

## 1 Huffman codes CLRS §16.3/ KT §4.8

Recall from last time:

### 1.1 Intro to compression

Huffman coding is probably the most common compression technique today. E.g. used in: zip files, mp3 files, common formats of image files (specifically in cases where we don't want to lose any data).

### 1.2 Prefix codes

*Recall: Prefix codes allow for unambiguous parsing when we have variable length codewords.*

**Definition** A **prefix code** for a set  $S$  is a function

$$\gamma : S \rightarrow \{0, 1\}^*$$

such that for all  $x, y \in S$ ,  $x \neq y$ ,  $\gamma(x)$  is not a prefix of  $\gamma(y)$ .

**Definition** The **average bits per letter** of a prefix code  $\gamma$  is

$$\text{ABL}(\gamma) = \sum_{x \in S} f_x |\gamma(x)|$$

*Goal: given alphabet  $S$  and frequencies  $f$ , we want to find an optimal prefix code  $\gamma$ ; i.e. minimize  $\text{ABL}(\gamma)$ .*

*We can use binary trees to represent prefix codes!*

### Example

$$\text{ABL}(T) =$$

Can this encoding be made more efficient?

**Definition** A binary tree is **full** if

*Claim.* The binary tree corresponding to an optimal prefix code is full.

*Proof.*

### 1.3 Greedy attempt 1: Shannon-Fano 1949

Create tree top-down, splitting  $S$  into

$$f_a = 0.32, \quad f_e = 0.25, \quad f_k = 0.2, \quad f_r = 0.18, \quad f_u = 0.05$$

## 1.4 Greedy attempt 2: Huffman encoding 1952

- *Observation 1.* Lowest frequency symbols should be
- *Observation 2.* The lowest level always contains
- *Observation 3.* The order in which symbols appear

*Claim 1.* There is an optimal prefix code with tree  $T^*$  where

Create tree bottom-up.

### Example

$$f_a = 0.32, \quad f_e = 0.25, \quad f_k = 0.2, \quad f_r = 0.18, \quad f_u = 0.05$$

## 1.5 Algorithm

```
1  if |S| = 2:
2      return
3  Let y and z be
4  S' =
5  Remove y and z from
6  Insert new
7  T' =
8  T =
9  Return
```

*Time complexity*

- Naive implementation
- Use priority queue to store symbols

## 1.6 Proof of correctness/optimal

*Claim 2.*  $ABL(T) =$

*Proof.*

*Claim 3.* The Huffman code achieves the minimum ABL of any prefix codes.

*Proof.*

## 2 Graph Algorithms

### 2.1 Intro - Examples, notation, applications

Graph search/graph exploration problems

*Example applications.* Google pagerank, Facebook social graphs, Google maps, internet routing, biological network (protein-protein interactions), puzzles and games

#### Example

Representing graphs

## 2.2 Breadth-First Search (BFS) (CLRS §22.2)

A motivating example for BFS: Pocket cube ( $2 \times 2 \times 2$  Rubik's cube)

### Example

### BFS

*Input:*

*Output:*

*Idea:*

### Example

```
1 level = { s:0 }
2 parent = { s:None }
3 i = 1
4 frontier = [s]
5 while frontier not empty:
6     next = [ ]
7     for u in
8         for v in
9             if v not in
10                 level[v] =
11                 parent[v] =
12                 next.append
13     frontier =
14     i
```

*Runtime*



*Remarks.*

- For all  $v$ , the path
  
  
  
  
  
  
  
  
  
  
- The set of vertices we explored

**Example**

## 2.3 Depth-First Search (DFS) (CLRS §22.3)

*Idea:*

### Example

```
1
2
3 u.color =
4 for v in
5     if v.color ==
6         v.parent
7         DFS-VISIT
8 u.color =
9 time
10 u.f
```

We usually use DFS to learn something about the graph (as opposed to a vertex as in BFS). We therefore usually use:

```
1
2 for u in
3     u.color =
4     u.parent =
5 for u in
6     if u.color ==
7         DFS-VISIT
```

*Runtime.*

### 2.3.1 Edge Classification

**Definition**     • Tree edge

• Forward edge

• Backward edge

- **Cross edge**

*How can we detect what type of edge  $(u, v)$  is?*

- Tree edge:
- Forward edge:
- Backward edge:
- Cross edge:

To distinguish forward from cross edge,

- In forward edge
- In cross edge

## **Example**

**Theorem 22.10** In a DFS of an undirected graph  $G$ , every edge is either

In other words,

*Proof.*

**Corollary.** An undirected graph is acyclic if and only if

*Proof.*

*What about directed graphs?*

**Theorem 22.9 (white-path theorem)** The vertex  $v$  is a descendant of  $u$  in the DFS forest if and only if

*Proof idea.*

**Lemma 22.11** A directed graph is acyclic if and only if

*Proof.*

### 3 Topological Sort (CLRS §22.4)

Tasks to be performed where some tasks must be completed before others. E.g. prerequisites for courses.  
Input is represent as

#### Example

*Algorithm.*

Input:

1. Run
2. Output

*Runtime.*

**Theorem.** The given algorithm outputs

*Proof.*