



Multi-Rate DSP

Applications:

Oversampling, Undersampling,
Quadrature Mirror Filters



Multi-Rate DSP

Oversampling

Optimal Sampling vs. Oversampling

- Sampling at Nyquist rate $F_s = 2F_B$
 - Allows perfect reconstruction in principle, but...
 - Pre-sampling anti-aliasing filter must have very steep roll-off:
 - High-order analogue filter: expensive, difficult, imprecise, large phase distortion, ...
- Sampling at $F_s \gg 2F_B$ & decimation to $2F_B$
 - Larger separation between images \Rightarrow easier filtering of aliases (lower-order filter)
 - Cheaper analogue component; easier digital than analogue VLSI filters; greater digital complexity

Oversampling Noise Reduction

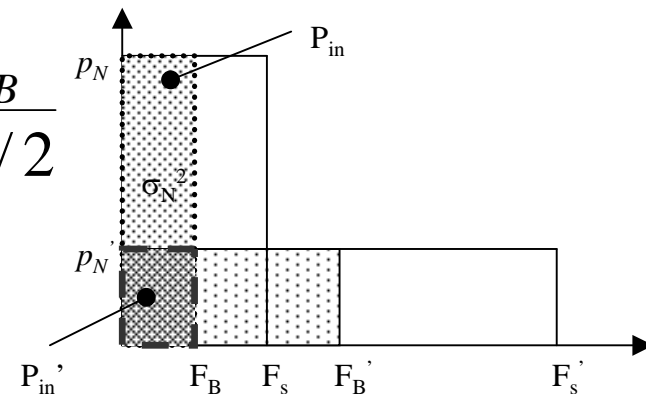
- Quantisation step (b -bit ADC, range R): $Q = \frac{R}{2^b}$
- Noise power density (per unit sampling bandwidth): $p_N = \frac{\sigma_N^2}{F_s/2} = \frac{Q^2/12}{F_s/2} = \frac{Q^2}{6F_s}$ [W/Hz]

- Total in-band noise power:

$$P_{in} = \int_0^{F_B} p_N(f) df = \frac{Q^2 F_B}{6F_s} = \frac{(R/2^b)^2}{12} \times \frac{F_B}{F_s/2}$$

- Low P_{in} for high F_s :

$$F_s' \gg 2F_B \Rightarrow P_{in}' \ll \sigma_N^2$$



Oversampling: Effective Resolution

- Equivalent β -bit ADC operating at $F_s = 2F_B$ giving same noise power as b -bit ADC operating at $F_s \gg 2F_B$ over same range R :

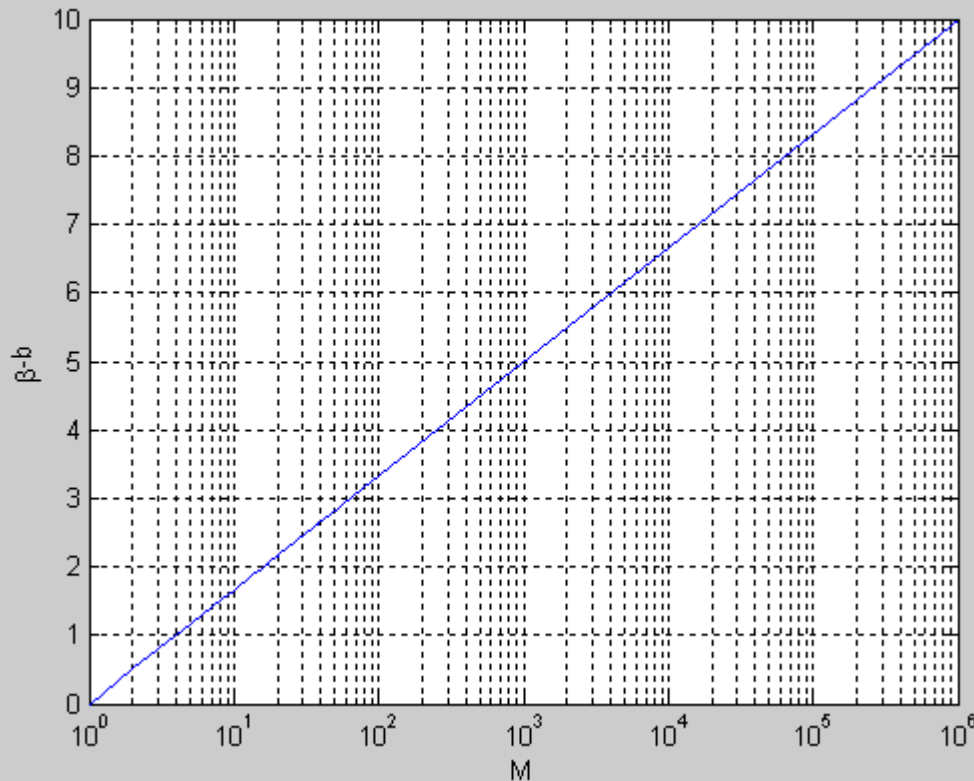
$$\frac{(R/2^b)^2}{12} \times \frac{F_B}{F_s/2} = \frac{(R/2^\beta)^2}{12} \times \frac{F_B}{2F_B/2}$$

i.e.,

$$\beta = b + \frac{\log_2(F_s / (2F_B))}{2} = b + \frac{\log_2(M)}{2}$$

- M = oversampling ratio, $\beta - b$ = resolution increase

Oversampling Ratio

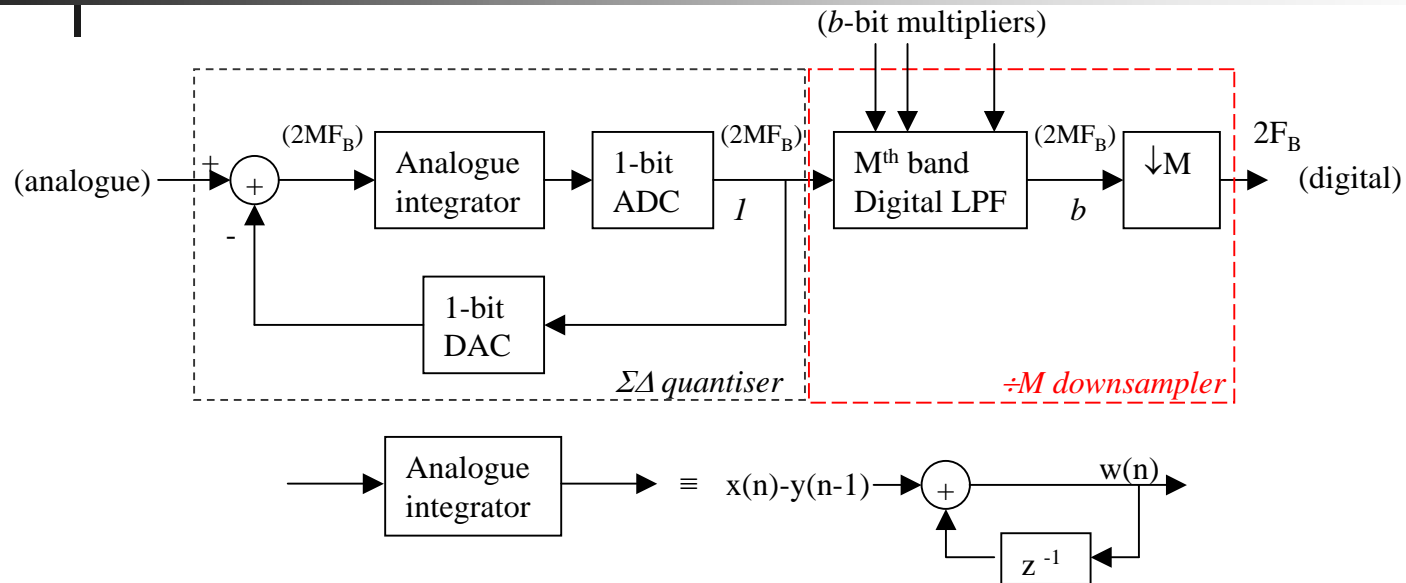


Example:

$M=10^6$: $\beta=b+10$, i.e., standard 16-bit ADC @ $F_s=2F_B$ has equivalent resolution w.r.t. noise power as an oversampling 6-bit ADC @ $F_s=2\times 10^6F_B$ or as oversampling 11-bit ADC @ $F_s=2000F_B$

Thus, 0.5 bit length reduction of ADC per doubling of M

$\Sigma\Delta$ (Sigma-Delta) Converters



-High-rate oversampling allows for differential encoding: only 1 bit needed to quantify change Δ between input and delayed output of 1-bit ADC, for closely spaced consecutive samples in output of $\Sigma\Delta$ quantiser (bitmap of sample increments)

- M^{th} order alias digital LPF eliminates out-of-band quantisation noise (sharp cut-off); heavy comp.; remedy: perform multiplications at later stage (down-rate $2F_B$) instead

-Long word length of digital o/p determines overall oversampling rate

$\Sigma\Delta$ Converters

- Accumulator (integrator) & quantiser outputs:

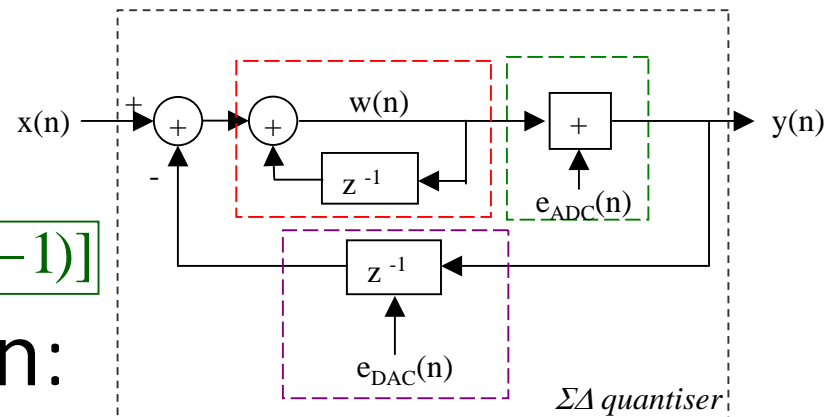
$$w(n) = x(n) - y(n-1) + w(n-1)$$

$$y(n-1) = w(n-1) + e(n-1)$$

$$\Rightarrow y(n) = w(n) + e(n) = x(n) + [e(n) - e(n-1)]$$

\Rightarrow noise transfer function:

$$H(z) = 1 - z^{-1}$$



- Output psdf (one-sided spectrum):

$$p_y(f) = \left| H\left(e^{j\omega T_s}\right) \right|^2 p_N(f) = 4 \sin^2\left(\frac{\omega T_s}{2}\right) p_N(f)$$

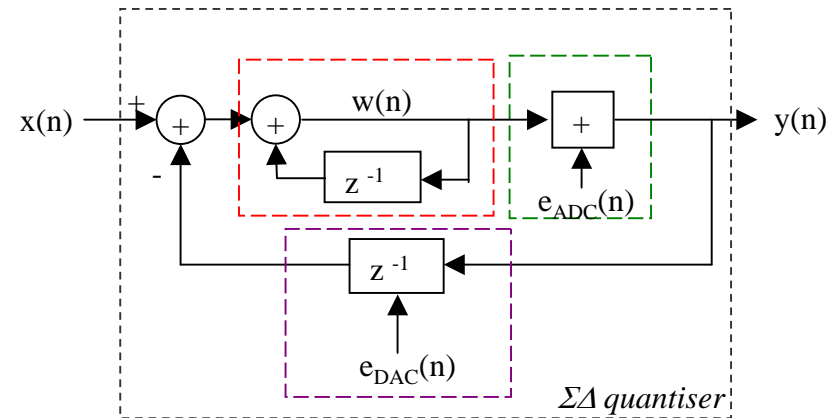
$\Sigma\Delta$ Oversampling

- Precise psdf of output noise depends on pdf & spectral characteristics of $\{x(n)\}$
 - Assume: $\{e(n)\}$ is random, uncorrelated, white:

$$p_N = \frac{\sigma_N^2}{F_s/2} = \frac{Q^2/12}{F_s/2}$$

⇒ psdf of output noise:

$$p_y(f) = \frac{2 \sin^2(\pi f T_s)}{3} \frac{Q^2}{F_s}$$



Oversampling: Performance Comparison

- For efficient oversampling ($M \gg 1, f \ll F_s$):

$$p_y(f) \approx \frac{2(\pi f / F_s)^2 Q^2}{3F_s} = \frac{2\pi^2 Q^2 f^2}{3F_s^3}$$

- Output noise power for $\Sigma\Delta$ modulator:

$$P_y = \int_0^{F_B} p_y(f) df = \frac{2\pi^2 Q^2 F_B^3}{9F_s^3}$$

⇒ Improvement over standard oversampling:

$$10\log_{10}\left(\frac{P_{in}}{P_y}\right) = 10\log_{10}\left(\frac{3M^2}{\pi^2}\right) = [-5.17 + 20\log_{10}(M)] \text{ dB}$$



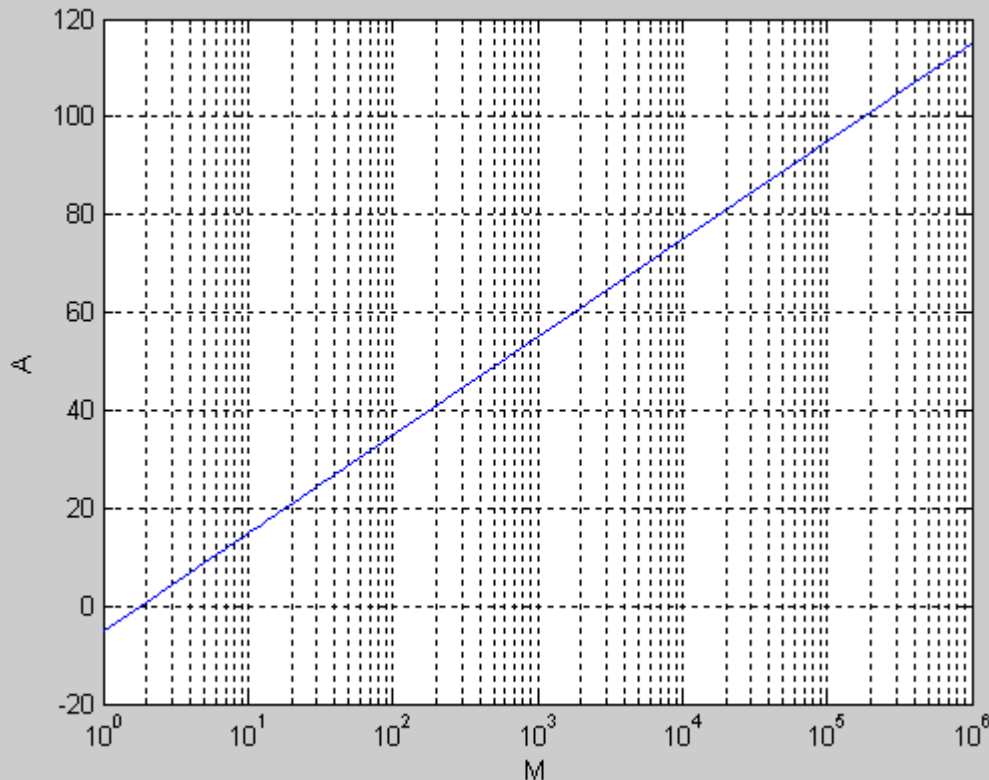
Oversampling: Performance Comparison

$$A = 10 \log_{10} \left(\frac{P_{in}}{P_y} \right) = [-5.17 + 20 \log_{10}(M)] \text{ dB}$$

$$M=10: \quad A=14.8 \text{ dB}$$

$$M=1000: \quad A=54.8 \text{ dB}$$

$$M=10^6: \quad A=114.8 \text{ dB}$$



1.5 bit length reduction
of ADC per doubling of
 M (relative to standard
oversampling):

is due to **noise shaping**
by $|H(f)|$: noise reduc-
tion if $f < F_B$



Oversampling: Application

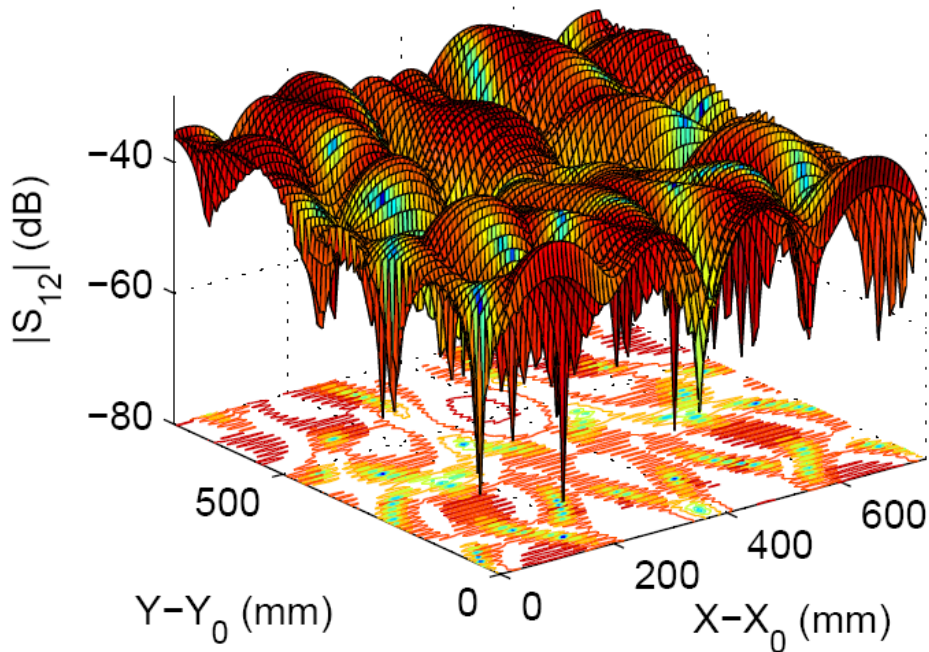
Example: measurement of indoor EM wave propagation: GSM



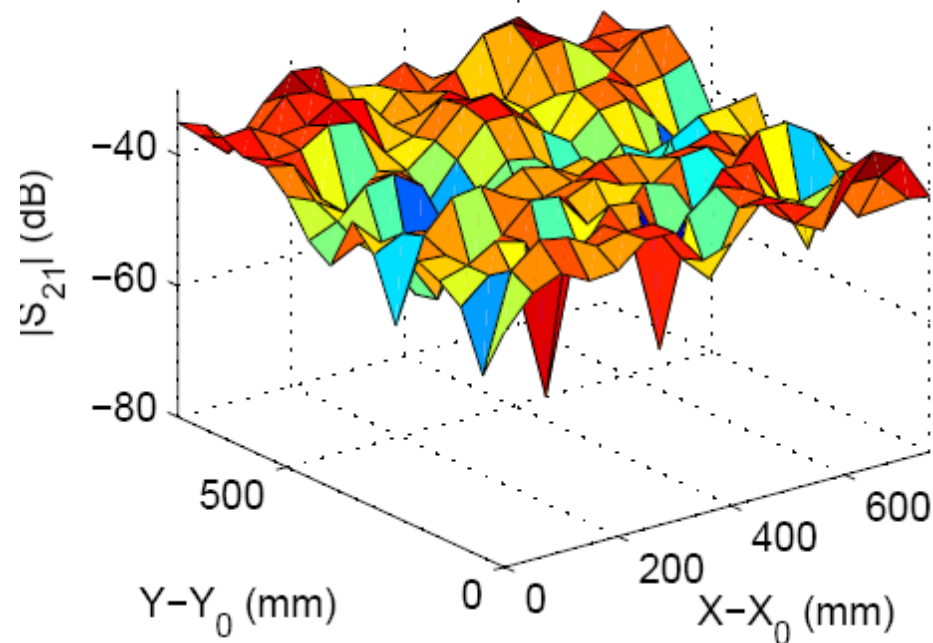
Oversampling: Application

GSM band (925 MHz)

$Z-Z_0 = 1300\text{mm}; f=925\text{MHz}$ ($\lambda/2 = 16.2\text{ cm}$) $Z-Z_0 = 1300\text{mm}; f=925\text{MHz}$



1 cm \times 1 cm cell size



5 cm \times 5 cm cell size

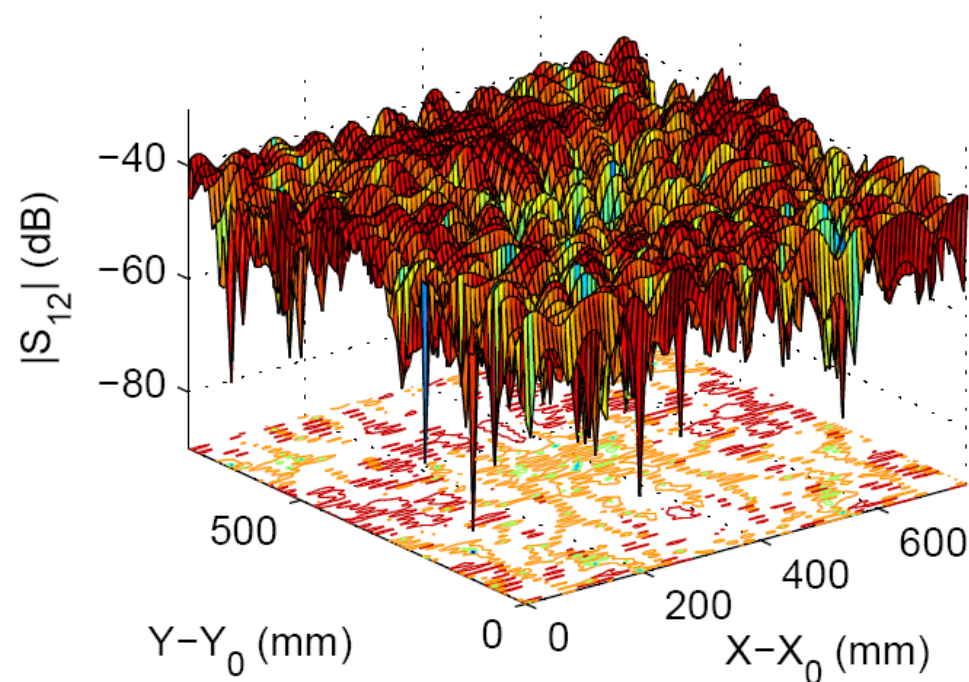
Oversampling: Application

ISM band (2450 MHz)

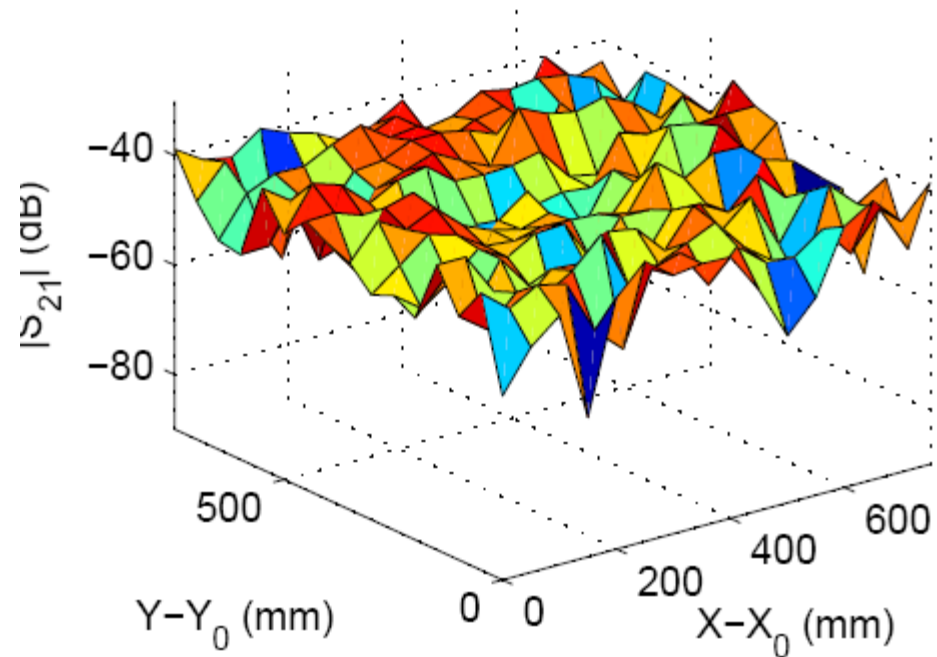
$Z-Z_0 = 1300\text{mm}$; $f=2450\text{MHz}$

$(\lambda/2 = 6\text{ cm})$

$Z-Z_0 = 1300\text{mm}$; $f=2450\text{MHz}$



1 cm × 1 cm cell size



5 cm × 5 cm cell size



Multi-Rate DSP

Undersampling

Nyquist Condition

- Alias-free (sub)sampling of (discrete) function

$$x_n(t) = x(t) \delta_{T_s}(t) = x(t) \sum_{k=-\infty}^{+\infty} \delta(t - kT_s) = \sum_{k=-\infty}^{+\infty} x(kT_s) \delta(t - kT_s)$$

- Spectrum (Fourier transformation): convolution

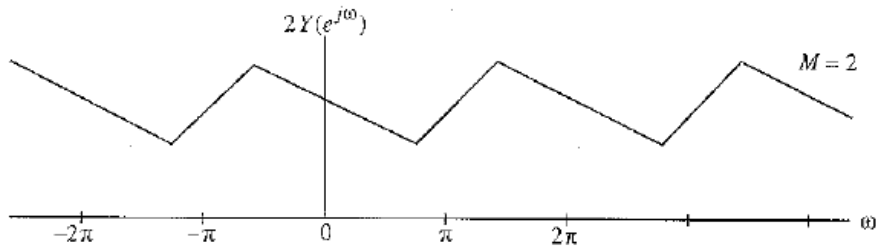
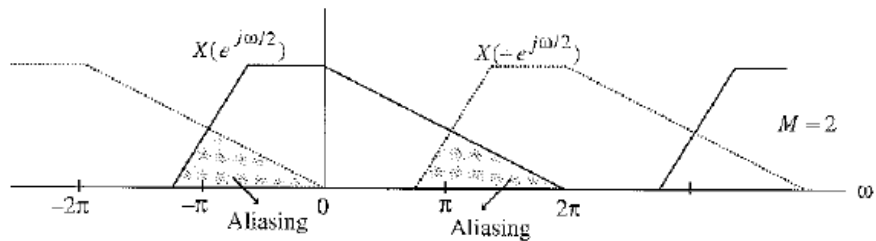
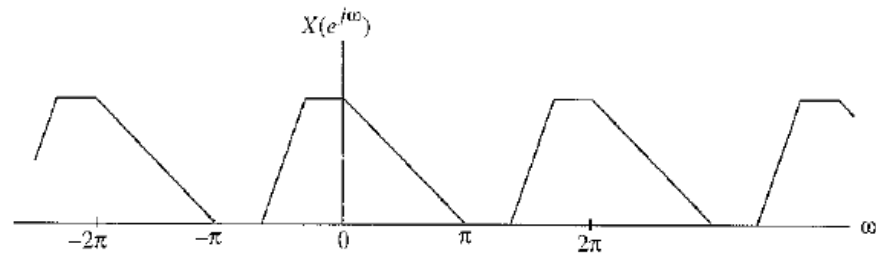
$$\begin{aligned} X_n(f) &= \int_{-\infty}^{+\infty} X(f - \varphi) \left[\frac{1}{T_s} \sum_{k=-\infty}^{+\infty} \delta(\varphi - kF_s) \right] d\varphi \\ &= \frac{1}{T_s} \sum_{k=-\infty}^{+\infty} \int_{-\infty}^{+\infty} X(f - \varphi) \delta(\varphi - kF_s) d\varphi \end{aligned}$$

Thus,

$$X_n(f) = \frac{1}{T_s} \sum_{k=-\infty}^{+\infty} X(f - kF_s)$$

- No spectral overlap (aliasing, stroboscopy) iff $F_s \geq 2F_B$

Undersampling: Aliasing



Undersampling: Baseband

- Shannon sampling theorem: $F_s \geq 2F_B$
 - Applies to baseband signals (DC-coupled): F_B is largest frequency component in signal
 - Motivation: avoid spectral overlap of baseband frequency responses that are periodically continued due to sampling operation
 - For bandpass (narrowband modulated) signals (e.g., radio- and optical communications, IF filters, etc.): condition is too conservative: large spectral gaps occur because $F_c \gg |F_B - F_c|$

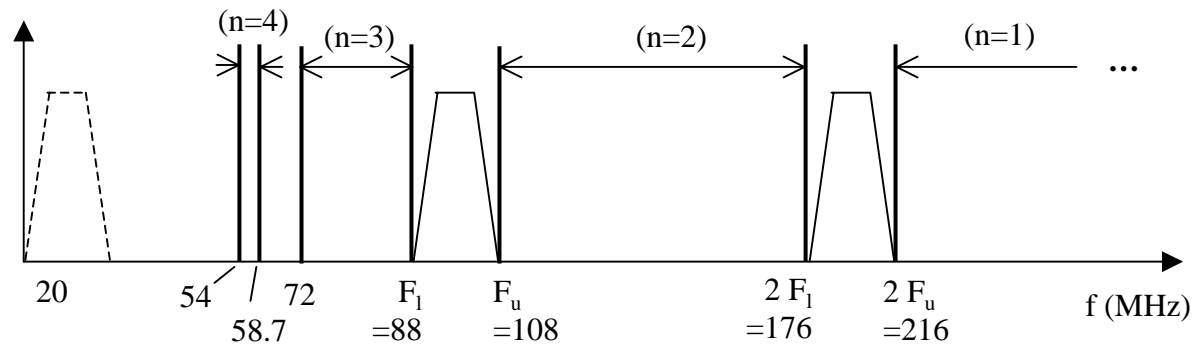
Undersampling: Bandpass

- Aliasing of bandpass signal is avoided if baseband can be folded periodically around carrier frequency without causing overlap
 - Range of permissible sample frequencies:
$$\frac{2F_u}{n} \leq F_s \leq \frac{2F_l}{n-1} \quad \text{i.e.,} \quad 1 \leq n \leq \left\lfloor \frac{F_u}{F_u - F_l} \right\rfloor$$
- Yields additional permissible lower sampling rates for narrowband signals without aliasing
 - Practically useful (slower computations)

Undersampling: Applications

Example 1: digitization of analogue FM audio

$F_l = 88 \text{ MHz}$, $F_u = 108 \text{ MHz} \Rightarrow 1 \leq n \leq 5$ (nonzero gap)



- $n=1$: classical (\geq Nyquist rate)
- $n=2$: between modulated ($I_u=1$) signal and doubled ($I_f=2$) signal
- $n=3$: $D_u=2/3$, $I_f=1$
- $n=5$: $43.2 \text{ MHz} \leq F_s \leq 44 \text{ MHz} \Rightarrow 86.4 \text{ MHz} \leq 2 \dots 2.5 F_s \leq 110 \text{ MHz}$



Multi-Rate DSP

Quadrature Mirror Filters for Subband Coding



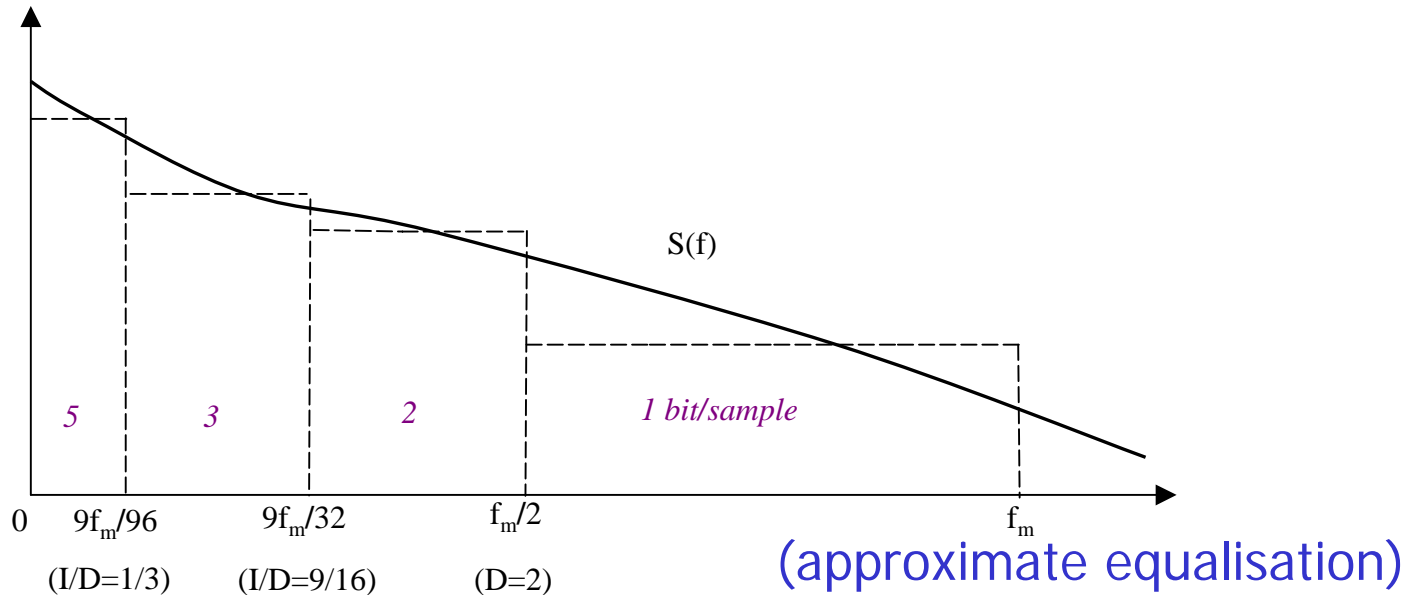
Subband Coding

- Problem statement:
 - Efficient transmission of realistic speech or video signals
 - Contain most energy at relative low frequencies (time/space)
 - Coding scheme to be tailored to assign more bits to LF band

- Solution:
 - *Subband coding:*
 - divide total frequency band in *unequal* subbands;
 - narrowest subband for interval with highest energy (equalization of *power* across band)
 - each subband is encoded separately
 - is alternative to companding (pre-distortion)

Subband Coding

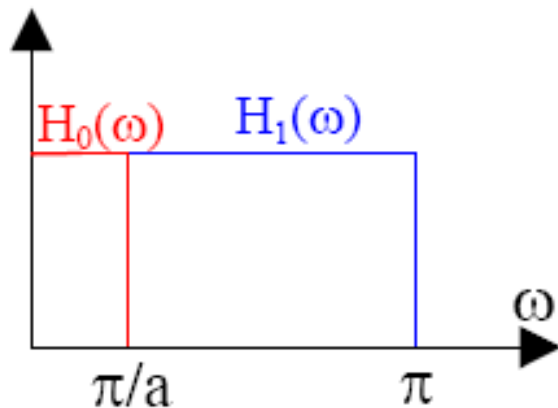
Example:



- Multi-rate conversion by factor $//D$ after each frequency subdivision (LPF/HPF)
- **Reduced bitrate** of digitized signal (bandwidth compression) due to nonuniform coding (variable number of bits per sample)

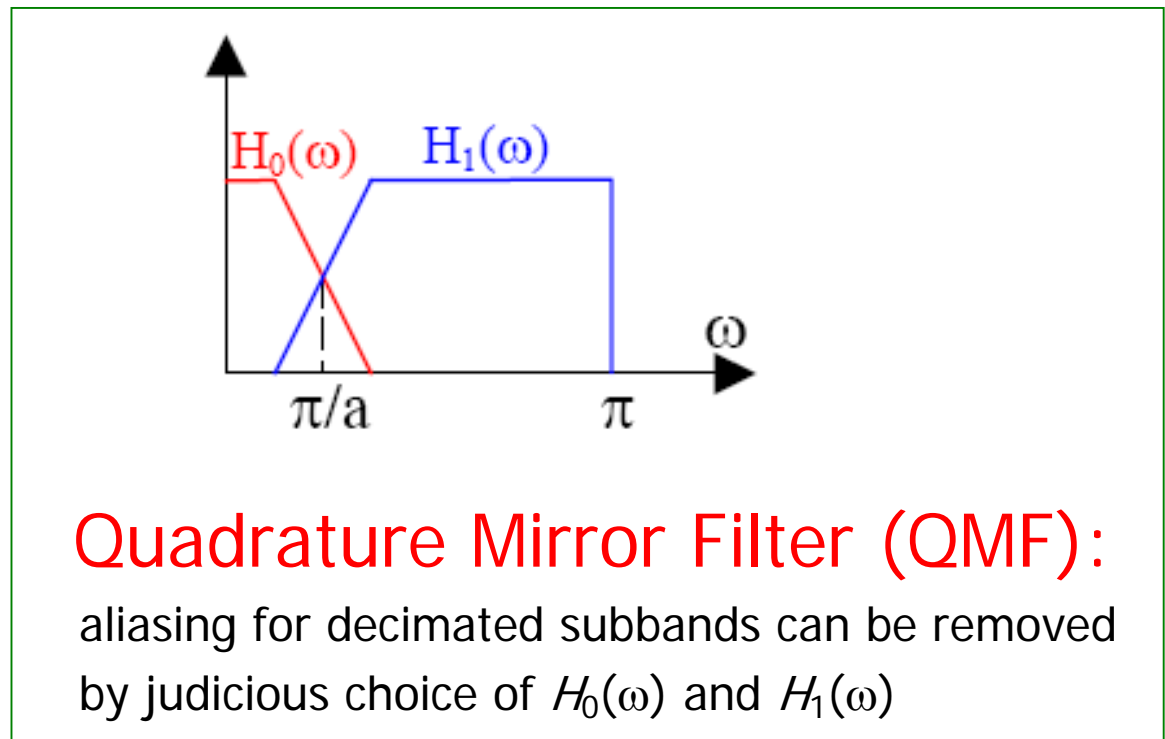
Subband Coding

■ Implementation:



Brickwall Filter:

Physically
unrealizable

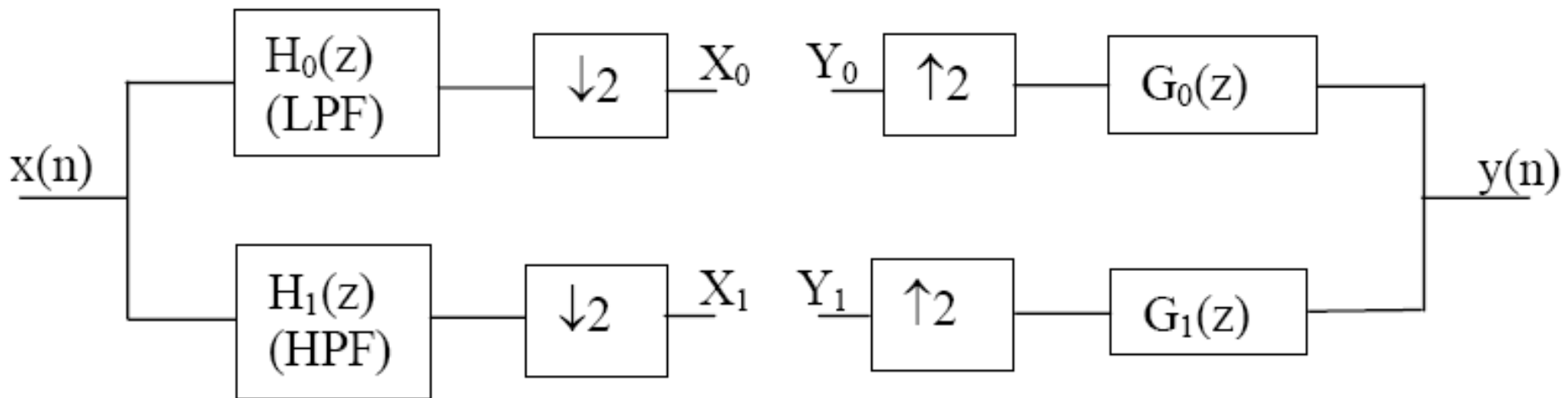


Quadrature Mirror Filter (QMF):

aliasing for decimated subbands can be removed
by judicious choice of $H_0(\omega)$ and $H_1(\omega)$

Two-Channel QMF

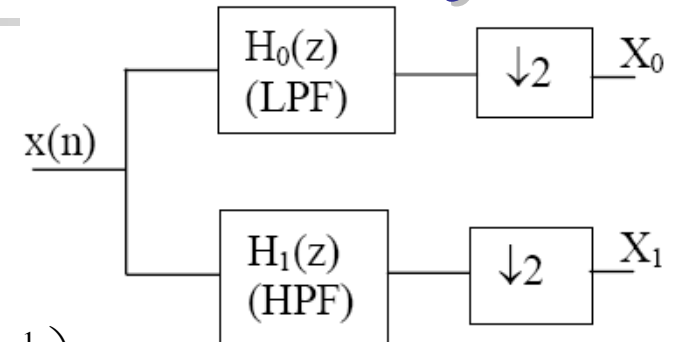
- Implementation (analyzer / synthesizer):



(for $I/D=1/2$)

Two-Channel QMF: Analysis

■ QMF Analyzer:



$$X_0(z) = \frac{1}{D} \sum_{k=0}^{D-1} H_0 \left(\exp \left(-\frac{j2\pi}{D} k \right) z^{\frac{1}{D}} \right) X \left(\exp \left(-\frac{j2\pi}{D} k \right) z^{\frac{1}{D}} \right), \quad D = 2$$

$$\Rightarrow X_0(\omega) = \frac{1}{2} \left[H_0 \left(\frac{\omega}{2} \right) X \left(\frac{\omega}{2} \right) + H_0 \left(\frac{\omega}{2} - \pi \right) X \left(\frac{\omega}{2} - \pi \right) \right]$$

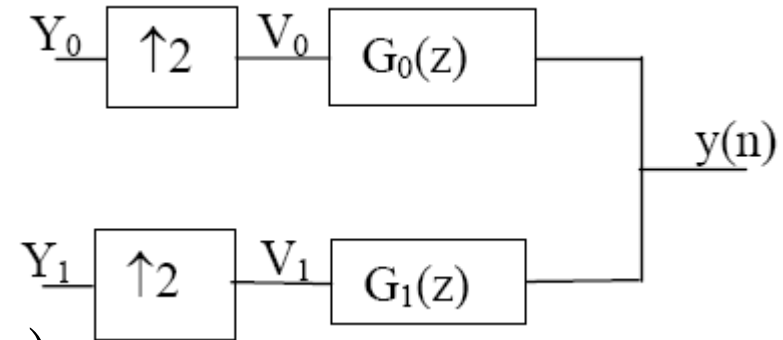
$$X_1(\omega) = \frac{1}{2} \left[H_1 \left(\frac{\omega}{2} \right) X \left(\frac{\omega}{2} \right) + H_1 \left(\frac{\omega}{2} - \pi \right) X \left(\frac{\omega}{2} - \pi \right) \right]$$

Two-Channel QMF: Synthesis

- QMF Synthesizer:

$$V_0(z) = Y_0(z^I), \quad I = 2$$

$$\Rightarrow Y(\omega) = G_0(\omega)Y_0(2\omega) + G_1(\omega)Y_1(2\omega)$$



- Cascaded QMF analyzer-synthesizer:

$$Y_0(\omega) = X_0(\omega), \quad Y_1(\omega) = X_1(\omega) \quad \Leftrightarrow$$

Aliasing ($k=1$)

$$Y(\omega) = \frac{1}{2} [H_0(\omega)G_0(\omega) + H_1(\omega)G_1(\omega)]X(\omega) + \frac{1}{2} [H_0(\omega - \pi)G_0(\omega) + H_1(\omega - \pi)G_1(\omega)]X(\omega - \pi)$$

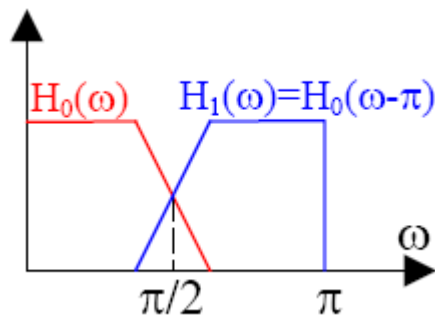
QMF Anti-Aliasing

- Elimination of aliasing for any input signal:

$$H_0(\omega - \pi)G_0(\omega) + H_1(\omega - \pi)G_1(\omega) = 0$$

e.g. $G_0(\omega) = H_1(\omega - \pi), \quad G_1(\omega) = -H_0(\omega - \pi)$

- results in time-*invariant* filter
- example: alias-free symmetric subband coding



$$G_0(\omega) = H_0(\omega), \quad G_1(\omega) = -H_0(\omega - \pi)$$

QMF Perfect Reconstruction

- Distortion-free & alias-free reconstruction:

$$H_0(\omega)G_0(\omega) + H_1(\omega)G_1(\omega) = D \exp(-jk\omega), \quad D = 2$$

$$\Leftrightarrow H_0(\omega)H_1(\omega - \pi) - H_1(\omega)H_0(\omega - \pi) = D \exp(-jk\omega)$$

- Example: symmetric subband

$$H_0^2(\omega) - H_0^2(\omega - \pi) = D \exp(-jk\omega)$$

i.e., $|H_0^2(\omega) - H_0^2(\omega - \pi)|$ independent of ω (**all-pass filter**), but may exhibit phase distortion!

- It can be shown: linear-phase FIR QMF causes amplitude distortion

M-Channel QMF Bank

- M branches; $\downarrow M$ in analyzer, $\uparrow M$ in synthesizer
- Output k^{th} analyzer branch (BPF + D):

$$X_k(z) = \frac{1}{M} \sum_{m=0}^{M-1} H_k \left(z^{1/M} \exp \left(-j \frac{2\pi m}{M} \right) \right) X \left(z^{1/M} \exp \left(-j \frac{2\pi m}{M} \right) \right), \quad (M = D)$$

- Output synthesizer (I + BPF): $Y(z) = \sum_{k=0}^{M-1} G_k(z) Y_k(z^M)$

$$\Rightarrow Y(z) = \sum_{k=0}^{M-1} G_k(z) \left[\frac{1}{M} \sum_{m=0}^{M-1} H_k \left(z \exp \left(-j \frac{2\pi m}{M} \right) \right) X \left(z \exp \left(-j \frac{2\pi m}{M} \right) \right) \right]$$

$$= \sum_{m=0}^{M-1} L_m(z) X \left(z \exp \left(-j \frac{2\pi m}{M} \right) \right), \quad L_m(z) = \frac{1}{M} \sum_{k=0}^{M-1} H_k \left(z \exp \left(-j \frac{2\pi m}{M} \right) \right) G_k(z)$$

M-Channel QMF

- Alias-free QMF:

$$Y(\omega) = L_0(\omega) X(\omega) \quad \text{iff} \quad \sum_{m=1}^{M-1} L_m(z) X\left(z \exp\left(-j \frac{2\pi m}{M}\right)\right) = 0, \quad \forall X(z)$$

$$\text{i.e.} \quad \boxed{L_m(z) = 0, \quad 1 \leq m \leq M-1}$$

- Distortion-free & alias-free QMF:

$|L_0(\omega)|$ independent of ω (all-pass filters)