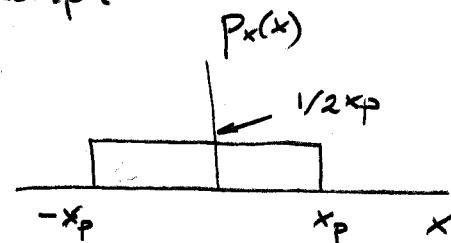
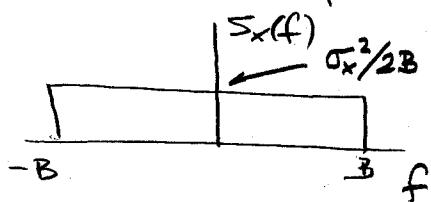


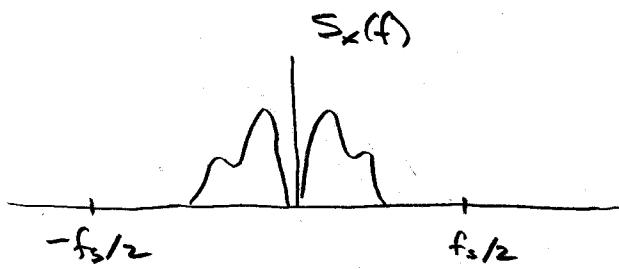
4.4 Companding, DPCM and Delta Modulation

- So far, we have considered only the most straightforward way of sending an analog signal as digital:
 - sample at Nyquist rate
 - convert each sample with a linear (i.e. uniform) AD

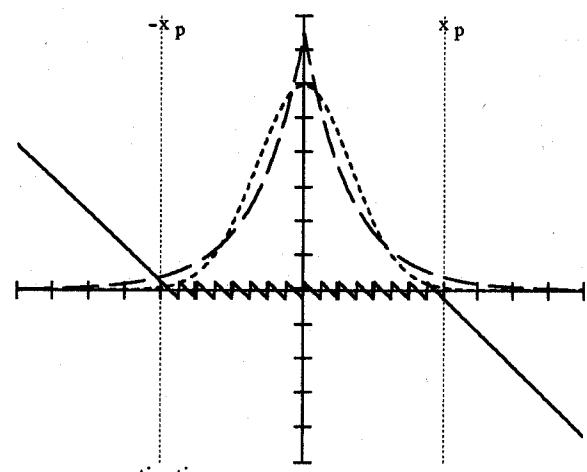
This is good for samples from a white (flat) process with a uniform pdf for each sample



but it's not real life, which is more like



Not flat, sampled
faster than Nyquist rate



Uniform Quant., 3 Bits, 3 Sigma Loading

These factors allow us to send the signal with fewer bits, while maintaining equivalent quality. Therefore:

- less bandwidth expansion
- more energy per bit if same transmit power

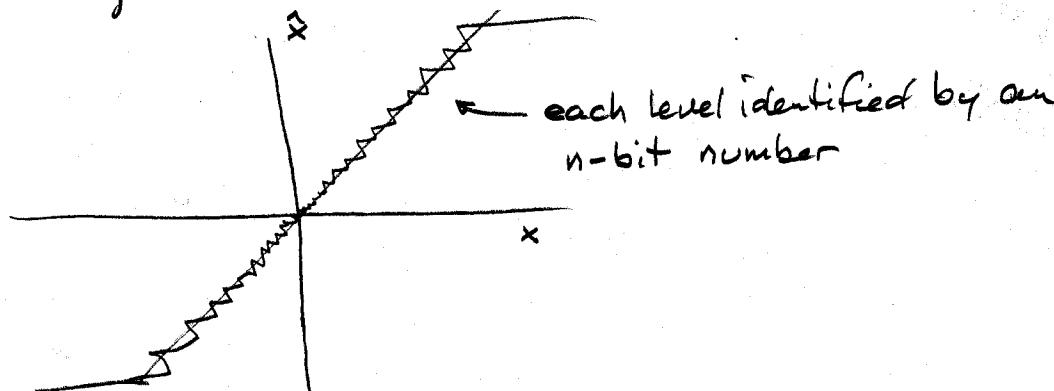
Non-Uniform Quantization (Companding)

P+S 4.6.1

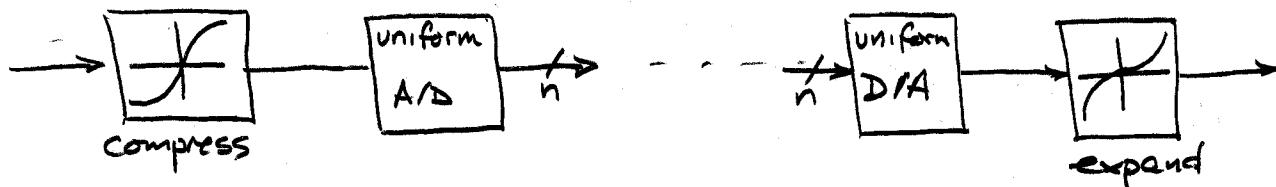
- Problem in linear (non-uniform) quantizer:
 - step size large enough to minimize overload error is too coarse at small amplitudes, even when loading factor α_x/x_p is optimized

Solution:

- make step size proportional to amplitude in a logarithmic scale

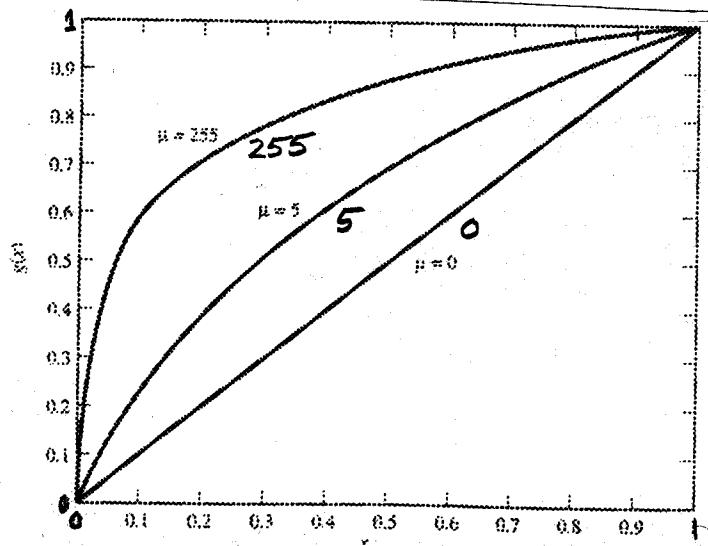


- It is implemented by "companding"



compression : $g(x) = \frac{\log(1+\mu|x|)}{\log(1+\mu)} \operatorname{sgn}(x), |x| \leq 1$
 μ law
 (usually $\mu=255$)
 ie. $|x/x_p| \leq 1$

compression : $g(x) = \begin{cases} \frac{1 + \ln(A|x|)}{1 + \ln(A)} \operatorname{sgn}(x), & \frac{1}{A} \leq |x| \leq 1 \\ \frac{A|x|}{1 + \ln(A)} \operatorname{sgn}(x) & 0 \leq |x| < \frac{1}{A} \end{cases}$
 A law
 (usually $A=87.5$)



μ law compression $g(x)$

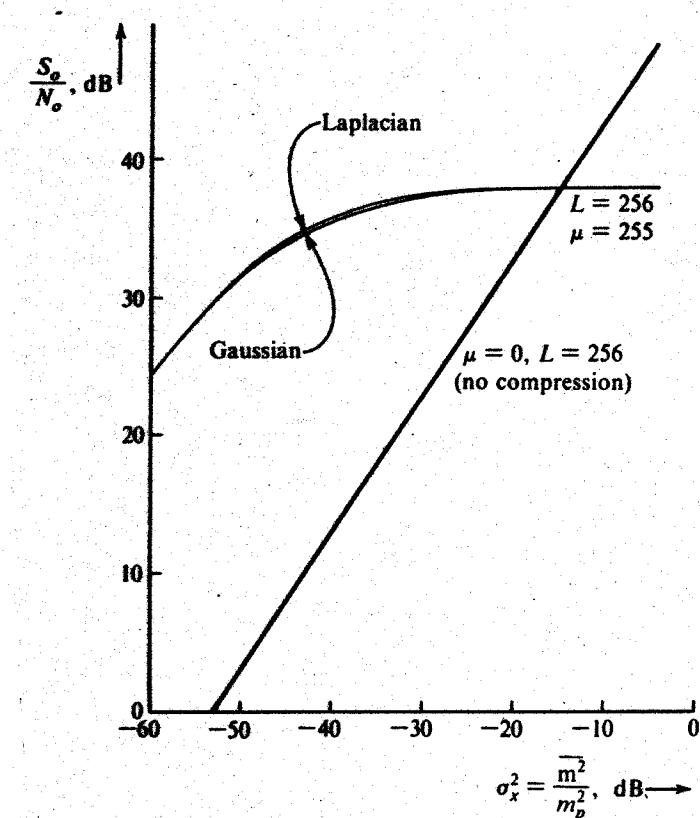


Figure 6.17 PCM performance with and without companding.

(from Hathi)

- Performance improvement :

- 8-bit μ -law ($\mu = 255$) usually considered to be subjectively equivalent to 12-bit uniform
- standard PCM in NA is 7 bits, $\mu = 255$. Companding improves performance by about 24 dB.

Differential PCM

P+S 4.6.2

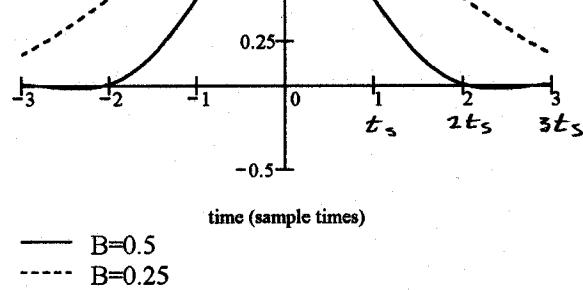
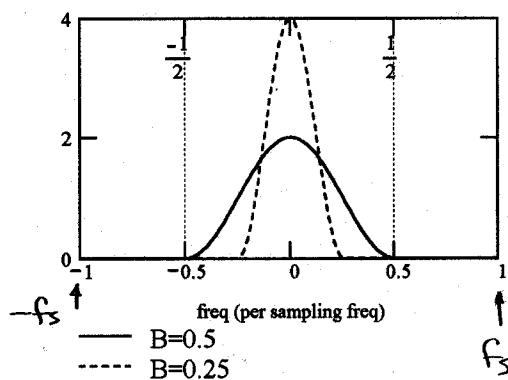
4.4.4

- When the input spectrum is not flat, successive samples become correlated. Here's an example.

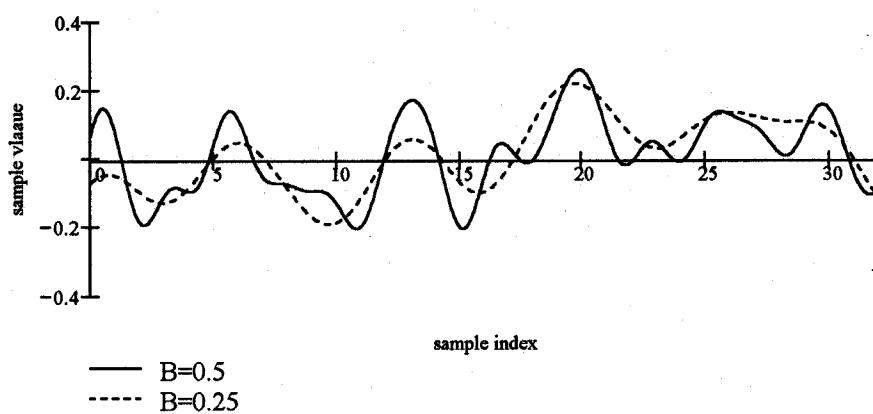
A special case of the raised cosine spectrum. Here the bandwidth is selected to be a fraction of the sampling frequency B/f_s .

$$S_X(f, B) := \frac{1}{2 \cdot B} \left(1 + \cos\left(\pi \frac{f}{B}\right) \right) \cdot (|f| \leq B)$$

$$R_X(t, B) := \frac{\sin(\pi \cdot t \cdot B) \cdot \cos(\pi \cdot t \cdot B)}{\pi \cdot B \cdot t \cdot (1 - 4 \cdot t^2 \cdot B^2)}$$



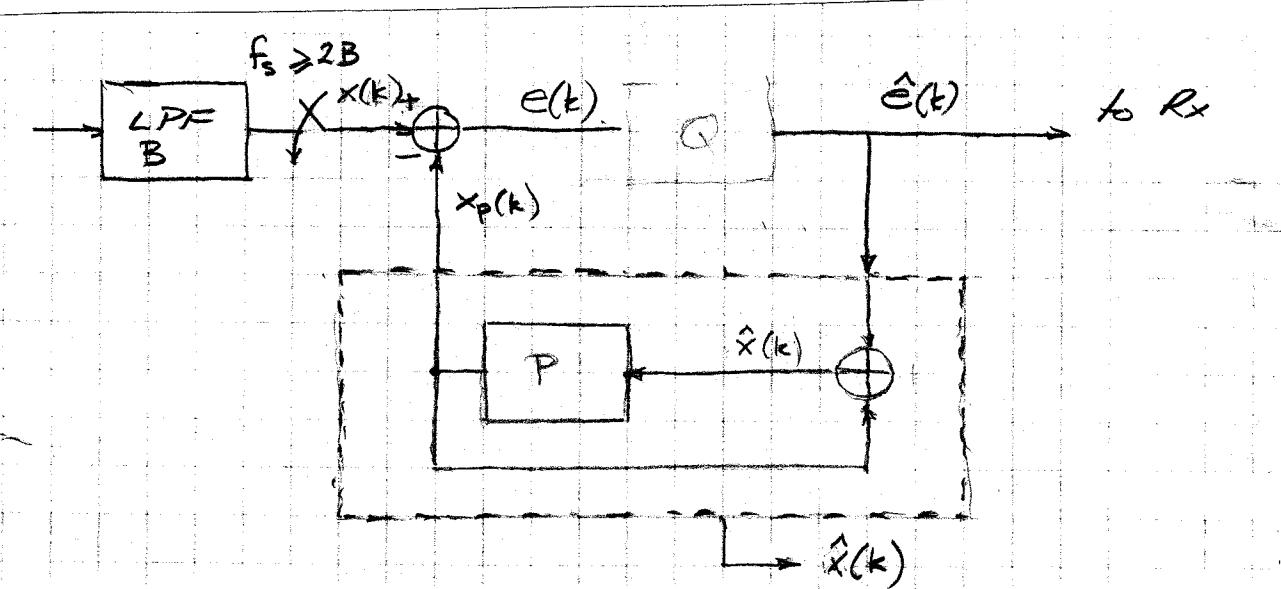
Autocorrelation Function



Typical Sample Functions

Two Different Filters, same white noise Input

- To reduce the number of bits needed, predict the value of the sample from the previous samples. The receiver can do this, too, so just quantize and send the prediction error — it has lower variance than the sample.



- Principles:**
 - The quantizer can be uniform or compounded.
 - Given a prediction $x_p(k)$, the sample itself is just $x(k) = x_p(k) + e(k)$ or $\hat{x}(k) = x_p(k) + \hat{e}(k)$ (Rx version)
 - The prediction is based on samples reconstructed from the quantized $\hat{e}(k)$, so that Tx and Rx don't drift apart.
 - Rx is a direct copy of the dotted box above.
 - Because prediction error variance σ_e^2 is smaller than σ_x^2 , we can use fewer bits in quantizer to get same quality of $\hat{x}(k)$ or more quality with same number of bits.

- The predictor can take a variety of forms:

- zero order predictor $x_p(k) = \hat{x}(k-1)$

- first order predictor $x_p(k) = \frac{R_x(t_s)}{R_x(0)} \hat{x}(k-1)$

- two point or higher predictor

$$x_p(k) = a_1 \hat{x}(k) + a_2 \hat{x}(k-2) + \dots + a_n \hat{x}(k-n)$$

Coefficients selected to minimize conditional variance
(mean squared error) of prediction error.

"Yule-Walker equations"

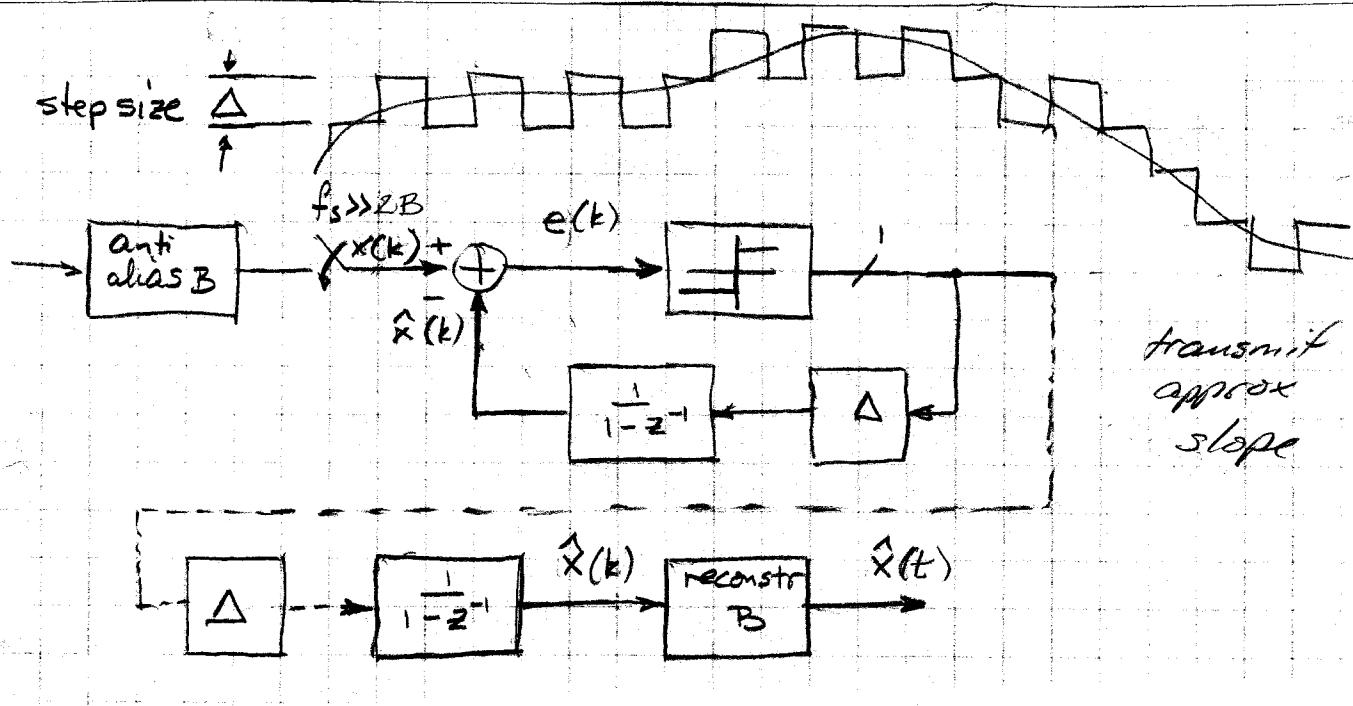
- DPCM is widely used for coding speech

Delta Modulation

P+S 4.6.3

4.4.7

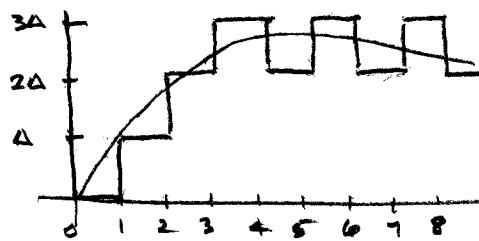
- In the same spirit as DPCM, we encode sample-to-sample differences — but we sample much faster than Nyquist and use only a 1-bit (two-level) quantizer. The result is a staircase-like approximation.



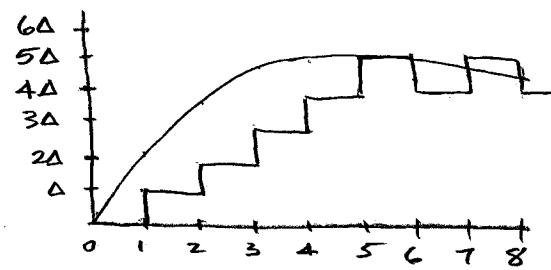
Note coder generates a replica of the signal reconstructed by the decoder (ignoring channel errors), as in DPCM

ΔM gives "toll quality" (64 kb/s PCM quality) at 32 kb/s.

- Choice of step size Δ is important:



Δ too large: coarse representation, especially in low slope and dithering regions



Δ too small: slope overload.

- Adaptive Δ mod adjusts the step size in response to changes in slope. The principle again: the coder and decoder both base adaptation on the transmitted signal in order not to drift apart,

