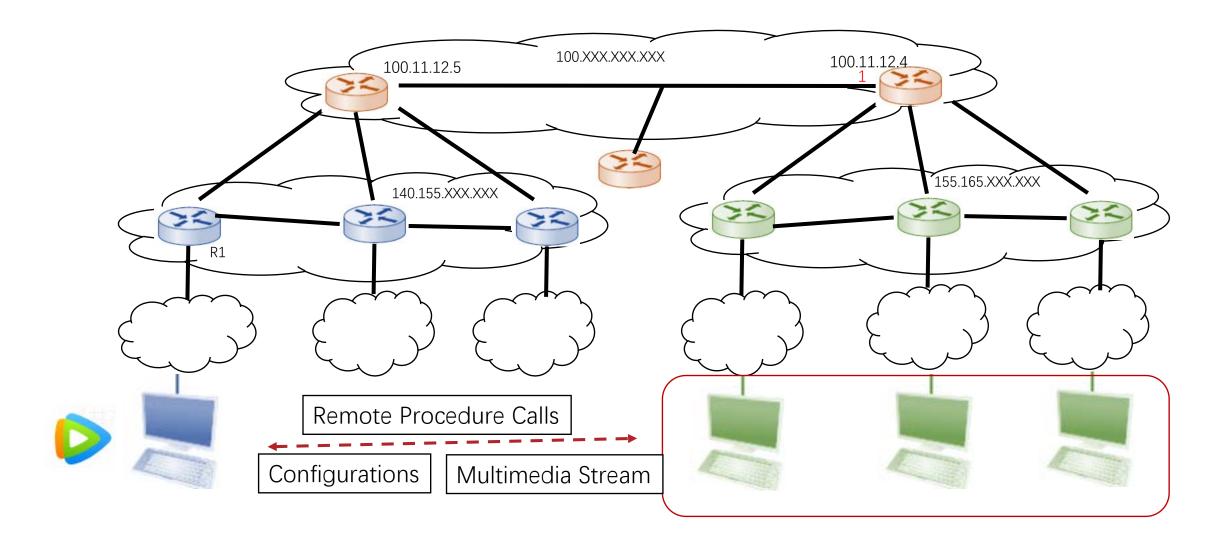


# CS120: Computer Networks

Lecture 23. Data Compression

Zhice Yang

#### Data in End-to-End Connections



#### Data in End-to-End Connections

- Data Presentation
- ➤ Data Compression
  - Lossless Compression
  - Multimedia Compression

# gzip

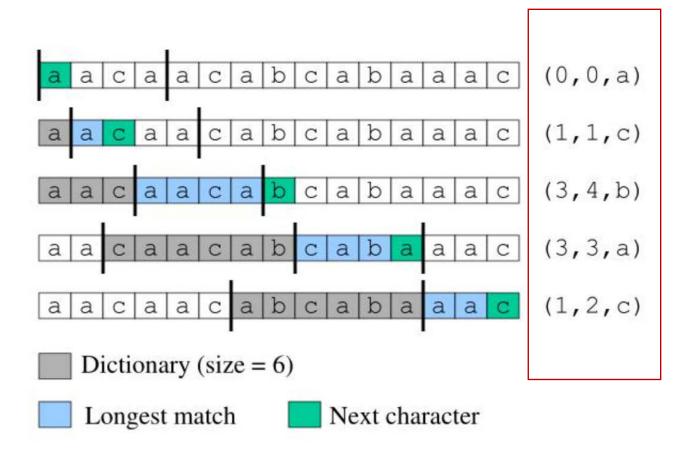
- GNU zip
- A widely-used lossless compression method
- Main Algorithms
  - LZ Algorithm
  - Huffman Coding

### LZ Algorithm

- Dictionary-Based Compression
- Method
  - Construct dictionary: find repeated strings
  - Repeated strings are represented by its index in dictionary
    - eg. Repeated strings are simplified to <distance, length> pair
      - blah blah b! => blah [D=5, L=6]!

#### LZ77

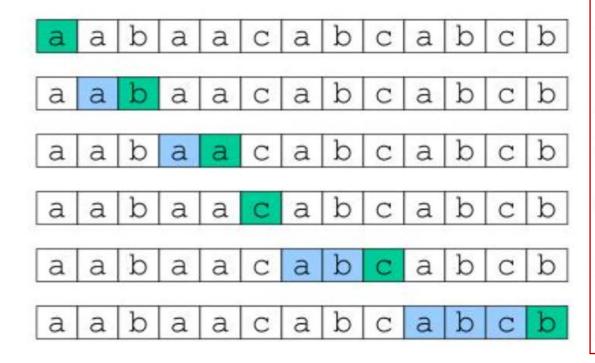
Encoding



Output

#### LZ78

Encoding



#### Output

Output			
Output	į.	Dict.	
(0,a)	1	=	a
(1,b)	2	=	ab
(1,a)	3	-	aa
(0,c)	4	=	С
(2,c)	5	=	abc
(5,b)	6	=	abcb

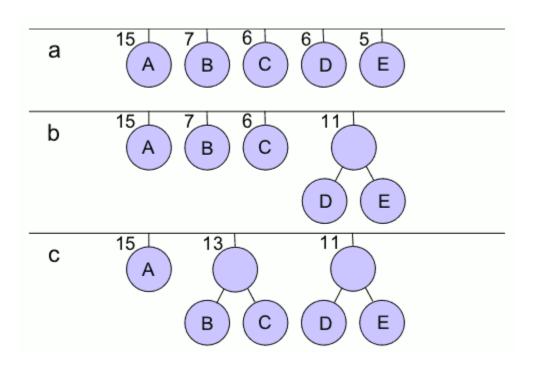
### Huffman Coding

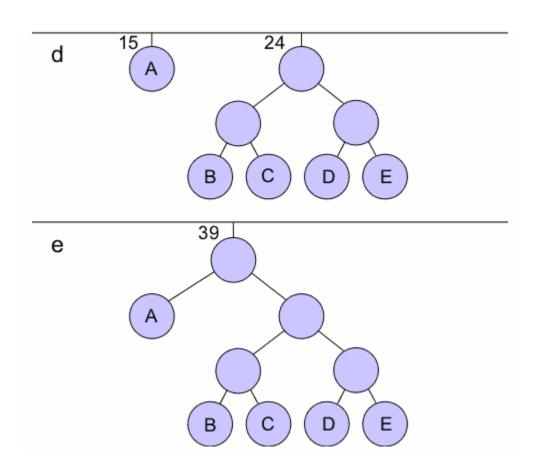
- Intuition: Higher frequency characters => less bit to representation
- A:90%, B:5%, C:5%
  - A: 1
  - B: 01
  - C: 00

### Huffman Coding

- Create a leaf node for each symbol and add it to the priority queue.
- While there is more than one node in the queue:
  - Remove the two nodes of highest priority (lowest probability) from the queue
  - Create a new internal node with these two nodes as children and with probability equal to the sum of the two nodes' probabilities.
  - Add the new node to the queue.
- The remaining node is the root node and the tree is complete.

# Huffman Coding





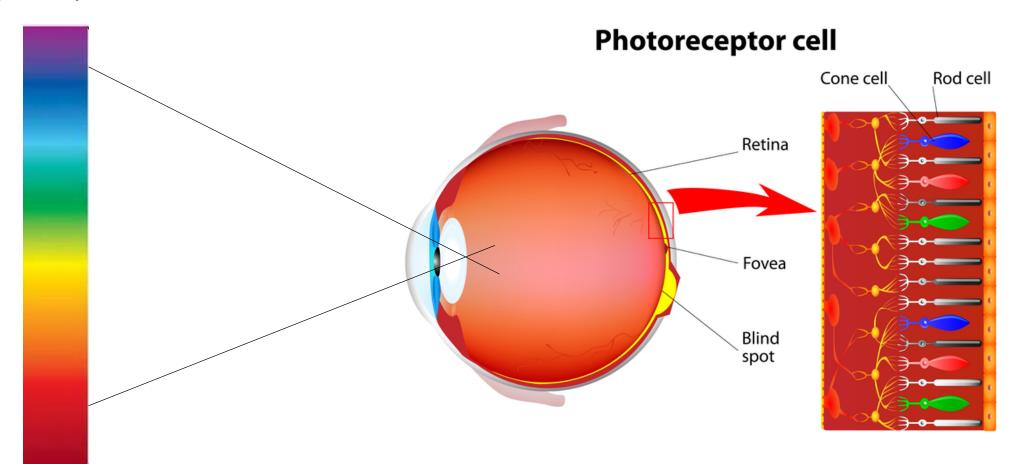
#### Data in End-to-End Connections

- Data Presentation
- Data Compression
  - Lossless Compression
  - ➤ Multimedia Compression

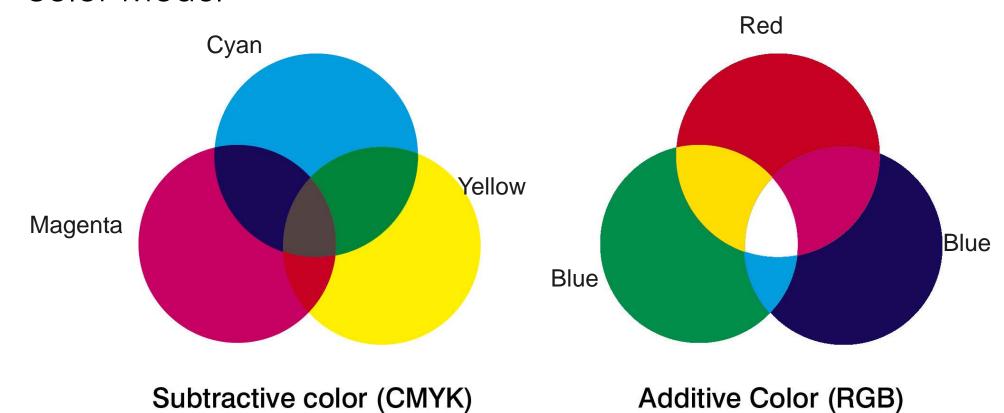
#### End-to-End Data

- Data Presentation
- Data Compression
  - Lossless Compression
  - ➤ Multimedia Compression

• eyes spectrum



Color Model

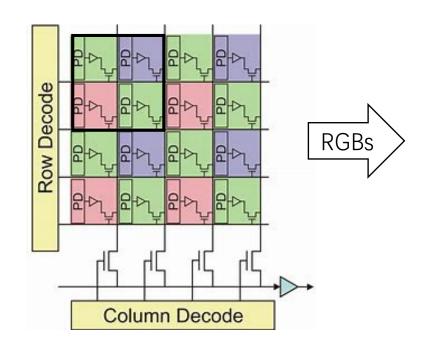


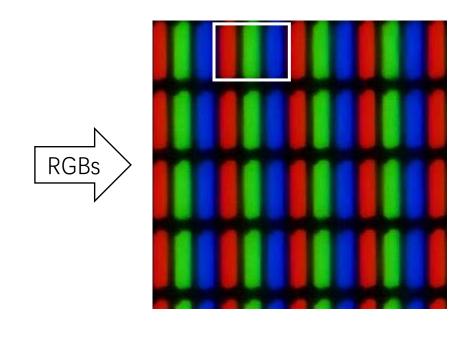
for printing

for display

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Imaging and Display





Display

Digital Image



$$\begin{pmatrix}
a_{11} & a_{12} & \cdots & a_{1m} \\
a & a & \cdots & a
\end{pmatrix}$$

$$\begin{vmatrix}
a_{11} & a_{12} & \cdots & a_{1m} \\
a_{21} & a_{21} & a_{22} & \cdots & a_{2m} \\
\vdots & \vdots & & \vdots \\
a_{n1} & a_{n2} & \cdots & a_{nm}
\end{pmatrix}_{n \times m}$$

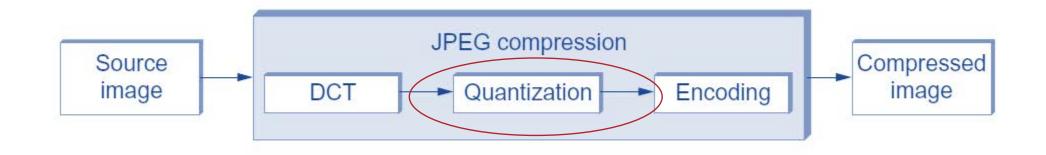
# GIF – Image Compression

- Filename Extension: .gif
- Simple Lossy Compression
- 3\*8 bit => 256 colors

### JPEG – Image Compression

- Filename Extension: .jpg, .jpeg
- Joint Photographic Experts Group
- Intuition
  - Human eyes are sensitive to intensity changes, but less sensitive to chromatic changes
  - Human eyes are sensitive to low frequency changes, but less sensitive to high frequency changes

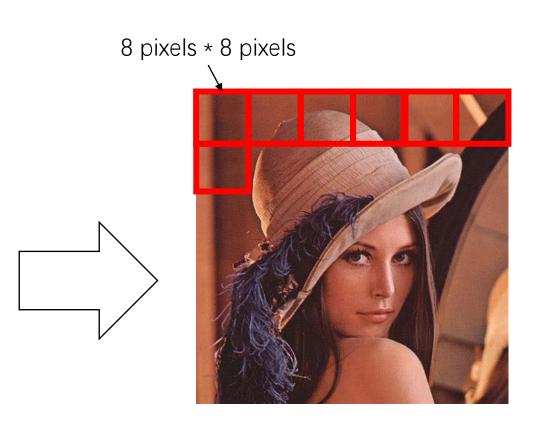
# JPEG Compression Flow



Information Loss

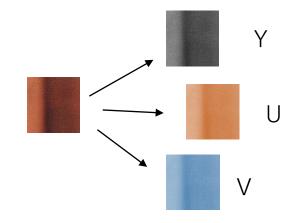
# JPEG Compression: Splitting





### JPEG Compression: RGB -> YUV

- YUV Space
  - Y -> luminance
    - Sensitive
  - U, V -> chrominance



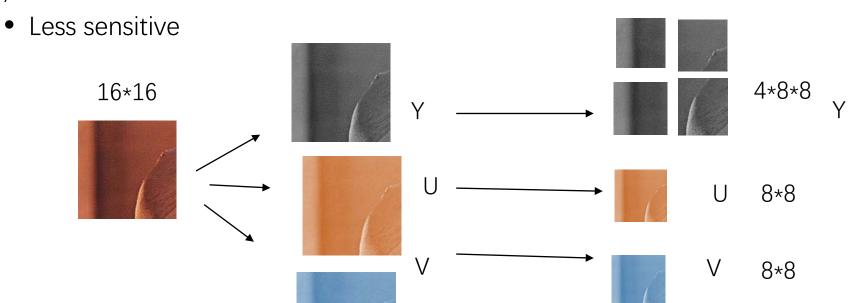
$$Y = 0.299R + 0.587G + 0.114B$$

$$U = (B - Y) \times 0.565$$

$$V = (R - Y) \times 0.713$$

# JPEG Compression: Subsampling UV

- YUV Space
  - Y -> luminance
    - Sensitive
  - U, V -> chrominance



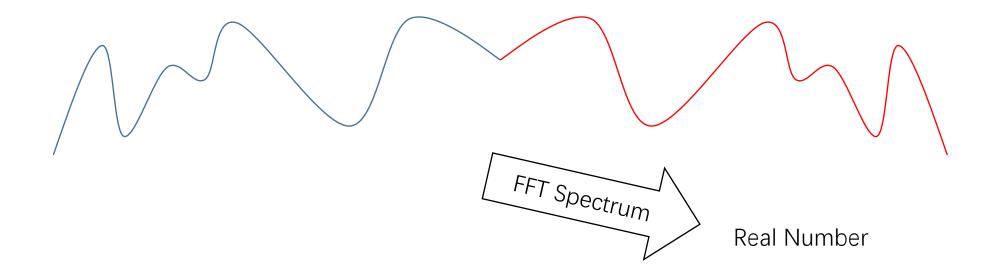
# JPEG Compression: DCT

• Discrete Cosine Transform



# JPEG Compression: DCT

• Discrete Cosine Transform



# JPEG Compression: DCT



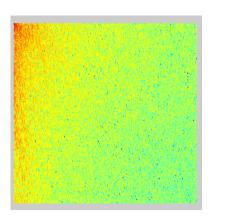


DCT

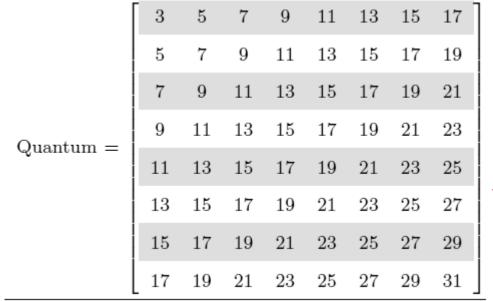
Sensitive to Low frequency

DCT

# JPEG Compression: Quantization



Round (DCT(i,j)/Quantum(i,j))

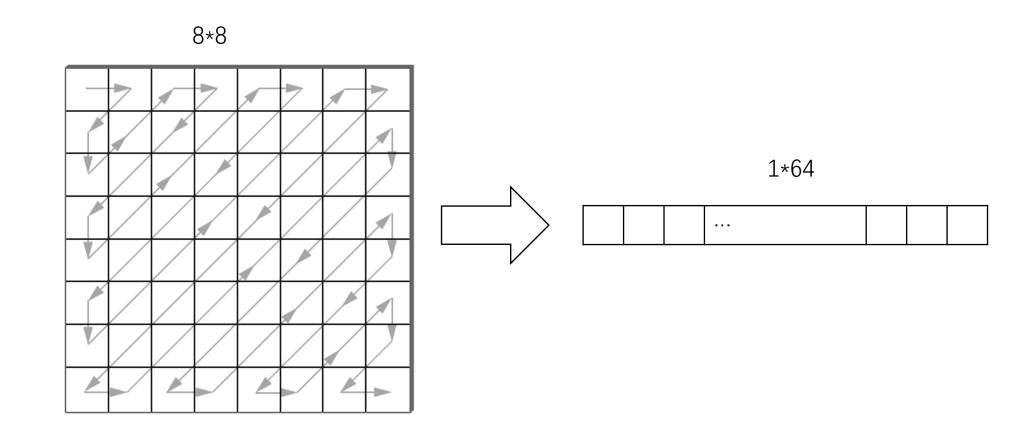


Determine the How Much Information is dropped

# JPEG Compression: Quantization

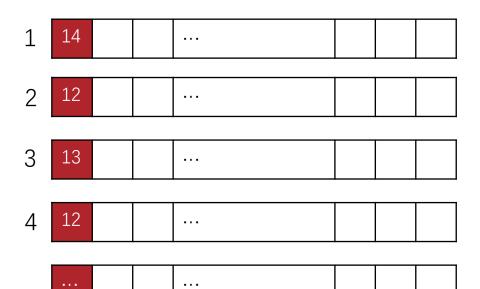
- Quantization is a lossy process
  - Recovered DCT(i,j) = QuantizedValue(i,j)\*Quantum(i,j)
  - Rounding in Quantization is lossy

# JPEG Compression: Zig-Zag



# JPEG Compression: DC Component

- DC Components are large and normally non-zero
- Nearby DC Components are closed
- ➤ Differential Pulse Code Modulation (DPCM)
  - 14, 12, 13, 12, 15 => 14, -2, 1, -1, 3





# JPEG Compression: DC Component

- DC Component can be expressed in integer
  - eg. in one's complement
    - 3 => 0011
    - -3 => 1100
    - 4 => 0100
    - -4 => 1011
- Problem
  - If expressing integer in fix-length bits
    - padding zeros waste space
  - If expressing integer in dynamic length bits
    - how to split the bit stream?

# JPEG Compression

- DC Component can be expressed as (size, amplitude)
  - Size: number of bits to express amplitude
  - Amplitude: DPCM value in ones complement
  - Examples:
    - 0 = > (0, -)
    - 1 = > (1,1)
    - -1 => (1,0) bitwise inverse for negative value
    - 2 = > (2, 10)
    - -2 => (2, 01)
    - 3 = > (2,11)
    - -3 => (2,00)

# JPEG Compression: Huffman Coding

- DC Component can be expressed as (size, amplitude)
  - Size: number of bits to express amplitude, Huffman coded
    - The coding table is included in the JPEG file
  - Amplitude: DPCM value in ones complement
  - Examples:
    - 0 => (0,-) => 0
    - 1 => (1,1) => 101 1
    - -1 => (1,0) => 1010
    - 2 => (2, 10) => 011 10
    - -2 => (2, 01) => 011 01
    - 3 => (2,11) => 011 11
    - -3 => (2,00) => 011 00

Length	Code	Size
	000	04
	001	05
	010	03
3 bits	011	02
	100	06
	101	01
	110	00 (End of Block)
4 bits	1110	07
5 bits	1111 0	08
6 bits	1111 10	09
7 bits	1111 110	OA
8 bits	1111 1110	ОВ

# JPEG Compression: AC Component

- AC Components are small and normally zero
- ➤ Run Length Encoding (RLE)
  - 000002000010000210000 => (5,2)(4,1)(4,2)(0,1)(0,0)

1 14 ...



#### JPEG Problem

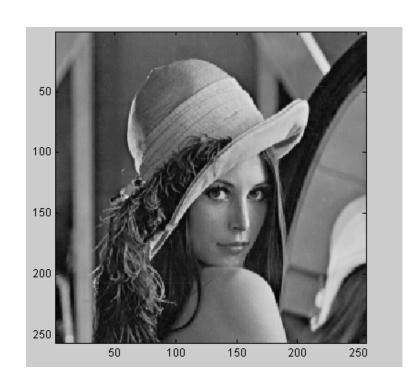
Compression Granularity is in Unit of 8\*8

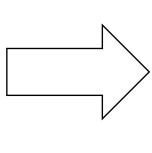


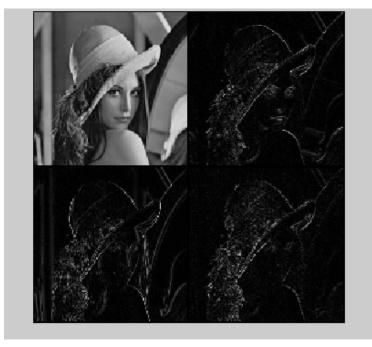


# JPEG 2000

Wavelet Transform







# MPEG – Video Compression

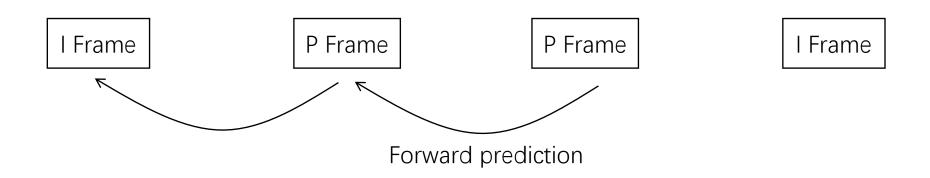
- Filename Extension: MPEG-4 .mp4
- Moving Pictures Experts Group
- Intuition
  - Adjacent frames are similar and changes are due to foreground motion



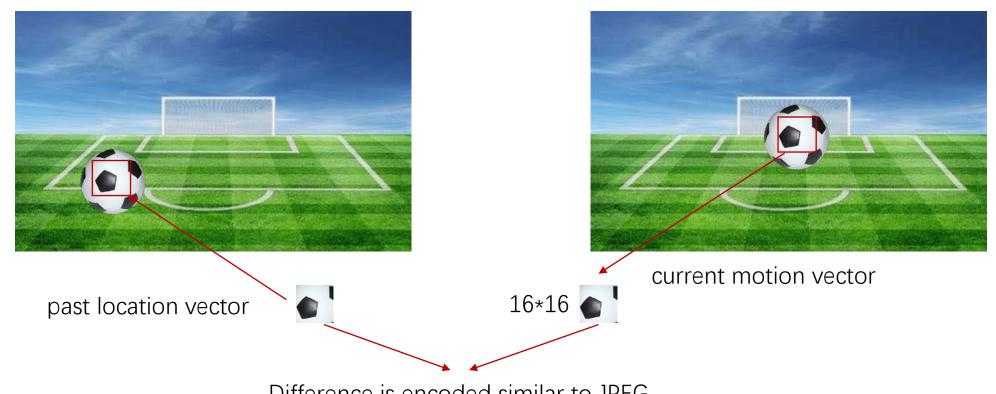


### MPEG Compression: I Frame and P Frame

- I (intra) Frame
  - Independent frames
  - Coded without reference to other frames (JPEC Compressed)
- P (predictive) Frame
  - Not Independent frames
  - Predicted from a past frame (I or P)



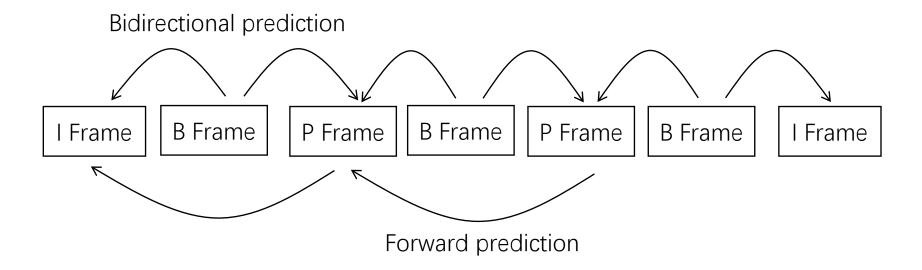
# MPEG Compression: Forward Prediction



Difference is encoded similar to JPEG

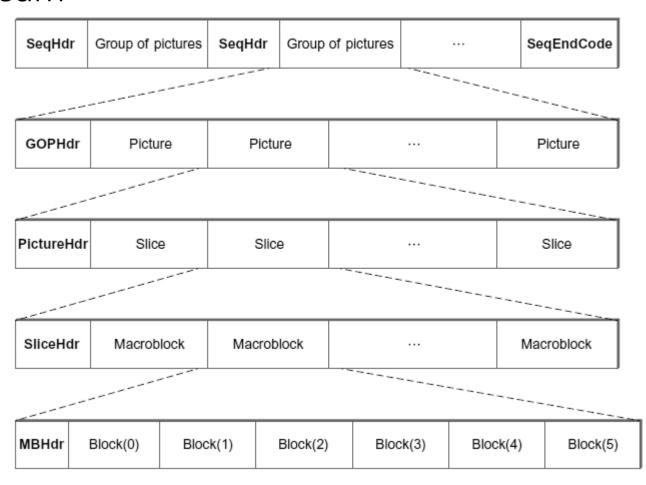
### MPEG Compression: B Frame

- B (Bidirectional) Frame
  - Not independent frames
  - Reason: enhance forward prediction
    - The forward I frame might not contain similar information as the B frame
  - Coded with reference to both previous and future frames (I or P)



#### MPEG over a Network

A Video Stream



#### MPEG over a Network

- Frame Sequence
  - Target Seq: IBBBBPBBBBI
  - Transmitting Seq: IPBBBBIBBBB
    - Large Delay
  - For Interactive Videos
    - Only use I and P frames or pure I frames

#### MP3 – Audio Compression

- Filename Extension: mp3
- A part of MPEG
  - MP3 is introduced in MPEG-1 to encode audio
- Intuition
  - Human ear are less sensitive to high frequency sound
  - Divide audio signal into subbands
  - Compressing subband by allocating different numbers of bits

### Reference

• Textbook 7.2