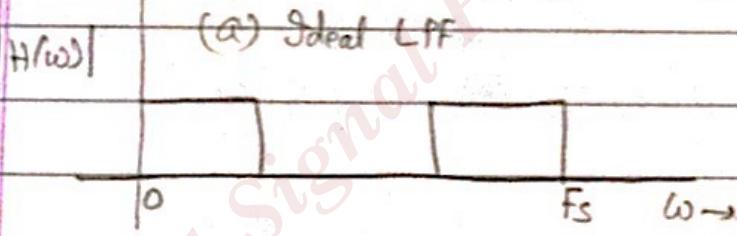
Frequency sampling method.

consider an ideal LPF

we are taking diffst samples of freq.
 So, we have freq. values at diffst pts. as shown above
 Now, the points in between can vary in
 any way. So, deciding coeff. appropriately, we can design
 the req^d filter & limit the ripples in PB, if req^d.
 This method allows non-recursive FIR design
 both freq. selective and arbitrary freq. response
 filters.

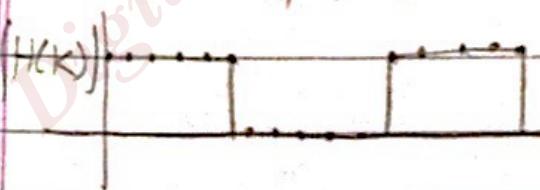
Unique attraction is that this method allows
 recursive implementation leading to computationally
 efficient filters.

• Non recursive freq. sampling filters :



We have freq. at diff intervals \Rightarrow discrete intervals $\Rightarrow H(z)$ value

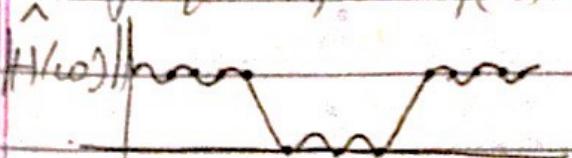
(b) Samples of ideal LPF

(whose FT is $H(\omega)$)Now, take F^{-1} to get h(n)

freq. response

$$h(n) = \frac{1}{N} \sum_{k=0}^{N-1} H(k) e^{j\left(\frac{2\pi}{N}\right) n k}$$

(c) freq. response derived from freq. samples of (b).



$$= \frac{1}{N} \sum_{k=0}^{N-1} |H(k)| e^{-j\left(\frac{2\pi}{N}\right) k} e^{j\left(\frac{2\pi}{N}\right) n k}$$

$$= \frac{1}{N} \sum_{k=0}^{N-1} |H(k)| e^{j2\pi k(n-k)}$$

$$= \frac{1}{N} \sum_{k=0}^{N-1} H(k) \cos \left[\frac{2\pi k(n-\alpha)}{N} \right]$$

Since $h(n)$ is real, for linear phase, $h(n)$ will be symmetrical. Assuming the symmetry & N is even,

$$\therefore h(n) = \frac{1}{N} \left[\sum_{k=1}^{\frac{N}{2}} 2|H(k)| \cos \left[\frac{2\pi k(n-\alpha)}{N} \right] + H(0) \right]$$

N is odd, upper limit changes to $\frac{N-1}{2}$

$$\therefore h(n) = \frac{1}{N} \left[\sum_{k=1}^{\frac{N-1}{2}} 2|H(k)| \cos \left[\frac{2\pi k(n-\alpha)}{N} \right] + H(0) \right]$$

∴ freq. response is exactly same as sampling instant. Other than that instant, response is significantly diff.

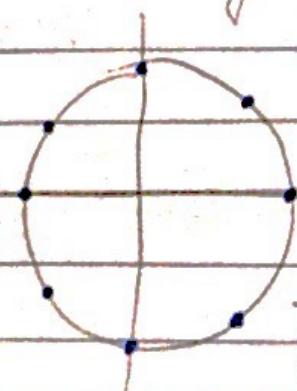
∴ we must take a sufficient no. of freq. samples. A diff freq sampling filler-type 2 will result if samples are taken at intervals of $f_k = \frac{(k+\frac{1}{2})}{N}$

eg. Suppose one sampling is of $1_1, 1_2, 1_3, 1_4$, starts at next, shift it a bit $1_{0.1}, 1_{1.1}, 1_{2.1}, 1_{3.1}, 1_{4.1}, 0_{0.1}$ starts at & make type-2

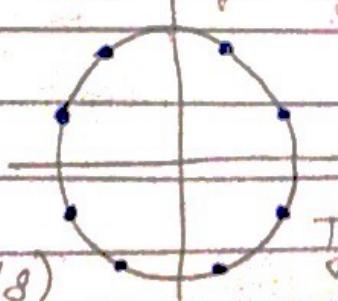
so, same type of sampling used to get diff samples

In terms of angle:

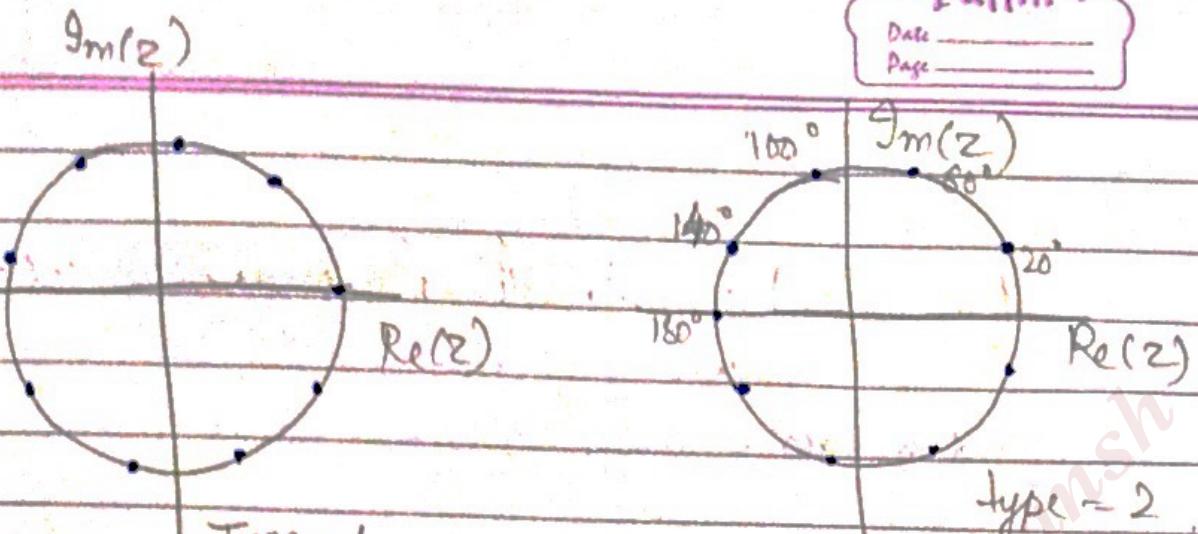
N : no. of samples



Type - 1
(N even/8)



Type - 2
(N even/8)



Type - 1

 $N = 9$ (odd)(Start from 0°)
(for type 1, always)

$$\frac{360^\circ}{9} = 40^\circ$$

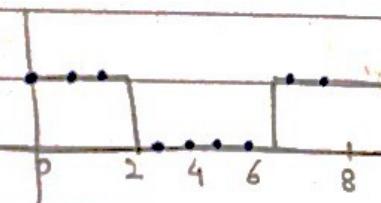
for Type 2; take $\frac{1}{2}$ of
angle $= 20^\circ$. So, start
from 20° .eg :- Requirement : $PB = 0 - 5 \text{ kHz}$

$$F_s = 18 \text{ kHz}$$

$$N = 9$$

find FIR coeff ($h(n)$) using freq. sampling method.

Given :- Ideal LPF :-

we have 9 pts. & $f_s = 18 \text{ kHz}$.So, sampling interval $= \frac{18}{9} = 2 \text{ kHz}$. $PB = 0 - 5 \text{ kHz}$. Dr. $\exists 3$ pts at
 0 kHz , 2 kHz & 4 kHz in the LPFSo, from alone fig, seeing in terms of $H(k)$

$$\text{as :- } |H(k)| = \begin{cases} 1, & k = 0, 1, 2 \\ 0, & k = 3, 4 \end{cases}$$

Note :- It's symmetrical. So, only take till $h(4)$.

Now, finding $h(n)$

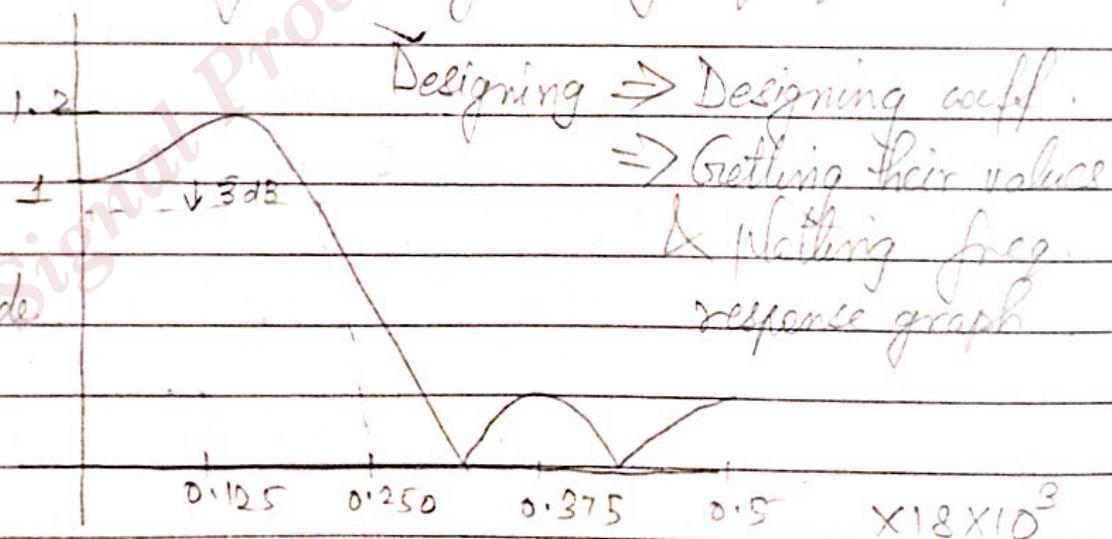
$$h(n) = \frac{1}{N} \left[\sum_{k=1}^{N-1} 2|H(k)| \cos \left[\frac{2\pi k(n-\alpha)}{N} + H(0) \right] \right]$$

Using values, we get

$h(0)$	$7.2522627e-02$	$h[8]$
$h(1)$	$-1.111111e-01$	$h[7]$
$h[2]$	$-5.9120987e-02$	$h[6]$
$h[3]$	$3.1993169e-01$	$h[5]$
$h[4]$	$5.55555556e-01$	$h[4]$

Now, seeing if these coeff. are correct?

Checking done by seeing freq. response.



Now, in non-ideal case, there may exist some samples in trans. band.

* Optimising the amplitude response in freq. Sampling method:

In window method, wider transⁿ width gives improved amplitude response.

Why, in freq. sampling method, we can allow more samples in transⁿ band to have more attenuation.

For a LPF, stopband attenuation varies approx. 20 dB for each transⁿ band freq. sample.

approx. stopband attenuation : ~~20 + (25 + 20) M~~ dB.
" transⁿ width : $(M+1) \frac{F_s}{N}$.

M : no. of freq. sample in transⁿ band

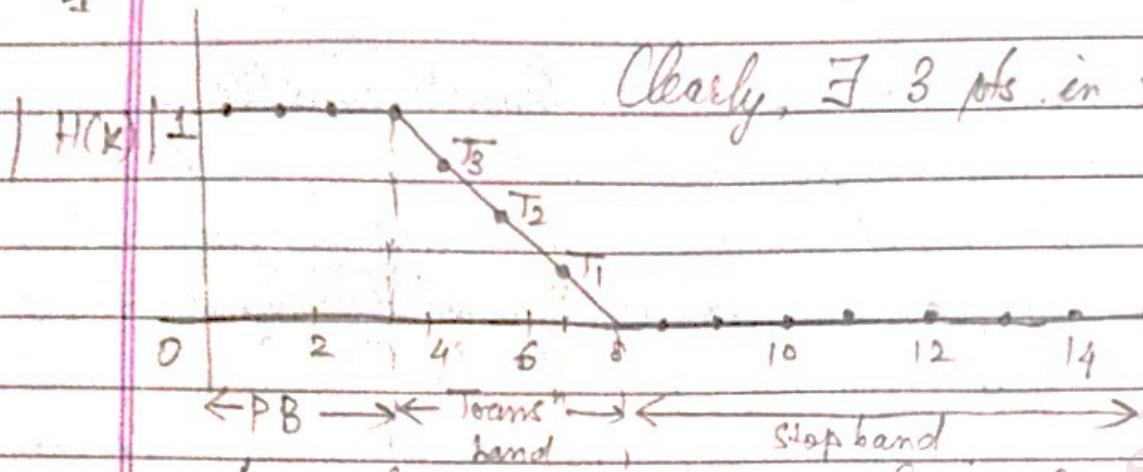
N : filter length

The value of transⁿ band freq. samples that will give optimum stopband attenuation are determined by Optimizⁿ process. The desired property can be mathematically represented as:-

$$\text{minimise}_{(T_1, T_2, \dots, T_M)} \left[\max \left| w [H_0(\omega) - H(\omega)] \right| \right]$$

* Depending on N & no. of samples in transⁿ band, optimised value will differ.

e.g. Consider LPF : It's a 15 pt. FIR filter



Clearly, \exists 3 pts. in trans. band

Any value in trans. band, has value b/w 0 to 1
 ↳ Observed values :

- If \exists one value in trans. band, its value lies b/w $0.25 \leq T_1 \leq 0.45$
- 2 values in trans. band
 $0.04 \leq T_1 \leq 0.15$
 $0.45 \leq T_2 \leq 0.85$
- 3 values in trans. band.
 $0.003 \leq T_1 \leq 0.035$
 $0.100 \leq T_2 \leq 0.300$,
 $0.55 \leq T_3 \leq 0.75$

e.g. Consider a 15 pt. FIR filter

Given freq. responses :-

$$|H(k)| = \begin{cases} 1 & ; k = 0, 1, 2, 3 \\ 0 & ; k = 4, 5, 6, 7 \end{cases}$$

assume $f_s = 2 \text{ kHz}$,

taking only half ($\frac{15}{2}$)

① Obtain its freq. response.

Idea : Find $h(n)$ & plot graph.

$$3 = 20 \log_{10} (Y_{f2})$$

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Q) Compare freq. response of filter if

- (a) One sample lies in trans' band
- (b) 2 " " "
- (c) 3 " " "

Basically, see how the design varies.

Q) (a) $|H(k)|$ changes as

$$|H(k)| = \begin{cases} 1 & k=0, 1, 2, 3 \\ 0.40406 & k=4 \\ 0 & k=5, 6, 7 \end{cases}$$

(from table 7.11)

for the no. (k) in BW column

Note down its SB attenuation & its value (T_s)

having known these values, put in eqⁿ & find $h(n)$ & plot.

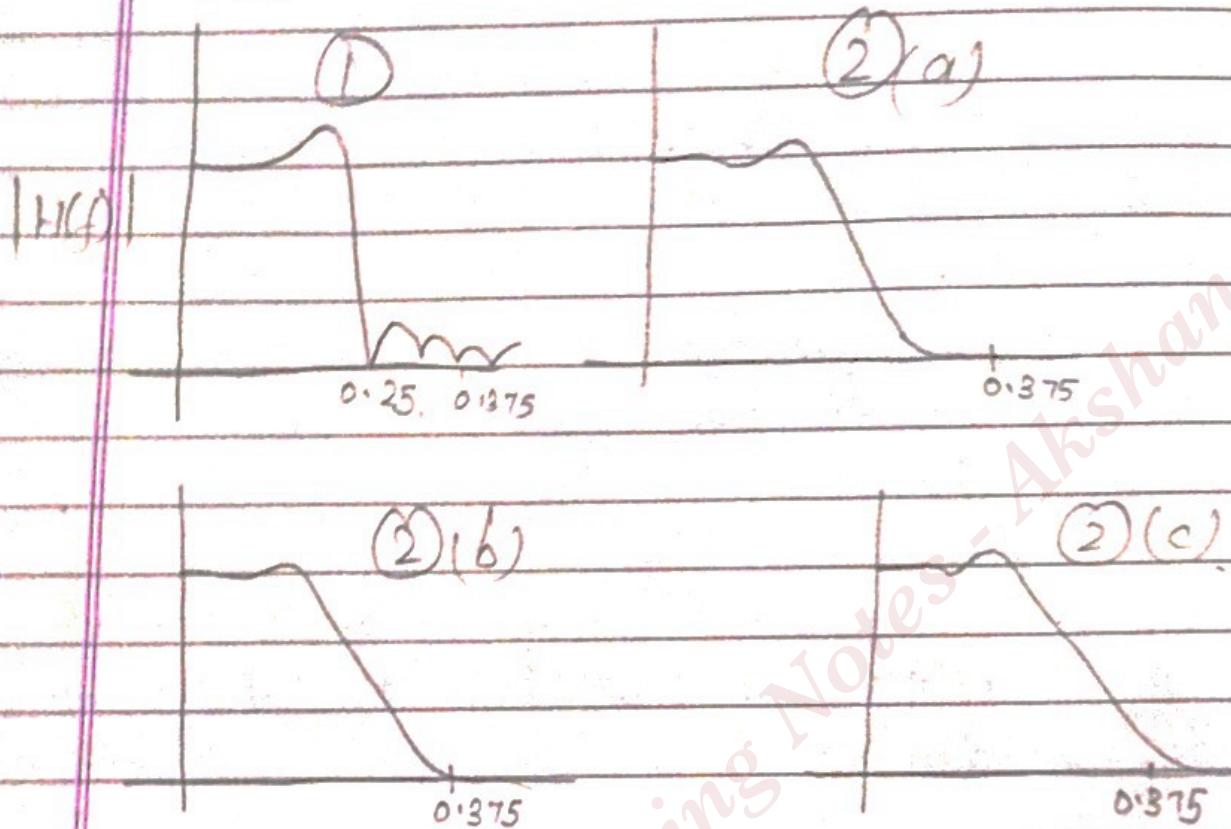
(b) 1 by 2 samples

$$|H(k)| = \begin{cases} 1 & k=0, 1, 2, 3 \\ 0.084 & k=4 \\ 0.557 & k=5 \\ 0 & k=6, 7 \end{cases}$$

(c) 1 by 3 samples

$k=4, 5, 6$ in trans' band.

Note values from table & make freq. response.

Results:

Inference :- Transfer band is increasing as no. of samples in it increase.

PHYSICALLY

Say, 3 dB variation in PB. So, if max. value is 100% or 1, what is value at low 3 dB i.e., -3 dB \rightarrow

$$-3 \text{ dB} = 20 \log_{10}(\text{value}) = 0.707$$

Now, similarly, if SB attenuation = 40 dB, what is value at SB?

$$-40 \text{ dB} = 20 \log_{10}(\text{value}) = 0.01$$

So, value = 0.01 at SB. (goes down from 1 to 0.01)

Q) Find optimum freq. samples of transⁿ band freq given:-

$$\text{PB edge freq} = 0.143 \text{ (normalised)}$$

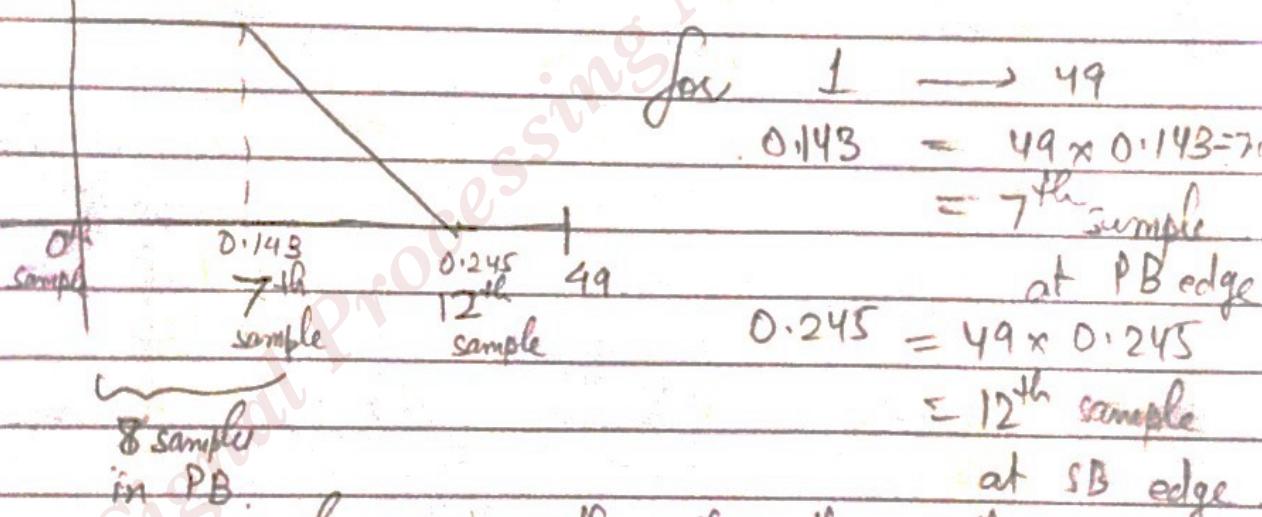
$$\text{SB edge freq} = 0.245 \text{ (normalised)}$$

$$\text{no. of filter coeff} = 49$$

$\Rightarrow f_s$ not reqd

Idea: Find the coeff. no. corresponding to PB & SB, i.e. what no. coeff is corresponding to 0.143 & 0.245 (say, x & y). So,

$y - x$ are no. of samples in transⁿ band
It's symmetrical, so, take 25 samples.



So, 7th, 8th, 9th, 10th & 11th sample in transⁿ band.

So, total 5 samples in transⁿ band.

Finding value corresponding to the sample

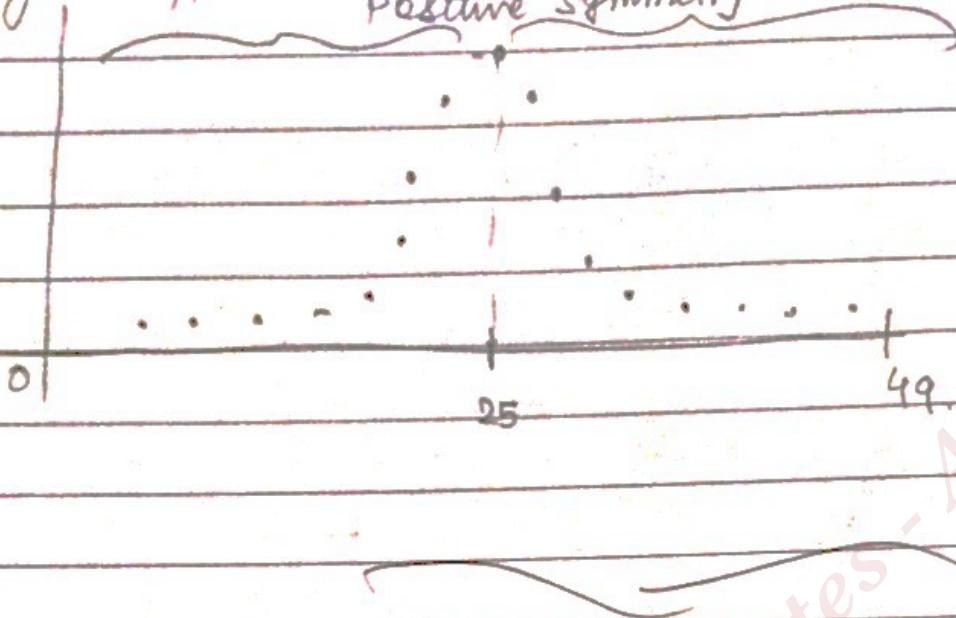
$$\text{So, } 8^{\text{th}} \rightarrow 8$$

Using these values,

check if the given freq. response (in any problem)

Note: In case of a value 7.005, choose 7th or 8th → See condⁿ

Final op something like
positive symmetry



* Way to remember :-

Inductor :



Passes DC

(straight line passes through it)

Stops AC

(AC signal gets sort of jumbled up)

Capacitor

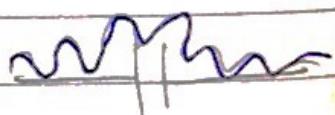


Stops DC



Passes AC

= goes over it



*

$H(j\omega)$

$\delta_p \text{ or } 20 \log(1 + \delta_p)$

$\delta_s \text{ or } 20 \log(\delta_s)$

* Recursive freq. sampling method.
 => freq. sampling with FEEDBACK

$$h(n) = \frac{1}{N} \sum_{k=0}^{N-1} H(k) e^{-j(2\pi k N/N)} ; k=0, 1, \dots, N-1$$

based on
no. of coeff $R \leq 1$

Discrete inverse FT.

radius of unit circle; if $R \leq 1$,
sys. always stable

Now,

$$TF, H(z) = \sum_{n=0}^{N-1} h(n) z^{-n} = \sum_{n=0}^{N-1} \left[\frac{1}{N} \sum_{k=0}^{N-1} H(k) e^{-j(2\pi k N/N)} \right] z^{-n}$$

Discrete freq. domain Discrete time domain.

Interchanging limits

$$H(z) = \frac{1}{N} \sum_{k=0}^{N-1} H(k) \left\{ \sum_{n=0}^{N-1} \left(r e^{-j(2\pi k N/N)} z^{-1} \right)^n \right\}.$$

Now, for finite GIP, we can say,

$$\text{Sum} = S_N = \sum_{n=0}^{N-1} \delta^n = \frac{1 - \delta^N}{1 - \delta} ; \delta \neq 1$$

(δ : common ratio of GIP)

$$\Rightarrow \sum_{n=0}^{N-1} \delta^n = \frac{1 - (r e^{-j(2\pi k N/N)} z^{-1})^N}{1 - r e^{-j(2\pi k N/N)} z^{-1}} = \frac{1 - (r e^{-j(2\pi k N/N)})^{-N}}{1 - (r e^{-j(2\pi k N/N)}) z^{-1}}$$

(= Numerator
Denominator)

= N zeros on/inside unit circle
($r = 1 < 1$)
+ pole on/inside unit circle

$$\text{So, } \therefore e^{j2\pi k} = 1 (\cos(2\pi k) + j\sin(0))$$

$$\sum_{n=0}^{N-1} g^n = \frac{1 - e^N z^{-N}}{1 - re^{j2\pi k/N} z^{-1}}$$

Now,

$$H(z) = \frac{1}{N} \sum_{k=0}^{N-1} H(k) \times \frac{1 - e^N z^{-N}}{1 - re^{j2\pi k/N} z^{-1}}$$

$$= \left(\frac{1 - e^N z^{-N}}{N} \right) \sum_{k=0}^{N-1} \frac{H(k)}{1 - re^{j2\pi k/N} z^{-1}}$$

$$= (\text{Poly. in -ve power of } z) \times \frac{1}{(\text{Poly. in -ve power of } z)}$$

{ Numerator }

{ Denominator }

* So, feedback sort of seen

$$\Rightarrow H(z) = H_1(z) \cdot H_2(z)$$

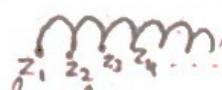
$$H_1(z) = \frac{1 - e^N z^{-N}}{z} \rightarrow \text{Radius of zero loc}^{tr}$$

$$H_2(z) = \sum_{k=0}^{N-1} \frac{H(k)}{1 - re^{j2\pi k/N} z^{-1}} \rightarrow \text{Radius of pole loc}^{tr} \quad (r < 1, \text{ mostly for stability})$$

$\hookrightarrow k \in \mathbb{Z}, N: \text{no. of samples}$

$$\frac{k}{N} \not\in \mathbb{Z}$$

$$= \frac{H(0)}{1 - rz^{-1}} + \frac{H(1)}{1 - re^{j2\pi/N} z^{-1}} + \dots + \frac{H(N-1)}{1 - re^{j2\pi(N-1)/N} z^{-1}}$$

* N zeroes \Rightarrow sth like 
So, looks like comb

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$$\text{if } h = 1$$

$$\Rightarrow H(z) = \frac{1 - z^{-N}}{N} \sum_{k=0}^{N-1} \frac{H(k)}{1 - e^{j2\pi k/N} z^{-1}}$$

$$= H_1(z) \cdot H_2(z)$$

(cascaded)

\exists N zeroes around unit circle (Comb filter)
 $\&$ \exists N sections of single pole filter with

$$z_k = e^{j2\pi k/N}$$

\therefore Poles exactly cancel the zeroes
(each change in zeroes is compensated by pole locⁿ)

Wordlength effects:

\hookrightarrow doesn't cancel the zeroes exactly thus, making FIR filter, an IIR and thus, unstable.

Stability issue is solved by sampling $H(z)$ at a radius slightly less than unity.

Consider $H_2(z)$

If poles are complex, then $H(k)$ will also be complex. But, $H(k)$ (freq. response) can't be imaginary. So, we take double poles (as, complex poles are in complex conjugate)

So, we take 2nd order (N double pole) sections instead of N sections of ² single poles

So, in this case, $H_2(z)$ changes to

$$H_2(z) = H(0) + H(1) + H^*(1) + H(2) + \dots$$

$$\frac{1}{1 - az^{-1}} + \frac{1}{1 - ae^{j2\pi/N} z^{-1}} + \frac{1}{1 - ae^{-j2\pi/N} z^{-1}} + \frac{1}{1 - ae^{j2\pi/2N} z^{-1}} + \dots$$

one Double pole section

* If integer or powers of 2 coeffs. are used, computational efficiency is improved. It's only possible if \exists restriction on pole loc^{ns} i.e. at specific freq.

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Thus, poles are scan in conjugate pairs

For linear phase filters of even length, $H(N/2) = 0$
Combining kth pole & its conjugate

$$\Rightarrow H(k) + H^*(k)$$

$$1 - r e^{j 2\pi k/N} z^{-1} \quad 1 - r e^{-j 2\pi k/N} z^{-1}$$

Taking LCM & solving,
simplifying denominator

$$() () = 1 - 2r \cos\left(\frac{2\pi k}{N}\right) z^{-1} + r^2 z^{-2}$$

For linear phase filter, $H(z) = |H(k)| e^{-j 2\pi k \alpha / N}$

$$\alpha = \frac{N-1}{2}$$

& simplifying numerator:
we get

$$|H(k)| \left\{ 2 \cos\left(\frac{2\pi k \alpha}{N}\right) 2r \cos\left(\frac{2\pi k(1+\alpha)}{N}\right) z^{-1} \right\}$$

Combining numerator & denominator,

$$H(z) = \frac{1 - r^N z^{-N}}{1 - 2r \cos\left(\frac{2\pi k}{N}\right) z^{-1} + r^2 z^{-2}}$$

$$H(z) = \sum_{k=1}^{N/2} |H(k)| \left\{ 2 \cos\left(\frac{2\pi k \alpha}{N}\right) 2r \cos\left(\frac{2\pi k(1+\alpha)}{N}\right) z^{-1} \right\} + \frac{H(0)}{1 - 2z^{-1}}$$

assuming M: double poles

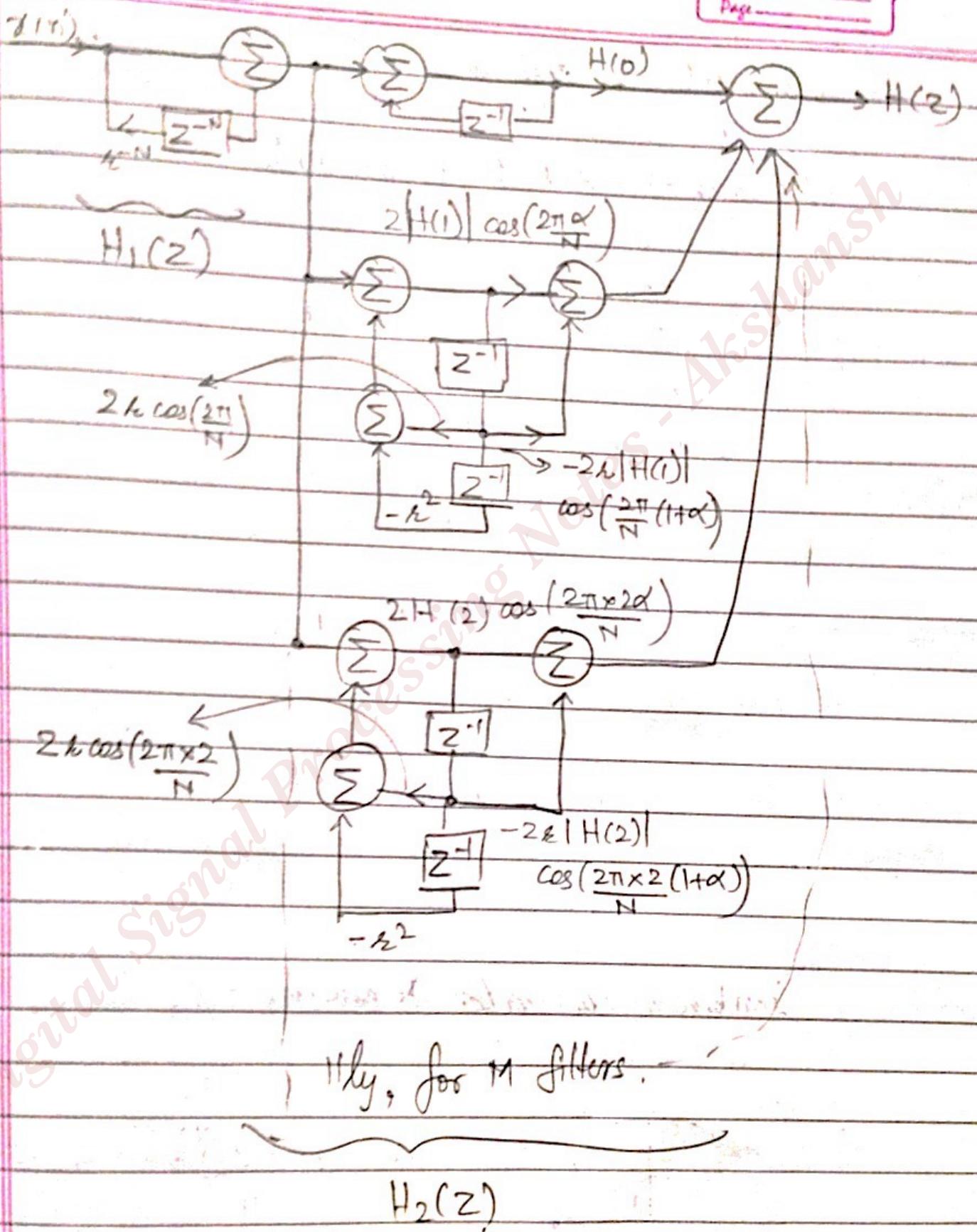
for $N = \begin{cases} \text{odd}, M = \frac{N-1}{2} \\ \text{even}, M = \frac{N}{2} \end{cases}$

Implementing

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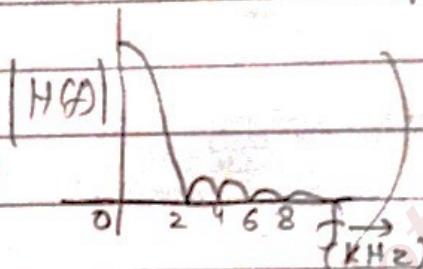
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Q. Obtain TF & difference eq'

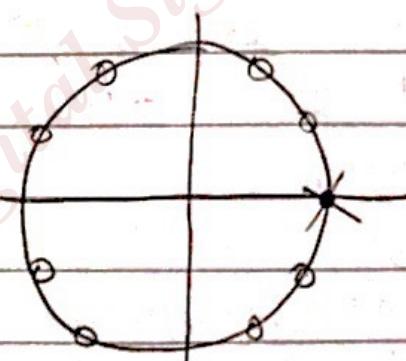
- ① a recursive FIR Lowpass filter with simple integer coeff meeting following specs:-
 centre freq :- 0 Hz
 sampling freq :- 18 kHz

(i.e., we are seeking something like



- ② a recursive FIR bandpass filter with simple integer coeff meeting following specs:-
 centre freq :- 3 kHz
 sampling freq :- 12 kHz

- ① Assume we take 9 samples. So, placing them on unit circle, we get



$$H(z) = \frac{1 - z^{-9}}{9} \left(\frac{1}{1 - ke^{j\omega_0}z^{-1}} \right)$$

for $k=1$ for $H_2(z)$
 $N=9$
 for $H_1(z)$ keeping $k=0$,

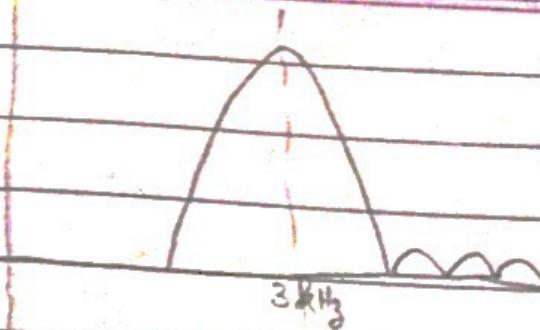
i.e., pole at 0°

Diff. eq :-

$$y(n) = y(n-1) + \frac{1}{9} (x(n) - x(n-9))$$

∴ we want
 centre freq. at
 0 Hz

(2)



It's req'd to keep a pole at 3 kHz.
And there should be a pole corresponding to 3 kHz on unit circle.

Assuming 8 samples so, $12 = 1.5 \text{ kHz}$.

Hence, each sample at $1.5^{\circ} = 1.5 \text{ kHz}$. (So, on 2nd sample, 3 kHz comes, as wanted).

Now, for Z plane, for 360° & 8 samples,
each sample is at $360^\circ = 45^\circ$.

Now, we want pole at 2nd sample. &

So, at angle $= 90^\circ$, we get 3 kHz sample.

$$(0, 1.5 \text{ kHz}, 3 \text{ kHz}) \\ 0^\circ, 45^\circ, 90^\circ$$

So, 3 kHz sample comes on Imaginary axis.

Hence, its conjugate will be there at 270° also.

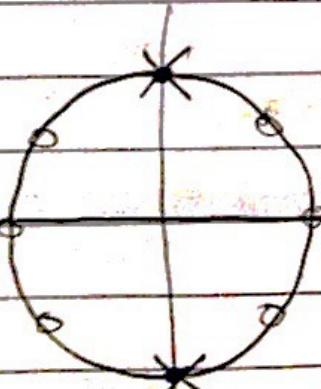
Hence, we have

$$H(z) = \frac{(1 - z^{-8})}{8} \left(\frac{1}{1 + z^{-2}} \right)$$

Dif. eq. r/t-

$$y(n) = -y(n-2) + \frac{1}{8} (x(n) - x(n-8))$$

& graph:-



Q. A LPF with spec. :-

$$PB : 0 - 4 \text{ kHz}$$

$$f_s = 18 \text{ kHz}$$

$$\text{length of filter} = 9$$

Find :- TF of filter in recursive form using DIFZ.

Sampling method.

(Assume $\alpha = 1$.)

Draw $nabg^n$ diagram & compare computational complexities with direct form FIR.

Soln:-

$$\text{Sampling interval} = \frac{18 \text{ kHz}}{9} = 2 \text{ kHz}$$

So, samples are at $0 \text{ kHz}, 0+2 \text{ kHz}, 0+2+2 \text{ kHz},$

$$\text{So, } H(k) = \begin{cases} 1 & ; k=0, 1, 2 \\ 0 & ; k=3, 4 \end{cases}$$

Now,

$$H(z) = \underbrace{[-z^{-9} \sum_{k=0}^2 H(k)]}_{q} \left(\underbrace{+ 2[H(2)]}_{+ 2[H(2)](z^{-1}) + \frac{1}{1-z^{-1}}} \right) \quad \left(\begin{array}{l} \because \text{LP Band} \\ \text{is } 0 - 4 \text{ kHz,} \\ \text{given} \end{array} \right)$$

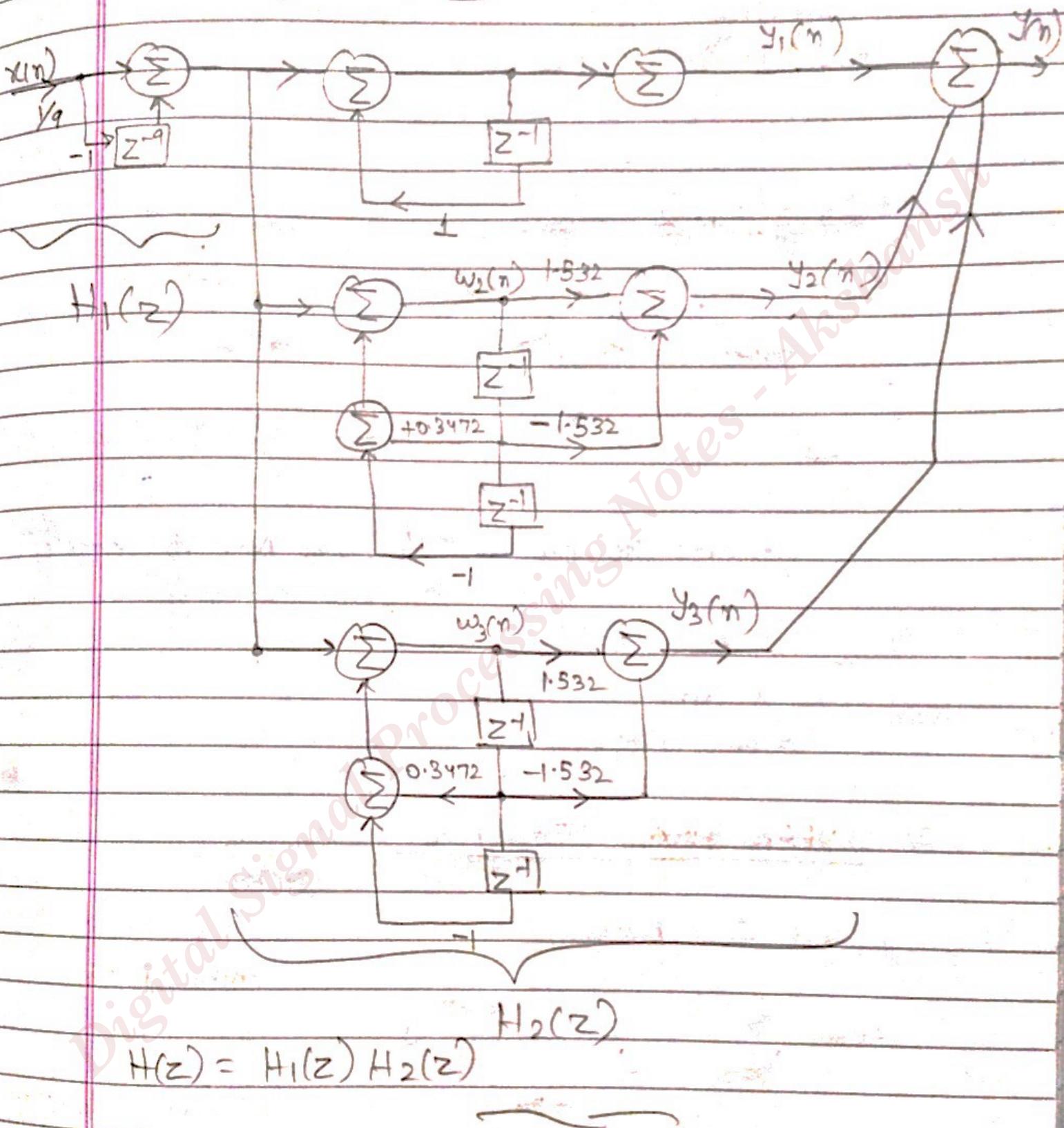
using the expression $H(z) = H_1(z) + H_2(z)$

$$\Rightarrow H(z) = \frac{1-z^{-9}}{q} \left[\frac{-1.8794(1-z^{-1})}{1-1.532z^{-1}+z^{-2}} + \frac{1.532(1-z^{-1})}{1-0.3472z^{-1}+z^{-2}} + \frac{1}{1-z^{-1}} \right]$$

$$H_1(z)$$

$$H_2(z)$$

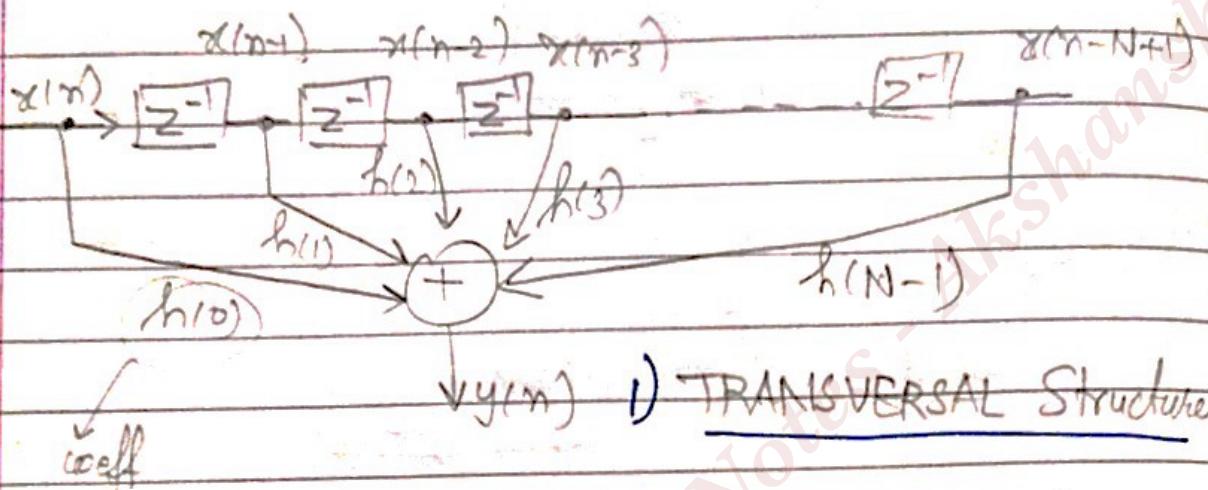
Canonical form representⁿ:



* Impulse response coeff. of FIR sys. are symmetrical.

* Realisation structures of FIR filters

$$H(z) = \sum_{n=0}^{N-1} h(n) z^{-n}; y(n) = \sum_{m=0}^{N-1} h(m) x(n-m)$$



Uses :

- N-1 memory locⁿ to store N-1 ip samples
- N memory locⁿ to store N coeff.
- N multipliers
- N-1 addition

hardware device requirements to implement N point FIR filter.

2) LINEAR PHASE STRUCTURE (take advantage of Symm.)

$$h(n) = \pm h(N-n-1)$$

$$H(z) = \sum_{n=0}^{\frac{N-1}{2}} h(n) [z^{-n} + z^{-(N-1-n)}]$$

$$+ h(\frac{N-1}{2}) z^{-\frac{(N-1)}{2}}$$

↳ for N=odd

→ suppose N=13

$$h(0) = h(13)$$

$$h(1) = h(12)$$

So, we are multiplying
 $x(n) h(n-n)$.

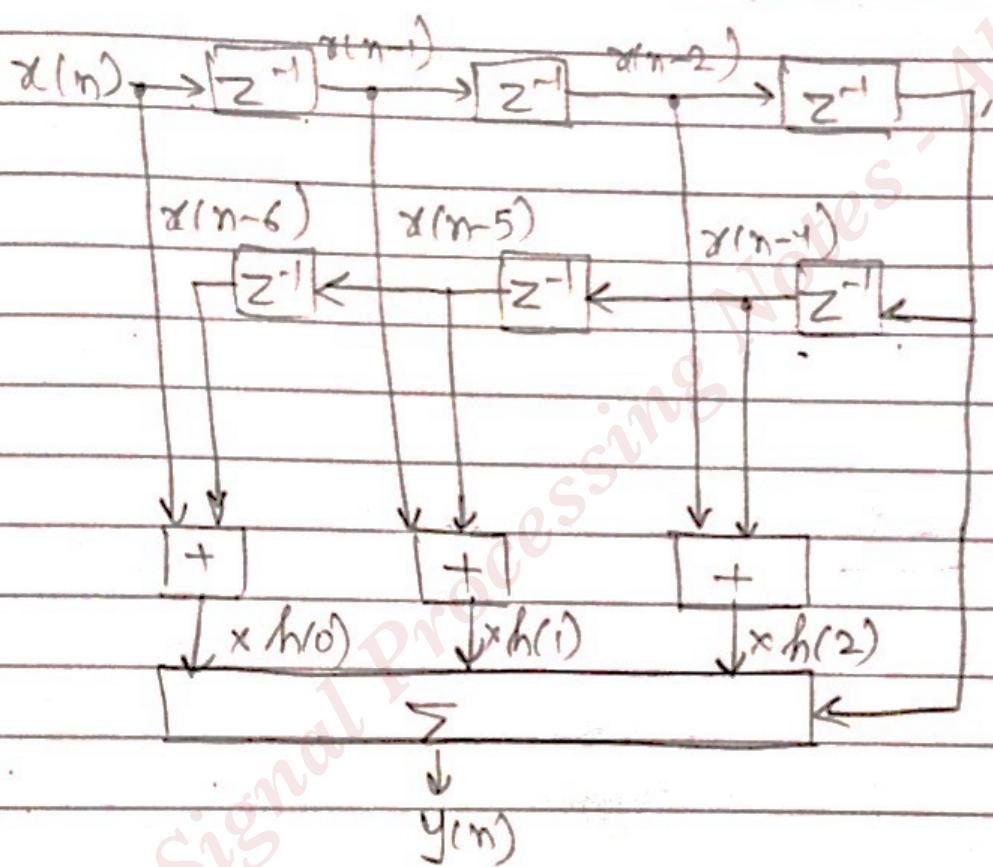
we needed N multipliers
above. Now, we'll

need $\frac{N}{2}$ or $\frac{N-1}{2}$

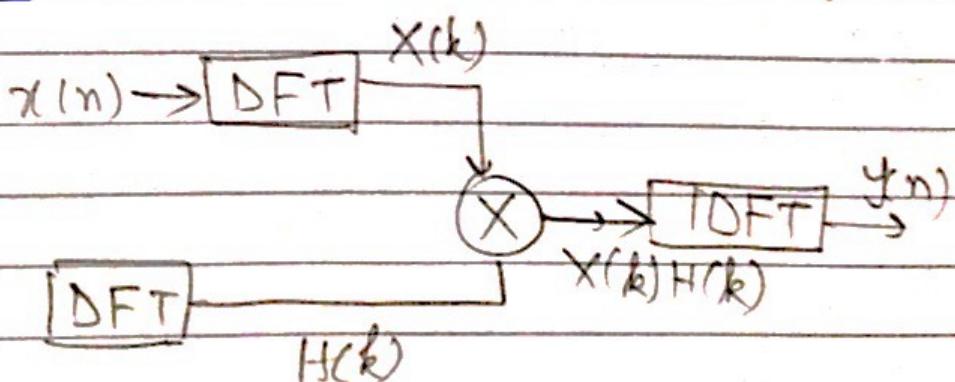
$$H(z) = \sum_{k=0}^{N-1} h(k) [x(n-k) + x[n-(N-1-k)]]$$

\rightarrow for $n = \text{even}$

eg : $N = 7$: 7 pt FIR



3) DFT METHOD



8

FINITE WORD LENGTH EFFECT

ON IIR FILTERS

Direct form I: Computing 2nd order section

$$\text{O/P} \rightarrow y(n) = \sum_{i=0}^2 b_i x(n-i) - \sum_{i=1}^2 a_i y(n-i)$$

(difference eq.)

&

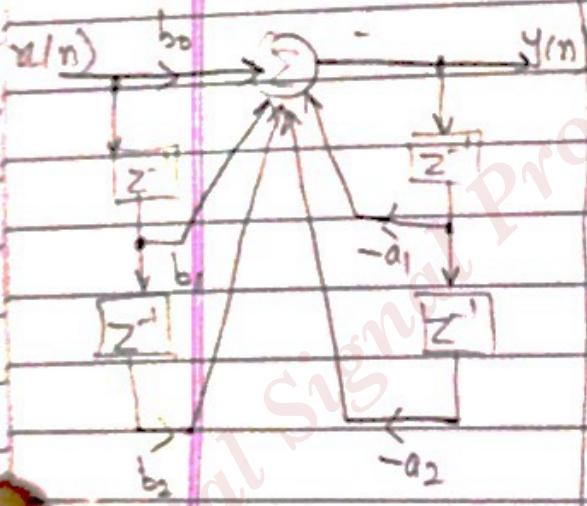
$$H(z) = \frac{b_0 + b_1 z^{-1} + b_2 z^{-2}}{1 + a_1 z^{-1} + a_2 z^{-2}}$$

num
den

→ 2nd ord. std. TF.

→ 3 5 filter coeff.

⇒ 5 memory loc^{ns} reqd to store them



$$H(z) = \frac{y(z)}{x(z)} = \frac{\text{num}}{\text{den}}$$

$$\Rightarrow y(z) \text{ den} = x(z) \text{ num}$$

Taking z^{-1}

$$\Rightarrow y(n) + a_1 y(n-1) + a_2 y(n-2) = b_0 x(n) + b_1 x(n-1) + b_2 x(n-2)$$

$$\Rightarrow y(n) = b_0 x(n) + b_1 x(n-1) + b_2 x(n-2) - a_1 y(n-1) - a_2 y(n-2)$$

→ 9 memory loc^{ns} + 6

5 for data

→ delay elements (z^{-1} terms)

2 in num & 2 in den ⇒ Total 4

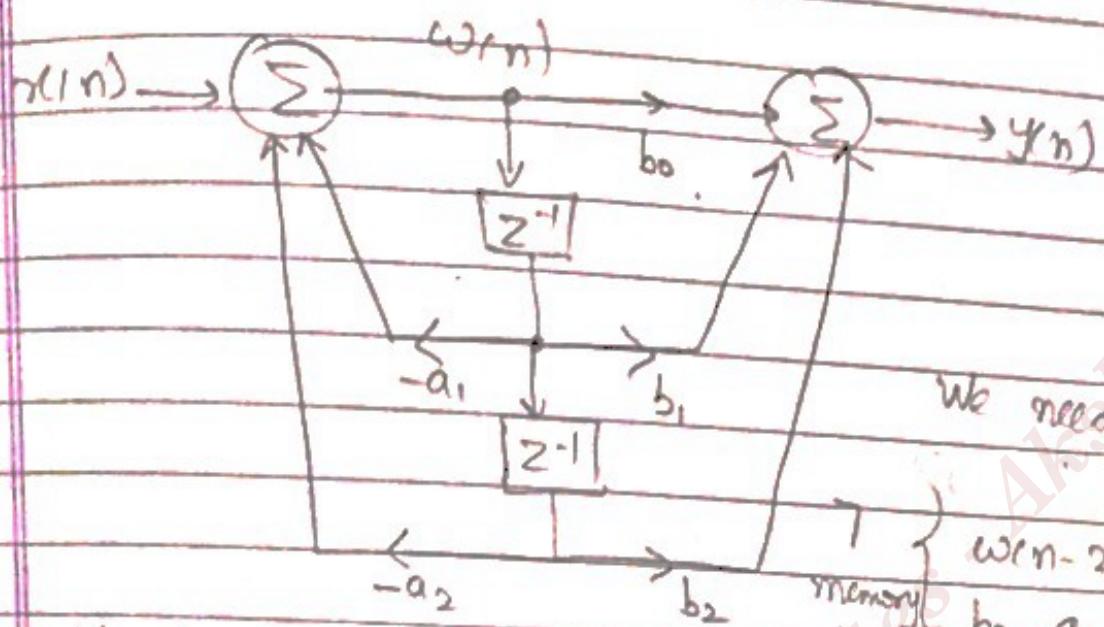
→ 1 adder (4 additions)

→ 1 quantizer pt. for sum of product.

→ 1 multiplier (5 multiplications)



Direct form II :-



We need to store
 $w(n-1)$,

$w(n-2), b_0, b_1,$
memory loc. b_2, a_1, a_2

Hardware structure reqd. :-

- 5 filter coeff.
- 2 delay elements
- 2 adders (4 additions)
- 2 quantizⁿ pl. for SOP.
- 7 memory loc.

• Quantizⁿ effect on IIR filters :

given a BPF (digital) with $f_s = 153.6 \text{ kHz}$
where

$$H(z) = \frac{1}{1 + a_1 z^{-1} + a_2 z^{-2}} \quad (\text{single 2nd order section})$$

where $a_1 = -1.957558$, $a_2 = 0.995913$.

Now, quantize the coeff. to 8 bits & see effect

or poles loc. & hence, or centre freq

$$\omega = \sqrt{a_2}, \theta = \cos^{-1}\left(-\frac{a_1}{2\omega}\right)$$

(finding ω & θ from given coeff. of TF)

M2 :- find poles & use calculator to convert to polar

here, we get

$$\ell = \sqrt{0.995913} = 0.99795$$

$$\Theta = 108^{-1} \left(\frac{1.957558}{2 \times 0.99795} \right) = 11.25^\circ$$

Corresponding centre freq.

$$= \left(\frac{11.25}{360} \right) \times 153.6 \times 10^3 = 4.799 \text{ kHz}$$

Now, representing in 8 bits

↳ 1 bit : signed bit

1 bit : to represent integer part

6 bits : to represent fractional part

↳ sensitivity = 2^6 .

$$\text{So, } a_1 = -1.957558 \times 2^6 = -125.23$$

Truncated coeff = -125.

$$a_2 = 0.995913 \times 10^6 = 63.8$$

Truncated coeff = 63

(we are truncating, not rounding off)

$$\text{So, } a_1 = -\frac{125}{2^6} = -1.953125$$

Change of coeff.

$$a_2 = \frac{63}{2^6} = 0.984375$$

when 8 bits representation is used.

So, new ℓ & Θ values are

$$\ell = 0.992156 (\sqrt{a_2})$$

$$\Theta = \cos^{-1} \left(-\frac{a_1}{2\ell} \right) = 10.17^\circ$$

$$\& \text{ centre freq. : } f_0 = \left(\frac{10.17}{360} \right) \times (153.6 \times 10^3) = 4.34 \text{ kHz.}$$

Conclusion :- (freq. response gets shifted if exact coeff are not implemented)

Seeing change in pole locns:-

M1) Use calculator for new σ, θ

M2) $x + jy = r \cos\theta + j \sin\theta$ ✓

Ex:-

Now, consider a higher order section:-

$$H(z) = H_1(z) \cdot H_2(z) \cdot H_3(z) \cdot H_4(z)$$

(error for each $H_i(z)$ will get accumulated. We are seeing that :)

Given : PB : $20.5 - 23.5 \text{ kHz}$

SB : $0 - 19 \text{ kHz}, 25 - 30 \text{ kHz}$

PB ripple : $\leq 0.25 \text{ dB}$

SB attenuation : $> 45 \text{ dB}$

$$f_s = 100 \text{ kHz}$$

We got 4 sections of 2nd order (using program)

$$H_1(z) = \frac{1 + 0.0339z^{-1} + z^{-2}}{1 - 0.1743z^{-1} + 0.9662z^{-2}}$$

$$H_2(z) = \left(\begin{array}{cc} a_1 & b_1 \\ a_2 & b_2 \end{array} \right) \xrightarrow{\text{order 2}}$$

got using
computer

$$H_3(z) = \left(\begin{array}{cc} a_1 & b_1 \\ a_2 & b_2 \end{array} \right) \xrightarrow{\text{order 2}}$$

program.

$$H_4(z) = \left(\begin{array}{cc} a_1 & b_1 \\ a_2 & b_2 \end{array} \right) \xrightarrow{\text{order 2}}$$

Total: 8

order sys.

Now, Determine suitable coeff. wordlength.

a) to maintain stability

(b) to satisfy freq. response specs.

Suppose we use 8 bits (wordlength), we see response
(for all 4 sections) for rounding off effect

$$\text{For } H_1(z) = a_1 = -(0.1743 \times 2^7 + 0.5) = -22.8104 = -22$$

$$a_2 = (0.9662 \times 2^7 + 0.5) = 124.1736 = 124$$

1 bit for sign, rest 7 for fraction

corresponding modified coeffs become :-

$$a_1 = -22/128 = -0.171875$$

$$a_2 = 124/64 = 0.96875$$

& α, θ is $\alpha = 0.9843$

$$\theta = 84.99^\circ$$

Now do it 4 sections :

Then do $H(z) = H_1(z) H_2(z) H_3(z) H_4(z)$

We get $\frac{\text{num}}{\text{den}}$ (order 8).

Then, find the values of coeff after multiplying.
Now, choose no. of bits to represent these coeff.

Then, see what change come in coeff.

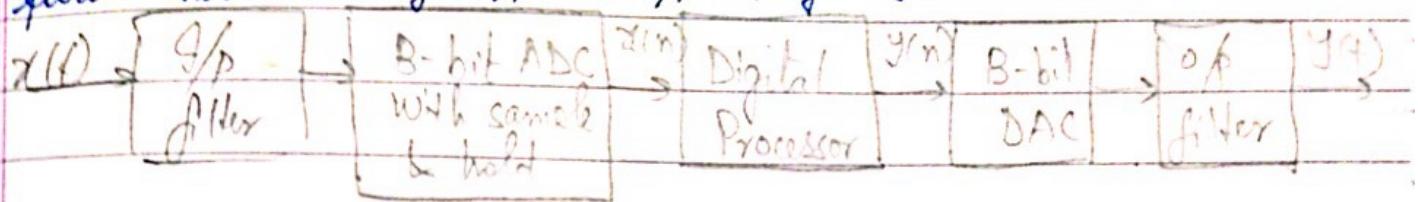
Now that, see if these coeff. are giving satisfying the reqd specs.

(for this problem, representation in 5 & 16 bits showed to satisfy given specs)

↳ seen by finding centre freq & pole loc^{ns}.

or, plot freq. response & see if specs are matching.

- * Block diagram of real time digital filter with analog I/P or O/P signals :-



(How a sys works in DSP)
 This O/P, y(t) will/can act as reference i/p for any electrical sys. (mobile etc.)

- * DAC & ADC are introducing errors

- * Word length effects :-
- 1) ADC noise
 - 2) Eff. quantizⁿ.
 - 3) Round off errors from arithmetic operⁿ.
 - 4) Arithmetic overflow.

eg Consider 2 bit representⁿ (binary (digital)) variation of 9.4 V.

We have 2 bits. So, sensitivity = $1 = 0.25$

Considering V from 0 to 10 V. So, 2^2 , sensitivity = 2.5×10^{-3}

So, $0 - 2.5 \rightarrow 00$ Idea:- if I represent 0.1 V, its 00, $2.4 \rightarrow 00$. If its 2.55, its 01. So, error, max is of 2.5. (for max 10 V) For 1V, its 0.25
 $2.5 - 5 \rightarrow 01$
 $5 - 7.5 \rightarrow 10$
 $7.5 - 10 \rightarrow 11$, So, Δ values from $\frac{1}{4}$

$$7.5 V - 10 V \rightarrow 11$$

4 bit, suppose.
 (errors will come.)

\Rightarrow Sensitivity = $\frac{1}{2^4} = 0.0625$ So, clearly, max. variation b/w actual value & quantized one is $\frac{1}{2^5}$, for 3 bits

$$0 - 0.0625 \rightarrow 0000$$

$$0.94 - 1.00 \rightarrow 1111$$

1111, $7.5 - 8.1 \rightarrow 10000$, say \rightarrow So, $7.5 - 8.1$ has one representⁿ.
 So, error is reduced

* Increasing no. of bits, \Rightarrow cost \uparrow .

So, we want to reduce no. of bits (with some adjustable errors).

If errors are involved & we are able to get req'd response in that case also, that design of B bits is req'd.

* Suppose we have to do 10 bit representⁿ & we have 8 bit 8086 µP. Then, to implement, truncation is req'd.

(3) ROUNDIN OFF ERROR

eg Given decimal no \rightarrow 1898.

Represent it in 3 bits.

Idea: We have diff' forms of representⁿ.

eg: Real no, Integer, Exponential form, double exponential forms etc.

Here, use

$$\text{Exponential form} = \underbrace{I}_{\text{Integer part}} \cdot \underbrace{F}_{\text{Fractional part}} \times \underbrace{E}_{\text{Exponential part}}^{\text{sign}} \rightarrow \text{no.}$$

$$\text{So, here } 1898 = 1.8 E(3)$$

eg:

$$8375.348 \rightarrow \text{represent in 10 bits}$$

st I \rightarrow 2 bits

F \rightarrow 3 bits

E \rightarrow 5 bits.

$$I \rightarrow 83, F \rightarrow 753, E \rightarrow +0002$$

$$= \underbrace{83}_{2} \cdot \underbrace{753}_{3} E(\underbrace{+0002}_{5})$$

(4) Arithmetic overflow.

Suppose we get $x(10)$ that is represented in 8 bits.

Now, we do $x(10) \cdot h(2)$. Then again representing in 8 bits (say) might overflow. So, truncating is reqd.

8 FINITE WORD LENGTH EFFECTS

ON FIR FILTERS

Coeff. quantiz. n:-

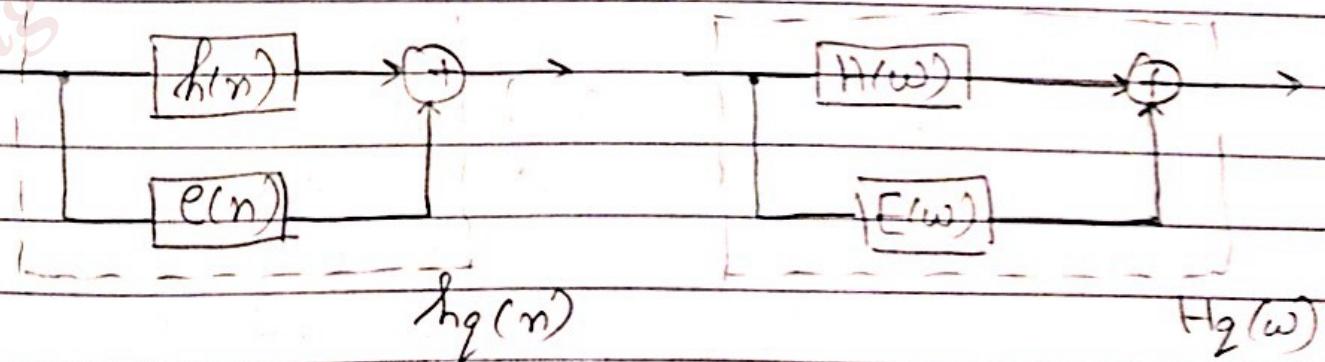
$$h_q(n) = h(n) + e(n) \quad ; \quad n = 0, 1, \dots, N-1$$

$$\Rightarrow H_q(\omega) = H(\omega) + E(\omega)$$

where

$$E(\omega) = \sum_{m=0}^{N-1} e(m) e^{-j\omega m}$$

↳ Objective is to limit $E(\omega)$



* In digital representⁿ of B bits, worst case error (max. error) that can occur in implementing quantized coeff. is $\frac{1}{2^B} = 2^{-B}$.

For N coeff., error = $\frac{N}{3} \times 2^{-B}$.

$$\text{So, } |E(\omega)| = N2^{-B}$$

$\hookrightarrow N$: filter length
 $\hookrightarrow B$: no. of bits

Based on statistical data, we assume only $\frac{N}{3}$ coeff will introduce error_{max.}

$$\Rightarrow |E(\omega)| = \left(\frac{N}{3}\right)^{\frac{1}{2}} 2^{-B}$$

Based on some other approximⁿ.

$$|E(\omega)| = 2^{-B} \left[\frac{(N \log_e N)}{3} \right]^{\frac{1}{2}}$$

* Coeff. quantizⁿ error

e.g. Determine effects of quantizing by rounding off coeff to 8 bits.

PB attenuation > 90 dB

PB ripple < 0.002 dB

PB edge freq 3.375 kHz

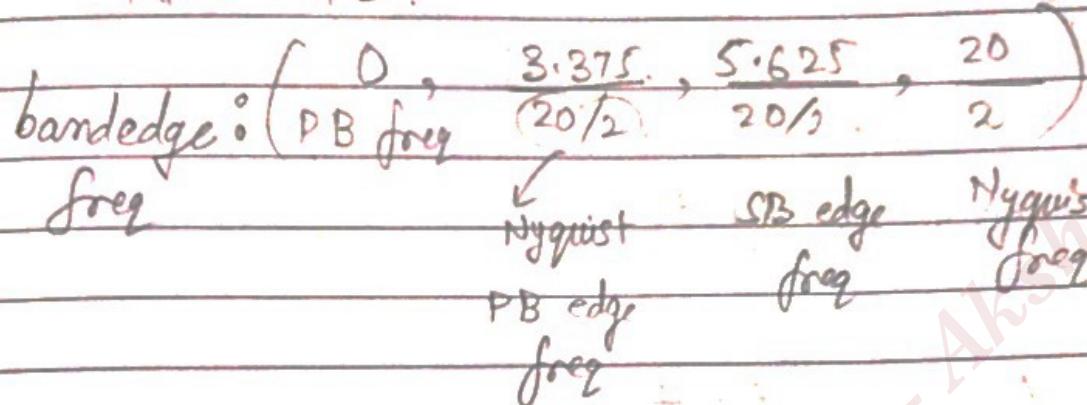
SB edge freq 5.625 kHz

Sampling freq. 20 kHz

No. of coeff. 45

Idea: See how design changes when quantized coeff are used than actual

$$N = 45.$$



weights : 1, 7.28,

From table 7.15 (Seachor), we find symmetrical coeff.

$$h(0) = h(44) = -1.05023e-04$$

$$h(1) = h(43) = -1.25856e-04.$$

Now, these values have to be converted to 8 bit representⁿ (hexadecimal, binary -- depends)

Seeing the values, we see some are +ve, some -ve.

So, 1 bit exclusively for sign So, now represent with remaining 27 bits.

Now, the intervals are

$$14\text{ bit} : 0 \text{ to } \frac{1}{2^7} \text{ ie } 0 - 7.8125 \times 10^{-3}$$

$$7.8125 \times 10^{-3} - 2(7.8125 \times 10^{-3})$$

2nd bit : $\frac{1}{2^7}$ to $\frac{1}{2^7} + \frac{1}{2^7}$

Say the interval is

Suppose

$$\begin{array}{rcl}
 0 - 7.81 \times 10^{-3} & = & 0 - a \\
 7.81 \times 10^{-3} - 15.6 \times 10^{-3} & & a - 2a \\
 & \vdots & 2a - 3a \\
 & \vdots & 3a - 4a
 \end{array}
 \quad \begin{array}{c}
 00 \\
 01 \\
 10 \\
 11
 \end{array}$$

Now,

Seeing Rounding,

For the bit 00, if \exists any value b/w

$$\begin{array}{rcl}
 0 - \frac{a}{2} & & 00 \\
 \frac{a}{2} - a & \rightsquigarrow & 01 \\
 & & \text{rounded off}
 \end{array}$$

likewise, for bit 01, if \exists any value b/w

$$\begin{array}{rcl}
 a - a + \frac{a}{2} & \rightsquigarrow & 01 \\
 a + \frac{a}{2} \rightarrow 2a & \xrightarrow[\text{off}]{\text{rounded}} & 10
 \end{array}$$

On similar lines,

$$\frac{7.81 \times 10^{-3}}{2} \approx 3.9 \times 10^{-3}$$

Now, if any filter has value of coeff as 3.7×10^{-3}
 (3.7654×10^{-3})

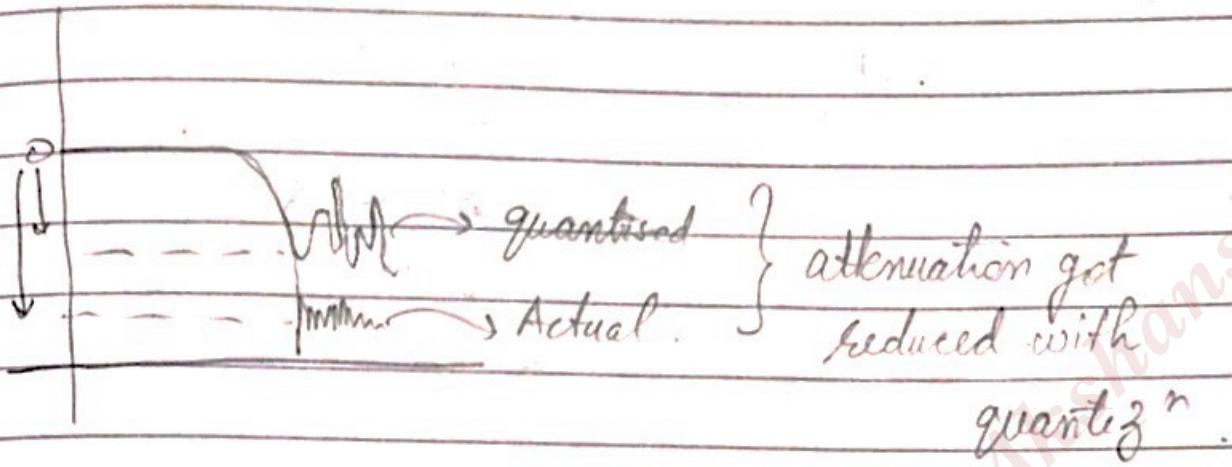
This value is b/w $0 - \frac{a}{2}$

hence, its bit will be 00000000

if any coeff has value $= 4.5 \times 10^{-3}$, say,

its bit will be 00000001 (rounded off)

Graphically, seeing it



(eg) Show that max SB attenuation possible (A_{max}) for a direct form LP FIR filter with coeff. rounded by

$$A_{max} \leq 20 \log_{10} (2^{-B} N) \rightarrow \text{eqn 7.45}$$

Given, LPF FIR filter with specs:-

PB deviation 0.05 dB

sampling freq 10 kHz

PB edge 1.8 kHz

TW 500 Hz

N 65

(a) Estimate no. of bits req'd to represent each coeff. for filter to have attenuation of atleast 60 dB in SB

(b) If coeff. wordlength in (a) is used, estimate increase in PB ripple & redⁿ in SB attenuation (in dB)

(c) Compare actual SB attenuation & PB ripple of filter using coeff. wordlength in (a)

(a) For 60 dB attenuation,

no. of bits can be got as

$$A_{max} \leq 20 \log_{10}(2^B N)$$

$$\therefore B = 15.988 \text{ bits} \approx 16 \text{ bits}$$

With no. of bits got, analysis of response will give (b) & (c).

(b) After quantizⁿ, let the worst case peak ripple in passband, R_{max} & SB attenuation A_{max} .
So, change in PB?

$$R_{max} = 20 \log(1 + S_p + |E(\omega)|)$$

$$\text{error} = N 2^{-B}$$

$$\Rightarrow R_{max} = 20 \log(1 + (S_p) + (65 \times 2^{-16}))$$

$$\text{got as } 20 \log(1 + S_p) = 0.05$$

$$\Rightarrow R_{max} = 20 \log(1 + 0.005713 + 0.001)$$

$$R_{max} = 0.0586 \text{ dB}$$

(So, by quantizⁿ, 0.05 \rightarrow 0.0586)

Now,

Change in SB:

$$\text{got as } 20 \log(S_s) = 60$$

$$A_{max} = -20 \log(S_s + |E(\omega)|) = -20 \log(6.001 + 0.001)$$

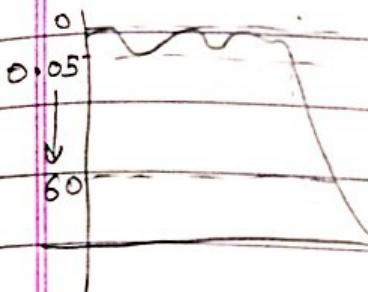
$$= 54 \text{ dB}$$

$$\rightarrow N 2^{-B}$$

(due to quantizⁿ, 60 dB \rightarrow 54 dB)

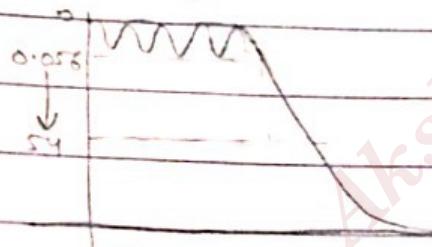
So, basically, if

I had :



on quantization

I got :



(PB ripple increases
SB attenuation decreases)

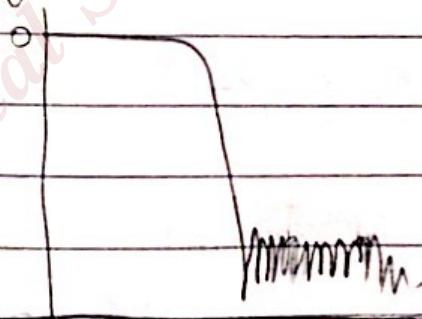
(c) Frequency response got by (Optimal filter design)

$$N = 65$$

$$\text{edge freq} = \left(\frac{0}{f_s/2}, \frac{1.8}{f_s}, \frac{1.8 + 0.5}{f_s}, \frac{f_s/2}{f_s} \right) \rightarrow \text{TW}$$

$$= (0, 0.18, 0.23, 0.5)$$

weights : 1, 5.733



: Graph that we get

(*) Round off error :

represent using double length registers and rounding at the final sum after $y(n)$
overflows overcome by normalizing

So, value never exceeds 1

seen in adder circuits when sum of values exceeds the size of register

how to prevent overflow? \rightarrow scale down (normalize) \rightarrow this decreases value.

M1

Suppose sum(koeff.) $a_1 + a_2 + a_3 = x$.

So, normalize all values, $\frac{a_1}{x}, \frac{a_2}{x}, \frac{a_3}{x}$

$$h(m) = \frac{h(m)}{\sum_{k=0}^{N-1} |h(k)|}$$

M2

Normalizing using RMS values.

$$h(m) = \frac{h(m)}{\left[\sum_{k=0}^{N-1} h^2(k) \right]^{1/2}}$$

* Better signal to noise ratio is got when this done. (SNR)

* Idea: Normalize using powers of 2.

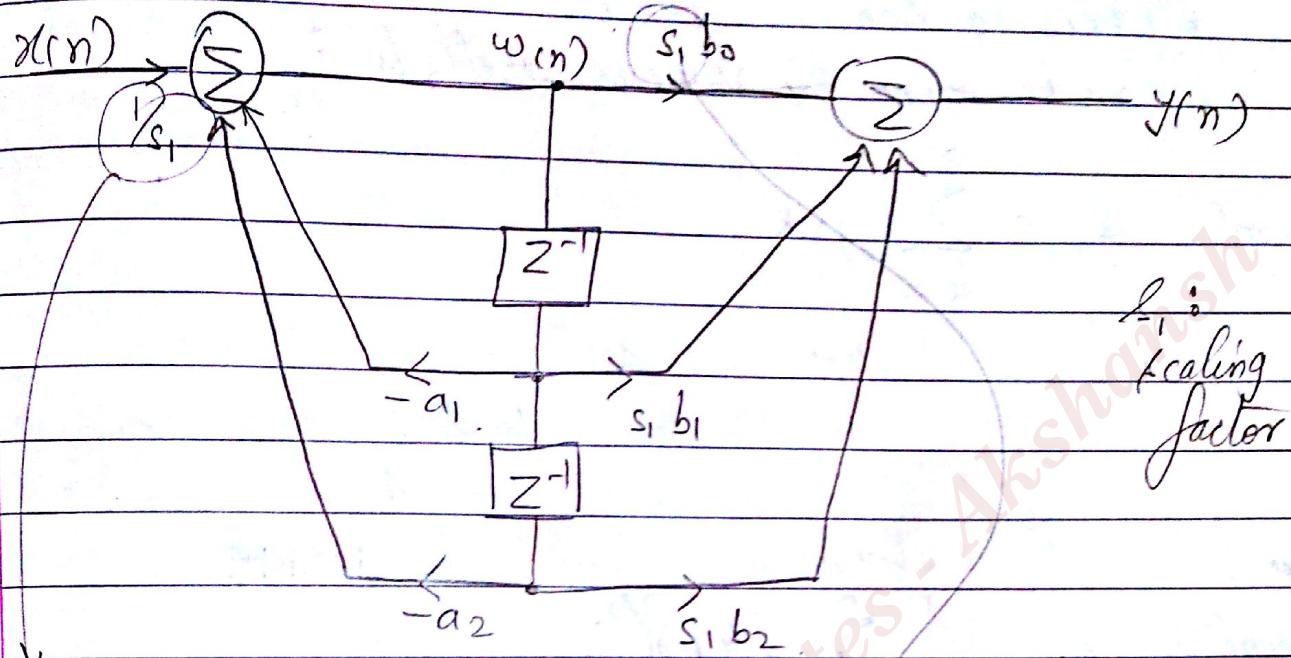
($\therefore \div 2$ is like shifting right by one bit.
 So, calculation becomes easy.)

* Seeing Scaling in block diagram

Canonical form of implement



Direct form 2

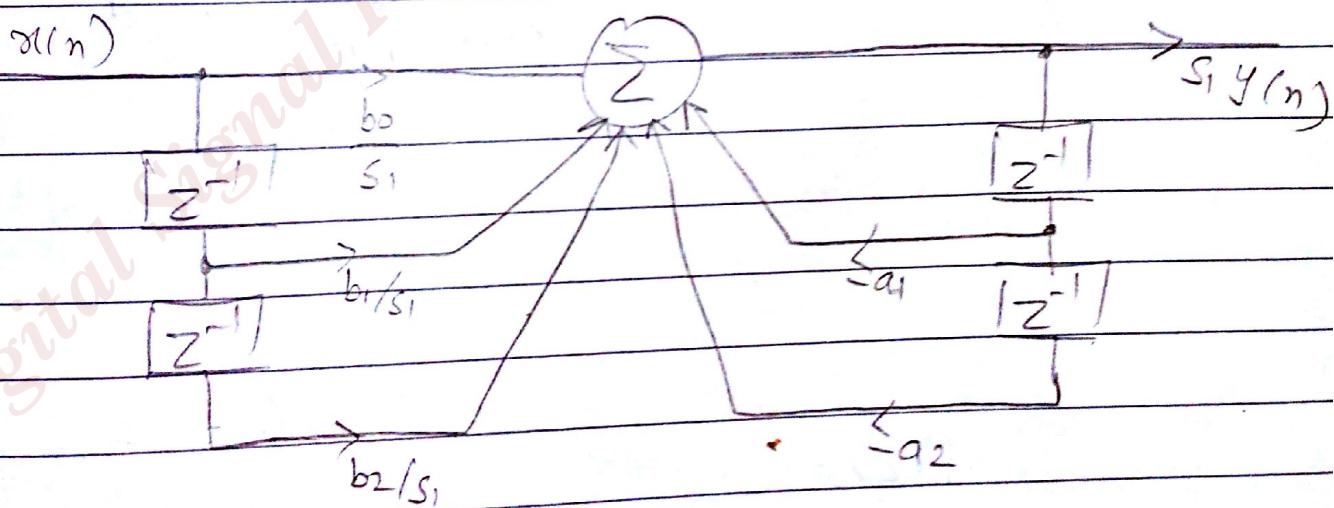


s_1 : scaling factor

Scaling $x(n)$ values by $1/s_1$ to balance out, numerator of TF is $\times (s_1)$

$$\frac{Y(z)}{X(z)} = \frac{N(z)}{D(z)} \Rightarrow Y(z) = (s_1) \times N(z) \times X(z) / D(z)$$

Direct form 1



* Choosing Scaling factors
Can be done by various methods :
Discrete impulse response diff

Form① $S_1 = \sum_{k=0}^{\infty} |f(k)|$

- Includes ∞ series summation
- Computation of infinite series can be done by evaluating freq. response
- This factor is called L_1 NORM

Form② $S_1 = \left[\sum_{k=0}^{\infty} f^2(k) \right]^{1/2}$

- The scaling factor is called as L_2 NORM
- finding L_2 norm

$$\sum_{k=0}^{\infty} f^2(k) = \frac{1}{2\pi j} \oint \frac{F(z)F(z^{-1})}{z} dz$$

→ Closed CONTOUR integral
(i.e., evaluating / considering values lying inside unit circle only)

* Consider a 2nd order section, with

$$F(z) = \frac{1}{1 + a_1 z^{-1} + a_2 z^{-2}}$$

$$\text{So, } F(z^{-1}) = \frac{1}{1 + a_1 z + a_2 z^2}$$

$$\text{So, } S_1^2 = \sum_{k=0}^{\infty} f^2(k) = \frac{1}{2\pi j} \oint \left(\frac{1}{1 + a_1 z^{-1} + a_2 z^{-2}} \right) \left(\frac{1}{1 + a_1 z + a_2 z^2} \right) dz$$

$$S_1^2 = \frac{1}{1 - a_2^2 - a_1^2(1 - a_2)(1 + a_2)}$$

$$\Rightarrow A_1^2 = \frac{1}{1 - a_2^2 - a_1^2(1 - a_2)} \\ \star$$

$$\rightarrow \text{If } F(z) = \frac{1}{1 + a_1 z^{-1} + a_2 z^{-2}}$$

Form ③

$$S_1 = \max |F(w)|$$

- $F(w)$: peak amplitude of freq. response b/w i/p & out
- called as L_∞ NORM.
- ensures no overflow for SINUSOIDAL INPUT

Practically, on evaluation, we get :

$$L_2 < L_\infty < L_1$$

Q. Determine a suitable scale factor to prevent or reduce the possibility of overflow in an IIR lowpass filter characterised by following TF :-

$$H(z) = \frac{1 + 2z^{-1} + z^{-2}}{1 - 1.0581359z^{-1} + 0.338541z^{-2}}$$

* Given TF, L_1 Norm, L_2 norm & L_∞ norm can be computed using software (program)

Found values :-

	L_1	L_2	L_∞
S_1	3.7112	1.7352	3.5663

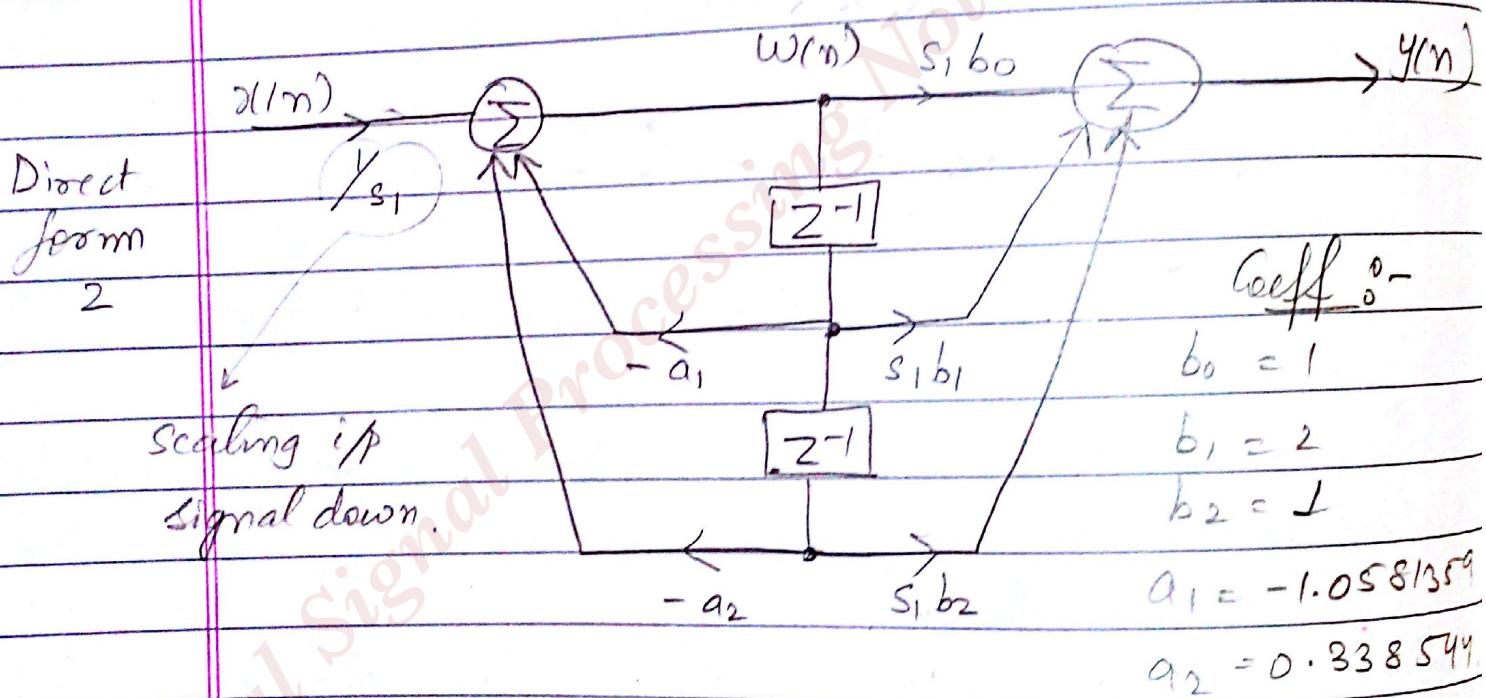
L_2 norm is found as 8

$$S^2 = \frac{1}{1 - a_2^2 - b_1^2(1 - a_2)} \cdot \frac{1 + a_2}{1 + a_2}$$

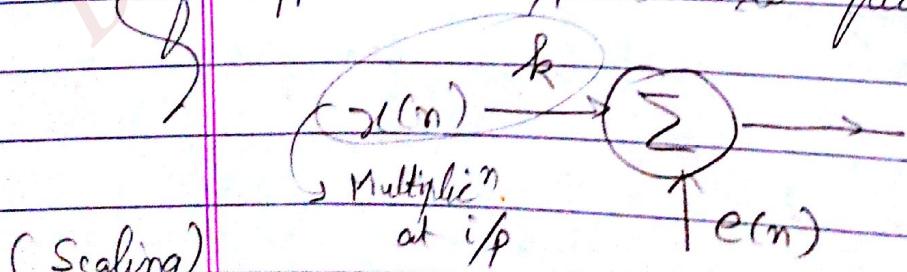
$$\Rightarrow S_1^2 = \frac{1}{1 - (0.3385)^2 - (1.058)^2} \cdot \frac{(1 - 0.3385)}{1 + 0.3385}$$

$$\Rightarrow S_1 = 1.735D.$$

Structure 8-



Effect on o/p due to quantiz'n errors



Multiplicⁿ $a_k \times y(n-k)$: at feedback part

seen $b_k x(n-k)$: at feed forward part

Wherever \exists multiplication of say
 $x(n) \times k$

$$\text{or } ax \rightarrow y(n-k)$$

$$\text{or } bx \rightarrow z(n-k)$$

$$\underbrace{B \text{ bits}}_{\text{B bits}} \cdot \underbrace{B \text{ bits}}_{\text{B bits}} = 2B \text{ bits.}$$

So, I need $2B$ bit storage to store result.

But, I want to truncate / round off / scale appropriately
 quantize it to fit in B bits.

Hence, \exists an error.

$$\text{Let } y(n) = k \cdot x(n) + \underbrace{(e(n))}_{\text{error}}$$

$$\text{Noise power ; } \frac{\sigma^2}{2} = \frac{q^2}{12}$$

$\xrightarrow{\text{rounding}} q$: quantizing error

$$q = \frac{1}{2^{B-1}} ; B: \text{no. of bits}$$

In rounding off, max.
 of $1/2$ bit error can

$$\text{come So, } q = \frac{1}{2^{B-1}}$$

$$= \frac{1}{2^{B-1}}$$

i.e., if rounding off
 is the only error considered:

$$q = 2^{-B+1}$$

Note:- If both sign bit & round off
 is taken, $q = \frac{1}{2^{B-2}}$

So, for rounding off,

$$\text{If truncation, } q = \frac{1}{2^B}$$

$$\sigma_n^2 = [2^{-(B-1)}]^2 = \frac{2^{-2B}}{12}$$

Total noise power = ADC noise power + Round off noise power

$$\Rightarrow \sigma_n^2 = \sigma_A^2 + \sigma_r^2$$

Let i/p signal variance = σ_x^2

Signal to noise ratio (SNR) due to rounding

$$(\text{SNR})_{\text{rounding}} = \frac{\sigma_x^2}{\sigma_r^2} = 12 \times 2^{2B} \cdot \frac{1}{12}$$

$$\text{in dB} = 20 \log \left(\frac{\sigma_x^2}{\sigma_r^2} \right)$$

∴ its power, basically,
is a square term \rightarrow error due
to rounding
 $= \sigma_x^2$

$$= 10 \log \left(\frac{\sigma_x^2}{12/12} \right)$$

$$= 10 \log (12 \times 2^{2B} \cdot \frac{1}{\sigma_x^2})$$

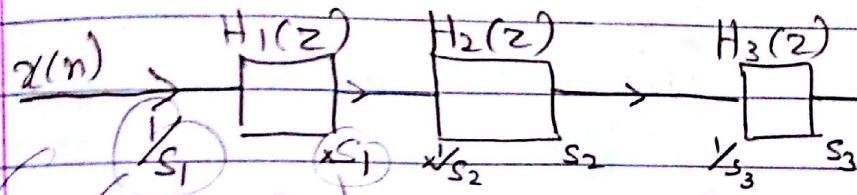
$$= (6.02B + 10.79) + 10 \log \frac{1}{\sigma_x^2}$$

\downarrow variable \rightarrow const

In SNR
6 dB increase is seen with each
of every bit.

* Scaling factors for cascade & parallel structures:

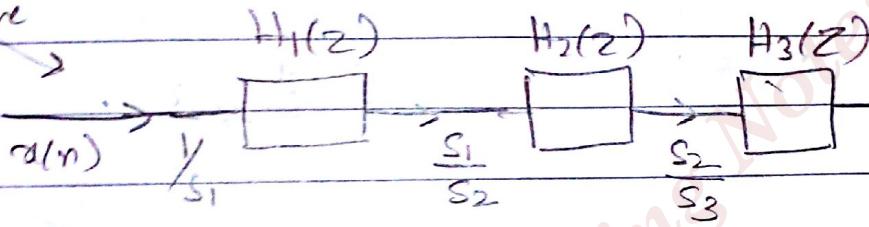
CASCADE STRUCTURE



applying scaling multiplying by s_1 , \therefore we can get original signal

Given: Overall TF, $H(z) = H_1(z) \cdot H_2(z) \cdots H_n(z)$

alternative



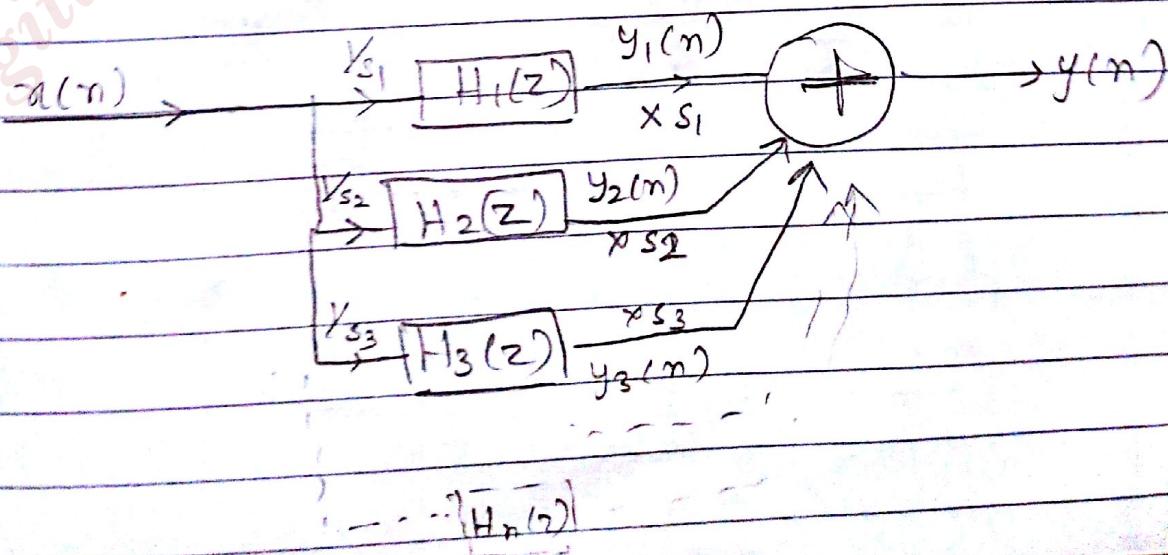
Without multiplier circuit, do calcul^{me}.

Note: We need to consider only $\frac{1}{s_1}$. Rest all is internal.

PARALLEL STRUCTURE

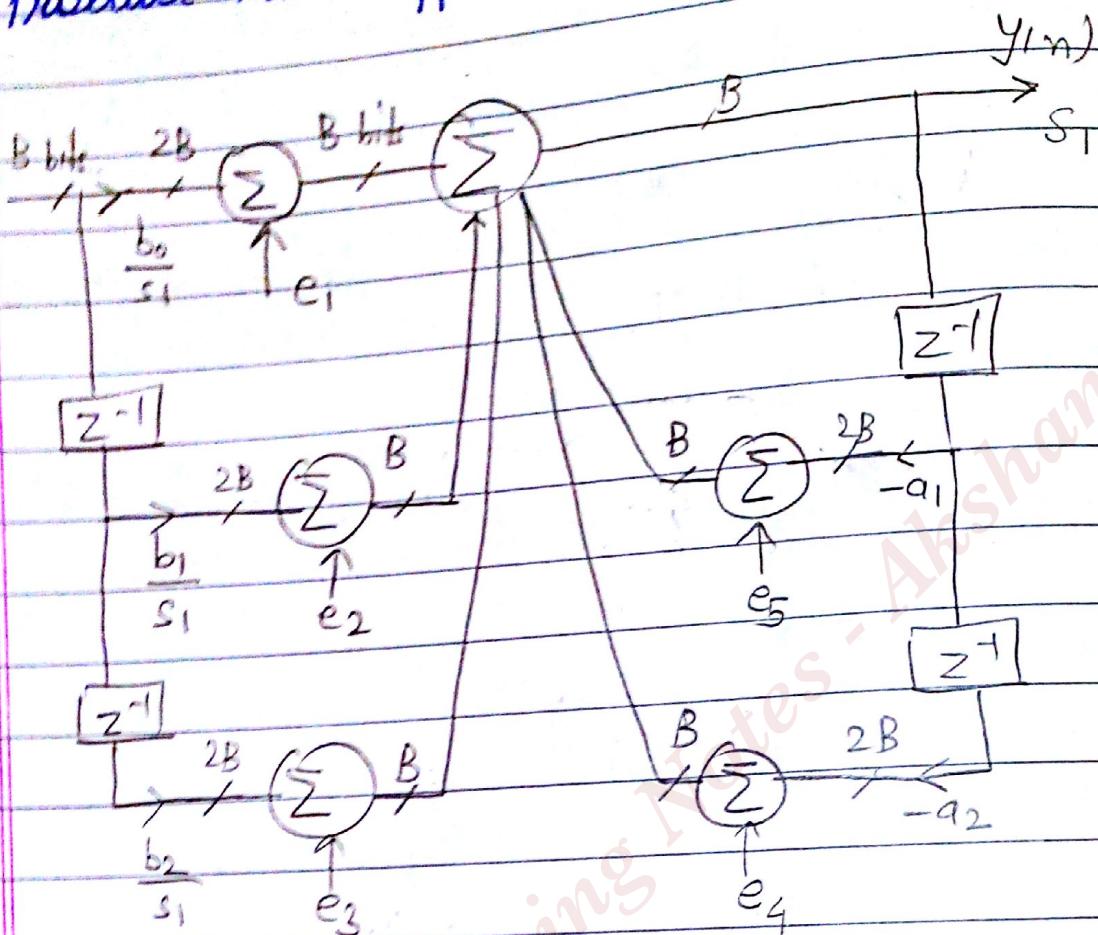
Overall TF, $H(z) = H_1(z) + H_2(z) + \cdots$

Structure:-



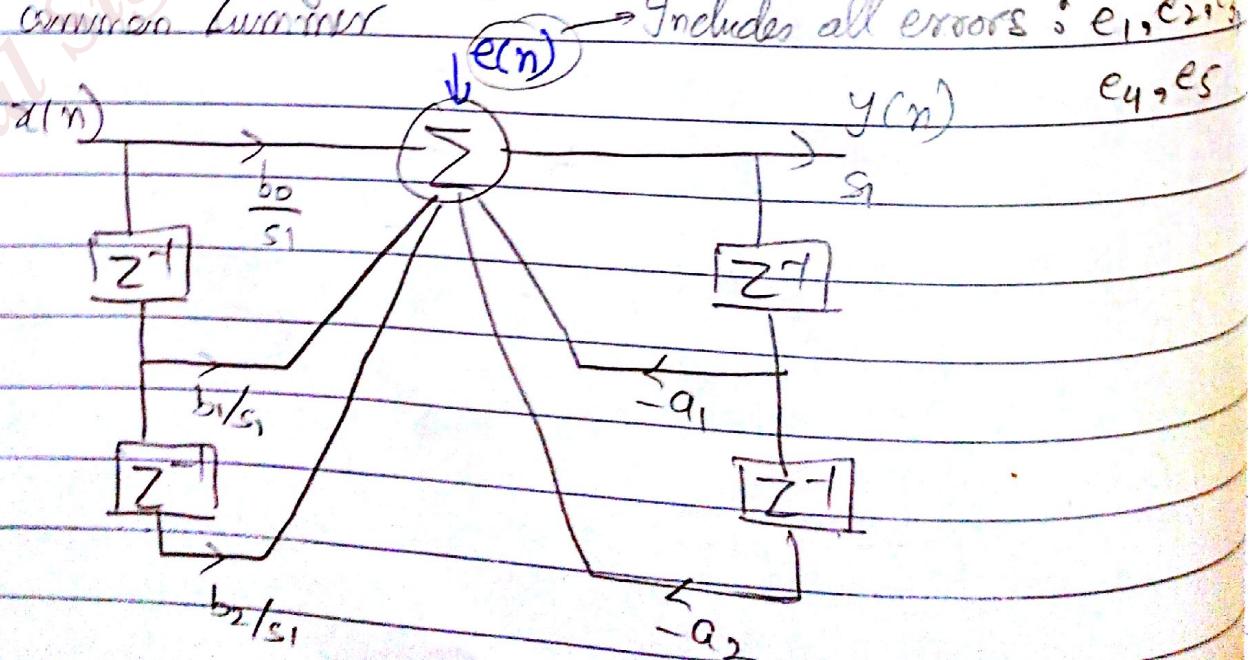
Product roundoff errors in IIR filter

Direct form I



2B bits are got on multiplication.

Now, each of them is converted into B bit i.e., \exists errors in each segment. This can be also made by taking 5 times error at the common summer \rightarrow Includes all errors : e_1, e_2, e_3, e_4, e_5



Finding error :-

Idea : Find TF b/w $e(n)$ & $y(n)$. Take other i/p = 0. So, only $f(z)$ is left.

$$\sigma_{\text{OA}}^2 = \frac{g^2}{12} \left[\frac{1}{2\pi j} \oint_{|z|=1} F(z) F(z^{-1}) dz \right] s_1^2$$

We found o/p is being x_s . So, corresponding power : $x s^2$.

$$= \frac{g^2}{12} \left[\sum_{k=0}^{\infty} f^2(k) \right] s_1^2$$

$$\sigma_{\text{OA}}^2 \text{ Total} = \frac{g^2}{12} \|F(z)\|_2^2 s_1^2$$

Quantiz'n
error at o/p
(roundoff
noise)

$\Rightarrow L_2 \text{ norm}$

$$\Rightarrow F(z) = \frac{1}{1 + a_1 z^{-1} + a_2 z^{-2}} ; \text{ 2nd ord TF}$$

$$\Rightarrow f(k) = z^{-k} [F(z)]$$

Now, we know

$$\sigma_o^2 = \sigma_{\text{OA}}^2 + \sigma_{\text{AAC error}}^2$$

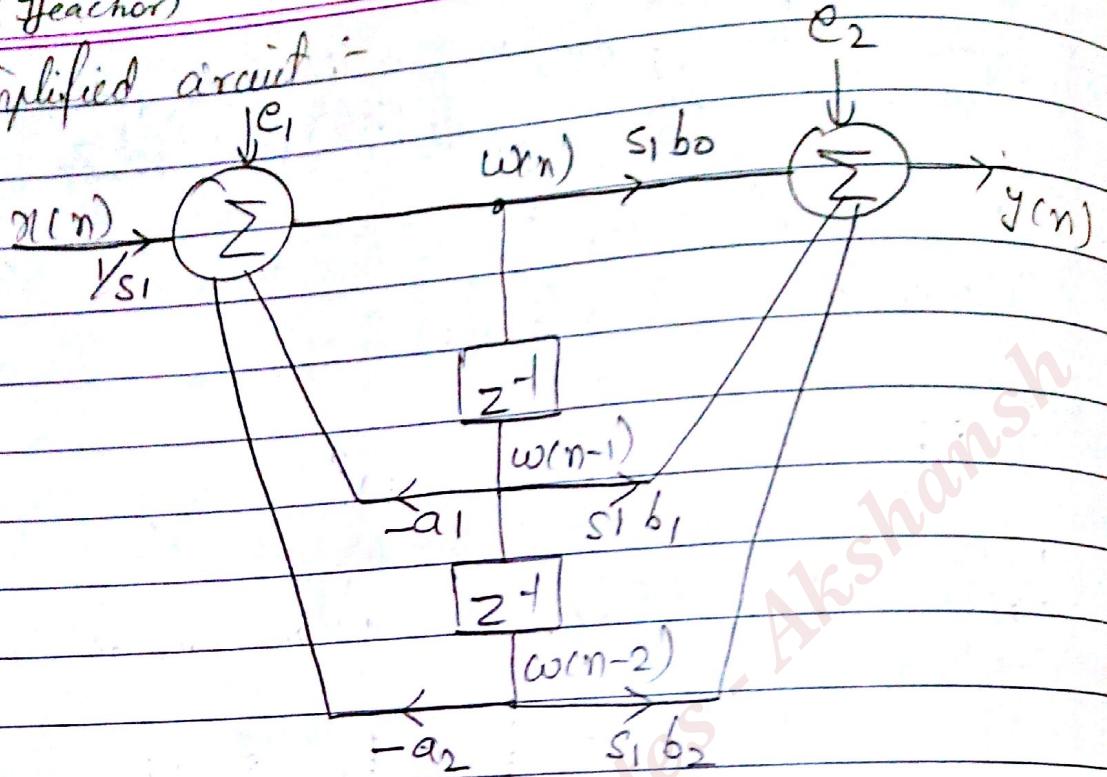
$$= \frac{g^2}{12} \left[\sum_{k=0}^{\infty} f^2(k) + 5s_1^2 \sum_{k=0}^{\infty} f^2(k) \right]$$

Direct form I : $\sigma_o^2 = \frac{g^2}{12} \left[\|F(z)\|_2^2 + 5s_1^2 \|F(z)\|_2^2 \right]$

o/p noise power)

Pg - 839 (Gfeachor)

Simplified circuit :-

Direct
form
II.

"Quantizing" errors have been distributed on the above simplified model having 2 adder circuits
So,

For 2 TF's :-

- (1) b/w e_2 & $y(n)$
- (2) b/w e_1 & $y(n)$

assuming all other symbols = 1

• TF b/w e_1 & $y(n)$:-

f/b & feedforward fn remains the same
So, its $H(z)$

• TF b/w e_2 & $y(n)$:-

All inputs = 0. So, we have →

$$\text{So, } \text{TF} = 1$$

$$\sigma_{\text{out}}^2 = \frac{3}{12} g^2 \sum_{k=0}^{\infty} f(k)^2 + \frac{3}{12} g^2 (1)$$

for e_1 , TF is same
for e_2 , TF = 1

$\because 3$ multiplications & truncation error for e_1 & 3 for e_2

$$\Rightarrow \sigma_{\text{out}}^2 = \frac{3}{12} g^2 \left(\|F(z)\|_2^2 + 1 \right)$$

$f(k)$ is impulse response from e_1 to $y(t)$

$$F(z) = S_1 \frac{b_0 + b_1 z^{-1} + b_2 z^{-2}}{1 + a_1 z^{-1} + a_2 z^{-2}} = S_1 H(z)$$

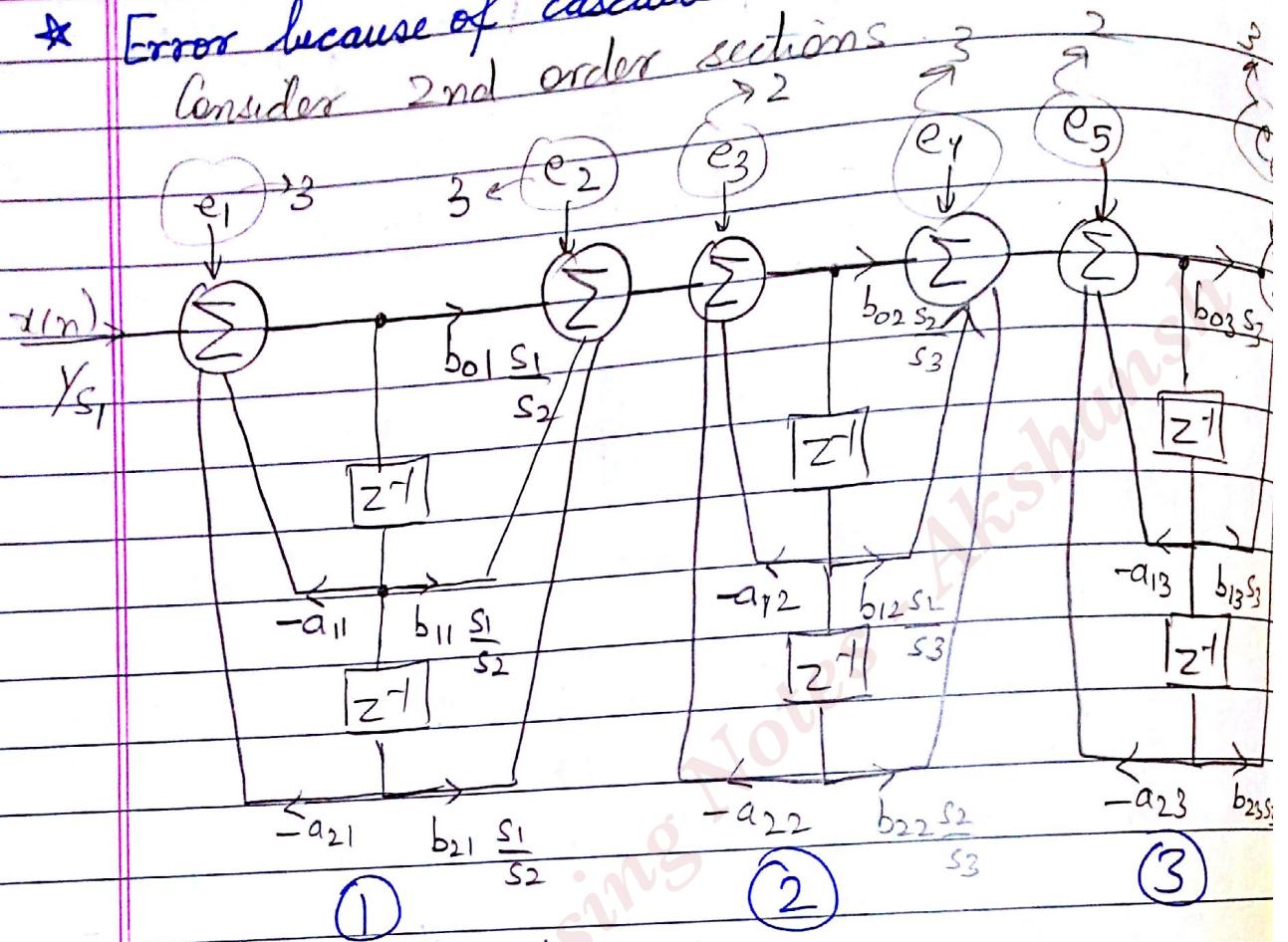
Total noise = ADC + roundoff noise

$$\begin{aligned} \sigma_o^2 &= \sigma_{\text{out}}^2 + \sigma_{\text{AA}}^2 \\ &= \frac{g^2}{12} \left[3 \left[1 + S_1^2 \sum_{k=0}^{\infty} h^2(k) \right] + \sum_{k=0}^{\infty} h^2(k) \right] \end{aligned}$$

$$\& \text{So, } \sigma_o^2 = \frac{g^2}{12} \left[3 \left(1 + S_1^2 \|H(z)\|_2^2 \right) + \|H(z)\|_2^2 \right]$$

* Error because of cascade :-

Consider 2nd order sections



e_1 has 3 quantizing errors

$e_2 \rightarrow 3$

$e_3 \rightarrow 2$ Total o/p noise due to roundoff

$e_4 \rightarrow 3$ error :-

$e_5 \rightarrow 2$

$$e_6 \rightarrow 3 \quad \text{Total noise} = 3 \frac{q^2}{12} \sum_{k=0}^{\infty} f_1^2(k) : e_1 \}$$

$$+ 3 \frac{q^2}{12} \sum_{k=0}^{\infty} f_2^2(k) : e_2 \}$$

$$+ 2 \frac{q^2}{12} \sum_{k=0}^{\infty} f_3^2(k) : e_3 \}$$

$$+ 3 \frac{q^2}{12} \sum_{k=0}^{\infty} f_4^2(k) : e_4 \}$$

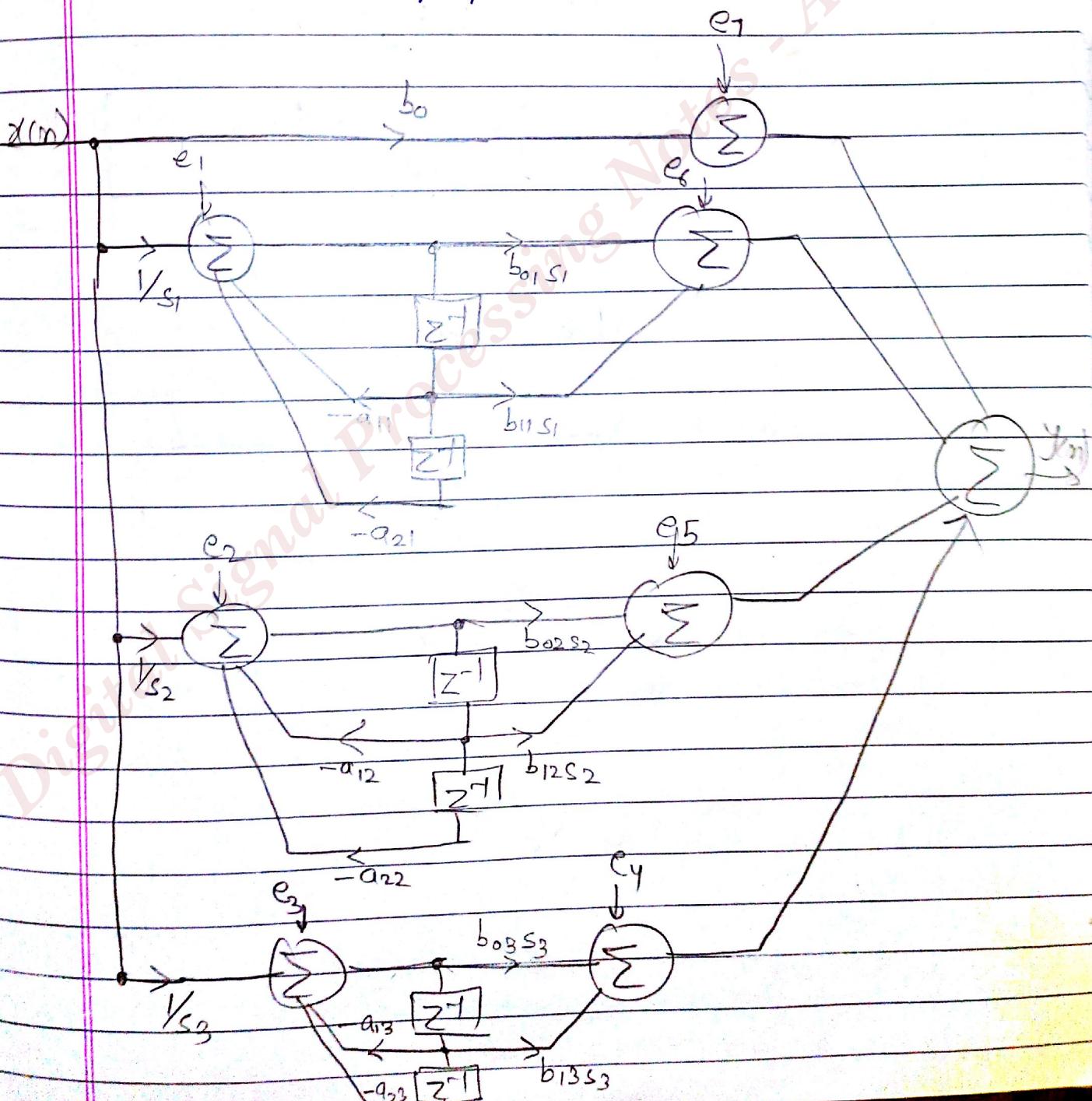
$$+ 2 \frac{q^2}{12} \sum_{k=0}^{\infty} f_5^2(k) : e_5 \}$$

$$+ 3 \frac{q^2}{12} : e_6 \}$$

$$\Rightarrow \nabla_{\Omega^2}^2 = \frac{g^2}{12} \left[3 \sum_{k=0}^{\infty} f_1^2(k) + 5 \sum_{k=0}^{\infty} f_3^2(k) + 5 \sum_{k=0}^{\infty} f_5^2(k) + 3 \right]$$

$$\Rightarrow \nabla_{\Omega^2}^2 = \frac{g^2}{12} \left[3 \|F_1(z)\|_2^2 + 5 \|F_3(z)\|_2^2 + 5 \|F_5(z)\|_2^2 + 3 \right]$$

* error because of parallel



$$\overline{s}_{i,i}^2 = \frac{3q^2}{12} \sum_{k=0}^{\infty} f_i^2(k) = \frac{3q^2}{12} \| F_i(z) \|_2^2 ; i=1,2,3$$

$$= \frac{3q^2}{12} s_i^2 \sum_{k=0}^{\infty} h_i^2(k) = \frac{3q^2}{12} s_i^2 \| H_i(z) \|_2^2$$

$\hookrightarrow i=1,2,3$

$$\overline{s}_{0k}^2 = \frac{q^2}{12} \left\{ 7 + 3 \sum_{i=1}^3 \left[s_i^2 \sum_{k=0}^{\infty} h_i^2(k) \right] \right\}$$

$$= \frac{q^2}{12} \left[7 + 3 \sum_{i=1}^3 s_i^2 \| H_i(z) \|_2^2 \right]$$

$\hookrightarrow H(z) = H_0(z) + H_1(z) + H_2(z) + H_3(z)$



TMS : Texas Instrument Processors

320 : Series for DSP

C : CMOS Tech

Puffin

Date 25/11/13
Page

Designing filters :-

Texas Instruments

ARCHITECTURE OF C5X Series Processors:

TMS 320...

- * Fixed point : Characteristic & mantissa has fixed no. of bits.
- * Floating point : has exponential terms . So, much more accurate.
- * C1x, C2x, C5x - 16 bit fixed point processors
- * C3x, C4x : 32 bit floating point processor
- * C6x : VLIW architecture - 1600 MIPS.
↳ 11 processing Every Large Instruction Word Processors
- * C8x : Multiple AOPS and a RISC master processor
↳ Advanced DSPs.

Applications :-

- C1x, C2x, C5x : toys, hard disk drives, modems, cellular phones
- C3x : filters, analysis, hi-fi sys, voice mail, imaging, bar-code readers, motor control, 3D graphics, scientific processing.
- C4x : parallel processing, image recognition etc.
- C6x : wireless base station, communication applications, multichannel communication.
- C8x : Video telephony, 3D comp. graphics etc.

C : CMOS tech.

If E is written instead of C,

E : EPROM (no chip non volatile memory)

TMS 320x50

⇒ NMOS Tech.

no alphabet

- C50, 51, 52: have same instruction sets.
but diff in capacity of on chip ROM & RAM
- C5x has 4 buses (has program & data memory separately)
 - 1) Program Bus (PB)
 - 2) Program Address Bus (PAB)
 - 3) Data Bus (DB)
 - 4) Data Address Bus (DAB)

Char. of some TMS320 family DSP chips

	'C15	'C25	'C30	'C50	'C52
cycle time	200	100	60	50	25
on chip RAM	4K	4K	4K	2K	5K
Total memory	4K	128K	16M	128K	128K
Parallel ports	8	16	16M	64K	64K

→ RAM + ROM

no. of addresses used for i/o port

Self : Balance of addressing :

- memory mapped i/o.
- i/o mapped i/o.

* Programmable DSPs.

1. MAC

can be hardware / software

↳ has Motorola DSP 56000 series

TI 3205X: multiplier of stored into product register
ACC is in ALU (CP10)

✓ instructions executed in single clock pulse.

data memory

x_n	x_{n-1}	x_{n-2}	...	x_{n-m+3}	x_{n-m+2}	x_{n-m+1}
-------	-----------	-----------	-----	-------------	-------------	-------------

input data

Program memory

h_0	h_1	h_2	...	h_{m-3}	h_{m-2}	h_{m-1}
-------	-------	-------	-----	-----------	-----------	-----------

($m = m + 1$)

✓ Multiply " operation & then, addition with prev. result
(executed in 1 clk)

Implementation of convolver with single multiplier/adder.
 $y_n = x_n \cdot h_n$ (vector mult.)

2. MACD : Multiply, Accumulate & Data Shift.

Bus structures & Mem. Access Schemes.

The 4 memory access/clock for MACD in
conv proc.

1) Fetch instruction from program mem.

2) " one operand from " "

3) " second " " data mem

4) Write content of dma to address $dma + 1$

Bus: Group of conductors through which data takes place.

Date _____
Page _____

Q) Advancement in architecture

1) Von Neumann Architecture

Single address bus & single data bus (4 bits for MACD)

2) Harvard architecture

- has separate buses for program & data
- So, data can be fetched simultaneously
- Speed ↑.
- consists of MAC units, multipliers, ALU, shifters

3) Modified Harvard architecture

- One set of buses for program & data
- Another set exclusively for data
- Texas Instruments use this

Q. Why don't we keep shifting to advanced architecture?

- 1) Cost of IC is high → on no. of pins.
how to cater cost?
- multiple buses used for internal data transfer (on chip). & off chip data transfer using single bus.

* Multiple Access Memory:

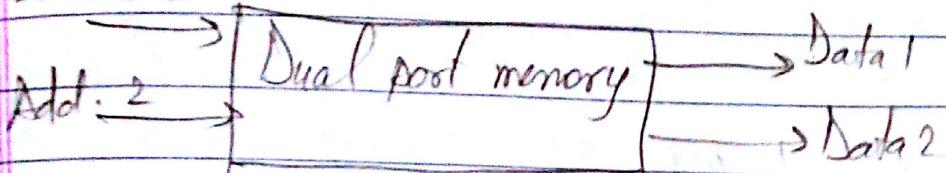
No. of memory access/clock - high speed memory

Eg: DARAM

2 DARAMs used as program & data
memory will allow 4 data access/clk

* Multiprotected Memory : has 2 diff data & memory bus.

Address 1



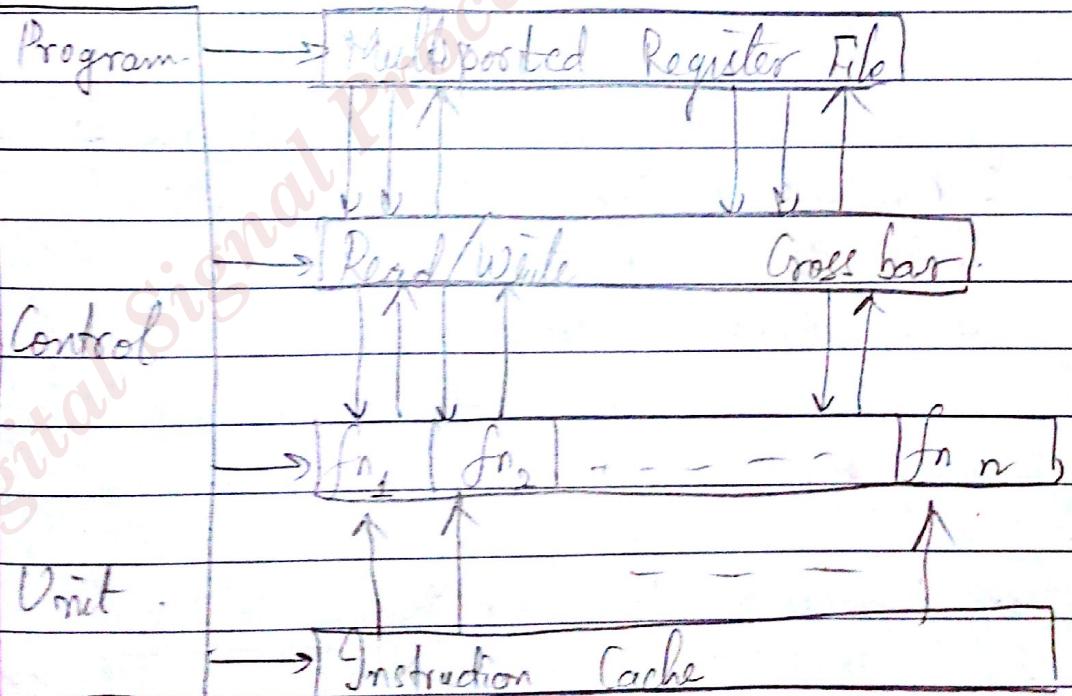
It's costly

eg Motorola 56 voice has single ported Program memory & Dual ported data memory.

* VLIW : Very Large Instruction Word Architecture.

eg :

TMS 320 C 6 X



* Now, we have to see diff. ways of addressing
 ↳ seen through mapping

eg: Suppose total data of 2k. size (2K memory)
 So, 11 bits reqd to address it.
 Suppose we take 4 ICs of 512 size.

=>	0 - 511	IC ₁
	512 - 1023	IC ₂
	1024 - 15 - -	IC ₃
	15... - 2023	IC ₄

So, in hexadecimal, addresses vary from
 000_H - $7FF_H$

Starting & ending addresses of

IC ₁	000 - 1FF	00 00 0 ₄
IC ₂	1FF - 3FF	00 01 F F
IC ₃	3FF - 5FF	= 0 00
IC ₄	5FF - 7FF	1 FF
		+ 2 0 0
		+ 3 FF
		+ 2 0 0
		5 FF

Suppose bits are

00 → IC₁ A₀ A₁ A₂ A₃ A₄ A₅ A₆ A₇ A₈ A₉ A₁₀
 01 → IC₂
 10 → IC₃
 11 → IC₄

Store Address

Chassis
IC

IC₁ -

* memory mapped addressing

* Choosing I/O or memory using PIN : ? masking
 I/O M ; address

Special addressing modes in P-DSP.

1) Short immediate addressing

→ length of instruction data depends on processor.

Feeding data, alongwith instruction

e.g.: T9 TMS 320C5X : allows an 8 bit data to be specified as one of the operand along with single word instruction for add, sub, AND, OR, XOR etc.

2) Short direct addressing:

→ only current page memory can be used.

Lower order n bits can be specified along with the instruction.

Higher order address will be loaded in

ADPP (Data page pointer)

TMS 320 → n=7

Motorola 5600 → n=6.

3) Memory mapped addressing:-

i/o & memory are continuously addressed

→ unique address for i/o & memory

e.g.: TMS 320C 5X : Page 0: CPU registers & i/o registers

↓: 128 words

data is stored as

page. Motorola 5600X :- last page: 56 loc is memory mapped for register io.

4) Indirect addressing :-

↳ done through registers called Auxiliary registers (ARs : AR0 - AR7)
 Many options : TI offset registers - INDEX register
 Analog : modifier registers are there.

- ✓ The pointer to AR will be of 3 bits
- ✓ These registers can be used with/without auto increment/decrement
- ✓ These registers are used to fetch the ADDRESSES of the memory, which has some data. Using AR with auto inc/dec will keep fetching data stored in memory.
- ✓ Incrementing / decrementing can be done before/after execution of instruction = Post PRE PROCESSING.

5) BIT-Reversal Addressing Mode :-

- Bit reversal technique is used in Fast Fourier Transform (FFT).

6) Circular Addressing

- Cyclic ^{func} req'd to implement this type of addressing
- registers .

* On Chip Peripherals :

1. On chip timers .
2. Serial port : with i/p & o/p buffers
Communic'n with A/D (external), -- -
3. TDM serial port .
4. Parallel port
5. Bit i/o ports - single bit wide .
6. Host port - 8 bit or 16 bit wide
7. Communic'n ports (inter processor communic'n bit P-DSP,)
8. On chip A/D - D/A converters .

* Instruction Cycle :-

PIPE

LINING :

- ① Fetch from Program memory
 - ② Decode
 - ③ Memory read from Data Memory
 - ④ Execution
- Every instruction goes through 4 T-states as written above.
- : 4 clk pulses reqd.

Value of T	Fetch	Decode	Read	Execute	
1	I1				
2		I1			
3			I1		
4				I1	
					Pipe line depth = 4

→ In these T-states, processor is idle

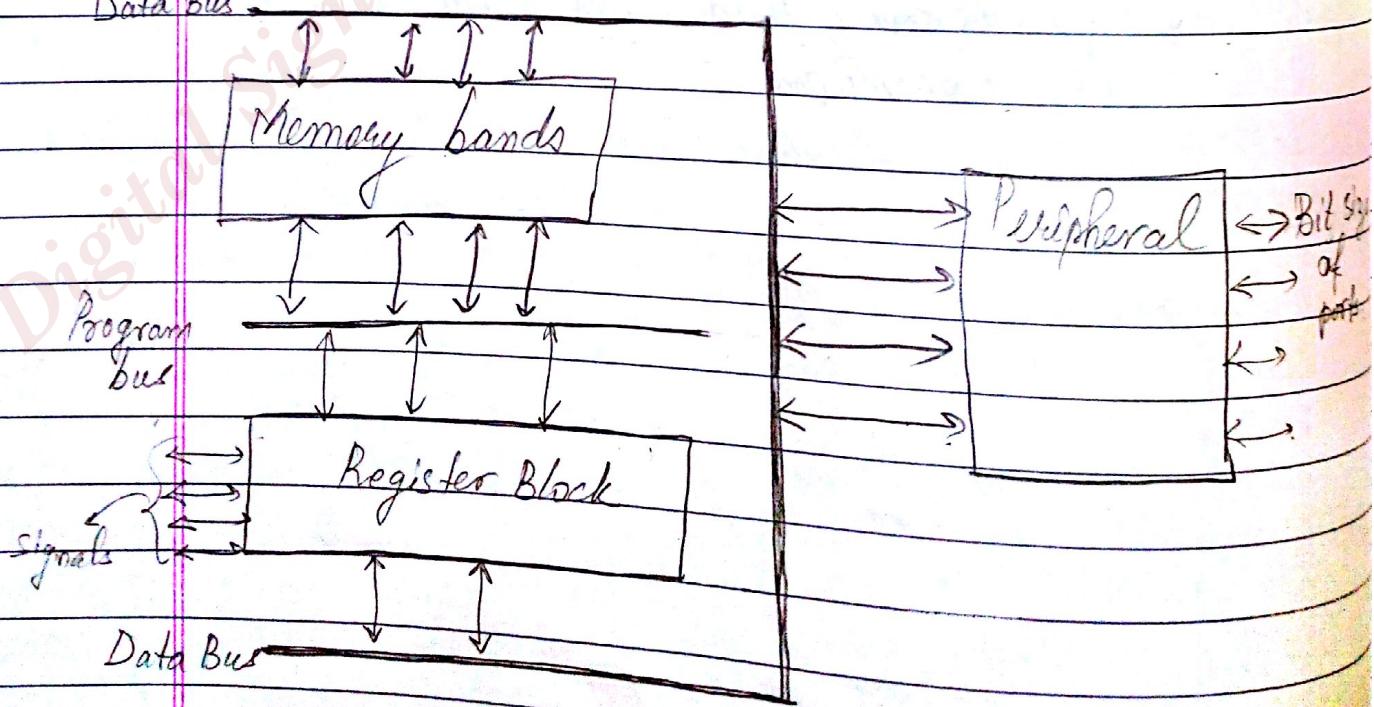
Now, we do pipelining to prevent processor being idle :-

Value of T	Fetch	Decode	Read	Exe
1	I ₁			
2		I ₁		
3		I ₂		
4		I ₃	I ₁	
5		I ₄	I ₂	I ₁
			I ₃	I ₂
			I ₄	I ₃
				I ₄

- * Total time in execution of program = $(N+4)T$
- * How many instructions have been queued up → tells depth of Pipelining
(depth = diff for Analog, TMS, Intel)

- * Internal Architecture of C5X [detailed diagram]

Data Bus



Register block contains

CALU - It has

- ✓ 16×16 bit parallel multiplier
- ✓ ALU, ACC, ACCB, PREG (each 32 bit) → Product Register
- ✓ 0-16 bit barrel shifter (left & right)
 - ↳ Max. no. we can have = $2^{16} - 1$
- ✓ TREG0 (Temporary reg.) (multiplicand can be held)
- ✓ ACC & PREG can also be shifted, but in 2 cycles.

5 bit TREG-1: Specifies no. of bits by which scaling shifter should shift

ARAU → Auxiliary Register ALU
has:

- ✓ 2 : 16 bit AR (AR0-AR7)
- 1 : 3 bit ARP
- 1 : unsigned 16-bit ALU
- ✓ ARAU calculates indirect addresses by using inputs AR, 16 bit INDX, ARCR.
- ✓ ARAU can auto index current AR while data memory locⁿ is being addressed and can index either by ± 1 or by contents of INDX.

e.g. consider instruction:

MOV A, M : Its indirect addressing

Data stored in HL register pair is located by M & stored in A.

eg (2) INX H : Incrementing HL.

H L

20 00.

INXH: 20 01

INRH: 21 00

We can execute these 2 instructions with 1 inst.

MOV A, M } \Rightarrow LA CC * + 0

INX H } / \

Load Accumulator

Auxiliary

register
content

No shifting

(; 1 \rightarrow shifting
once \Rightarrow X2

; 2 \rightarrow X4 ...)

* DECIMATION BY INTEGER FACTORS.

✓ Suppose we have CD & CD reader.

Both have different f_s sampling freq.

Now, how will we synchronize that?

* Also, large f_s require large size. So, f_s needs to be compressed at times (reducing f_s).

(\therefore storage requirement needs to be reduced)

Idea: If we are able to get the signal from lower f_s , clarity isn't req'd. (knowing its oversampled)

= for Audio-Video Signal

f_s more : Clarity more

f_s less : Clarity less

So, in such signals it's req'd to $\uparrow f_s$.

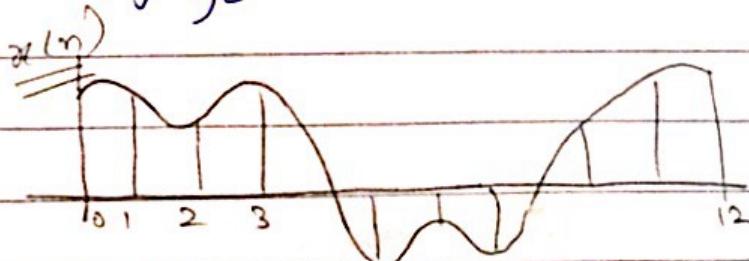
≤ Now, reduction in f_s should be done by keeping in mind Nyquist Criteria

* Decimation : Decreasing f_s

* Interpolation : Increasing f_s

(a) * DECIMATION

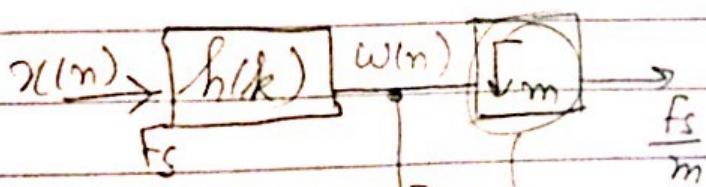
Consider i/p signal:



Pass signal

through LPF &
remove high f_s

components first



LPF
(remove drastic
changes)

Dropping
out samples
by a factor of m

Time Domain

After passing $w(n)$
through LPF

dithering occurred

p 1

2

3

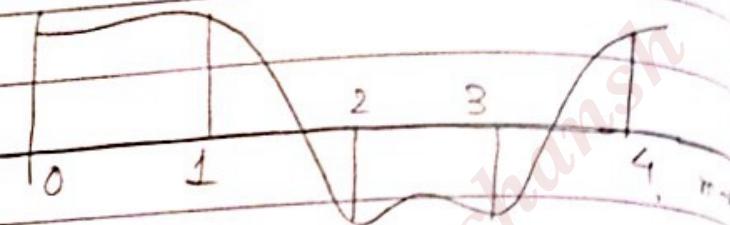
4

 n_m

After decimation $y(m)$

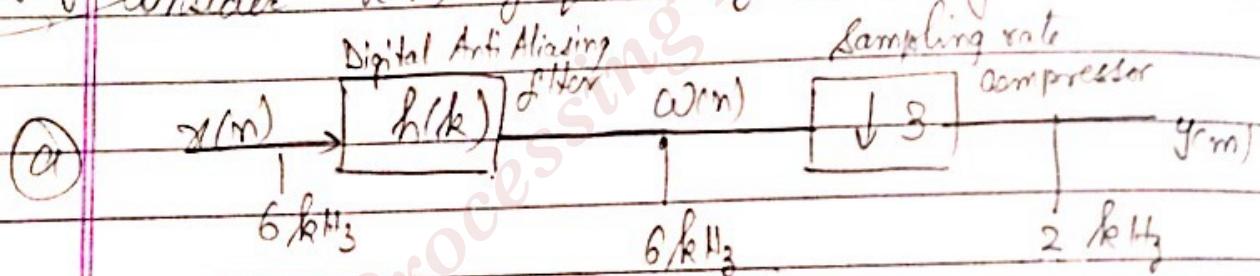
to $\frac{1}{3}$ fs.

i.e. 4 samples
instead of 12.

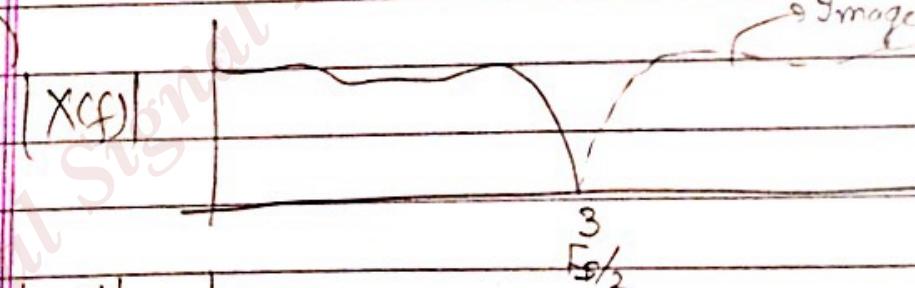


Domain

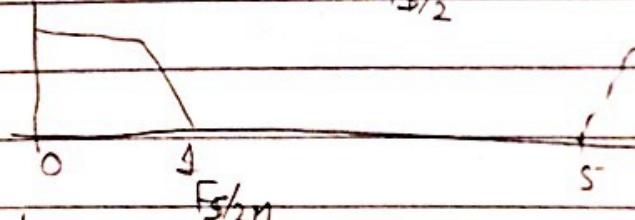
freq Consider $x(n)$ freq = 6 kHz as ip signal.



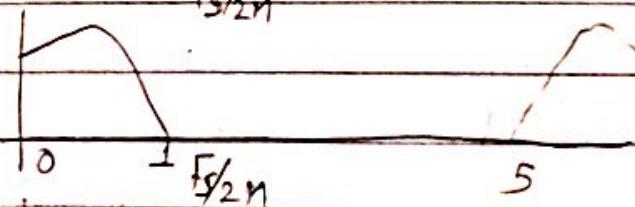
(b)



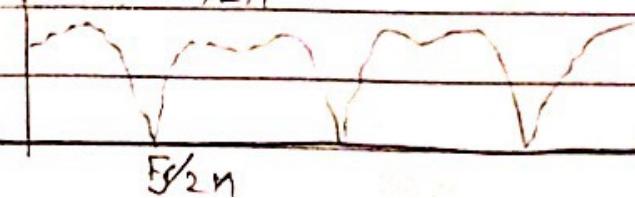
$H(f)$



$$|X(f)| \cdot |H(f)| = |W(f)|$$



$|Y(f)|$



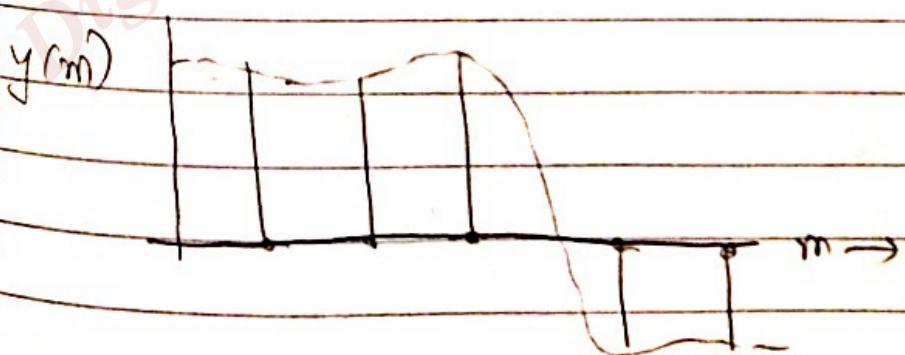
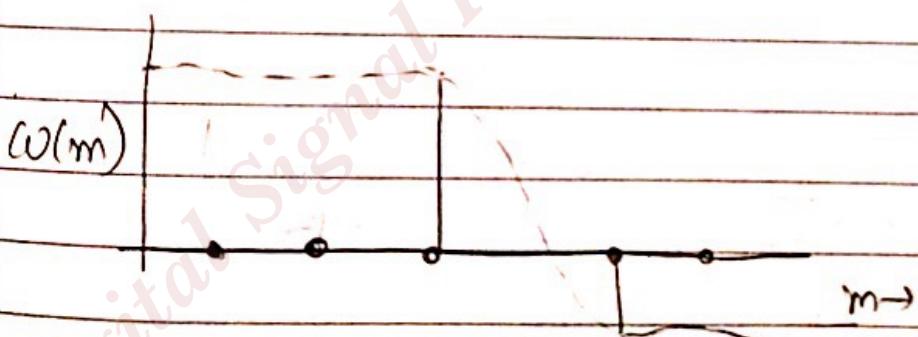
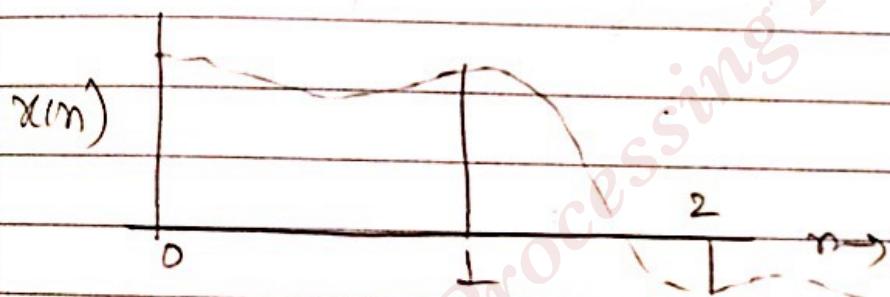
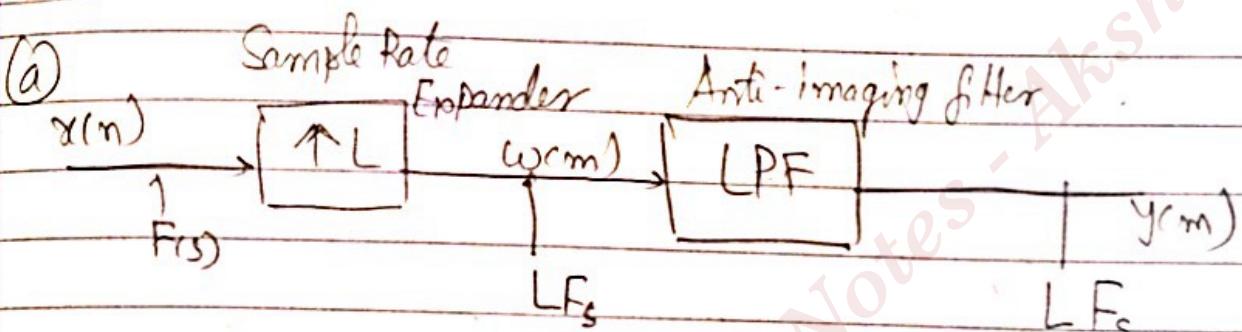
Case b) INTERPOLATION

Interpolation by integer factor

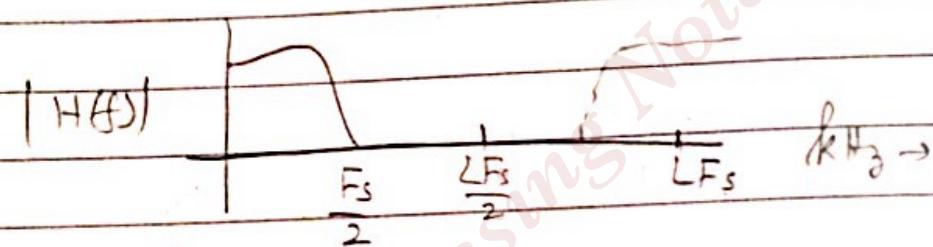
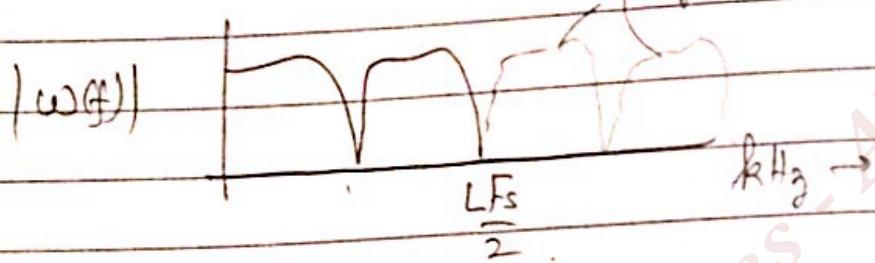
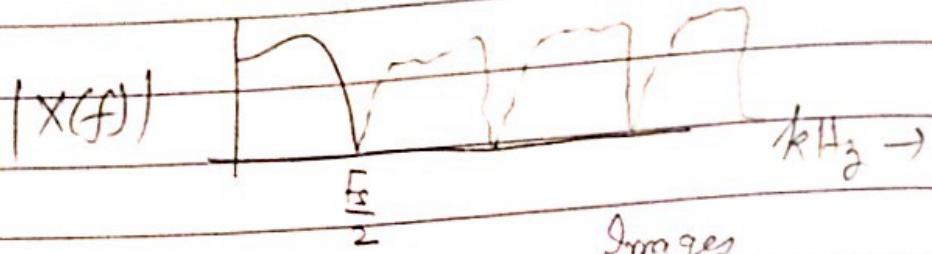
$$y_m = \sum_{k=-\infty}^{\infty} h(k) w(m-k)$$

Time Domain

$$w(m) = \begin{cases} \alpha(\frac{m}{L}) & ; m=0, \pm L, \pm 2L, \dots \\ 0 & \text{otherwise} \end{cases}$$



Freq. domain



8 MULTIRATE PROCESSING

* Till now, we did Integer decimation & Interpol.

Now, for Non-Integer value ?

Use Interpolⁿ & Decim^m together

Interpolation — followed by - Decim^m.

(\because If Decim^m comes first, \exists loss of info)

* Time domain & freq. domain diagrams of
Interpolⁿ followed by Decimⁿ (in book)

* Design of practical sampling rate converters:

1. Down Sampling

domains same
(we don't change PB)

Pass Band f : $0 \leq f \leq f_p$; δ_p
Stop Band f : $\frac{f_s}{2M} \leq f \leq \frac{f_s}{2}$; δ_s

reducing SB freq & its ripple content

2. Up sampling :

$0 \leq f \leq f_p$; δ_p
 $\frac{f_s}{2} \leq f \leq L\frac{f_s}{2}$; δ_s

* Individual Stages design .

✓ PB $0 \leq f \leq f_p$

✓ SB, $f_{s_i} = F_i - \frac{f_s}{2^m} < f < F_i$

$F_i \rightarrow o/p f_s$ for i^{th} stage

✓ PB ripple = $\frac{\delta_p}{I}$ ($(\delta_p)_{new} < \frac{\delta_p}{I}$)

✓ SB ripple = δ_s ($(\delta_s)_{new} > \delta_s$) $\xrightarrow{\text{no. of stages}}$

✓ o/p sampling rate, $F_i = \frac{F_{i-1}}{m_i}$

✓ $N_i, \Delta f_i \rightarrow$ for i^{th} stage.

$$- N \approx \frac{D_\infty(\delta_p, \delta_s)}{\Delta f_i} - f(\delta_p, \delta_s) \Delta f_i + 1$$

✓ "Multiplic" per second, MPS = $\sum_{i=1}^I N_i F_i$

✓ Total storage requirement = $\sum_{i=1}^I N_i$, TSR

✓ Initial Sampling rate is $F_0 = F_s$ & final is $\prod F_i \cdot \frac{F_s}{M}$.

* Usually, if decim' factor is more, we get more no. of coeff. So, it's broken into different stages.

eg: If decim' has to be done by $\frac{1}{50}$.

$$SD = 2 \times 5 \times 5$$

I can divide it into 3 stages

$$\frac{1}{2} \rightarrow \frac{1}{5} \rightarrow \frac{1}{5}$$

Just like this, we could have had diff' combin'. How to choose the optimum combin' — seen through MPS, TSR (min. value)

* Optimum M&I is for min MPS & TSR.

Given a signal $x(n)$, $f_s = 2.018 \text{ kHz}$.

It has to be decimated by a factor of 32 to yield a signal at a sampling freq. of 64 Hz.

Signal band of interest extends from 0 - 30 Hz.

The anti-aliasing digital filter should satisfy:-

PB deviation : 0.01 dB

SB deviation : 80 dB

PB : 0 - 30 Hz

SB : 32 - 64 Hz

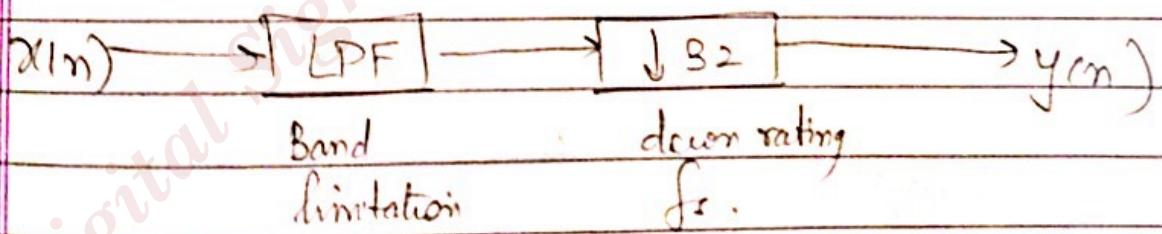
The signal components b/w 30 - 30 Hz, should be protected from aliasing. Design suitable one-stage decimator:

$$\text{Soln: } \Delta f = \frac{(32 - 30)}{2^{10}} = 9.766 \times 10^{-4}.$$

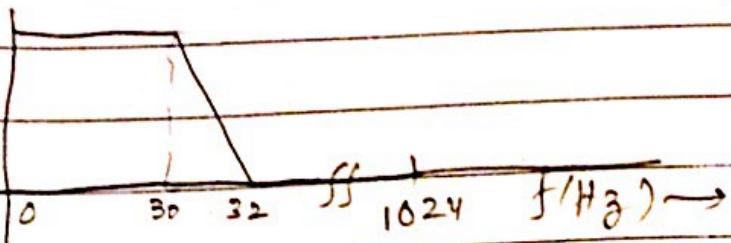
$$S_p = 0.00115 \quad (20 \log(1 + S_p) = 0.01 \text{ dB})$$

$$S_s = 0.0001 \quad (-20 \log(S_s) = 80 \text{ dB})$$

Now, estimating no. of coeff. to meet these specs:-



freq. response of this is till $\frac{f_s}{2}$ i.e 1024 Hz



Taking optimum filter design (Assuming)

$$N \approx D_\infty(\delta_p, \delta_s) - f(\delta_p, \delta_s) \Delta f + 1$$

can be found using fixed formulas
discussed before.

After putting values, we get

$$N \approx 3947 \text{ coeff.}$$

(obviously too large \rightarrow no. of bits can implement)
So, for implementing, down rates it to multiple stages

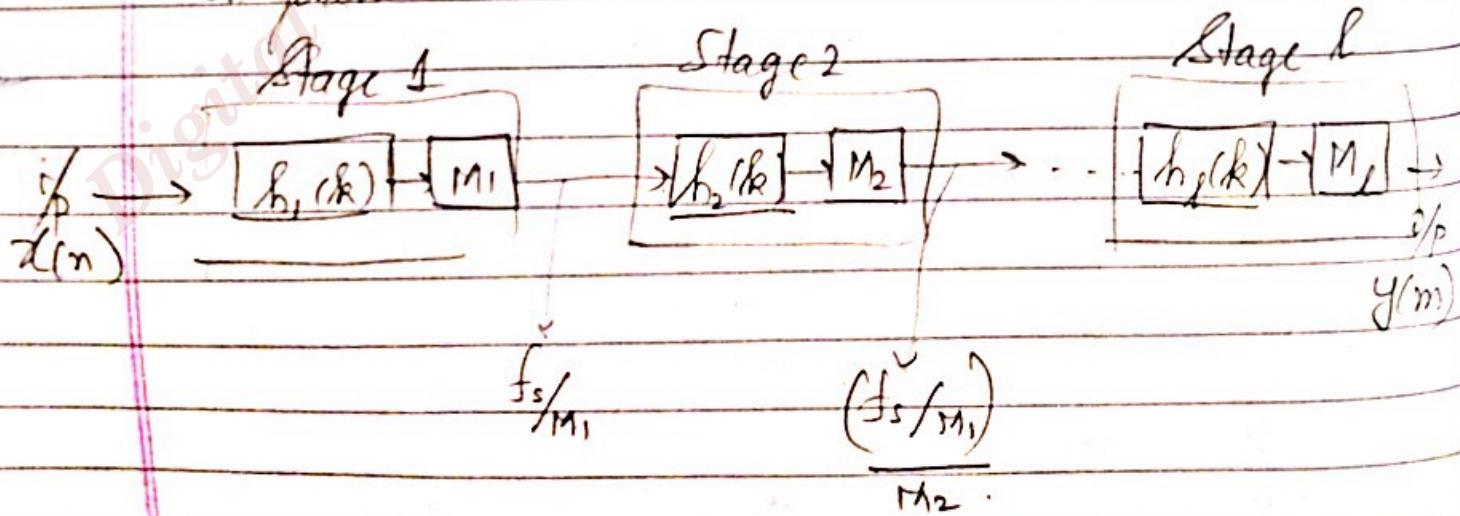
We have to do decimation of 32, So, for
2 stages $\downarrow 8 \rightarrow \downarrow 4$
or $\downarrow 16 \rightarrow \downarrow 2$

or - - -

3 stages $\downarrow 4 \rightarrow \downarrow 4 \rightarrow \downarrow 2$
or - - -

Now, optimise decimation factor & no. of stages.

In general:



Q Design 3 stage decimator used to reduce f_s from 3072 kHz to 48 kHz.

Assuming decimation factor of 8, 4 & 2, indicate sampling rate & δP of each stage.

Given specs: $\delta P_{fs}, f_s = 3072 \text{ kHz}$

decim factor, $M = 64$

PB ripple = 0.01 dB

SB ripple = 60 dB

freq. band of interest = 0 - 20 kHz.

$\Delta f, f_s$ should be min

$$\geq 2 \times 20 \text{ kHz} \text{ (Nyquist)} \\ = 40.$$

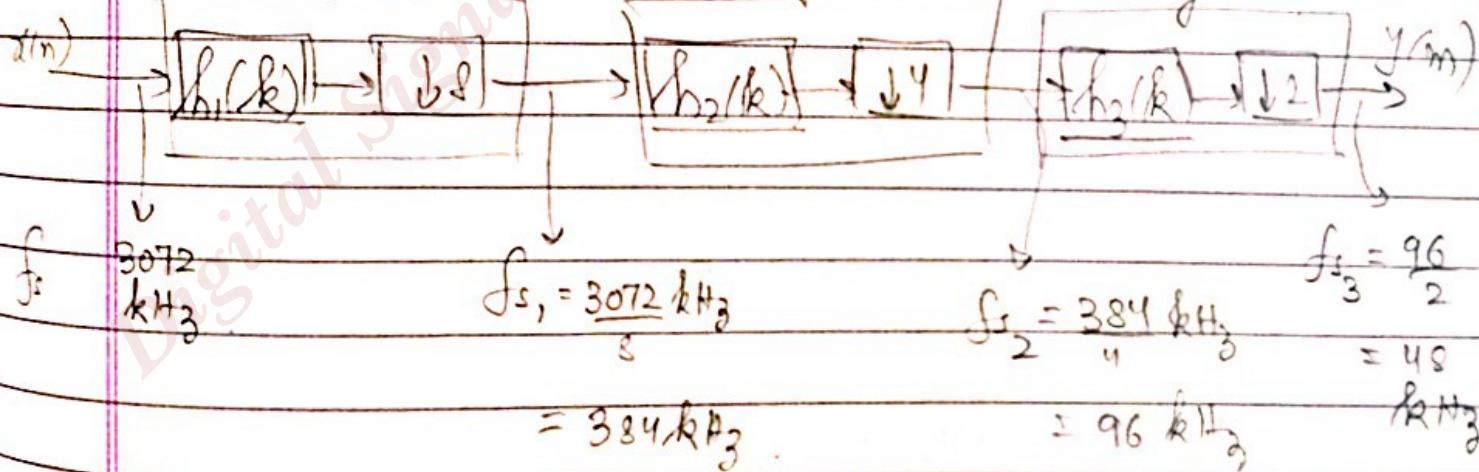
So, we have taken 48 kHz

Structure:

Stage 1

Stage 2

Stage 3



$$f_s = 3072 \text{ kHz}$$

$$f_{s1} = \frac{3072}{8} \text{ kHz}$$

$$= 384 \text{ kHz}$$

$$f_{s2} = \frac{384}{4} \text{ kHz} \\ = 96 \text{ kHz}$$

$$f_{s3} = \frac{96}{2} \text{ kHz} \\ = 48 \text{ kHz}$$

$$\therefore f_{s1} = 384 \text{ kHz}$$

$$f_{s2} = 96 \text{ kHz}$$

$$f_{s3} = 48 \text{ kHz}$$

Now, computing MPS & TSR to decide the optimum claim.

Now, designing filter:

$$\text{eqn: } f_{si} = (F_i) - \frac{f_s}{2M}; i = 1, 2, 3$$

f_{si} :- edge freq. of ith stage
 % sampling rate for stage

(i=1)

$$f_{s1} = 384 - \frac{3072}{2 \times 64} = 360 \text{ kHz}$$

edge freq. :- PB: 0, 20 kHz
 SB: 360 kHz

likewise, (i=2)

$$f_{s2} = 96 - \frac{3072}{2 \times 64} = 72 \text{ kHz}$$

edge freq. :- $\underbrace{0, 20}_{\text{PB}}, \underbrace{72}_{\text{SB}}, \underbrace{192}_{\text{SB}} \text{ kHz}$

(i=3)

$$f_{s3} = 48 - \frac{3072}{2 \times 64} = 24 \text{ kHz}$$

edge freq. :- $\underbrace{0, 20}_{\text{PB}}, \underbrace{24}_{\text{SB}}, \underbrace{48}_{\text{SB}} \text{ kHz}$

(i) Now, overall decimⁿ factor = 64 (3072 / 48)

(ii) Seeing possible combinⁿ for 2 stages :

$$32 \times 2$$

$$16 \times 4$$

$$8 \times 8$$

(iii) Taking 3 stages :

$$16 \times 2 \times 2$$

$$8 \times 4 \times 2$$

Seeing all possibilities.

(iv) 4 stages

$$8 \times 2 \times 2 \times 2$$

$$4 \times 4 \times 2 \times 2$$

From these possibilities find MPS & TSR of them.
See the min. value & choose those factors.

Q. Design 2 stage decimator that decimates by factor of 30. Specify f_s at i/p & o/p of each stage of decimⁿ.
Given Specs:

$$\text{i/p } f_s : 240 \text{ kHz}$$

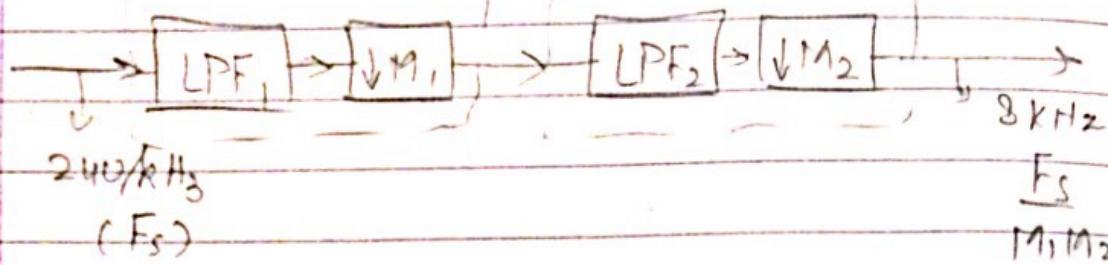
Highest freq. of interest in data : 3.4 kHz

(PB ripple, S_p : 0.05 (already value is given))

(SB ripple, S_s : 0.01 not in dB)

$$\text{filter length, } N = -\frac{10 \log(S_p S_s)}{14.6 \Delta f} - 1$$

Δf : Normalized trans width



The combin'g of factors can be

- (i) 15×2
- (ii) or 10×3
- (iii) or 6×5

$$(i) M_1 = 15, M_2 = 2.$$

$$\frac{240}{15} \rightarrow \frac{16}{2} \rightarrow 8\text{ kHz}$$

1st stage : bandedge freqs : 3.4 kHz & 12 kHz

$$\left(\frac{16 - 240}{2 \times 30} \right)$$

$$\Delta f = 12 - 3.4 = 0.0358$$

$$\delta p = \frac{0.05}{2} = 0.025, S_S = 0.01, N_1 = 45$$

2nd stage bandedge freqs : 3.4 kHz & 4 kHz

$$\Delta f = 0.0375 \left(\frac{4 - 3.4}{16} \right)$$

$$\delta p = \frac{0.05}{2} = 0.025, S_S = 0.01, N_2 = 43$$

11ly, do for 10×3 & 6×5 cases &
tabulate MPS & TSR.

	MPS	TSR
$M_1 = 15, M_2 = 2$	1064×10^3	88
$M_1 = 10, M_2 = 3$	1088×10^3	88
$M_1 = 6, M_2 = 5$	1368×10^3	119

Seeing min. value

So, optimum $\rightarrow M_1 = 15, M_2 = 2$
decimⁿ factors.

Q. Sampling rate of $x(n)$ has to be reduced from
196 kHz to 1 kHz

highest freq. of interest after decimⁿ = 4886 Hz

✓ Use optimal FIR filter

✓ PB ripple = $S_p = 0.01$

✓ SB deviation, $S_c = 0.001$

Design efficient decimator

Tells about
PB edge freq.

Here overall decimⁿ factor = 96

Now, see optimum decimⁿ factor for one or two
or 3 or 4 stages

Using computer, seeing values for diff^t stages

no. of
coeff

at each stage

	N_1	N_2	N_3	N_4	M_1	M_2	M_3	M_4	MPS	TSR
(1)	4886				96	-	-	-	48881000	4886
(2)	131	167			32	3	-	-	560000	298
(3)	25	34	17		8	6	2	-	485000	176
(4)	11	13	17	120	4	4	3	2	496000	161

Choosing min. values of MPS & TSR.

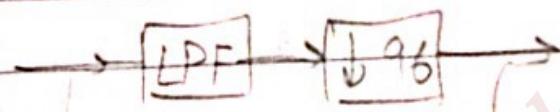
Clearly (1) & (2) are ruled out.

We have to choose b/w (3) & (4)

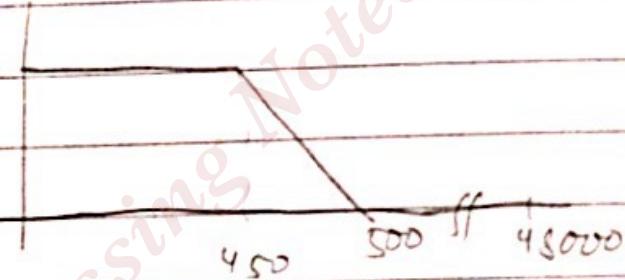
Based on our requirement we choose b/w (3) & (4)

Graph :

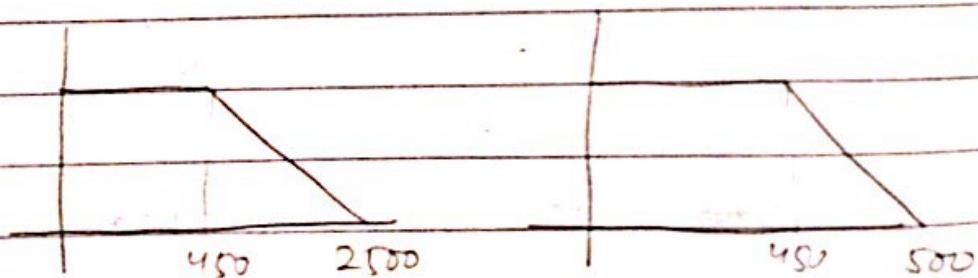
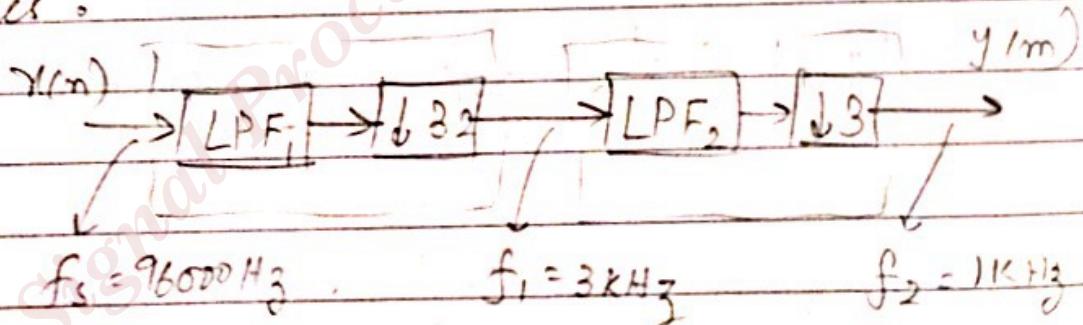
for single stage :



$$f_s = 1 \text{ kHz}$$



2 stages :



$$f_{s1} = 3000 - 96000 = 2500$$

2096

$$\Delta f_1 = 2500 - 450$$

Why for (3) & (4) stages (helped to choose)

Q A digital audio sys. exploits OVERSAMPLING techniques to relax requirements of analog anti-imaging filter.

Spur:

Baseband: 0 - 20 kHz.

F_s : i/p f_s 44.1 kHz.

o/p f_s 176.4 kHz.

SB attenuator 50 dB

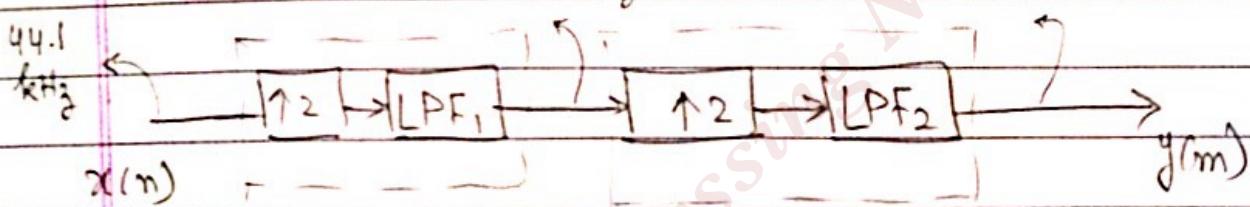
PB ripple 0.5 dB

Transn width 2 kHz.

SB edge freq. 22.05 kHz

Design suitable INTERPOLATOR

88.2 kHz 176.4 kHz



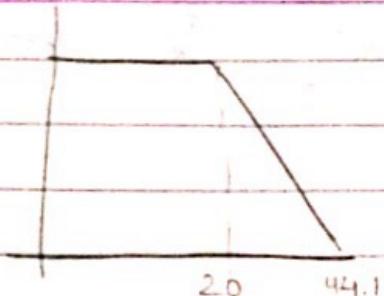
Idea: find no. of coeff. So, value of filter design coeff. can be evaluated.

→ find SB edge freq.

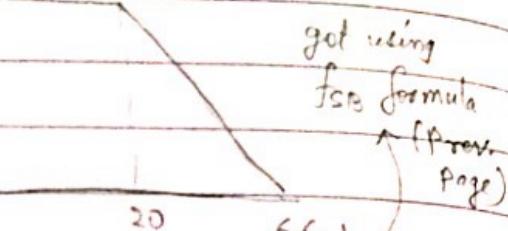
$$w_c \text{ i.e } f_{sb} = \frac{f_s}{2} + \frac{f_i}{2L_i} \quad \begin{matrix} \rightarrow i/p f_s \\ \rightarrow o/p f_s \\ \text{overall } L \end{matrix}$$

Having known SB edge freq, we get transn band. (Δf)

✓ Normalise it wrt APPROPRIATE Sampling freq.



$$\Delta f_1 = \frac{44.1 - 20}{88.2}$$



$$\Delta f_2 = \frac{66.1 - 20}{176.4}$$

$$0.5 = -20 \log(1 + \delta_{P_1})$$

$$50 = -20 \log(\delta_{S_1})$$

$$\delta_{P_1} = 0.0296$$

$$\delta_{S_1} = 0.00316$$

$$\checkmark N_1 = 83$$

$$\delta_{P_2} = 0.0296, \delta_{S_2} = 0.00316$$

$$N_2 = 6$$

no. of coeff. get in every stage.

Tabulated result for interpolator :

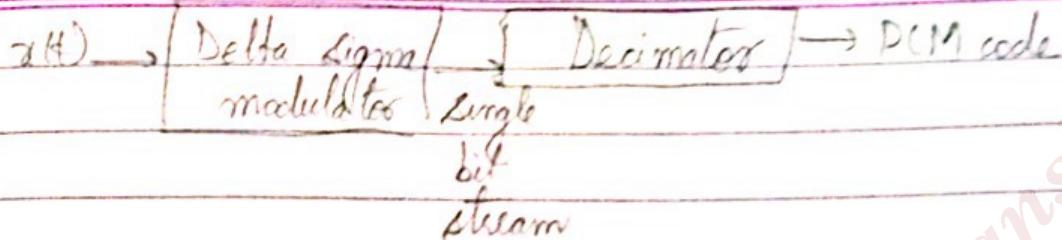
No. of stages	Interpol. factor α_L	filter length N_i	Normalised trans. width, Δf_i	PB ripple S_p	SB ripple S_s
1	4	146	0.04535	0.05925	0.00316
2	2	83	0.26162	0.0296	0.00316
	2	6	0.27324	0.0296	0.00316

• Multi-rate signal processing applications .

→ Data storage

(excess data can be stored in case of
ADC. So, decimator can be useful)

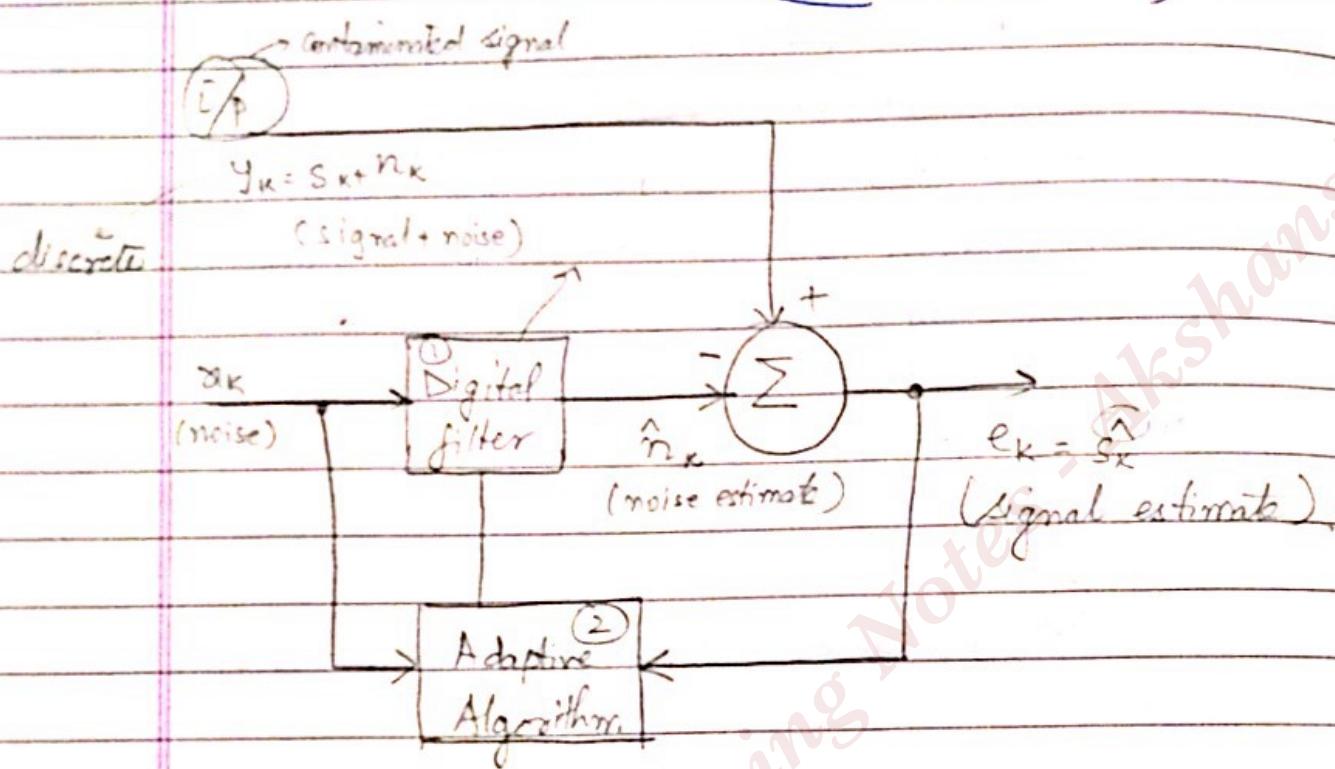
→ In communicⁿ, when $\Delta-\tau$ modulⁿ is
being done .



- ✓ $D \rightarrow A$ in compact hi-fi systems.
- ✓ high quality $A \rightarrow D$ conversion of digital audio
 - Interpol* is done for quality improvement
 - (Block diagram)
- Sub band coding of speech signals.
i.e., in the processes where multiple messages are multiplexed & sent through transmitter (radio stations).

Decimation is done before multiplexing &
Interpol* is done after demultiplexing

ADAPTIVE DIGITAL FILTERS



Sys. parameters change wrt environmental cond'n changes (e.g. temperature)

If the parameters don't change, we get o/p which is unaffected, such a sys. is called **Adaptive Control System**.

here, sys. is filter, which should be adaptive

- Sys. parameters get changed = Noise

(e.g. variation in pixel values in Photography)
↳ = Noise

- Original signal + Noise = Contaminated signal

Idea: Subtract noise signal from contaminated signal to get wanted signal.

(9) → making estimate

Puffin

Date _____

Page _____

In the block diagram (\leftarrow),

Digital filter makes Noise estimⁿ.

↳ Idea: Make any signal or noise ^(x_k) on

your own. Get its coeff. values &

Then do $y_k - \hat{n}_k$. If we get

our wanted signal back, the signal of

noise we made was correct. If not,

keep changing it.

Mathematically,

$$* \hat{s}_k = y_k - \hat{n}_k$$

$$\hat{s}_k = s_k + n_k - \hat{n}_k$$

for $s_k = \hat{s}_k \rightarrow n_k = \hat{n}_k$

i.e., noise signal should be exactly
matched to get signal back

* APPLICATION of Adaptive Filters

DEEG, ECG Signals.

↳ Micro sensors in body. That is amplified to
Milli level of voltage. That level is detected
through sensors.

Noise comes if \exists any movement of hand/
anything in the body.

Now, this movement signals & reqd signals
are in same freq & amplitude, then,
filtering them out using Adaptive filters.

- (2) ✓ Digital communication - jamming signals
 (wideband spectrum) narrow band high power signals within the band.

- (3) ✓ Data communication through telephone lines

Summary

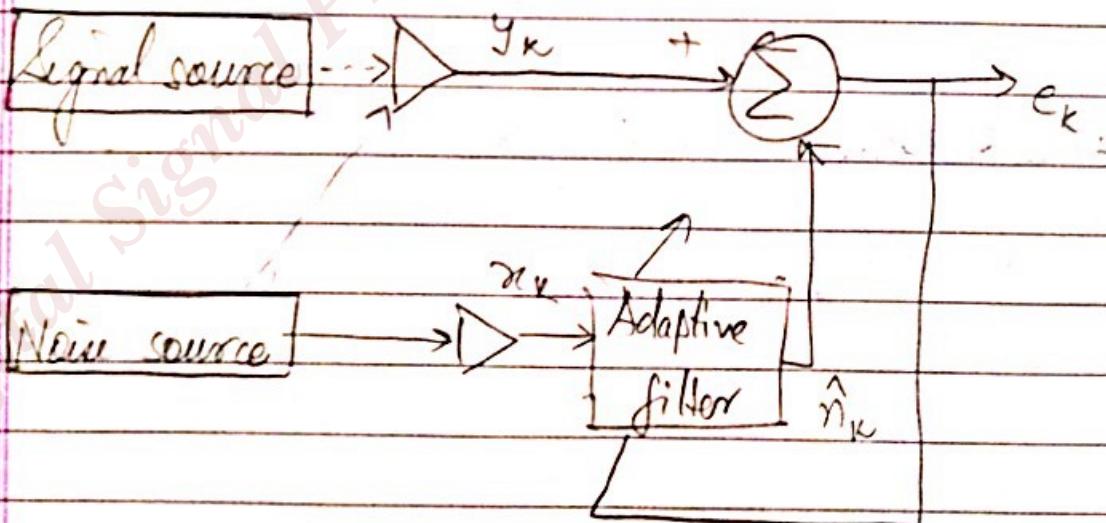
- ✓ When it's necessary to have variable filter characteristic - adapting to condⁿ
- ✓ Noise band is unknown or varies with time
- ✓ When there is spectral overlap

* Block diagram representⁿ?

→ Adaptive noise canceller

fig
10.3

(complete)



+ other block diagrams for other applications
 (line enhancer, system modelling -)

To design any Adaptive DSP : Main components:

- 1) FIR filter (tuning o/p) $\hat{y}_k = \sum_{i=0}^{N-1} w_k(i)x_{k-i}$
- 2) Algorithm (for tuning filter)

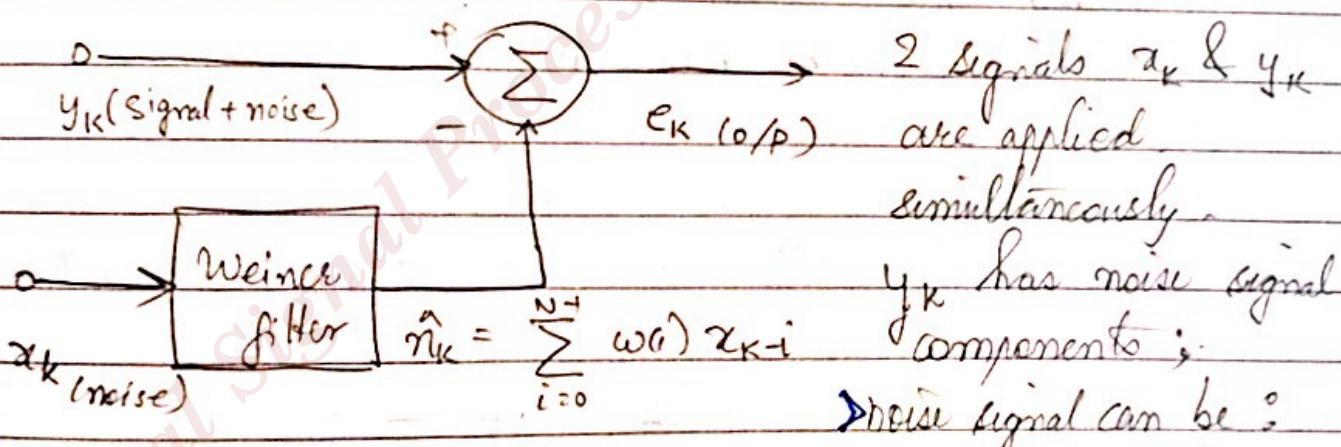
(A) • The Wiener filter

↳ used for designing adaptive filter
 aim : error = diff. b/w actual & estimated
 should be min.

mathematically,

$$e_k = y_k - \hat{y}_k = y_k - w^T X_k$$

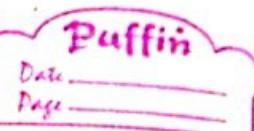
$$= y_k - \sum_{i=0}^{N-1} w_i x_{k-i}$$



Wiener filter produces the optimum estimate of
 1st part and is subtracted to get e_k

↳ correlated with x_k

• Refⁿ on one signal onto itself : Auto corr.
others : Cross



Tuning filter / extracting info:

We should see $e_k^2 = 0$.

Seeing signal \Rightarrow seeing power. So, seeing square of error signal

$$X_k = \begin{bmatrix} x_k \\ x_{k-1} \\ x_{k-2} \\ \vdots \\ x_{k-(N-1)} \end{bmatrix}, \quad W = \begin{bmatrix} w(0) \\ w(1) \\ \vdots \\ w(N-1) \end{bmatrix}$$

The square of error, $e_k^2 = y_k^2 - 2y_k X_k^T W + W^T X_k X_k^T W$.

Mean square error (MSE), J is obtained by taking E(expectation) on both sides assuming X_k & y_k are jointly stationary.

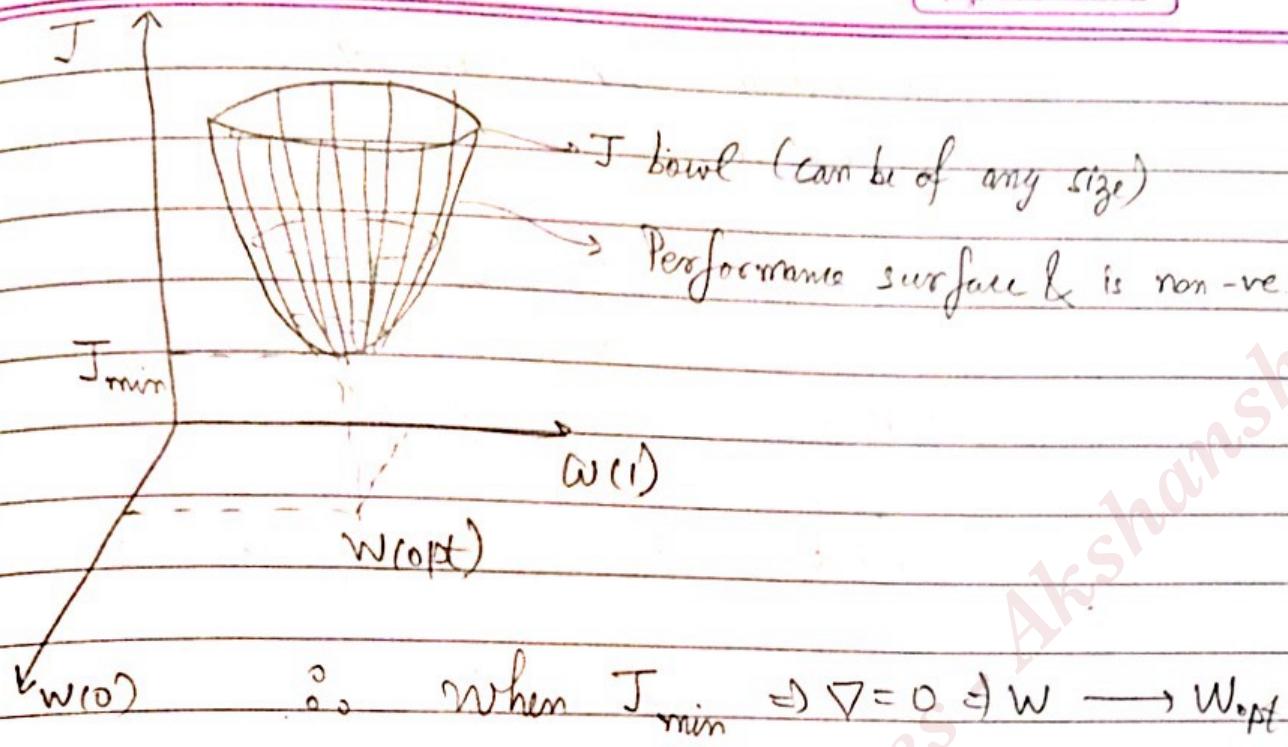
$$J = E(e_k^2) = E(y_k^2) - 2E(y_k X_k^T W) + E(W^T X_k X_k^T W)$$

$$= \sigma^2 - 2P^T W + W^T R W.$$

↳ estimating error power & trying to make it min.

Taking min. value \Rightarrow do $\frac{dJ}{dW} = 0$ & see max & min. values.

$$\nabla = \frac{dJ}{dW} = -2P + 2RW$$



Hence,

$$W_{opt} = R^{-1} P$$

- Wiener Hoffmann eqⁿ.
- R: autocorrelation of ~~is~~ X_k
- P: Prior info of cross correlⁿ.
- maybe computationally complex. So, we use other methods.

Fat Task: Adjust filter weights : $w(0) \dots w(N-1)$
using suitable algorithm to find optimum pt. on performance surface.

→ Limitations :-

↳ R, P needed (not known prior)

↳ Requires matrix inversion

- Q. Estimate desired signal at o/p of adaptive noise canceller, given by :

$$\hat{s}_k = y_k - \hat{n}_k = s_k + n_k - \hat{n}_k$$

Now, error can be seen as,

$$\text{min. of } E(\hat{s}_k^2) = E(s_k^2) + \text{min. } E(n_k - \hat{n}_k)$$

→ error min. \Rightarrow SNR is better
 \Rightarrow Noise is min.
 \Rightarrow Signal is max.

§ Other Algorithms (overcoming Wiener filter)

(B) Least Mean Square method (LMS)

(sys is stable, but 3 more MPS, TCR)

(C) Recursive Least Square method (RLS)

(superior convergence quality)

(D) Kalman's filtering

(B) Basic LMS Adaptive Algorithm

Mean Sq. error (MSE) gives W_{opt} instead in LMS,
 coeffs are adjusted from sample to sample to minimize
 MSE.

This leads to descending along surface of J bowl
 LMS is based on Steepest descent algorithm

When w_k value is updated from sample to sample,

$$\therefore w_{k+1} = w_k - \mu \nabla_k$$

\rightarrow gradient
 \rightarrow correction/weightage factor ($\propto \mu \leq 1$)

$$\nabla = (\text{cross}) - (\text{auto})$$

$$\nabla = -2P + 2RW$$

$$\therefore \nabla_k = -2P_k + 2R_k w_k = -2X_k Y_k + 2X_k X_k^T w_k$$

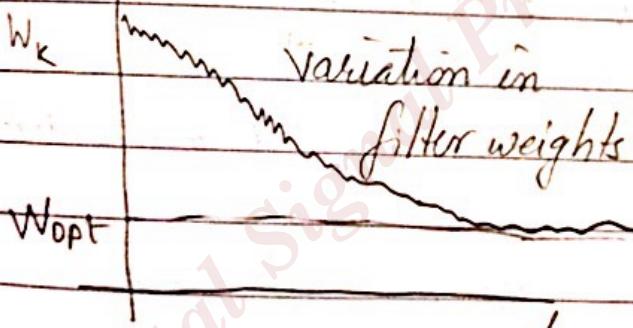
$$= -2X_k (Y_k - X_k^T w_k) = -2e_k w_k$$

$$e_k$$

o.o

$$w_{k+1} = w_k + 2\mu e_k X_k$$

$$\rightarrow e_k = y_k - w_k^T X_k$$



- We need init. values of R & P

- w_{k+1} is only estimate but slowly improves & converges to w_{opt} .

→ Limitations :

① Effects of non stationarity :

In non stationary environment, the min. point keeps changing; its orientation & curvature may also be changing.

② Effect of signal component on interference i/p channel

③ Computer word length requirements

digital filter :- $y_k^* = \sum_{i=0}^{N-1} w_k(i) x_{k-i}$

Adaptive algorithm: $w_{k+1} = w_k + 2\mu e_k x_k$

$$e_k = y_k - w_k^T x_k$$

↳ finite wordlength effect \Rightarrow may grow without limit \Rightarrow error grows.

→ Problems on implementing adaptive algorithms

- ✓ possible non convergence of adaptive filter to optimum solⁿ
- ✓ filter o/p may contain some noise which causes random fluctuations.
- ✓ premature terminⁿ of algorithm.

→ Most of adaptive sys. in literature shows:-

x_{k-1} & y_k : fixed pt. no. b1..8 & 16 bits

Quantizⁿ of coeff, multiplier & accumulators

16 - 24 bits 8x8 to
24x16 bit 16 \leftrightarrow 40 bits

④ Coefficient drift

e.g.: narrow band signal coeff drift from optimum & grow slow by demanding more word length.

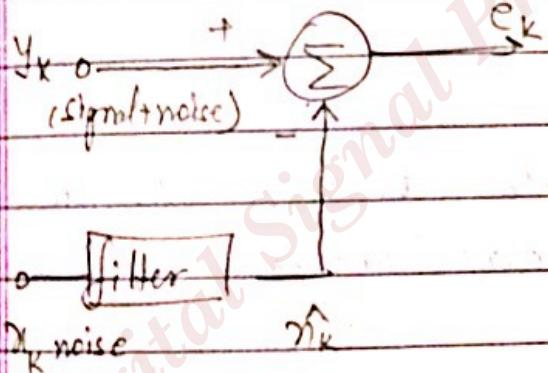
- Can be compensated by introducing a leakage factor '8' which will correct drift
- Sophisticated LMS Algo:
 - Handle complex data
 - Computationally advantageous.

(Fig 10.14) Simplified block diagram of freq. domain LMS filter.

FFT: Fast Fourier Transform

IFFT: Inverse Fast Fourier Transform.

LMS Algorithm requires $2N+1$ multiplications & $2N+1$ additions for each new set of i/p & o/p samples.

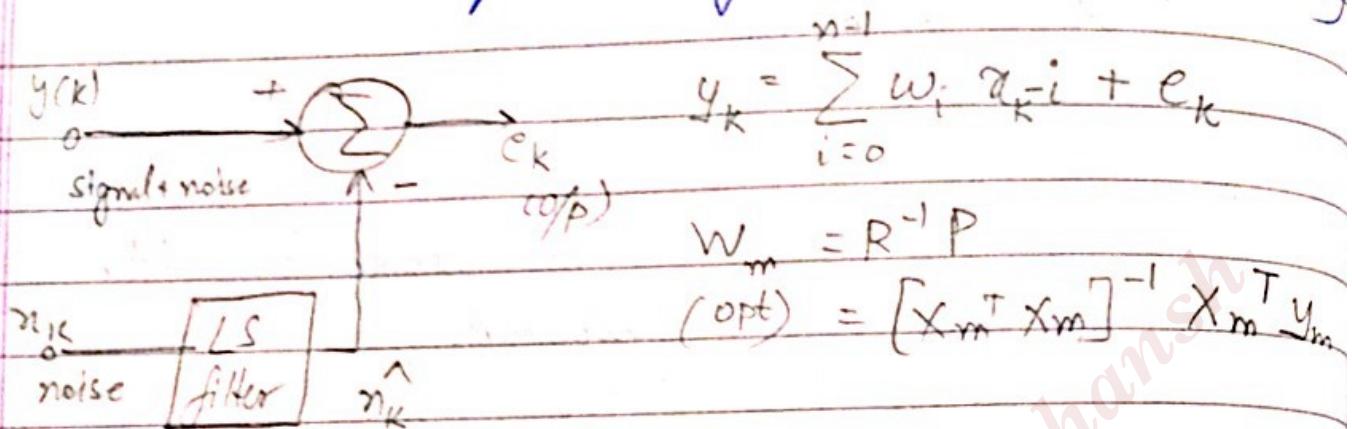


Most signal processors are suited for implementing LMS algorithm (Multiply accumulate)

Hardware implement of real time adaptive filtering

Block diagram #

* Recursive Least squares algorithm (RLS algorithm)



; where Y_m, X_m, w_m are all column vectors.

$$\hat{n}_k = \sum_{i=0}^{n-1} \hat{w}_i x_{k-i} ; \quad k=1, 2, \dots, m.$$

estimate filter i/p signal
 noise response coeff.
 signal for each sample.

For each set of new data, w_m is updated using previous values & i/p avoiding time consuming inversion process

$$\underbrace{w_k}_{\text{prev. coeff}} = \underbrace{w_{k-1}}_{\text{prev. updaton}} + \underbrace{G_k e_k}_{\text{updaton}} ; \quad P_k = \frac{1}{2} \left[P_{k-1} - G_k X_{(k)}^T P_{k-1} \right]$$

$$\rightarrow G_k = \frac{(P_{k-1}) x(k)}{\alpha_k} ; \quad e_k = y_k - X_{(k)}^T w_{k-1}$$

Cross corr " α_k " a variable

of prev. sample $\rightarrow \gamma$ (0 < γ < 0.8)

$$\rightarrow \alpha_k = \gamma + X_{(k)}^T P_{k-1} x(k)$$

P_K is measured or computed ~~not~~ recursively instead of $[X_K^T X_K]^{-1}$.

2 : forgetting factor : Smaller values for recent data which leads to wildly fluctuating estimates.

The no. of prev. samples which affects or contributes to the value of w_K at each sample point is called **Asymptotic Sample Length (ASL)** is given by :-

$$\sum_{k=0}^{\infty} \gamma^k = \frac{1}{1-\gamma} \quad \text{This defines the memory of RLS filter.}$$

When $\gamma = 1$: LS \rightarrow filter has finite memory

• Limitation of RLS algorithm

① If $\gamma(k)$ is zero for long time,

$$P_K \text{ will grow exponentially } \lim_{k \rightarrow \infty} P_k = \lim_{k \rightarrow \infty} \left(\frac{P_{k-1}}{\gamma_{k-1}} \right)$$

② Sensitivity to computer round off errors which results in -ve definite P matrix & hence to instability.

③ For successful estim' of w_K , it's necessary that P must be PSD (+ve semi definite) equivalent of $X^T X$ is invertible (\therefore of differentiating term in P_K)

- ④ Worse in multiparameter system where the parameters are linearly dependent & when algo. is implemented on a small sys with finite word length.
- ⑤ Problem of numerical instability may be solved by suitably factorising matrix P so that differencing is avoided.

2 such algs. are Square Root Algo & UD factorizⁿ Algo

↳ UD factorizⁿ algorithm :

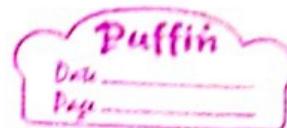
$$P_k = U_k D_k U_k^T \rightarrow \text{Diagonal matrix}$$

unit upper
triangular
matrix

* Instead of P_k , U & D are updated here.

ARCHITECTURE

Ch - 3



BLOCK REPEAT REGISTERS.

systems
Block
Registers

RPTC, BRCR

PASR

Program Address

Start Register

PAER

Program Address

End Register

Parallel Logic Unit (PLU)

Performs boolean or bit manipul^{ation} reqd for high speed controllers

Memory mapped registers

C5X :- 96 registers into page 0 of DR
28 CPU registers & 16 i/o port registers

Program controller :-

has logic circuitry which decodes instructions, manage CPU pipeline

entire module consists of → 16 bit program counter (PC)

→ 16 bit shift registers

STO, S11, PMST,

CBCR (Circular

Buffer Control Register)

→ 16 × 16 bit hardware stack register

→ Address Gener^{ator} logic

→ Instruction register

→ INFTR

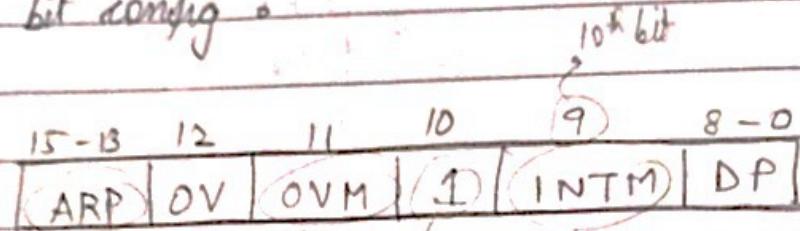
DP: Data Page Pointer
 sign extended \Rightarrow keeping sign same
 (arithmetic right shift)

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- Result analysis happens in Flag Registers or Status Registers (STO, ST1, ST2)

STO bit config:



Auxiliary Register Pointer

(3 MSB's of

STO stored

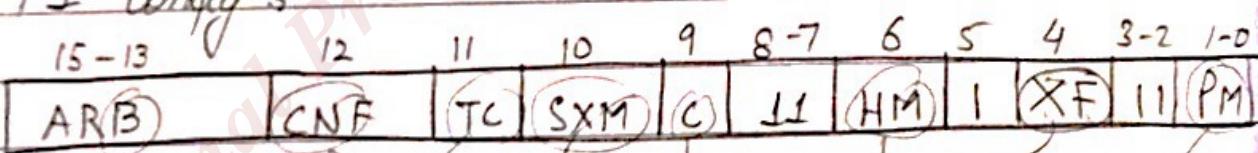
in AR pointer)

Suppose the

bits are 111 (=7)

So, content is taken from AR7

ST1 Config:



buffer

config. bit
 (specifies
 RAM posn)

= 0 : DARAM

B0 is in BM space

= 1 : DARAM

B0 is in PM space

Sign extended
 mode

Carry
 bit

Hold
 mode

level of
 external

(holding
 processor
 execution)

Processor
 Mode
 (defines
 data shift)

Checking data
 (0/1)

Test / Control

Flag bit

PM bits s_n

00 No shift

01 Left shift by
 1 bit, shifted

$\times 2 \Leftarrow$ data filled with

10 Left shift by 4
 $\times 16 \Leftarrow$ 4 bits

11 Right shift by 6
 bits & sign extended

* C5X - On Chip Memory :

Program ROM

Data / Program DARAM

Data / Program SARAM

Fifteen address range of 224 K words
X16 bits

divided into 4 memory segments.

1) 64 K word P1M

2) 64K word D1M

3) 64K word I/O ports

4) 64 K word global DM

* Seeing how instructions are being executed :

Instruction sets :

- 1) Data transfer
- 2) logic instructions
- 3) Control instruction
- 4) Arithmetic - ADD/SUB
- 5) Multiply

* Data Page Memory (0-8) : 9 bits

Data Memory (0-6) : 7 bits

ARP : 3 bits

Short immediate data (0-255) : 8 bit

Long immediate data (0-65535) : 16 bit

Syntax of operands

indirect addressing \times

$* +$

$* -$ → autodecrement AR

increment $* D + \rightarrow$ increment, after fetching data : incrementⁿ amount is specified in index register

decrement

$* D - \rightarrow$ decrement, by amount in index register

$* BRO +$

$* BRO -$

Implementation of above instructions.

e.g. LAAC(*,0) :- Load accumulator data AR₂ with [2345]
! n. of bits shifted
refers index addressing mode
 \Rightarrow ARP = 2
i.e., go to value of [250] ie 23458
store in AR₂

Assuming content in the following

ARP 2

AR₂ 1250h

NSX 10 h

[1240] \rightarrow [1260]

2345

content from 1240 \rightarrow 1260

SXM = 0,

LAAC * 1, 1

increment \downarrow shift left

by 1

$\times 2$.

LACC * , 0 ACC AR2
 $(2345)_H$ $(1250)_H$

LACC * + , 1 $(468A)_H$ $(1251)_H$

LACC * - , 2 $(8D14)_H$ $(124E)_H$

2 3 4 5
010 011 0100 0101 2345 →
discard ↓ ↓ ↓ ↗ 0 (shift by 2)
0100 0110 1000 1010
4 6 8 A
↓ ↓ ↓ ↗ 0
1000 1101 0001 0100 2345 2
8 D 1 4 (shifted by 4)

$$AR2 = 1250$$

$$AR2 + 1 = 1251$$

$$AR2 - 1 = 124F$$

TMS 320C5X.pdf

Page. 100

160168 Instruction Set Summary

Remember:

Each
Mnemonic

~~Table 6.9: Accumulator memory reference instructions~~

Mnemonic Description

ABS Absolute value of ACC

Zero carry bit

ADCB Add ACCB & carry
bit to Accumulator (ACC)

ADD

address of DAT₁

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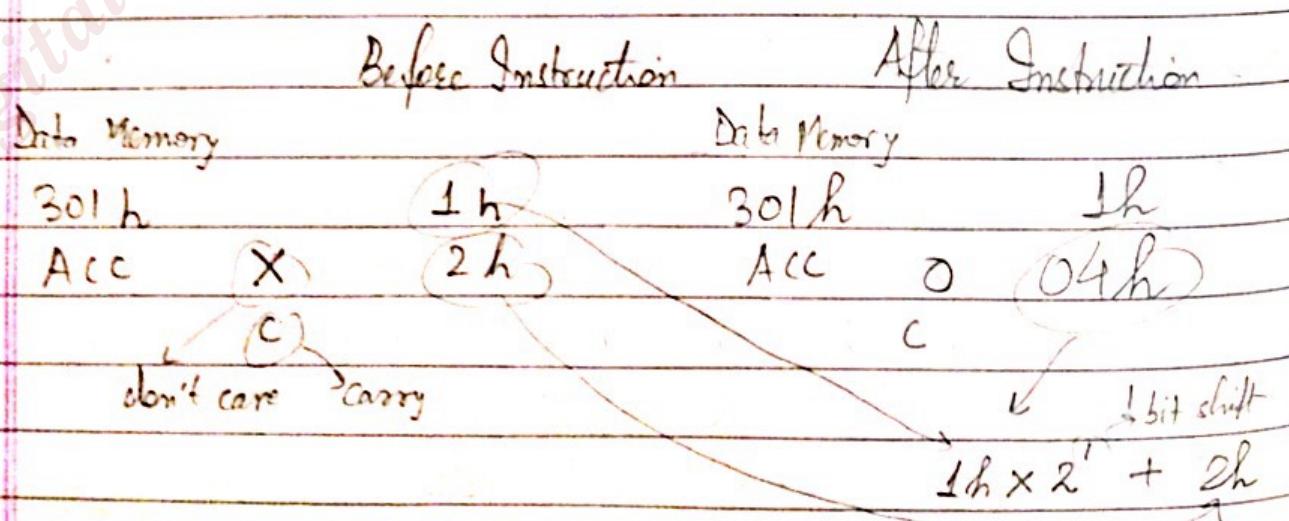
e.g.: ADD DAT₁, 1 ; (DP = 6,

~~shift by 1 bit~~

→ See memory locⁿ 301

means data page pointer
tells me 6. So, its value

is (300)₁₀ → starting address



after execution,
AR pointer points
to ARO for NEXT
instruction

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eg (2)

ADD *+, 0, ARO

ARP

4

ARP

0

AR4

0302h

AR4

0303h

Data Memory

302h

2h

302h

2h

ACC

X

2h

ACC

C

c

0

04h

eg (3)

Indicates Immediate addressing

ADD #1h; Add short Immediate

Before

ACC

X

2h

After

C

0

03h

eg (4)

Add #1111h, 1

Before

ACC

X

2h

After

C

2224h

1111h x 2
+ 2h.

* ACCH : Accumulator High Data

* ACCL : Accumulator Low Data

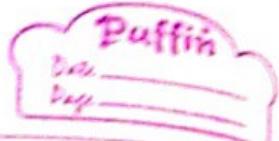
* BSAR : Where data is being shifted → CALU or PALU?

* ACCB : Accumulator Buffer ; Stores prev. data

* TREG : Temporary Register 1

* ROLB : Rotate Acc left by 1 bit through ACC buffer

- * PC : Program counter
- * SX : Sign extension bit



ex (SAMM) PRD; (DP=6)

Store Acc to memory mapped register (PRD)	Before	After
	ACC 80h	80h
	PRD 05h	80h
↓ Product Register decided by DP (=6)	Data memory 325h	0FH
		0FH

ex SAMM *, AR2); BMAR=1Fh,

	Before	After
ARP	7	2
AR7	31FH	31FH
ACC	080h	080h
BMAR	0h	080h
Data Memory		
31FH	11h	11h

* 00110(001111)

Seeing LSB 7
bits = 1F

CMR : Compares b/w AR & ARCR (Accumulator Register Count Register).

No. of bits compared = no. of CM bits.

XPL : Ex-OR operation

* LT : Load data memory value to T-Register

VIMP MAC : Multiply & accumulator
Very useful

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* Further tables which are used :

Tables 6.5, 6.6, 6.7

↳ diff instruction for diff applicns

* What will come in exam ?

Description for any mnemonic will be given (from tables from page 160 onwards in TMS CSX manual)
We have to tell the final value present in each register

* For multiply " oper", data is available in PREG & TREG (not Acc)

Q-320 Multiplic " : ways :-

- (1) Direct MPY dma
- (2) Indirect MPY {ind}[AR_n] → optional
- (3) Short Immediate MPY # k
- (4) long Immediate . MPY # lk

→ program counter

$$\rightarrow (PC) + 1 \rightarrow PC$$

$$(TREG_0) \times (dma) \rightarrow PREG$$

$$\rightarrow (PC) + 1 \rightarrow PC$$

$$(TREG_0) \times k \rightarrow PREG$$

$$\rightarrow (PC) + 2 \rightarrow PC$$

$$(TREG_0) \times lk \rightarrow PREG$$

* TRM bit : T-Register Mode bit

Pg - 322 Direct mode

op MPY DAT13 ; ($\Delta P = 18$)

7f

effectu13

→ Data Page pointer = 8

address = 400

$$\text{Address of data} = (\underset{\text{Before}}{400 + 13}) \underset{\text{H}}{=} \underset{\text{After}}{40D}$$

Data Memory

40Dh

7h

7h

TREGD

6h

6h

PREG

36h

2Ah

$$7h \times 6h \\ = 2Ah$$

(rest content

remains same)

Indirect mode

MPY *, AR2

→ ARP → modified to AR2.

Before

After

ARP

1

2

ARI

40Dh

40Dh

Data memory

40Dh

7h

7h

TREGD

6h

6h

PREG

36h

2Ah

From here,

take address
of operand

Short Immediate

MPY #1031h

TREG0

Before

2h

After

2h

PREG

36h

(62h)

long Immediate

MPY #101234h.

Before

TREG0

2h

After

2h

PREG

36h

2468h.

e.g. See Pg. 324 examples.

Pg - 329

NEG

; ($VM = X$)

\rightarrow (overflow) is none
mask bit

is complement
of Acc.

Acc

C

OV

Before

FFFF F228h

After

0000 DD8h

X C

X OV

FFFF FFFF

- FFFF F228

0000 0DD7

+ 1

0000 0DD8

Pg - 333 Normalising content :

Syntax NORM {ind}

Execution :

$$(PC) + 1 \rightarrow PC$$

$$\text{If } (Acc) = 0 ;$$

$$TC \rightarrow 1$$

Else :

$$\text{if } (Acc(31)) \text{ XOR } (Acc(30)) = 0 :$$

$$TC \rightarrow 0.$$

$$(Acc) \times 2 \rightarrow Acc$$

Modify current AR as specified.

Else :

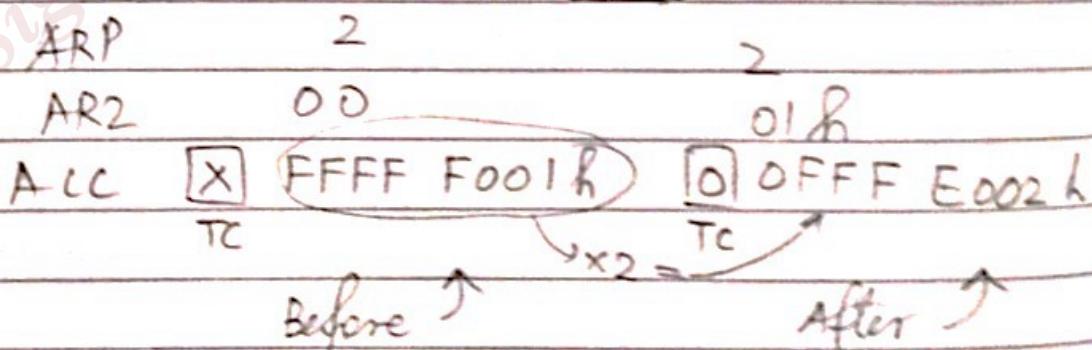
$$TC \rightarrow 1$$

Here, TC bit is getting affected

Pg - 334
eg

NORM * +

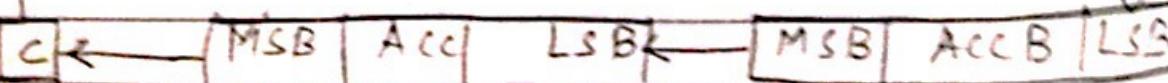
Increment AR content



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ROLB

→ Rotate left through Buffer



Before

ACC

(1)
C

0808 0808h

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Date
Page

After

0
C

1010 1011h

ACCB

FFFF FFFEh

FFFF FFFDh

0 8 0 8 0 8 0 8
↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓
0000 1000 0000 1000 0000 1000 0000 1000 ← (1)
1 0 1 0 1 0 1 0
1010 1011 h

comes
from
ACCB

end of course.