

Any Differences?

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Motivation towards Compression

- Digital images require huge amounts of space for storage and large bandwidths for transmission.
 - A 640 x 480 color image requires close to 1MB of space.
- Calculate the space required for a SD (Standard Definition 720 * 480) movie of 2 hours running at 30 fps...!! (Answer = 224 GB)
- Imagine how movies came in two CD's / DVD's of very less size than required 224 GB size...?

Motivation Continued...

- Have you checked the size of any image when its clicked by your camera and compared it to the ones you share on social media...?
- Imagine the network congestion if all images shared over Whatsapp or any social media did not have any provision for compression.
- What would have been the cost of data transmission then?

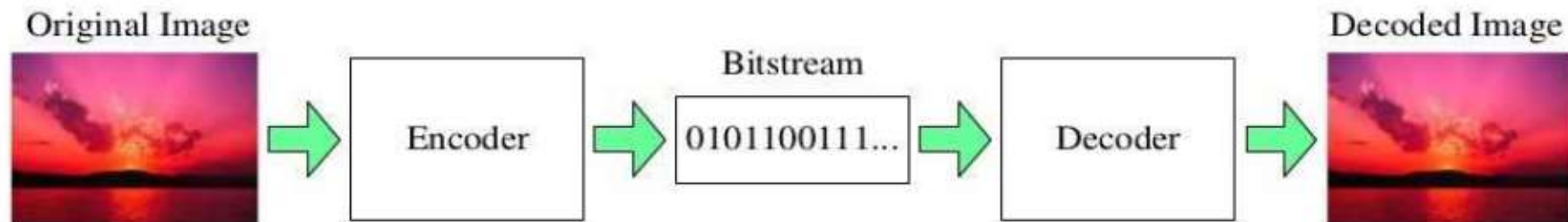
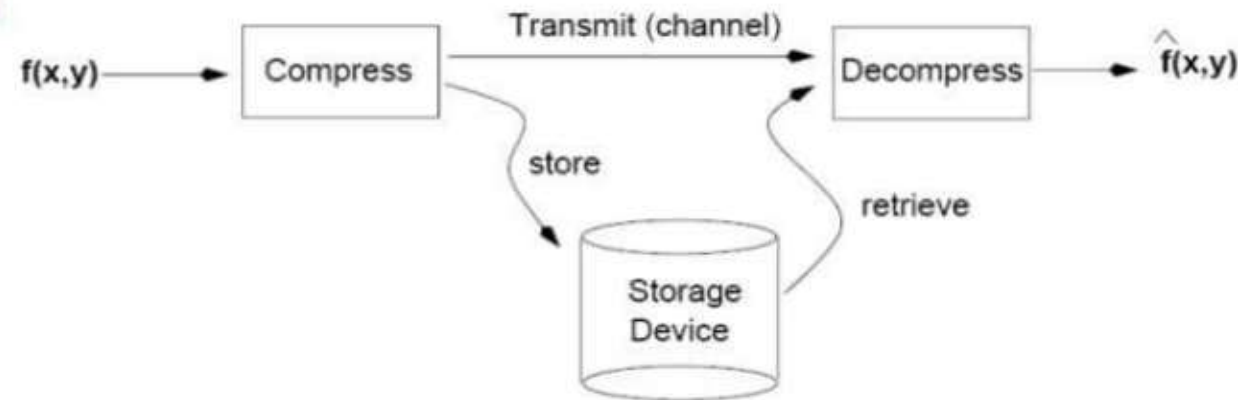
Data Compression

- It aims at reducing the amount of data required to represent a given quantity of information.
- Data is the means by which information is conveyed.
- Information are said to contain **redundant** data.

What is Image Compression?

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- Image compression is the process of reducing the amount of data required to represent an image



Data ≠ Information

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- Data and information are not synonymous terms.
- Data is the means by which information is conveyed.
- Data compression aims to reduce the amount of data required to represent a given quantity of information while preserving as much information as possible.
- Image compression is an irreversible process.

- The same amount of information can be represented by various amount of data.
- For example:-
- *Your wife, Helen, will meet you at Logan Airport in Boston at 5 minutes past 6:00 pm tomorrow night*
- *Your wife will meet you at Logan Airport at 5 minutes past 6:00 pm tomorrow night*
- *Helen will meet you at Logan at 6:00 pm tomorrow night*
- **All 3 statements represent the same information with different levels of data redundancy, the first line containing maximum redundant data.**

Compression Fundamentals

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- ✓ Image compression involves reducing the size of image data files, while retaining necessary information
- ✓ Retaining necessary information depends upon the application
- ✓ Image segmentation methods, which are primarily a data reduction process, can be used for compression
- ✓ The ratio of the original, uncompressed image file and the compressed file is referred to as the *compression ratio*

Compression Ratio



Compression Ratio: $C_R = \frac{n_1}{n_2}$

Data Redundancy

• **Relative data redundancy:** $R_D = 1 - \frac{1}{C_R}$

Example:

If $C_R = \frac{10}{1}$, then $R_D = 1 - \frac{1}{10} = 0.9$

(90% of the data in dataset 1 is redundant)

if $n_2 = n_1$, then $C_R = 1$, $R_D = 0$

if $n_2 \ll n_1$, then $C_R \rightarrow \infty$, $R_D \rightarrow 1$

if $n_2 \gg n_1$, then $C_R \rightarrow 0$, $R_D \rightarrow -\infty$

Data Redundancies

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Compression algorithms are developed by taking advantage of the redundancy that is inherent in image data

Coding Redundancy

- ✓ Occurs when the data used to represent the image is not utilized in an optimal manner

Interpixel Redundancy

- ✓ Occurs because adjacent pixels tend to be highly correlated, in most images the brightness levels do not change rapidly, but change gradually.

Psychovisual Redundancy

- ✓ Some information is more important to the human visual system than other types of information

Coding Redundancy

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- Length of the code words (e.g., 8-bit codes for grey value images) is larger than needed.
- Coding redundancy is associated with the representation of information.
- The information is represented in the form of codes.
- If the gray levels of an image are coded in a way that uses more code symbols than absolutely necessary to represent each gray level then the resulting image is said to contain coding redundancy.

Inter-Pixel Redundancy

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- **Inter-Pixel Spatial Redundancy:**

- Inter-pixel redundancy is due to the correlation between the neighboring pixels in an image.
- The value of any given pixel can be predicated from the value of its neighbors (Highly Correlated).
- The information carried by individual pixel is relatively small.
- To reduce inter-pixel redundancy the difference between adjacent pixels can be used to represent an image.

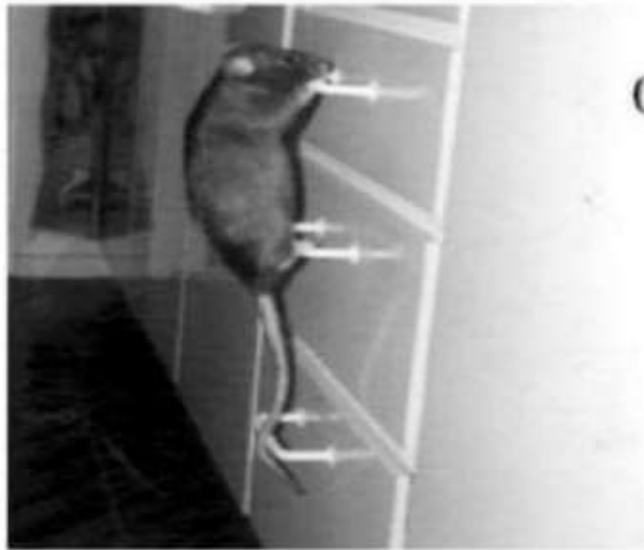
- **Inter-Pixel Temporal Redundancy**

- Inter-Pixel temporal redundancy is the statistical correlation between pixels from successive frames in video sequence.
- Temporal redundancy is also called inter-frame redundancy.
- Removing a large amount of redundancy leads to efficient video compression.

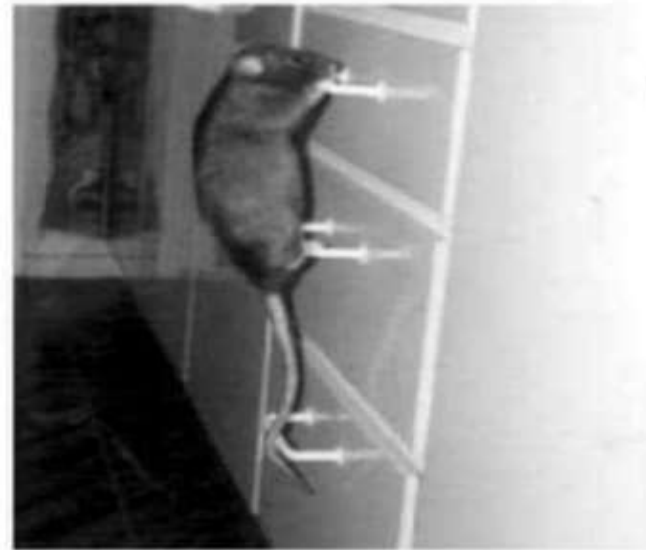
Psychovisual Redundancy

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If the image will only be used for visual observation (i.e. illustrations on the web etc), a lot of the information is usually psycho-visually redundant. It can be removed without changing the visual quality of the image. This kind of compression is usually irreversible.

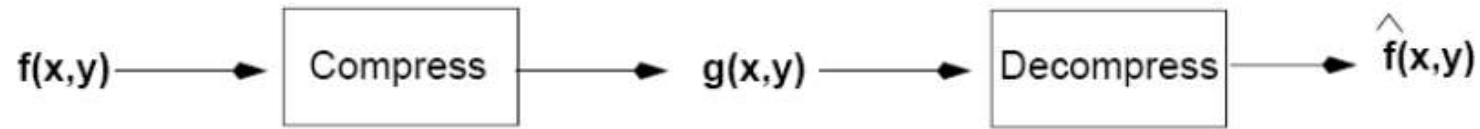


0.5kB



0.05kB

Fidelity Criteria



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

- How close is $f(x, y)$ to $\hat{f}(x, y)$?
- Criteria
 - Subjective: based on human observers
 - Objective: mathematically defined criteria

Subjective Fidelity Criteria

Value	Rating	Description
1	Excellent	An image of extremely high quality, as good as you could desire.
2	Fine	An image of high quality, providing enjoyable viewing. Interference is not objectionable.
3	Passable	An image of acceptable quality. Interference is not objectionable.
4	Marginal	An image of poor quality; you wish you could improve it. Interference is somewhat objectionable.
5	Inferior	A very poor image, but you could watch it. Objectionable interference is definitely present.
6	Unusable	An image so bad that you could not watch it.

Types of Image Compression

- Based on the loss incurred in the compression scheme, it is classified into the following:-

- **Lossless**

- Information preserving
- Low compression ratios

- **Lossy**

- Not information preserving
- High compression ratios

- Trade-off: image quality **vs** compression ratio

Image Compression

100% fidelity
Image is 725kB



90%
250kB



10%
37kB



1%
20kB



Some Basic Compression Methods

- Huffman coding
- Golomb Coding
- Arithmetic Coding
- LZW Coding
- Run Length Coding (*Already Discussed*)
- Symbol Based Coding
- Bit Plane Coding (***You are familiar***)

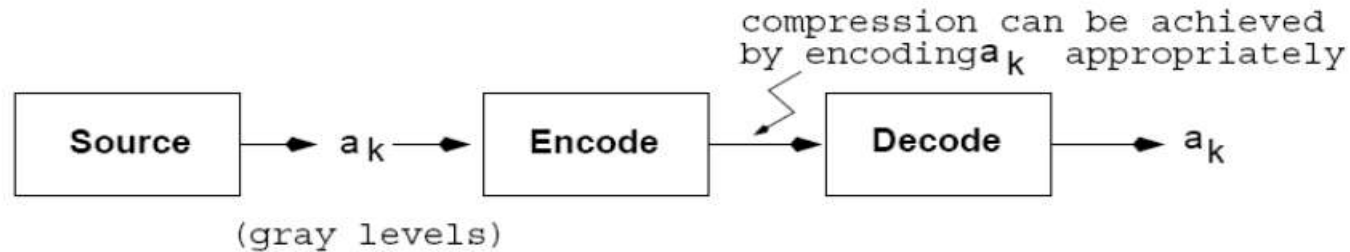
....many more for detail:

Image Processing Gonzalez Book (Chapter 8-Image Compression)



Lossless Compression

Huffman Coding (coding redundancy)



- A **variable-length coding** technique.
- Optimal code (i.e., minimizes the number of code symbols per source symbol).
- Assumption: symbols are encoded one at a time!

✓ Arithmetic (or Range) Coding (coding redundancy)

- No assumption on encoding source symbols one at a time.
 - Sequences of source symbols are encoded together.
 - There is no one-to-one correspondence between source symbols and code words.
- Slower than Huffman coding but typically achieves better compression.

Arithmetic Coding (cont'd)

- A sequence of source symbols is assigned a single arithmetic code word which corresponds to a sub-interval in $[0,1]$.
- As the number of symbols in the message increases, the interval used to represent it becomes smaller.
- Smaller intervals require more information units (i.e., bits) to be represented.



LZW Coding (Interpixel Redundancy)

- Requires no prior knowledge of pixel probability distribution values.
- Assigns **fixed length** code words to **variable length** sequences.
- It is a type of **Dictionary based Coding**.
- Included in GIF and TIFF and PDF file formats

LZW Coding

- A **codebook** (or **dictionary**) needs to be constructed.
- Initially, the first 256 entries of the dictionary are assigned to the gray levels 0,1,2,...,255 (i.e., assuming 8 bits/pixel)

Consider a 4x4, 8 bit image

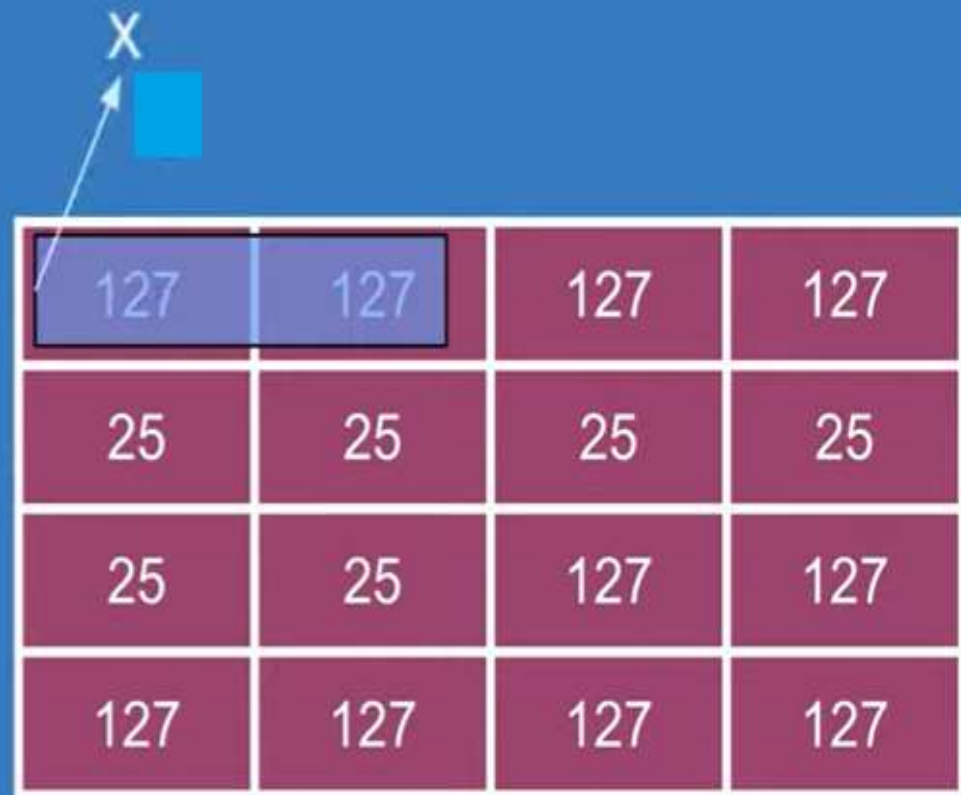
39	39	126	126
39	39	126	126
39	39	126	126
39	39	126	126

Initial Dictionary

Dictionary Location	Entry
0	0
1	1
.	.
255	255
256	-
511	-

Lempel-Ziv-Welch (LZW) coding

- Focusses on spatial redundancy.



A 4x4 grid of values is shown, with a cursor 'x' pointing to the top-left cell. The grid contains the following values:

127	127	127	127
25	25	25	25
25	25	127	127
127	127	127	127

The top-left cell (127) is highlighted with a blue box, and the cursor 'x' is positioned above it.

Lempel-Ziv-Welch (LZW) coding

- Focusses on spatial redundancy.

127	127	127	127
25	25	25	25
25	25	127	127
127	127	127	127

- Assigns fixed-length code words to variable length sequences.

xxxxxxxxxx - 127-127
yyyyyyyyyy - 127-127-127
zzzzzzzzzz - 25-25

LZW Coding (cont'd)

39 39 126 126
39 39 126 126
39 39 126 126
39 39 126 126

As the encoder examines image pixels, gray level sequences (i.e., **blocks**) that are not in the dictionary are assigned to a new entry.

Dictionary Location	Entry
0	0
1	1
...	...
255	255
256	39-39
...	...
511	-

- Is 39 in the dictionary.....Yes
- What about 39-39.....No
- Then add 39-39 in entry 256



Example

39 39 126 126
 39 39 126 126
 39 39 126 126
 39 39 126 126

Concatenated Sequence: CS = CR + P

Currently Recognized Sequence	(CR) Pixel Being Processed	(P) Encoded Output	Dictionary Location (Code Word)	Dictionary Entry
	39			
39	39	39	256	39-39
39	126	39	257	39-126
126	126	126	258	126-126
126	39	126	259	126-39
39	39			
39-39	126	256	260	39-39-126
126	126			
126-126	39	258	261	126-126-39
39	39			
39-39	126			
39-39-126	126	260	262	39-39-126-126
126	39			
126-39	39	259	263	126-39-39
39	126			
39-126	126	257	264	39-126-126
126		126		

CR = empty

If CS is found:

(1) No Output

(2) CR=CS

else:

(1) Output D(CR)

(2) Add CS to D

(3) CR=P