# CSc 461/561 Multimedia Systems Lossless Compression 

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## First things first

- A1 posted on connex
- due on Friday, Jan 23
- any questions?
- Project ideas?
- anything related to multimedia systems
- survey (and evaluate) it for 461 (561)
- group by 3 (or 2) or individual for 461 (561)
- email me by Monday, Jan 26
- [csc461] or [csc561] on subject line

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## Compression

- Why compression?
- there is (a lot of) redundancy!
- How to compress?
- remove data and information redundancy
- Lossless compression
- without information loss
- Lossy compression


## Compressibility

- Compression ratio
$-\mathrm{B}_{0}$ : \# of bits to represent before compression
$-B_{1}$ : \# of bits to represent after compression
- compression ratio $=\mathrm{B}_{0} / \mathrm{B}_{1}$
- Entropy: a measure of uncertainty; min bits
- alphabet set $\left\{\mathrm{s}_{1}, \mathrm{~s}_{2}, \ldots, \mathrm{~s}_{\mathrm{n}}\right\}$
- probability $\left\{\mathrm{p}_{1}, \mathrm{p}_{2}, \ldots, \mathrm{p}_{\mathrm{n}}\right\}$
- entropy: - $\mathrm{p}_{1} \log _{2} \mathrm{p}_{1}-\mathrm{p}_{2} \log _{2} \mathrm{p}_{2}-\ldots-\mathrm{p}_{\mathrm{n}} \log _{2} \mathrm{p}_{\mathrm{n}}$

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## Entropy examples

- Alphabet set $\{0,1\}$
- Probability: \{p, 1-p\}
- Entropy: $\mathrm{H}=-\mathrm{p} \log _{2} \mathrm{p}-(1-\mathrm{p}) \log _{2}(1-\mathrm{p})$
- when $\mathrm{p}=0, \mathrm{H}=0$
- when $\mathrm{p}=1, \mathrm{H}=0$
- when $\mathrm{p}=1 / 2, \mathrm{H}_{\text {max }}=1$
- 1 bit is enough!



## Shannon-Fano algorithm

- Fewer bits for symbols appear more often
- "divide-and-conquer"
- also known as "top-down" approach
- split alphabet set into subsets of (roughly) equal probabilities; do it recursively
- similar to building a binary tree

| Symbol | H | E | L | O |
| :--- | :---: | :---: | :---: | :---: |
| Count | 1 | 1 | 2 | 1 |

Frequency count of the symbols in "HELLO"

## Shannon-Fano: examples



## Shannon-Fano: results

- Prefix-free code
- no code is a prefix of other codes
- easy to decode


| Symbol | Count | $\log _{2} \frac{1}{p_{i}}$ | Code | \# of bits used |
| :---: | :---: | :---: | :---: | :---: |
| L | 2 | 1.32 | 0 | 2 |
| H | 1 | 2.32 | 10 | 2 |
| E | 1 | 2.32 | 110 | 3 |
| O | 1 | 2.32 | 111 | 3 |
| TOTAL number of bits: |  |  |  | 10 |

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* what if $\{0.4,0.3,0.2,0.1\}$


## Shannon-Fano: more results

- Encoding is not unique
- roughly equal
(5)


| Symbol | Count | $\log _{2} \frac{1}{p_{i}}$ | Code | \# of bits used |
| :---: | :---: | :---: | :---: | :---: |
| L | 2 | 1.32 | 00 | 4 |
| H | 1 | 2.32 | 01 | 2 |
| E | 1 | 2.32 | 10 | 2 |
| O | 1 | 2.32 | 11 | 2 |
| TOTAL number of bits: |  |  |  | 10 |

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## Huffman coding

- "Bottom-up" approach
- also build a binary tree
- and know alphabet probability!
- start with two symbols of the least probability
- $\mathrm{s}_{1}: \mathrm{p}_{1}$
- $\mathrm{s}_{2}: \mathrm{p}_{2}$
- $\mathrm{s}_{1}$ or $\mathrm{s}_{2}: \mathrm{p}_{1}+\mathrm{p}_{2}$
- do it recursively



## Huffman coding: examples

- Encoding not unique; prefix-free code
- Optimality: $\mathrm{H}(\mathrm{S})<=\mathrm{L}<\mathrm{H}(\mathrm{S})+1$ Sort combine Sort combine Sort combine Sort combine



## Run-length coding

- Run: a string of the same symbol
- Example
- input: AAABBCCCCCCCCCAA
- output: A3B2C9A2
- compression ratio $=16 / 8=2$
- Good for some inputs (with long runs)
- bad for others: ABCABC
- how about to treat ABC as an alphabet?

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## LZW compression

- Lempel-Ziv-Welch (LZ77, W84)
- Dictionary-based compression
- no a priori knowledge on alphabet probability
- build the dictionary on-the-fly
- used widely: e.g., Unix compress
- LZW coding
- if a word does not appear in the dictionary, add it
- refer to the dictionary when the word appears again


## LZW examples

- Input
- ABABBABCABABBA

- Output
- 124523461

| code | string |
| :---: | :---: |
| ------------- |  |
| 1 | A |
| 2 | B |
| 3 | C |


| A | B | 1 | 4 | AB |
| ---: | :---: | :---: | :---: | :---: |
| B | A | 2 | 5 | BA |
| A | B |  |  |  |
| AB | B | 4 | 6 | ABB |
| B | A |  |  |  |
| BA | B | 5 | 7 | BAB |
| B | C | 2 | 8 | BC |
| C | A | 3 | 9 | CA |
| A | B |  |  |  |
| AB | A | 4 | 10 | ABA |
| A | B |  |  |  |
| AB | B |  |  |  |
| ABB | A | 6 | 11 | ABBA |
| A | EOF | 1 |  |  |

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## This lecture

- Lossless compression
- entropy
- Shannon-Fano algorithm
- Huffman coding
- LZW compression
- Explore further
- decoding: Shannon-Fano, Huffman, LZW
- arithmetic coding [Ref: Li\&Drew 7.6]
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## Next lecture

- Multimedia manipulation
- lossy compression [Ref: Li\&Drew Chap 8]
- rate vs distortion [8.2-3]
- quantization: uniform vs non-uniform [8.4.1-2]
- discrete cosine transform [8.5.1]

