

$$\rightarrow R_D = 1 - \frac{1}{C_R}$$

↳ Compression Ratio

→ Spatial → Interpixel → Pixels are correlated

$$f \otimes g = \int_{-\infty}^{\infty} f(x) g(x+a) da$$

↳ Auto correlation: $f(x) = g(x)$

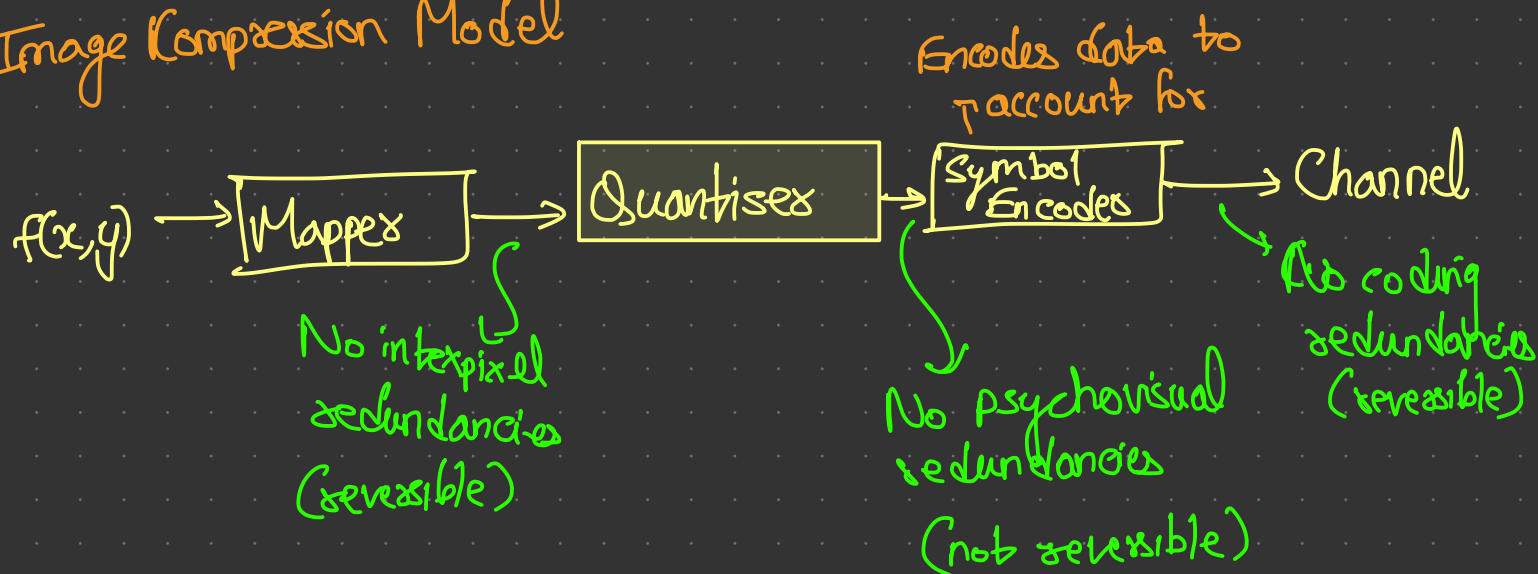
→ Psychovisual → Visual / Perceptual redundancy

→ Shannon's Theorem:

→ Provides lower bound on bit rate for encoding statistically independent symbols

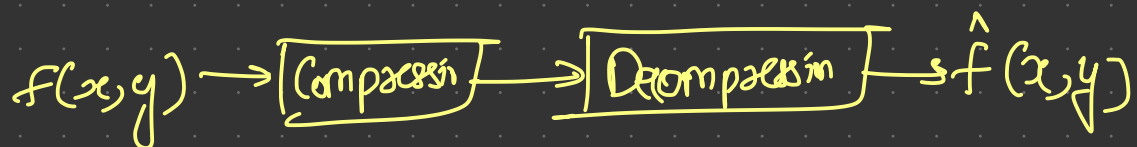
→ For finite markov, this may not hold as we can leverage on the redundancies

Image Compression Model





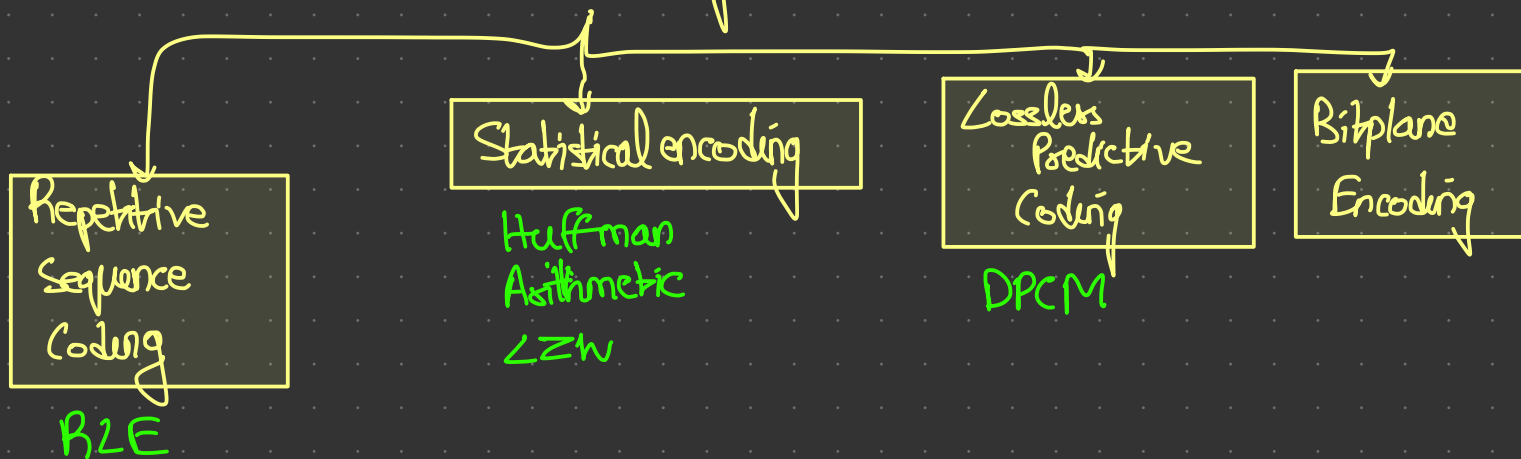
Lossless Compression



$$e(x, y) = \hat{f}(x, y) - f(x, y)$$

Taxonomy of lossless methods

Lossless coding techniques



Huffman Encoding [Addresses coding redundancy]

- \rightarrow Variable length coding technique
- \rightarrow Source symbols encoded one at a time
- \rightarrow Optimal code - Minimise code word length per source symbol

Forward Pass

- \rightarrow Sort prob. per symbol
- \rightarrow Combine two lowest
- \rightarrow Repeat step 2 till only 2 probs remain

Backward Pass

- \rightarrow Assign code symbols going backwards

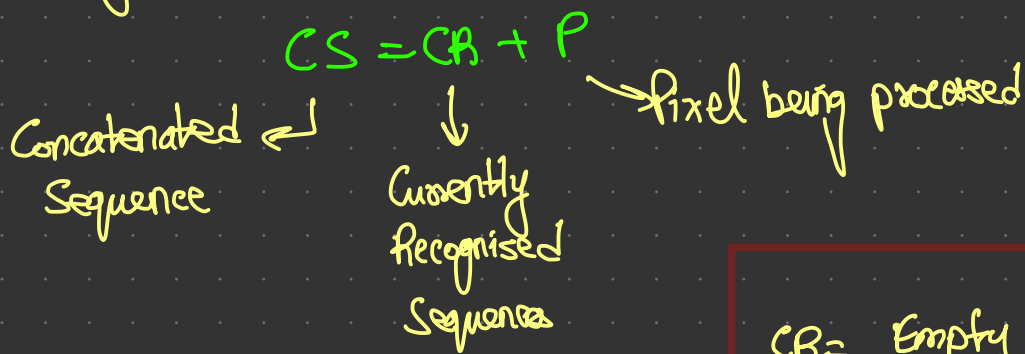
→ Implemented using lookup table to do decoding unambiguously

Arithmetic (Range) Coding

- No one-one correspondence
- Slower than Huffman
- Better compression than Huffman
- Sequence assigned to subinterval in $[0, 1)$ represented by arithmetic code
 - ↳ Interval reduces with increase in number of symbols in message

LZW Coding

- Codebook (dictionary) needs to be constructed
- Initially first 256 entries are assigned directly



→ Dictionary can be built as we go through sequence [real time]

```
CR = Empty
repeat
  P = Next pixel
  CS = CR + P
  IF CS is found,
    (1) No output
    (2) CR = CS
  Else:
    (1) Output D(CR)
    (2) Add CS to D
    (3) CR = P
```

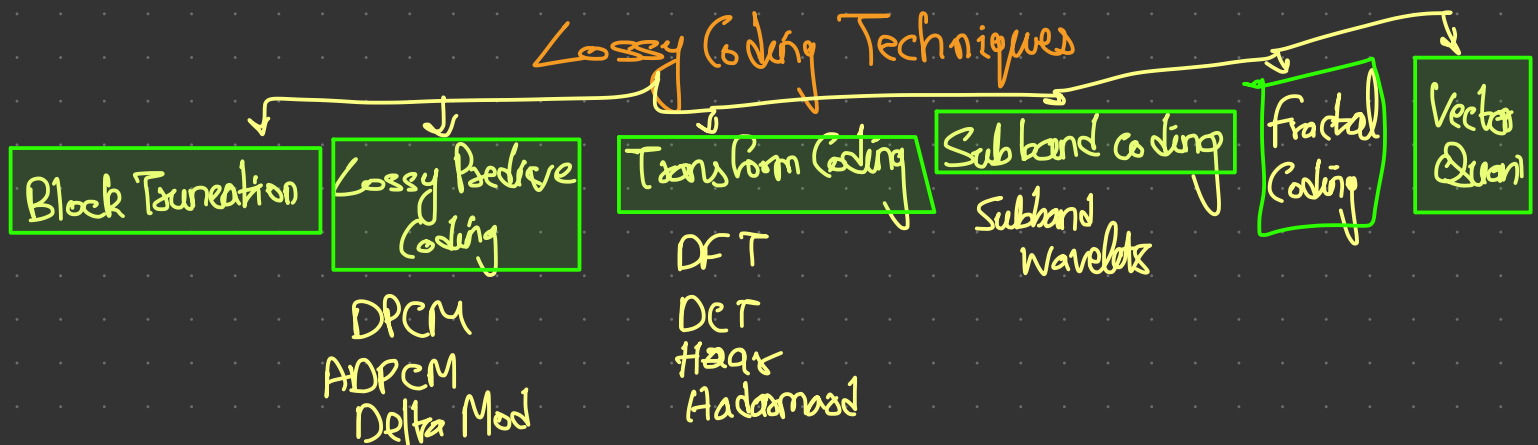
Run-length coding (Interpixel address)

- Reduce size of repeated strings of symbols
- Encode a run of symbols into 2 bytes (symbols, count)
- Can compress any type of data

Bit Plane Coding

- Process each bit plane individually
 - ↳ Decompose into series of binary image
 - ↳ Compress each binary image (using eg run-length)

Lossy Coding Techniques



Transform the image into some other domain to reduce interpixel redundancy.

- Do quant. in forward transform

→ Fourier Transform

Suppresses high freq. coeff in freq. domain

Types of transforms:

→ DFT

→ DCT (Discrete Cosine Transform)

→ KLT (Karhunen-Loeve Transform)

DCT performs better and has a better RMS error in comparison to DFT

DCT minimises blocking artifacts

DCT → 2n-point periodicity
n-point periodicity

JPEG compression

