

2/5/14 class 7
 how much can a signal be compressed
 what is the ultimate transmission rate

9.2 Uncertainty, Information and Entropy

Finite alphabet $\mathcal{C} = \{S_0, S_1, \dots, S_{K-1}\}$
 with probabilities $P(S=S_k) = P_k, \sum_{k=0}^{K-1} P_k = 1$
 logarithmic function $I(S_k) = \log_2(1/P_k) = -\log_2 P_k$ (bit)

① $I(S_k) = 0$, for $P_k = 1$

② $I(S_k) \geq 0$ for $0 \leq P_k \leq 1$

③ $I(S_k) > I(S_i)$ $P_k < P_i$

④ $I(S_k S_l) = I(S_k) + I(S_l)$ if S_k, S_l are statistically independent

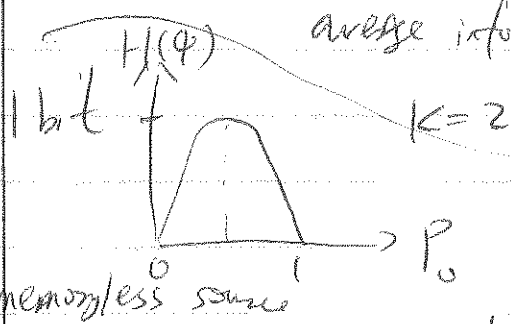
Entropy: $H(\mathcal{C}) = E[I(S_k)] = \sum_{k=0}^{K-1} P_k I(S_k)$
 $= \sum_{k=0}^{K-1} P_k \log_2(1/P_k)$

average information content per source symbol

properties of Entropy

$$0 \leq H(\mathcal{C}) \leq \log_2 K$$

ex-9.1
 Entropy of
 binary memoryless source



$$H(P_0) = -P_0 \log_2 P_0 - (1-P_0) \log_2 (1-P_0)$$

Extension of a discrete memoryless source
 n source symbol: $H(\mathcal{C}^n) = n H(\mathcal{C})$

ex 9.2 Entropy of Extended source

$$H(\mathcal{C}^2) = \sum_{i=1}^4 P(S_i) \log_2 \frac{1}{P(S_i)}$$

$$= \frac{1}{16} \log_2(16) + \frac{1}{16} \log_2(16) = 3 \text{ bits}$$

Table 9.1

9.3 Source coding Theorem

- requirements
- 1 code words are binary form
 - 2 uniquely decodable. original ~~can be~~ source sequence can be reconstructed perfectly

example Morse code. ~~by keyboard~~ from encoded binary sequence -
 average code length $\bar{L} = \sum_{k=1}^K p_k l_k$

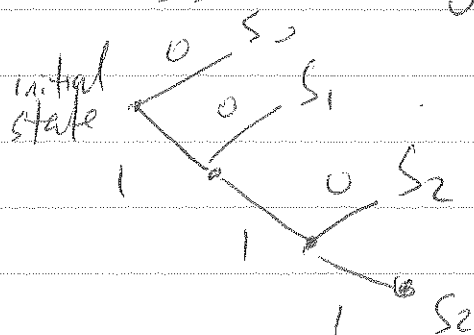
theorem: given ~~the minimum~~ a discrete memoryless source of entropy $H(X)$
 the average code-word length $\bar{L}$ for any distortionless source encoding scheme is bounded by
 $\bar{L} \geq H(X)$

9.4 Data compaction: Question 1 how zip works

prefix coding, Huffman coding, Lempel-Ziv coding

— prefix coding. table 9.2

Symbol	probability	code I	code II	code III
S_0	0.5	0	0	0
S_1	0.25	1	10	01
S_2	0.125	00	110	011
S_3	0.125	11	111	0111



ex 1011111000
 $\underbrace{10}_{S_1} \underbrace{11}_{S_3} \underbrace{110}_{S_2} \underbrace{00}_{S_0 S_0}$

prefix code

$$\bar{L} = 0.5 \cdot 1 + 0.25 \cdot 2 + 0.125 \cdot 3 + 0.125 \cdot 3$$

Kraft-McMillan Inequality
 $\sum_{k=1}^K 2^{-l_k} \leq 1$

given discrete memoryless source with entropy $H(\psi)$
a prefix code can be constructed with length $\bar{L}$
$$H(\psi) \leq \bar{L} < H(\psi) + 1$$

for extended code

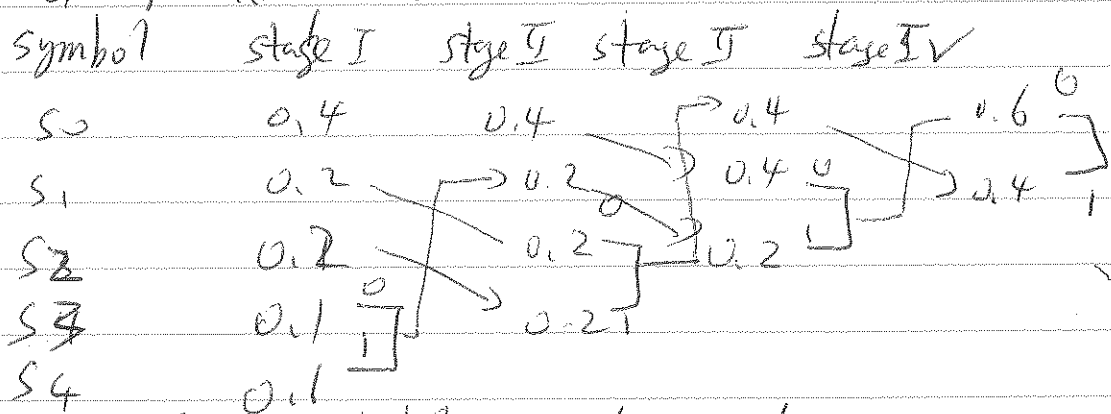
$$nH(\psi) = H(\psi^n) \leq \bar{L}_n < H(\psi^n) + 1 = nH(\psi) + 1$$

$$\lim_{n \rightarrow \infty} \frac{1}{n} \bar{L}_n = H(\psi) \quad \text{Asymptotically achieving entropy.}$$

- Huffman coding: ~~known~~ ^{important} a special class of prefix codes
Huffman encoding algorithm

1. source symbols are listed in order of decreasing probability. Two source symbols of lowest probability are assigned a 0 and 1. splitting stage
2. These two source symbols are regarded as being combined into new source symbol with probability equal to the sum of the two original probabilities (the list of source ~~ability of the~~ ^{new} symbols, and therefore source statistics, is thereby reduced in size by one)
The probability of the new symbol is placed in the list in accordance with its value
3. The procedure is repeated until we are left with a final list of source statistics (symbols) of only two for which a 0 and 1 are assigned

example 9.3 Huffman Tree



symbol	probability	code word
S ₀	0.4	00
S ₁	0.2	10
S ₂	0.2	11
S ₃	0.1	010
S ₄	0.1	011

$$L = 0.4 \cdot 2 + 0.2 \cdot 2$$

$$+ 0.2 \cdot 2 + 0.1 \cdot 3$$

$$+ 0.1 \cdot 3 = 2.2$$

$$H(P) = 0.4 \log_2 \left(\frac{1}{0.4} \right) + 0.2 \log_2 \left(\frac{1}{0.2} \right) + 0.2 \log_2 \left(\frac{1}{0.2} \right) + 0.1 \log_2 \left(\frac{1}{0.1} \right) + 0.1 \log_2 \left(\frac{1}{0.1} \right) = 2.12193$$

drawback: need probability.

example: morse code

— Lempel-Ziv coding adaptive and simpler

— parsing the source data stream into segments that are the shortest subsequences not encountered previously.

initial: subsequence stored 0,1

Data to be parsed 000101110010100101

shortest subsequence not stored

step 1 subsequence stored 0,1, 00

Data to be parsed 0101110010100101

step 2 subsequence stored 0,1, 00, 01

Data to be parsed 01110010100101

~~num~~ numerical positions 1 2 3 4 5 6 ~~7 8 9~~

subsequences 0 1 00 01 011 10 010 100 101

(Numerical representation) ~~0 1 2 11 12 42 21 41 61 62~~

encoding → binary block 0000, 0001, 0010, 0011, 1001, 0100, 1000, 1100, 1101

4 2

decoding 1101, position 9. last bit 1, remaining 110 $\rightarrow$
sequence 6 (10) so decoding is 101

- file compression zip
- fixed length codes to represent a variable number of source symbols

$C(n)$ is the number of phrases in L-2 parsing
 $\log(C(n))$ is the number of bits

$\log(n)$ is the number of bits

the total length of the compressed sequence is

$$C(n)(\log(n)+1) \rightarrow n+1(\psi)$$

$$C(n) \leq \frac{n}{(1-\epsilon_n) \lg n}$$

$$f_n \rightarrow 0, n \rightarrow \infty$$