DCT Based, Lossy Still Image Compression



NOT a JPEG artifact !



"Lenna", Playboy Nov. 1972

Lena Soderberg, Boston, 1997

Nimrod Peleg

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Image Compression: List of Topics

- Introduction to Image Compression (DPCM)
- Image Concepts & Vocabulary
- JPEG: An Image Compression System
- Basics of DCT for Compression Applications
- Basics of Entropy Coding
- JPEG Modes of Operation
- JPEG Syntax and Data Organization
- H/W Design Example (Based on Zoran Chip)
- JOEG-LS: A Lossless standard
- JPEG2000: A Wavelets based lossy standard

Image Compression: List of Topics (Cont'd)

- Other Compression techniques:
 - FAX (Binary Image Compression)
 - G3 / G4 Standards
 - JBIG Standard
 - Context based lossless compression
 - Wavelets Based Compression
 - Pyramidal Compression
 - Fractal Based Image Compression
 - BTC: Block Truncation Coding
 - Morphological Image Compression

Image Compression Standards

- G3/G4
- JBIG
- JPEG
- JPEG-LS
- JPEG2000

Binary Images (FAX)FAX and DocumentsStill Images (b/w, color)Lossless, LOCO basedLossy, Wavelets based

Introduction to Still Image Compression: DCT and Quantization



~5KB, 50:1 compression ratio

The Need for Compression

Still Image:

• B&W: 512x512x8 = 2Mb

• True Color: 512x512x24 = 6Mb

FAX, **Binary** A4 DOC,
1728 pel/line, 3.85line/mm = 2Mb







Compression Techniques

• <u>Lossless</u>

Decompressed image is <u>exactly</u> the same as original image

• <u>Lossy</u>

Decompressed image is as close to the original as we wish

 \approx





Lossless Compression

- Define the amount of information in a symbol
- <u>Define Entropy</u> of an image:

"Average amount of information"

- Make a new representation, which needs less bits in average
- Make sure you can go back to original...



Known Lossless Techniques

- <u>Huffman Coding</u>
- <u>Run-Length</u>

Coding of strings of the same symbol

• Arithmetic (IBM)

Probability coding

• <u>Ziv-Lempel (LZW)</u>

Used in many public/commercial application such as ZIP etc...

Lossless Features

- Pro's:
 - No damage to image (Medical, Military ...)
 - Easy (?) to implement (H/W and S/W)
 - Option for progressive
 - ease of use (no needs for parameters)
- Con's:
 - Compression ratio 1:1 2:1
 - Some are patented ...

Lossy Compression : Why ?!

• More compression

Up to an acceptable* damage to reconstructed image quality.

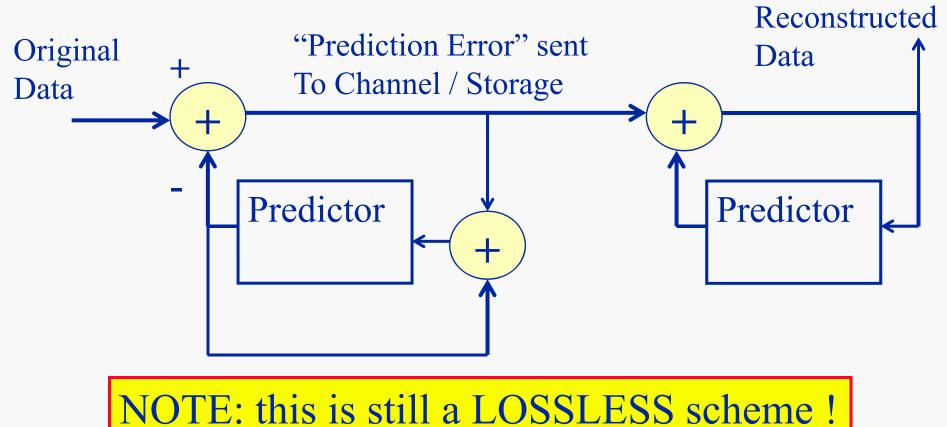


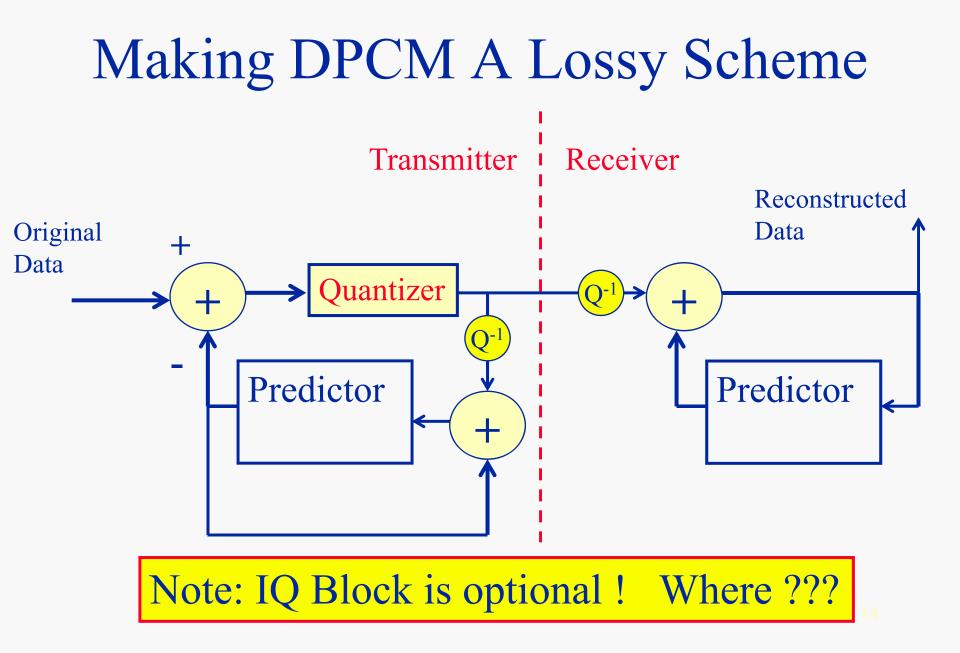
* "Acceptable": depends on the application...

• <u>Objective criterion:</u> PSNR, but the human viewer is more important...

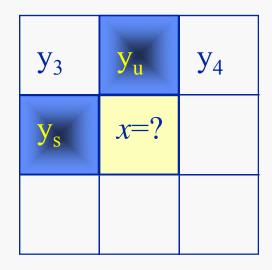
Lossy Compression (Cont'd) Image Quality, Subjective Criterion – MOS: - Goodness Scale: - Impairment Scale: Not Noticeable Excellent (1)(5)Just Noticeable Good (4)(2)Fair (3)Poor (2)Definitely Objectionable (6) Unsatisfactory (1)Extremely Objectionable (7)

Basic DPCM Scheme





Linear Predictor



• Casual predictor:

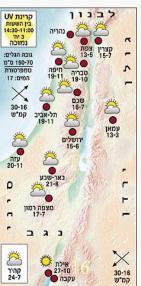
 $x = h_1 y_s + h_2 y_u + h_3 y_3 + h_4 y_4 + \dots$

Adaptive Prediction

- Predictor coefficients change in time.
- Adaptation e.g. : the LMS method
- Higher order predictors can be used



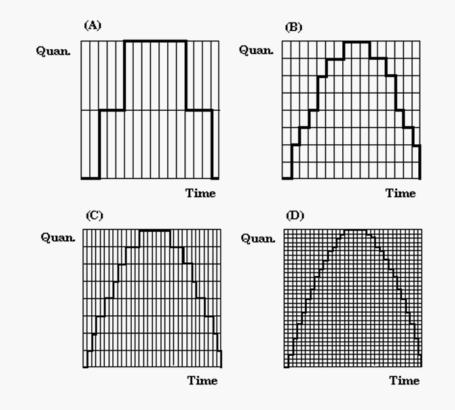




Quantization

Compression is achieved by Quantization of the un-correlated values (frequency coefficients)

<u>Quantization</u> is the ONLY reason for both compression and loss of quality !

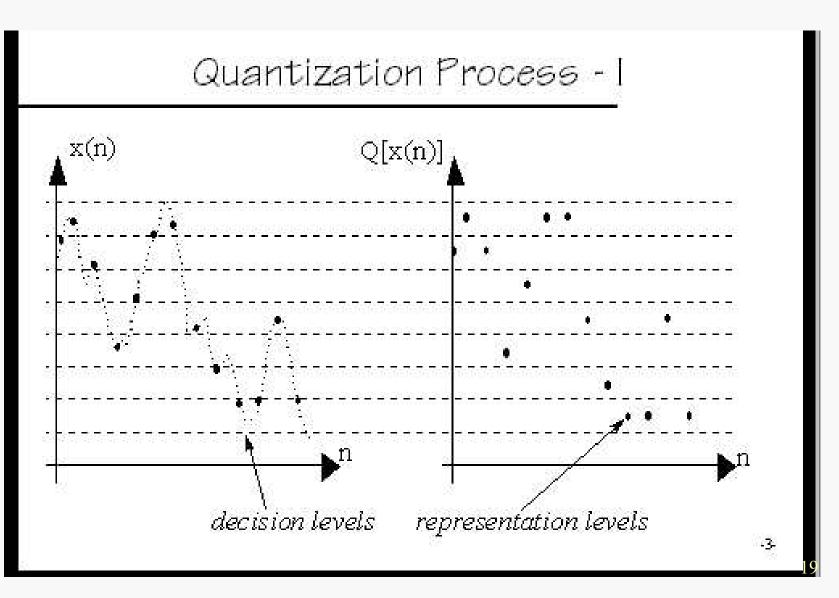


What is Quantization ?

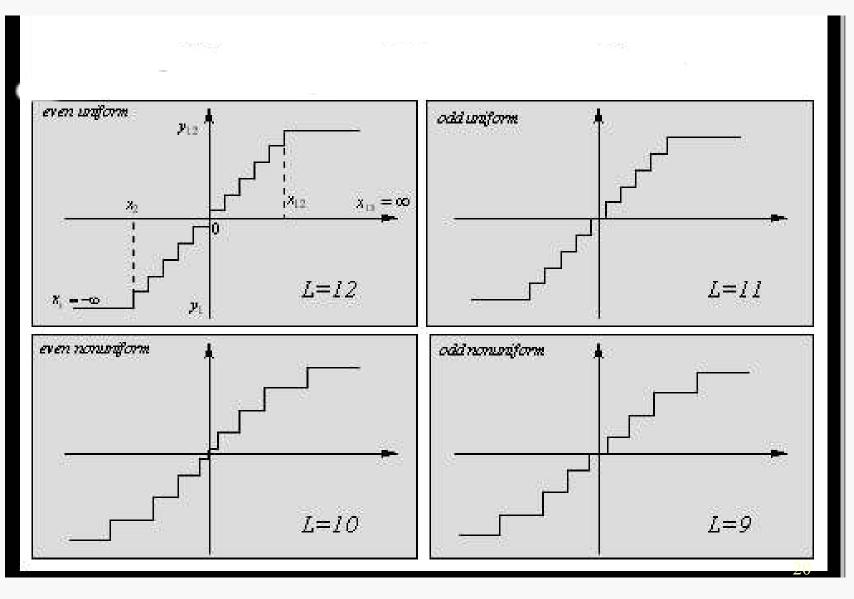
Mapping of a continuous-valued signal value x(n) onto a limited set of discrete-valued signal y(n): y(n) = Q [x(n)]
such as y(n) is a "good" approximation of x(n)

- y(n) is represented in a limited number of bits
- <u>Decision levels</u> and <u>Representation levels</u>

Decision levels Vs. Representation levels



Typical Quantizers - II



Quantization Noise

• Define Signal to Noise Ratio (SNR):

$$SNR = 10 \log_{10} \left(\frac{\sigma_s^2}{\sigma_n^2} \right) = 10 \log_{10} \left(\frac{\sum_{i} \sum_{j} (s_{ij} - E_s)^2}{\sum_{i} \sum_{j} (n_{ij} - E_n)^2} \right)$$

$$PSNR = 10 \log_{10} \frac{(2^n - 1)^2}{MSE}$$

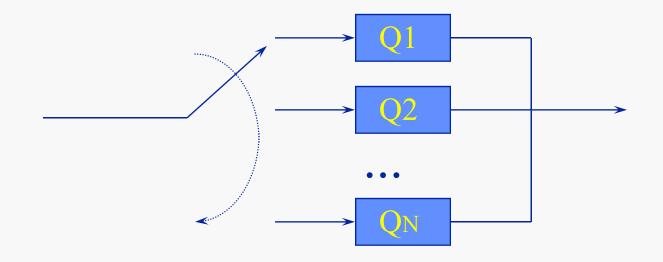
Optimal Non-Uniform Quantizer

• <u>Max-Lloyd Quantizer</u>:

Iterative algorithm for optimal quantizer, in the sense of minimum MSE

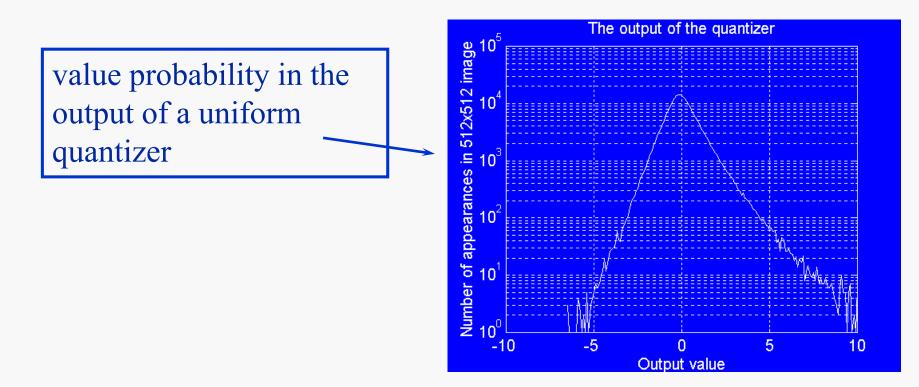


Adaptive Quantizer



• Change of Delta , Offset, Statistical distribution (Uniform/Logarithmic/...) etc.

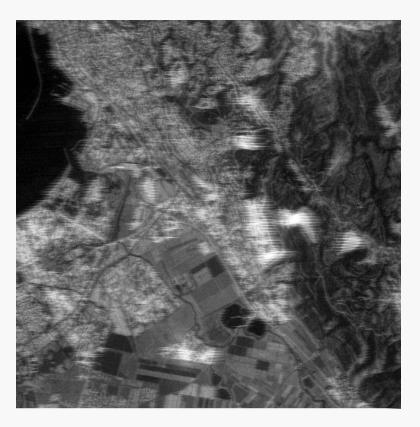
Laplacian Quantizer



• For Natural Images !

Uniform Quantizer, simple predictor (2bpp, 22dB)







Reconstructed

Laplacian-Adaptive (2-4-6 levels) Quantizer, Adaptive, second order predictor (2bpp, 26.5dB)



Lossy Compression (Cont'd)

• Transform Coding :

Coefficients can be quantized, dropped and coded causing a <u>controlled damage</u> to the image.

Possible Transforms:

KLT, DFT, DCT, DST, Hadamard etc.

• <u>Mixed</u> Time-Frequency presentations e.g.: Gabor, Wavelets etc...

Transform Coding (Cont'd)

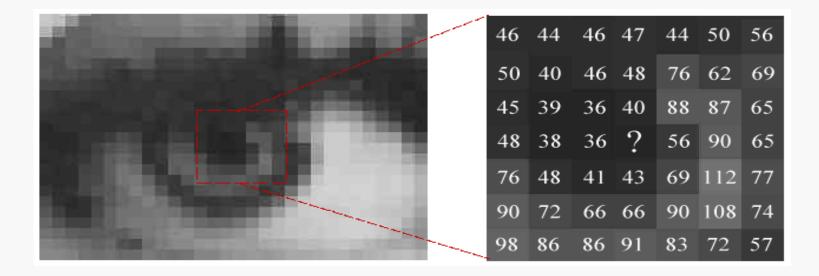
Transform Coding Technique:

- 1. Split the $K_1 x K_2$ image into M NxN^{*} blocks
- 2. Convert each NxN correlative pixels (Block) to un-correlative NxN values
- 3. Quantize and Encode the un-correlative values

* The NxN nature is a convention, but there are non-square transforms !

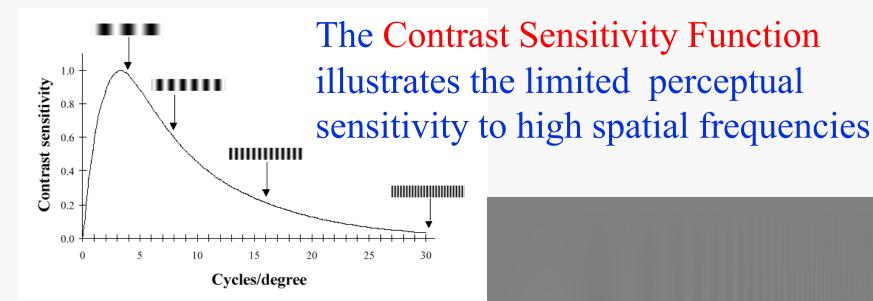
The "Small Block" Attitude

- What is the value of the missing pixel? (It is 39)
- How critical is it to correctly reproduce it?



Spatial Redundancy & Irrelevancy

What About the Contrast?



Visual Masking



distortion in smooth area



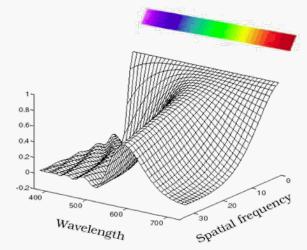
distortion in busy area



Images and Human Vision

"Natural" images are

- Spatially redundant
- Statistically redundant



Human eyes are

Chromatic Modulation Transfer Function

- Less sensitive to high spatial frequencies
- Less sensitive to chromatic resolution
- Less sensitive to distortions in "busy" areas

So?

- Lets go to "small blocks"
- JPEG, MPEG : 8x8 Pixels Basic blocks for the transform

