Lecture 1 Introduction

Coded Bitstream: The binary string representing the whole coded (compressed) data.

Codeword: A binary string representing either the whole coded bitstream or one coded data symbol (you will tell the difference from the context).

Bit Rate (or bitrate): Average number of bits per original data element after compression.

Compression Ratio (CR):

$$\text{Compression Ratio (CR)} = \frac{\text{size of uncompressed data (in bits)}}{\text{size of coded bitstream (in bits)}} = \frac{|I|}{|b|}.$$

Entropy: the minimum average number of bits/symbol possible.

Lecture 2 Lossless Compression Part I

2.1 Huffman Coding

Algorithm 1 Huffman Coding

- 1: **Input** Alphabet $\{a_1, a_2, \dots, a_n\}$ and symbol probabilities $\{p_1, p_2, \dots, p_n\}$
- 2: Create a node for each symbol a_i // these nodes will be the leaves.
- 3: While (there are two or more uncombined nodes) do
- 4: Select 2 uncombined nodes a and b of minimum probabilities
- 5: Create a new node c of probabilities $p_a + p_b$, and make a and b children of c
- 6: Label the tree edges: left edges with 0, right edges with 1
- 7: The codeword of each alphabet symbol a_i (a leaf) is the binary string that labels the path from the root down to leaf a_i
- 8: Output The codewords of the alphabet symbols

2.2 Huffman Decoding

Algorithm 2 Huffman Decoding

- 1: **Input** A coded bitstream $b_1b_2...b_N$ (and we have the Huffman tree).
- 2: Initialize: i = 1, and let node pointer ptr point at the tree root
- 3: While (i < N) do
- 4: If $b_i == 0$, let ptr go to left child, else go to the right child
- 5: **If** ptr is pointing to a leaf node
- 6: Append to the output the symbol corresponding to that leaf;
- 7: Reset ptr back to the root
- 8: i = i + 1
- 9: **Else** i = i + 1
- 10: Output The reconstructed data (will be identical to the original data).

2.3 The Prefix Property

The prefix property: a coding scheme where every alphabet symbol is coded with a codeword said to have the prefix property if no codewords a prefix of another codeword. Huffman coding has the prefix property because every codeword is a path from the root to a leaf in the Huffman tree, and no leaf is on the path from the root to another leaf.

2.4 Block Huffman Coding

Algorithm 3 Block Huffman Coding

- 1: **Input** An input bitstream
- 2: Break the input into a series of blocks
- 3: Treat every block as a new (macro) symbol
- 4: Take all possible macro-symbols (as a new macro-alphabet)
- 5: Compute the probabilities of the individual macro-symbols
- 6: Apply Huffman coding on the macro-symbols, getting a tree and codewordsfor the macr-symbols
- 7: Code the original input by replacing each block by its corresponding codeword
- 8: Output The codewords of the input

Block Huffman Decoding is similar, getting back the blocks, which are appended to the output.

2.5 Run-length Encoding (RLE)

Run: Each maximal stretch of identical symbols.

RLE coding method: Replace each run by (a, L) where 'a' is the symbol repeating in the run, and L is the length of the run.

M: The number of bits that will be allocated to each length.

• Determine ahead of time the maximum L, then set $M = \log(\max L)$. Otherwise, per input, find the max L, set $M = \log(\max L)$, allocate a fixed number of bytes in the header to store the value of M so the decoder knows it.

• (Run-splitting) Set M to a reasonable, non-wasteful value even if $M < \log(\max L)$. If a run has L > M, then split the run into q + 1 runs: $L = q * (2^M - 1) + r$ where $r < 2^M - 1$.

Algorithm 4 Run-length Encoding (Run-splitting)

- 1: **Input** An input bitstream
- 2: Process the input with RLE coding method
- 3: Fix the number of bits (say M bits) that will be allocated to each length
- 4: If a run has L > M:
- 5: $L = q * (2^M 1) + r \text{ where } r < 2^M 1$
- 6: Split the run into q+1 runs: the first q runs are of length 2^M-1 (needs M bits)
- 7: The last run of length r (needs $\leq M$ bits)
- 8: Apply Huffman coding on the 'a'
- 9: Output The codewords of the input

2.6 RLE Decoding

Algorithm 5 RLE Decoding

- 1: **Input** A coded bitstream $b_1b_2...b_N$
- 2: Apply Huffman Decoding on the 'a' and next M bits
- 3: Output The reconstructed data (will be identical to the original data)

2.7 Golomb Coding

More Probable Bit (MPB): If the input is a binary stream, then count the number of 0's (say N_0) and the number of 1's (say N_1), calculate the probability

$$p = \max\left(\frac{N_0}{N_0 + N_1}, \frac{N_1}{N_0 + N_1}\right)$$

to find the more probable bit in the input stream.

Tail Bit: The other bit which is not the MPB.

Parameter m: The optimal value of m is the nearest power of 2 to

$$p \times \frac{\ln 2}{1-n}$$

where p is the probability of the more probable bit in the input stream.

Algorithm 6 Golomb Coding (Assume b is the MPB)

- 1: **Input** An input bitstream and the parameter m
- 2: Break the input into runs of the form $b^i \bar{b}$
- 3: Code each Golomb run $b^i \bar{b}$ as $\bar{b}^q b y$ where
- 4: Divide i by m integer division, we get quotient q and a remainder r
- 5: y is the binary representation of r, using $\log m$ bits
- 6: **If** the last run has a tail
- 7: $tail? = \bar{b}$
- 8: Else
- 9: tail? = Null
- 10: **Output** The final coded bitstream: MPB $code_1 code_2 \dots code_n$ tail?

2.8 Golomb Decoding

Algorithm 7 Golomb Coding (Assume b is the MPB)

- 1: **Input** A coded bitstream $b_1b_2\dots b_N$ and the parameter m
- 2: Grab first bit b as the MPB
- 3: Set k=2 // index of the bits in the coded bitstram
- 4: Scan the bitstream rightward from position k looking for successive 1's, keeping a count q, and incrementing k along the way
- 5: When a 0 is met, read the next $\log m$ bits as y, set $k = k + \log m$
- 6: Set r = b2d(y) // binary to decimal conversion
- 7: Compute $i = q \times m + r$
- 8: Append $b^i \bar{b}$ to the output
- 9: Repeat from 2 until the coded bitstreamis exhausted
- 10: If the last bit (tail?) is b, strip the final bit from the output
- 11: Output The reconstructed data (will be identical to the original data)

2.9 Differential Golomb Encoding

Algorithm 8 Differential Golomb Encoding (Assume b is the MPB)

- 1: **Input** An input bitstream $x_1x_2...x_n$ and the parameter m
- 2: Transform x to $z = z_1 z_2 \dots z_n$ where $z_i = x_i x_{i-1} \forall i > 1$, and $z_1 = x_1$
- 3: Delete the alternating negatives of the tails, we get $z' = z'_1 z'_2 \dots z'_n$
- 4: Record sign of 1^{st} tail, by one bit s: s=1 if 1^{st} tail >0, s=0 otherwise
- 5: Code z' using Golomb coding, and prefix s to the output
- 6: Output The final coded bitstream: MPB $code_1 code_2 \dots code_n$ tail?

2.10 Differential Golomb Decoding

Algorithm 9 Differential Golomb Decoding (Assume b is the MPB)

- 1: **Input** A coded bitstream $b_1b_2...b_N$ and the parameter m
- 2: Set $s = 1^{st}$ bit of the coded bitstream, and remove it from the latter
- 3: Golomb-decode the rest of the coded bitstream into $z' = z'_1 z'_2 \dots z'_n$
- 4: If s == 0, set the first Golumbrun's tail to -1
- 5: Alternate the signs of the remaining tails in z', getting $z = z_1 z_2 \dots z_n$
- 6: Set $x_1 = z_1$, and for i = 2 to n do: $x_i = x_{i-1} + z_i$
- 7: Output The reconstructed data $x_1x_2...x_n$ (will be identical to the original data)