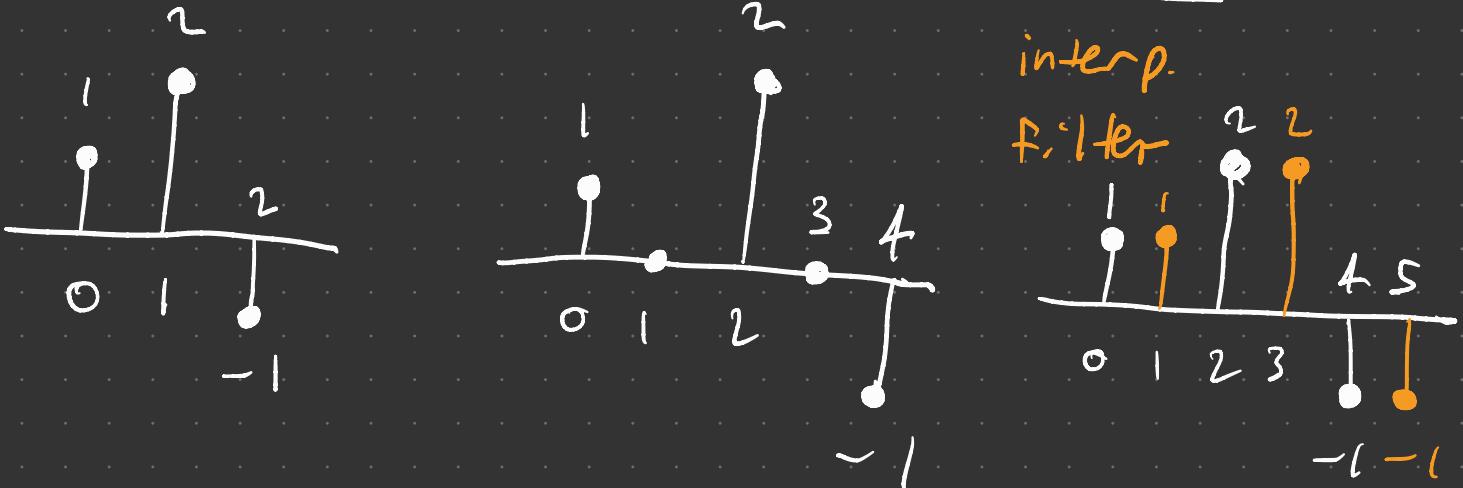
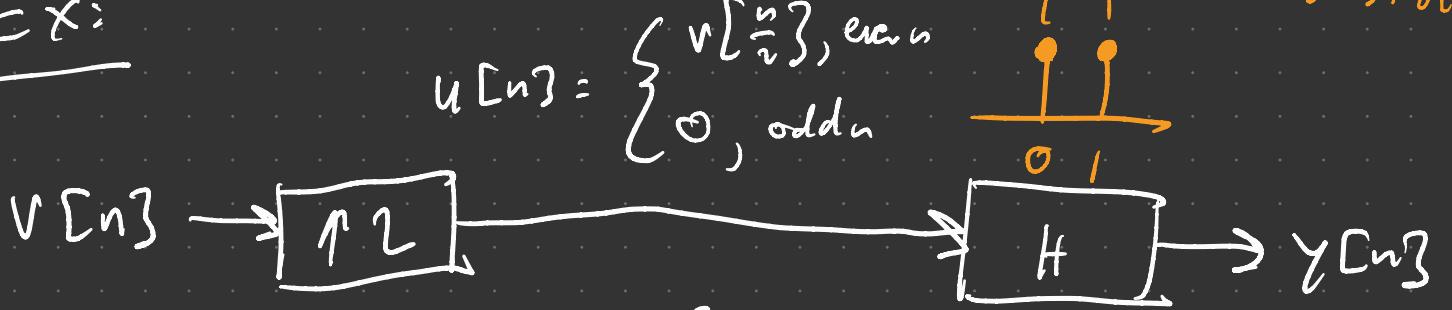


# Last Time: Multirate Systems

Ex:



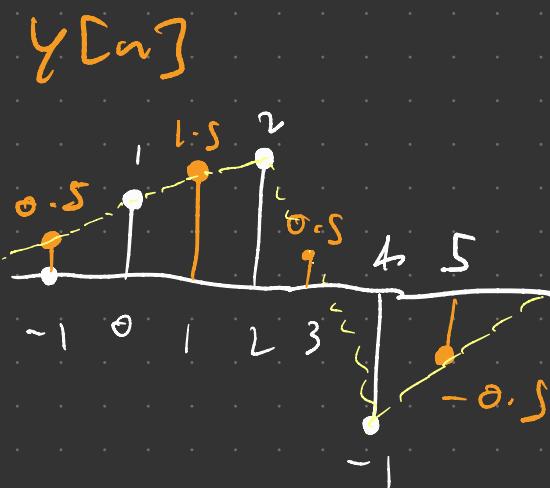
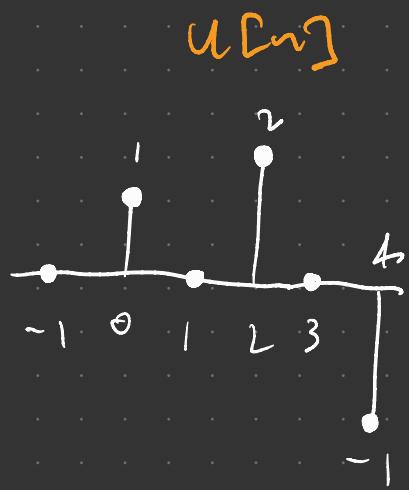
Q: Why is this bad?

A: Blocking artifacts.

(Imagine upsampling by factor 8)

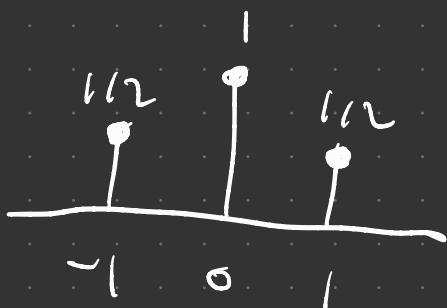
Remark: Interpolation filter design  
is a kind of art.

Q: What about linear interpolation?



Exercise: What is  $h[n]$ ?

Sol:



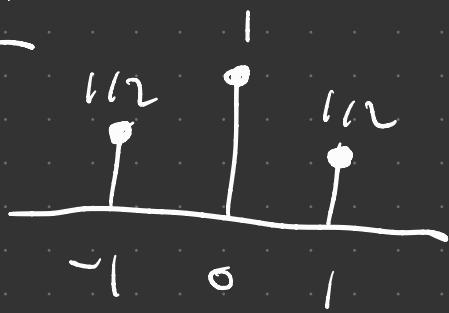
$$y[n] = \frac{u[n+1] + u[n-1]}{2} + u[n]$$

$$h[n] = \frac{1}{2}\delta[n+1] + \delta[n] + \frac{1}{2}\delta[n-1]$$

Q: Why is this bad?

A: Looks too sharp. We want something that looks smooth.

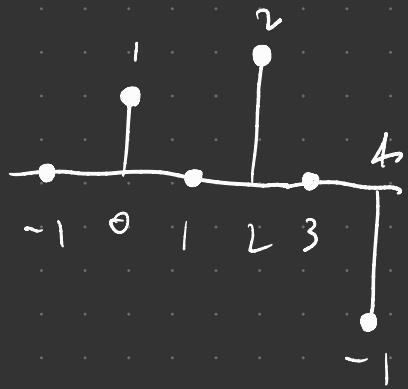
Obs:



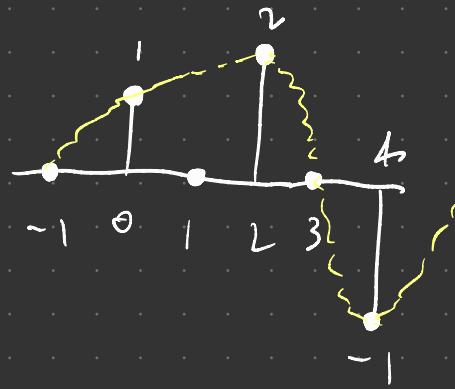
looks kinda like  
a sinc  $\Rightarrow$  low-pass

Goal:

$u[n]$

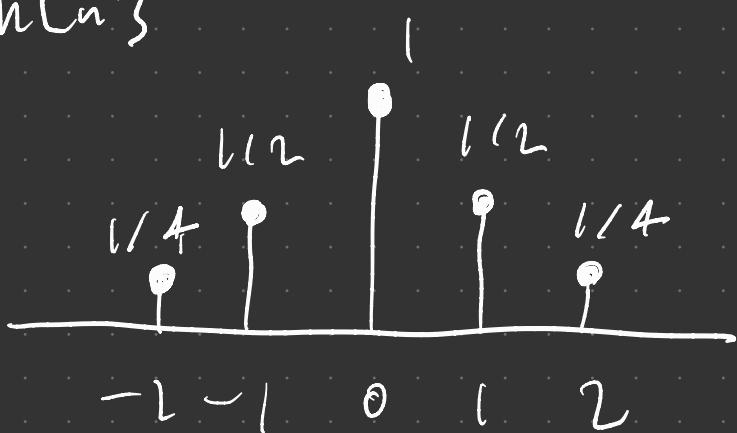


$y[n]$



Exercise: What about the filter

$h[n]$



?

Obs: It's bad because it changes the original samples!

Check what happens @  $y[0]$

$$y[0] = 1 + 0 + \frac{1}{4}(2) = \frac{3}{2} \neq u[0]$$

We destroyed the original samples!

Goal: Interpolate and preserve samples.

Obs: The issue is at even coeff. of  $h[n]$ .

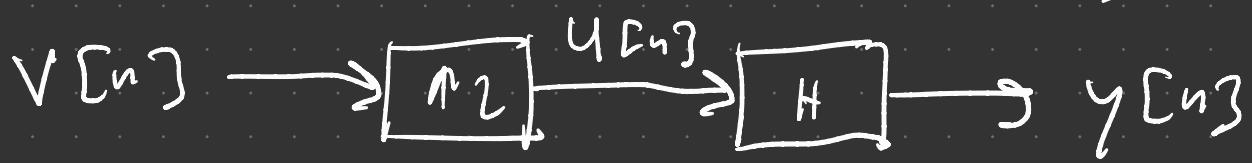
Property: An interpolation filter must satisfy

$$h[2n] = 8[n] \rightarrow (↓2)h[n]$$

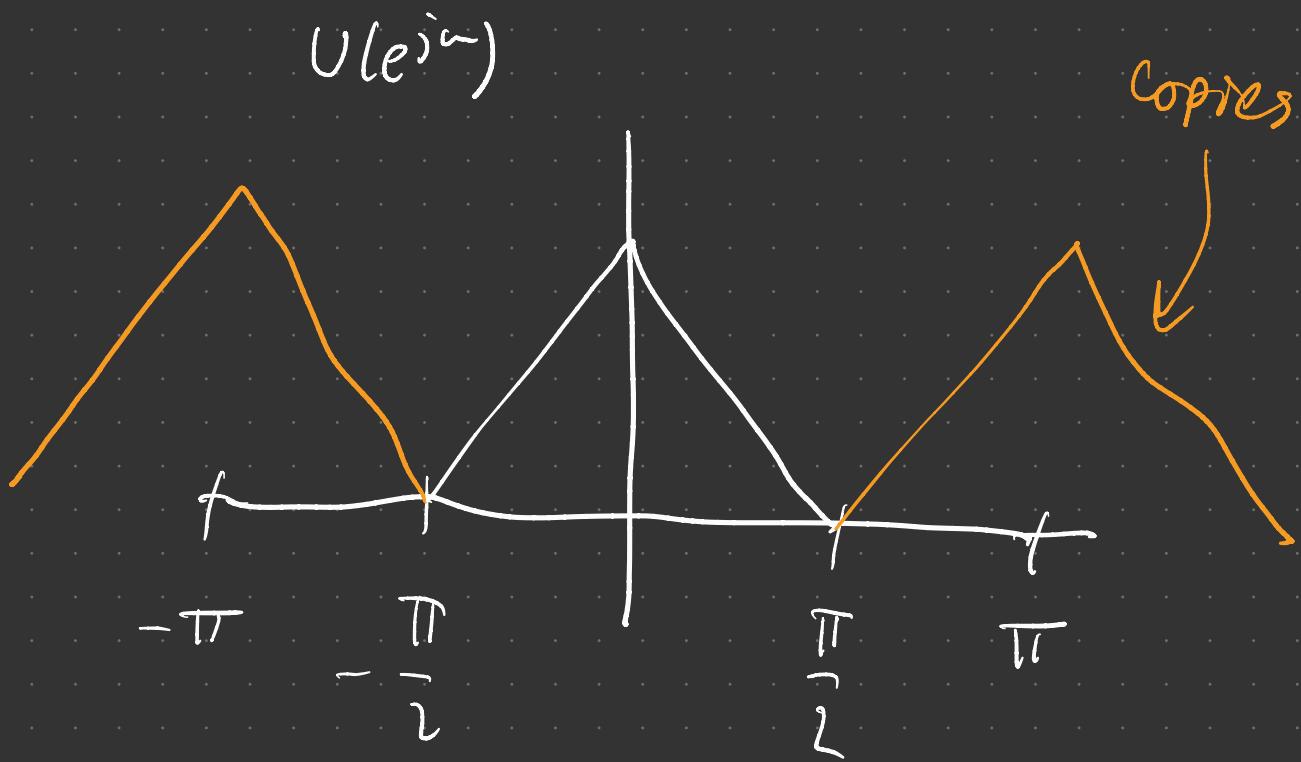
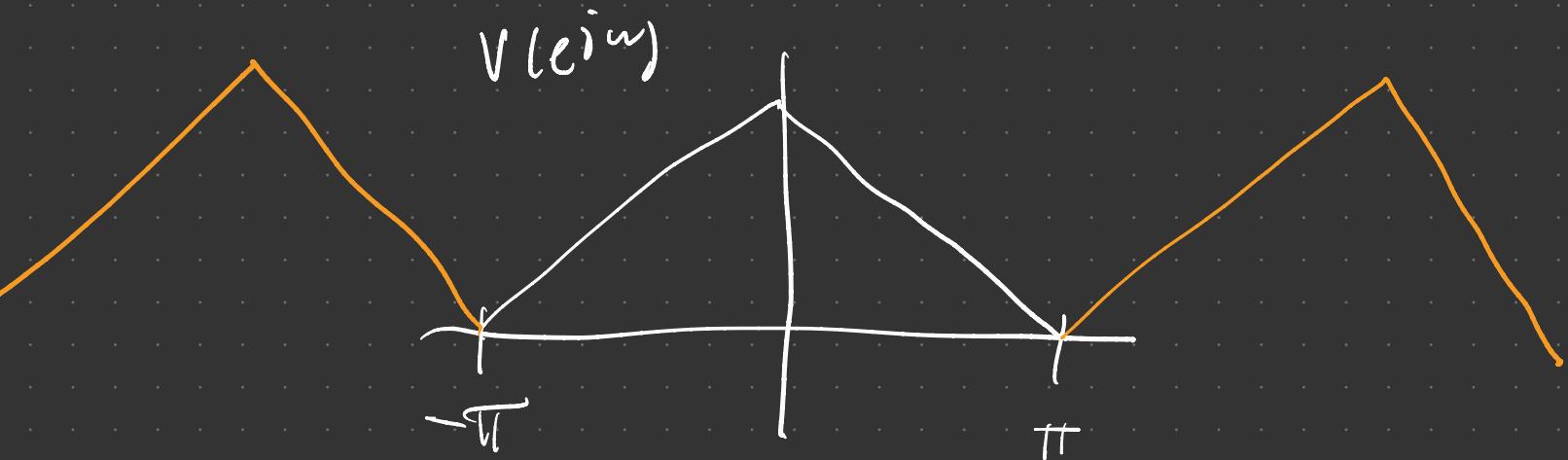
half-band condition

Obs: Interpolation filter design is only about the odd coeff.

# Frequency - Domain Analysis



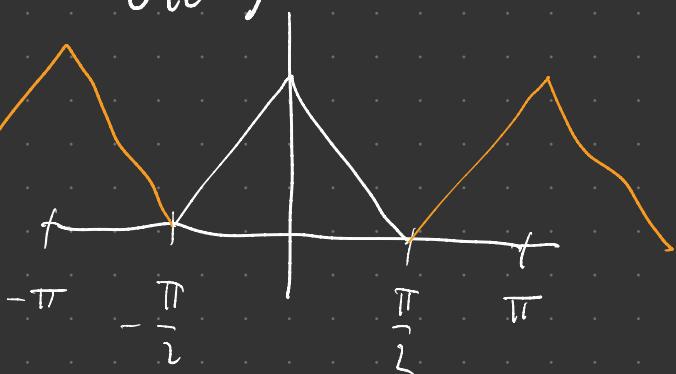
$$U(z) = V(z^2) \Rightarrow U(e^{j\omega}) = V(e^{j2\omega})$$



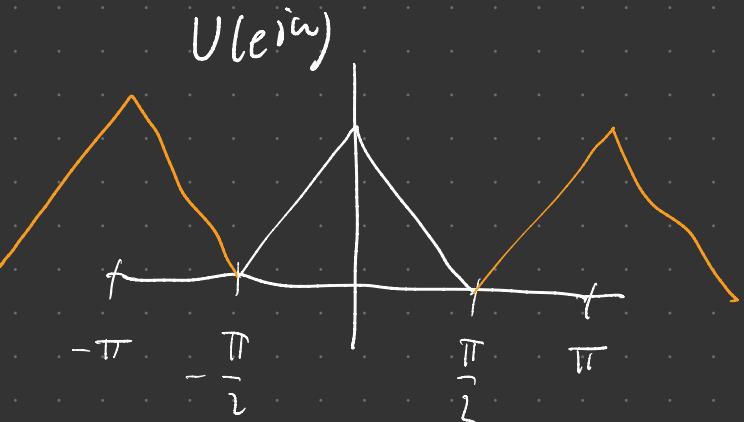
Remark: We don't want the spectrum to look like this!

Two Options:

$U(e^{j\omega})$

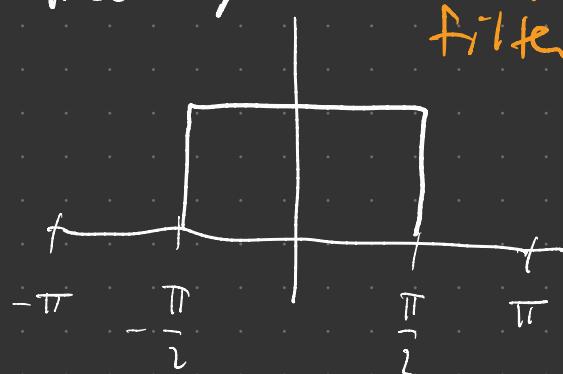


$U(e^{j\omega})$



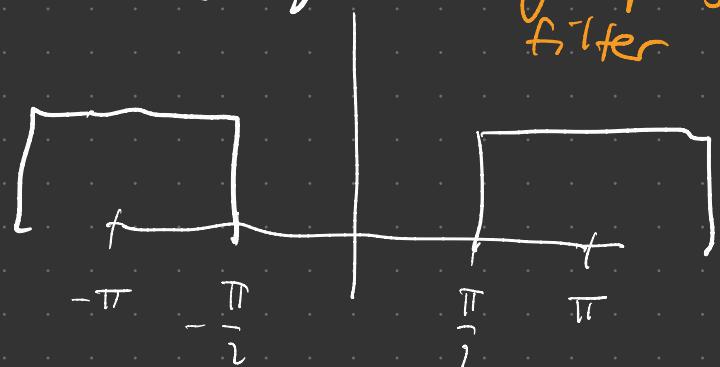
$H(e^{j\omega})$

low-pass filter

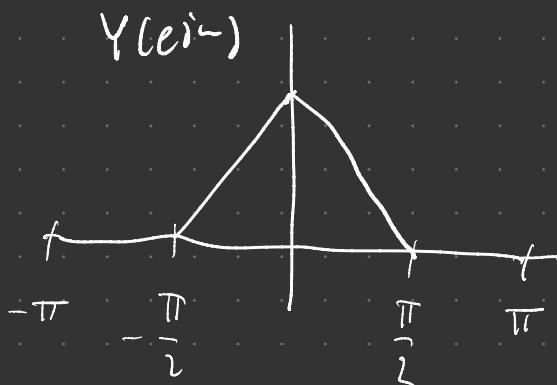


$G(e^{j\omega})$

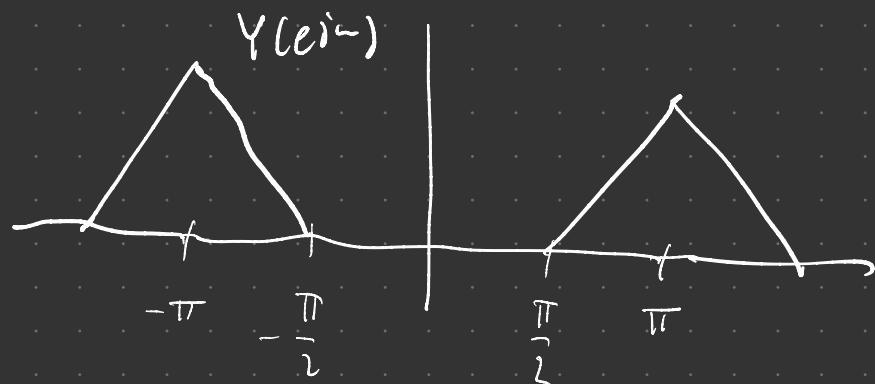
high-pass filter



$Y(e^{j\omega})$



$Y(e^{j\omega})$



Low-pass Interp.

High-pass Interp.

We have already seen low-pass interpolation.

Q: What is high-pass interpolation?

Q: Given a low-pass filter, is there a corresponding high-pass filter?

A: Yes.

$$G(e^{j\omega}) = H(e^{j(\omega - \pi)})$$
 shift in freq.

$$g[n] = e^{j\pi n} h[n]$$
 modulation in time

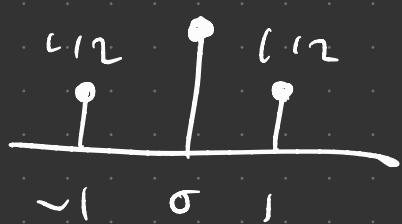
$$= (-1)^n h[n]$$

Obs: If  $h[n]$  satisfies half band condition, then so does  $g[n]$ . (even index stays the same).

Trick: Flip every other coeff of  $h[n]$  to get  $g[n]$ .

Exercise: Given the linear interp - filter

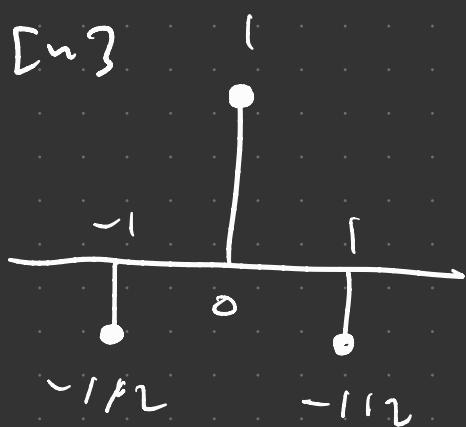
$h[n]$



What is the corresponding high-pass filter  $g[n]$ ?

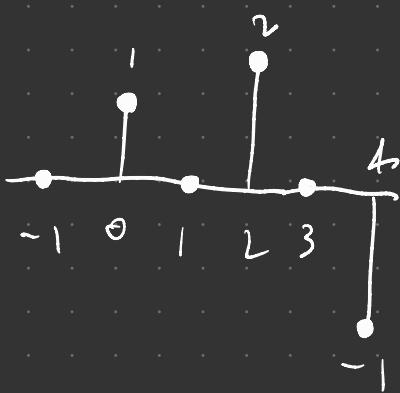
Sol:

$g[n]$

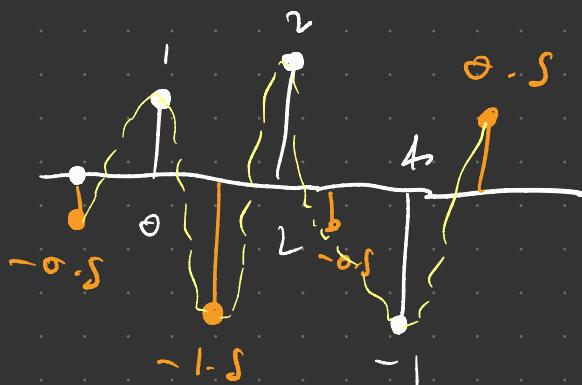


Really wiggly  
⇒ high-pass

$u[n]$



$y[n]$



Obs: Original samples are preserved because  $g[n]$  satisfies the half-band condition.

Q: Is upsampling linear?

A: Yes

$$\alpha, \beta \in \mathbb{R}$$

$$\text{Proof: } (\alpha V_1[n] + \beta V_2[n])$$

$$= \begin{cases} \alpha V_1\left[\frac{n}{2}\right] + \beta V_2\left[\frac{n}{2}\right], & n \text{ even} \\ 0, & n \text{ odd} \end{cases}$$

$$= \alpha \left\{ \begin{array}{ll} V_1\left[\frac{n}{2}\right], & n \text{ even} \\ 0, & n \text{ odd} \end{array} \right\} + \beta \left\{ \begin{array}{ll} V_2\left[\frac{n}{2}\right], & n \text{ even} \\ 0, & n \text{ odd} \end{array} \right\}$$

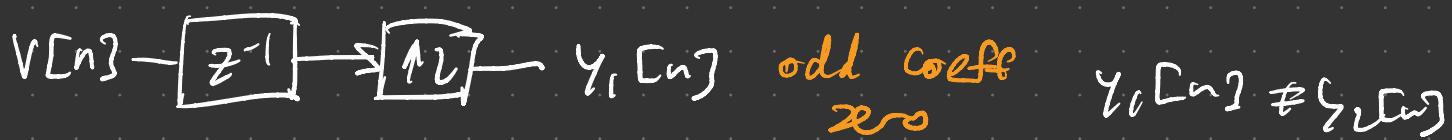
$$= \alpha (up2) V_1[n] + \beta (up2) V_2[n]$$

□

Q: Is upsampling time-invariant?

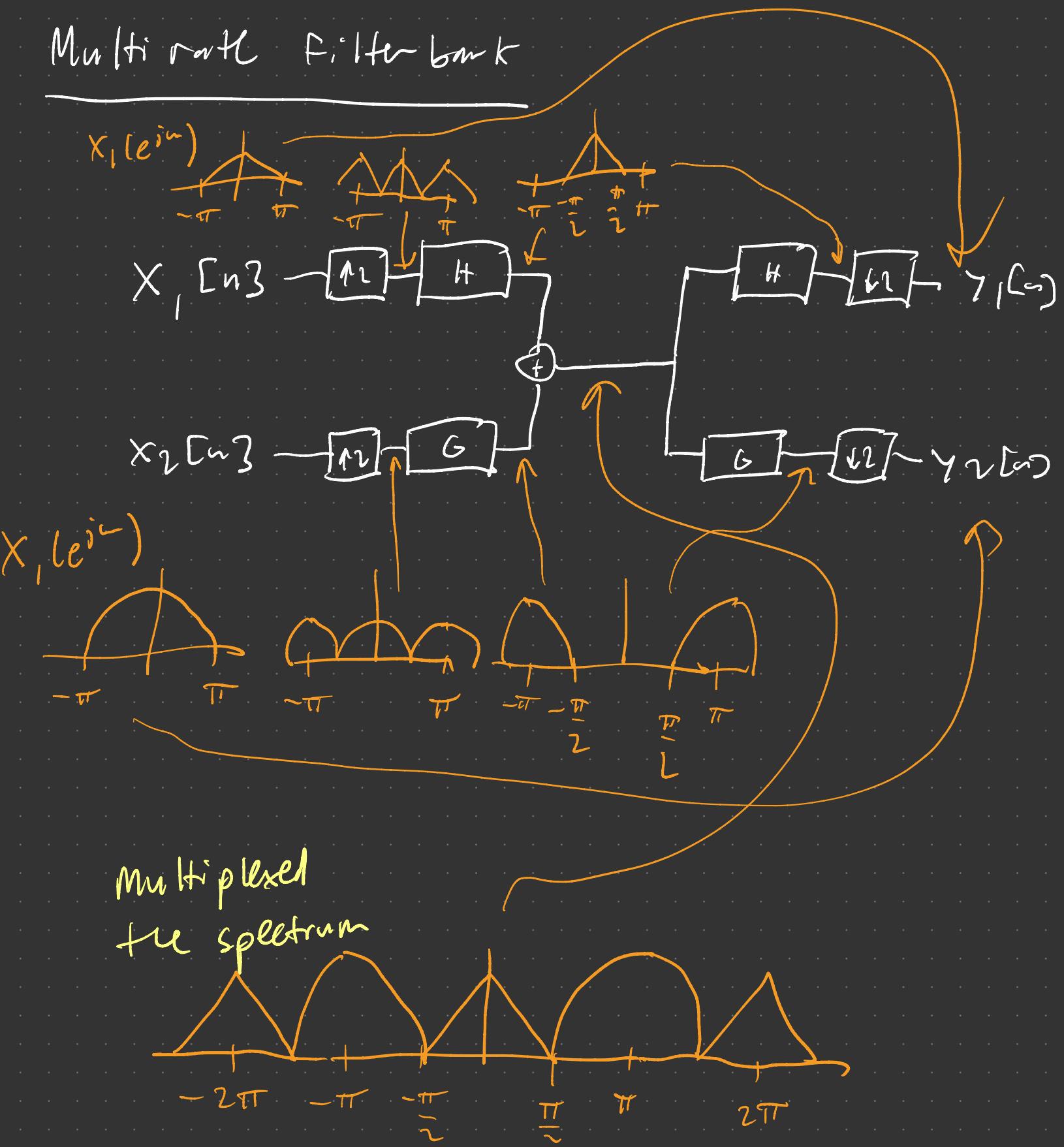
A: No.

Proof: After upsampling, the signal always has zero for odd coeff.



Remark: This is why Multirate DSP is hard: Operations don't commute.

## Multi path Filter bank



## General Case of Upsampling

$\frac{n}{L} \in \mathbb{Z}$



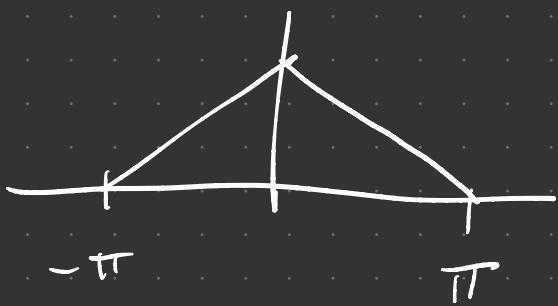
$$u[n] = \begin{cases} v\left[\frac{n}{L}\right], & n \text{ is mult. of } L \\ 0, & \text{else} \end{cases}$$

insert  $(L-1)$   
zeros between  
samples

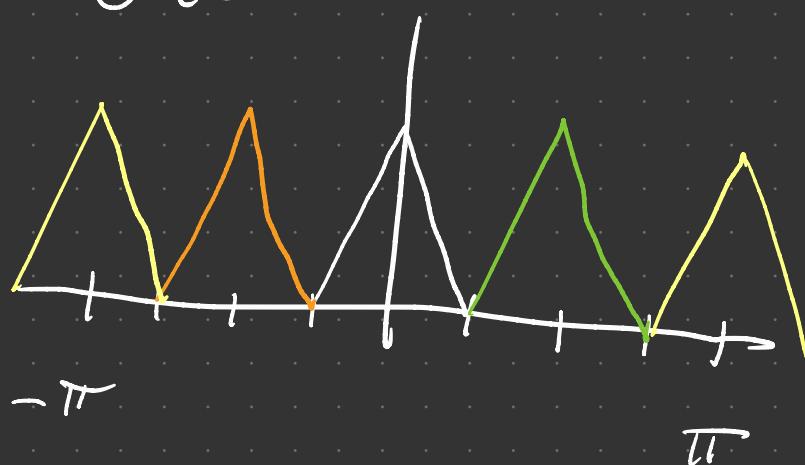
$$U(z) = V(z^L) \Rightarrow U(e^{j\omega}) = V(e^{j\frac{\omega}{L}})$$

Ex:  $L=4$

$$V(e^{j\omega})$$



$$U(e^{j\omega})$$



- 3 copies of the spectrum
- 4 total spectrums

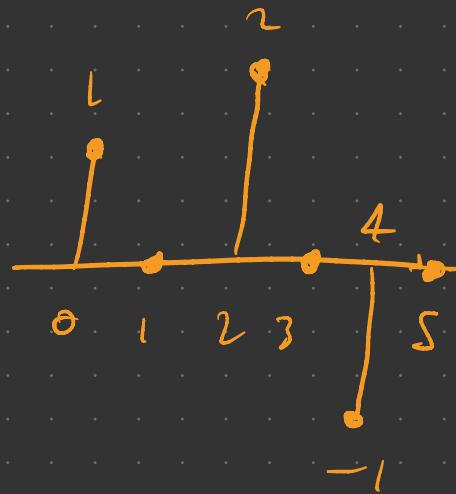
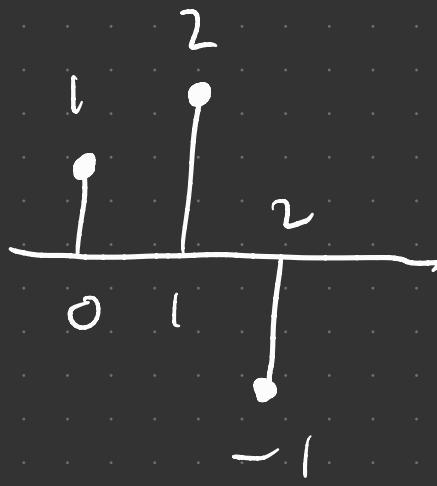
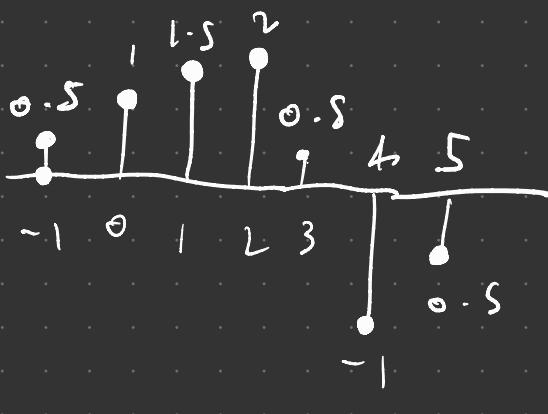
Obs: 4 options for the interp. filter

General: L interp. filters for the L spectrums

# Down sampling by Factor 2

Q: What is down sampling?

A: Deleting samples



Q: Is down sampling linear?

A: Yes

Q: Is it time-invariant?

A: No

Q: Is it invertible?

A: No.

Q: How are the spectrums  $X(e^{j\omega})$  and  $V(e^{j\omega})$  related?

A:  $V(e^{j\omega}) = V(e^{j2\omega})$

How are  $u[n]$  and  $x[n]$  related?

$$x[n] : x[0] \quad x[1] \quad x[2] \quad x[3] \quad x[4] \dots$$

$$+ (-1)^n x[n]: x[0] - x[1] \quad x[2] - x[3] \quad x[4] \dots$$

---

$$2u[n] : 2x[0] \quad 0 \quad 2x[2] \quad 0 \quad 2x[4] \dots$$

$$\Rightarrow u[n] = \frac{1}{2} (x[n] + (-1)^n x[n])$$

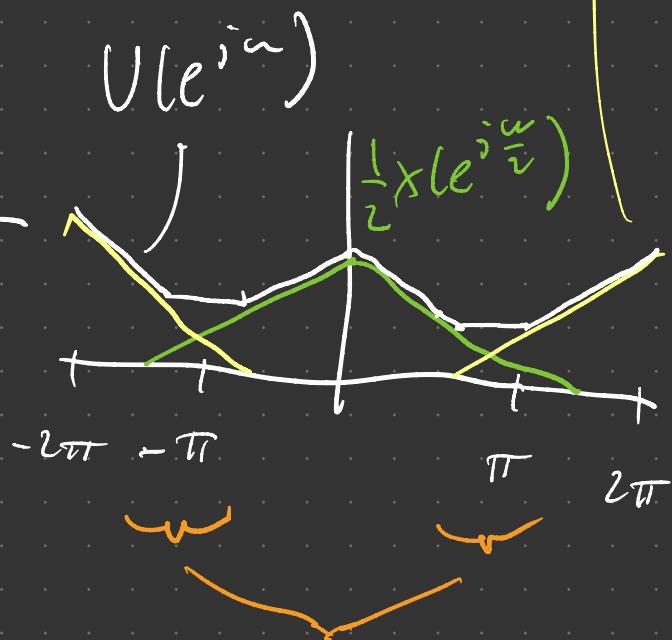
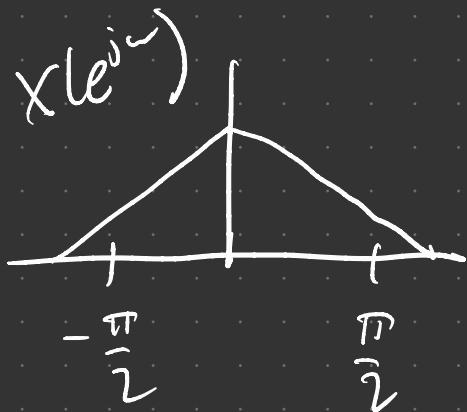
$$\Rightarrow V(e^{j\omega}) = \frac{1}{2} (X(e^{j\omega}) + X(e^{j(\omega-\pi)}))$$

$$\Rightarrow V(e^{j\omega}) = \frac{1}{2} \left( X\left(e^{j\frac{\omega}{2}}\right) + X\left(e^{j\left(\frac{\omega-2\pi}{2}\right)}\right) \right)$$

Obs: Downsampled spectrum is the avg.  
of original spectrum stretched by  
factor 2 and that same spectrum  
shifted by  $2\pi$ .

$$\frac{1}{2} X\left[e^{j\left(\frac{\omega-2\pi}{2}\right)}\right]$$

Ex:

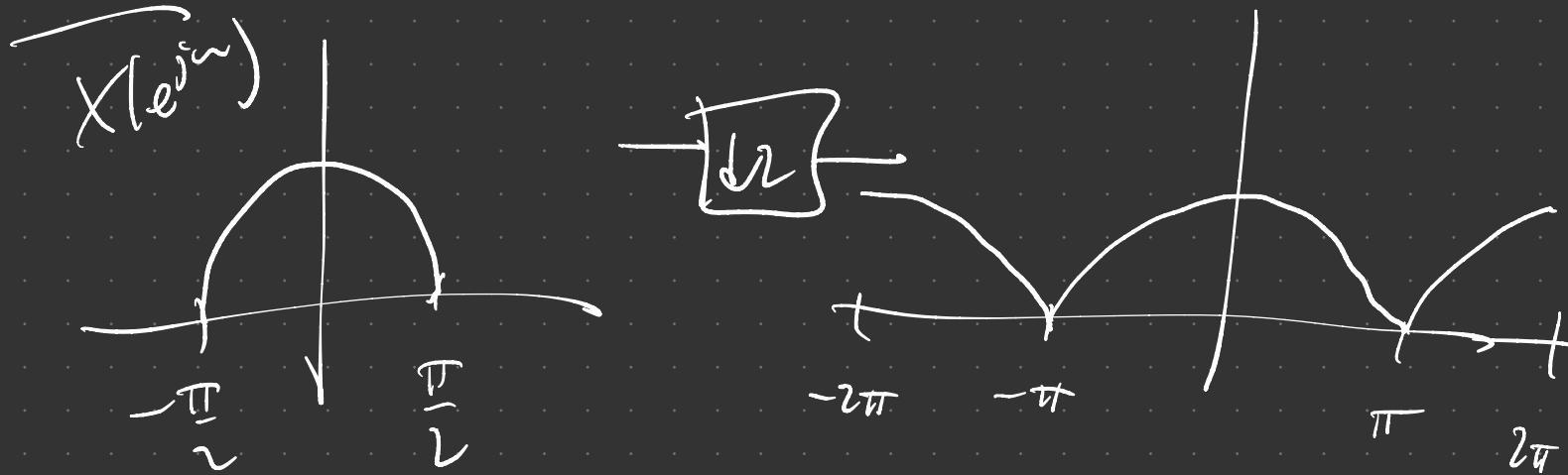


destroyed  
original  
signal

Q: What conditions on  $X(e^{jw})$  for  
no aliasing?

A: Band limited  $\left[-\frac{\pi}{2}, \frac{\pi}{2}\right]$ .

Ex:



Remark: Downsampling is always preceded by filtering

Decimation



antialiasing  
filter

Obs: Reverse of upsampling.