

Review:

20 Questions = Prefix code

Prefix code  $\Rightarrow$  Kraft :  $\sum_{x \in \Omega} 2^{-L(x)} \leq 1$   $\leftarrow$  Should be tight  
 Uniquely decodable (no punctuation needed)  $\Rightarrow$  Kraft  $\leftarrow$  Therefore, prefix is as efficient as uniquely decodable  
 Kraft  $\Rightarrow$  Exists a prefix code with those lengths.  
 $\uparrow$   
 Can be found by embedding in a binary tree.

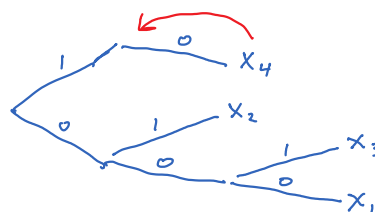
Kraft  $\Rightarrow$   $EL(x) \geq H(x)$  Entropy

- Achieved if  $L(x)$  not required to be integer by setting  $L(x) = \log_2 \frac{1}{p(x)}$
- Achieved if  $\log_2 \frac{1}{p(x)}$  is an integer for each  $x$ .

Shannon code :  $L_s(x) = \lceil \log_2 \frac{1}{p(x)} \rceil$  ,  $EL_s(x) < H(x) + 1$

Notice that if rounding occurs, Kraft is loose.  
 $\Rightarrow$  Shannon code is optimal iff  $\log_2 \frac{1}{p(x)}$  are integers.

Example:  $\Omega = \{x_1, x_2, x_3, x_4\}$   
 $p(x_1) = \frac{1}{6}$        $L(x_1) = \lceil \log_2 6 \rceil = 3$   
 $p(x_2) = \frac{1}{3}$        $L(x_2) = 2$   
 $p(x_3) = \frac{1}{6}$        $L(x_3) = 3$   
 $p(x_4) = \frac{1}{3}$        $L(x_4) = 2$



Code:  
 $x_1$  | 000  
 $x_2$  | 01  
 $x_3$  | 001  
 $x_4$  | 10

Entropy: Suppose all  $x \in \Omega$  are equally likely.  
 "Uniform distribution"  $p(x) = \frac{1}{|\Omega|} \forall x \in \Omega$

$$H(x) = E \log \frac{1}{p(x)} = E \log |\Omega| = \log_2 |\Omega|$$

$$H(X) = E \log \frac{1}{p(x)} = E \log |\Omega| = \log_2 |\Omega|$$

$$= \sum_{x \in \Omega} p(x) \log \frac{1}{p(x)} = \sum_{x \in \Omega} \frac{1}{|\Omega|} \log |\Omega| = \frac{1}{|\Omega|} \log |\Omega| \left( \sum_{x \in \Omega} 1 \right)$$

Entropy of a roll of a die:  
 $H(X) = \log_2 6 = 2.58$  bits

Entropy of two dice: Let  $X_1$  be the first die.  
 Let  $X_2$  be the second die.

E.g.  $(X_1, X_2) = (1, 5)$

Independence:  $P(X_1=3 \text{ and } X_2=6) = P(X_1=3) P(X_2=6)$

In general, this would be a conditional probability.

$$p(a, b) = \text{Prob}(X_1=a \text{ and } X_2=b)$$

$$p(x_1, x_2) = \left(\frac{1}{6}\right)\left(\frac{1}{6}\right) = \frac{1}{36} \quad \forall x_1, x_2$$

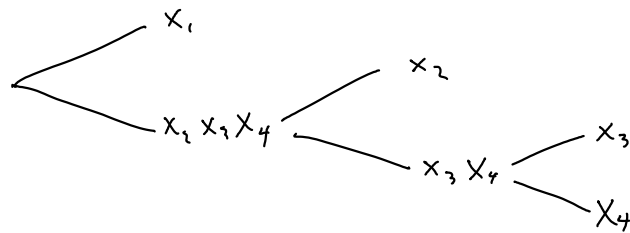
$$H(X_1, X_2) = \log_2 36 = 5.17 \text{ bits} = 2 \cdot (2.58 \text{ bits})$$

If  $X_1, X_2, X_3, \dots$  are independent:  $H(X_1, X_2, X_3, \dots) = \sum_i H(X_i)$   
 in general  $H(X_1, X_2, X_3, \dots) \leq \sum_i H(X_i)$

Shannon-Fano:

- Sort the outcomes by probability
- Make cuts as close to  $P = \frac{1}{2}$  as possible

	$P(x)$
$x_1$	0.45
$x_2$	0.2
$x_3$	0.2
$x_4$	0.15

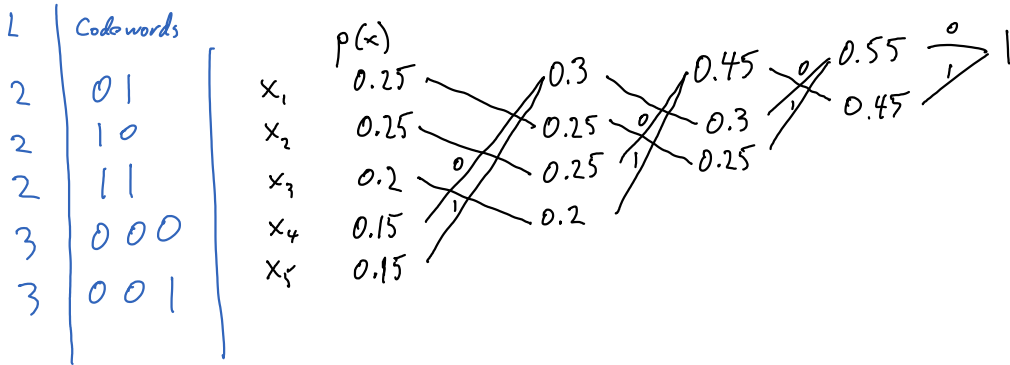


Huffman: 1951

- Design the tree from the leaves.

$$\Omega = \{x_1, x_2, x_3, x_4, x_5\}$$

Start by sorting



## JPEG:

Color is 3-dimensional as perceived by the human eye.

red, green, blue  $\leftarrow$  basis  
 red, yellow, blue  $\leftarrow$

$Y, C_B, C_R$

$Y$  is intensity

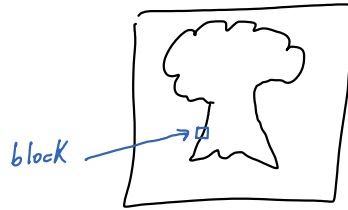
$C_B$ , color

$C_R$ , color

} Downsample by 2

Compress each separately.

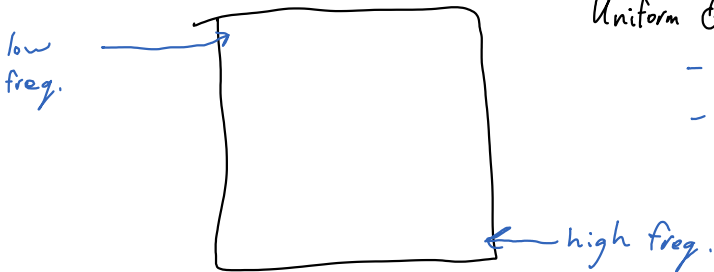
Split into  $8 \times 8$  pixel blocks:



DCT: (think of as DFT)

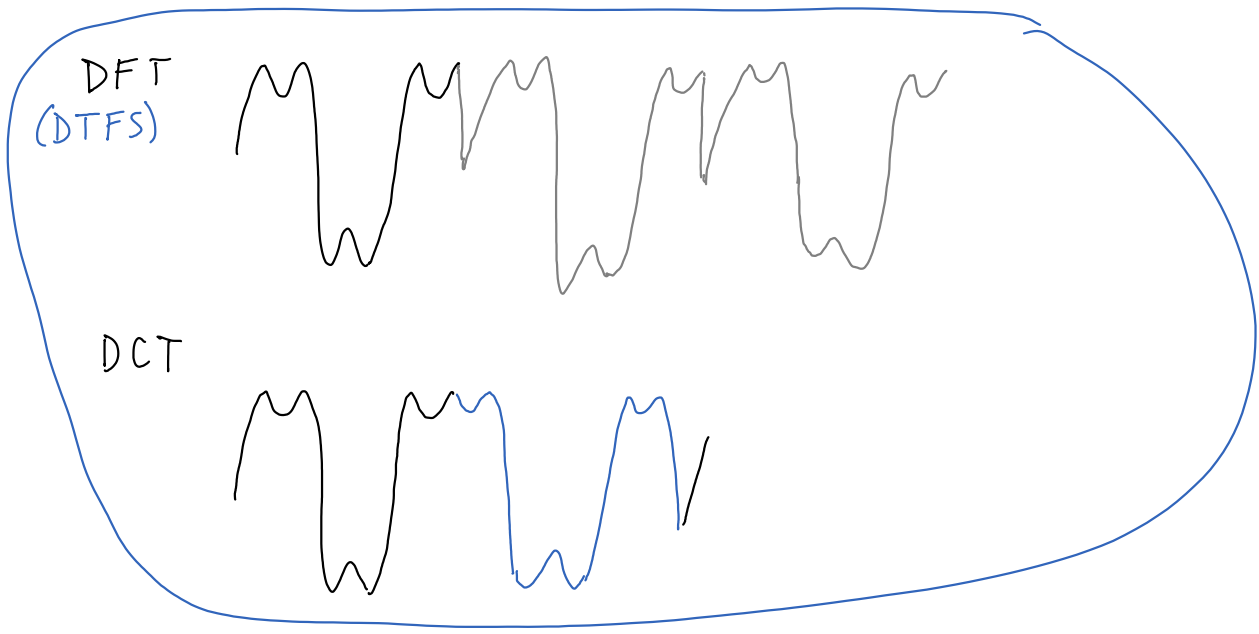
Uniform Quantization: Better precision used for low freq.

- Scale each entry (by different values)
- Round to nearest integer.



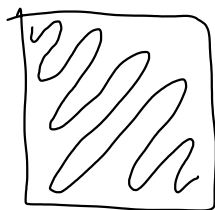
16	18
18	50
	50
	100

$\leftarrow$  Matrix of scaling constants. Fixed part of the protocol.



JPEG Last steps: Lossless

Quantized DCT:



- Run-length code:

11111000000111110000

(5,1), (7,0), (6,1), (4,0)

5, 7, 6, 4

- Huffman Code

Error-Correction: Add redundancy in a smart way.

Example: Reed-Solomon: In much of today's technology.

We'll investigate this and other error-correction codes in next lecture.