

## Review:

### Single Source Shortest Path (SSSP) Algorithms

- |                           |                           |
|---------------------------|---------------------------|
| 1) BFS                    | $O( V  +  E )$            |
| 2) Dijkstra's Algorithm   | $O(( V  +  E ) \log  V )$ |
| 3) Bellman-Ford Algorithm | $O( V  *  E )$            |
| 4) DAG - SSSP - Algorithm | $O( V  +  E )$            |

### Greedy Algorithms:

#### 1) Scheduling:

Thm: First finish time is optimal

Proof: Exchange Argument

#### 2) Compression (Huffman Codes)

Goal: Encode text with  $T$  letters from an alphabet  $\Pi$  with  $n$  letters and frequencies  $\{f_i : i \in \Pi\}$

Ex:  $\Gamma = \{A, B, C, D\}$   $T = 100$

Symbol	Frequency $f_i$	Code 1	Code 2	Code 3
A	80	00	0	0
B	10	01	1	11
C	5	10	10	100
D	5	11	11	101
	Cost:	200	110	130

Prefix-Problem: In Code 2, how to decode

10 = BA or C?

- B and C have same prefix

### Prefix-Free Property:

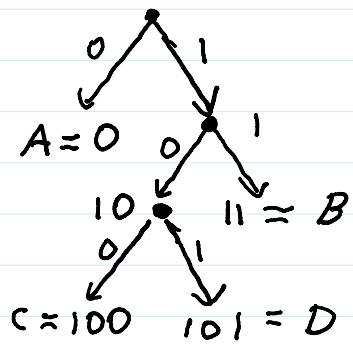
No codeword can be prefix of another

### Tree Representation

Binary tree:

0 in  $i^{\text{th}}$  position  $\Leftrightarrow$  go left in level  $i$

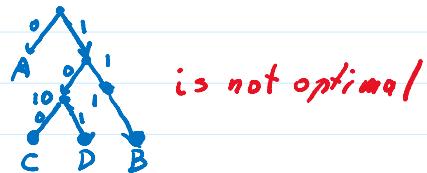
Codewords on leaves  $\Leftrightarrow$  prefix-free



Full binary tree:

every node has 0 or 2 children

Why Full?



is not optimal

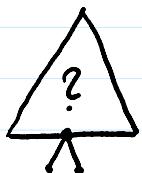
Q: Is the code  $\{0, 11, 100, 101\}$  optimal?

How do we find optimal codes in general?

$$\text{Cost}(T) = \sum_{i=1}^n f_i \times \text{depth of } i$$

Greedy: smallest  $f_i$  should be the leaves with largest depth, say  $f_A$  and  $f_B \Rightarrow$  Build tree bottom up

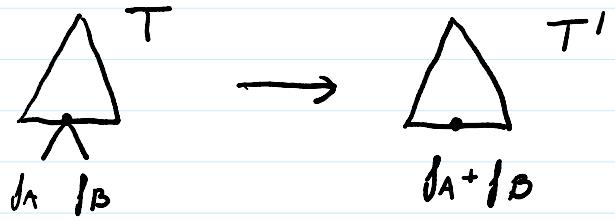
T



$f_A, f_B$

How to continue?

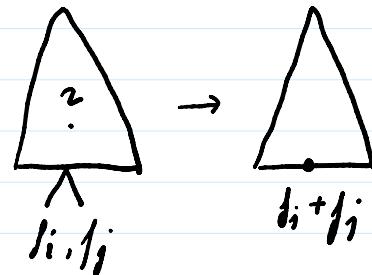
- new alphabet with  $n-1$  letters:  $A' = A \text{ or } B$



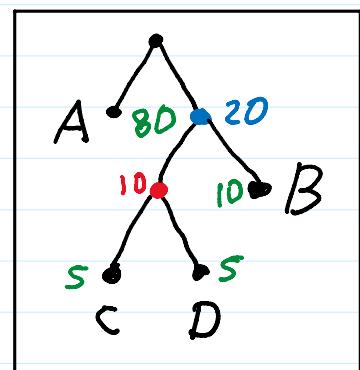
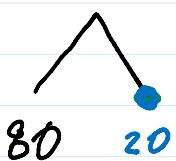
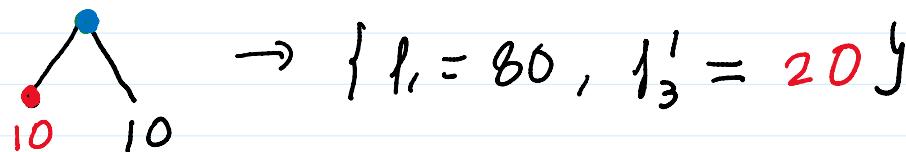
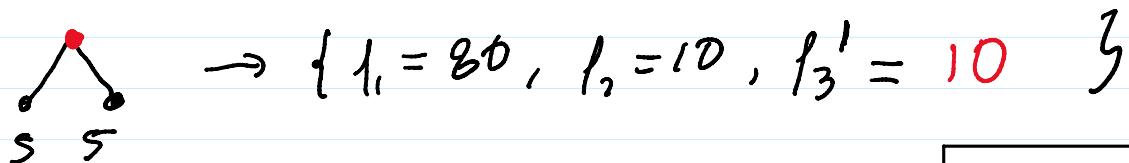
$$\text{cost}(T) = \text{cost}(T') + f_A + f_B$$

## Huffman Code

- Start with  $F = \{f_1, \dots, f_n\}$
- Find lowest two,  $f_i$  and  $f_j$
- Remove  $f_i, f_j$  from  $F$
- Add  $f_i + f_j$  to  $F$
- Iterate



Example  $f_1 = 80, f_2 = 10, f_3 = 5, f_4 = 5$



## Huffman (1)

Input:  $f[1, \dots, n]$  Frequencies

Output: encoding tree with  $n$  leaves

$H =$  priority queue

For  $i=1, \dots, n$ : insert  $(i, f[i])$

For  $k=n+1, \dots, 2n-1$

$u = \text{DeleteMin}$        $v = \text{DeleteMin}$

add  $(k, u)$  and  $(k, v)$  to  $E$

$$f[k] = f[u] + f[v]$$

insert  $(k, f[k])$

### Correctness Proof:

Claim: Order  $f_1 \leq f_2 \leq \dots$ . Then  $\exists$  optimal encoding tree

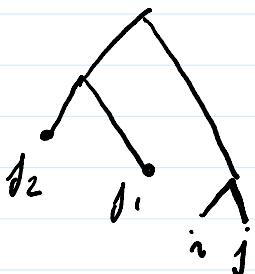
s.t.  $f_1$  and  $f_2$  are assigned to two siblings which are leaves of maximal depth

Pf: Choose optimal encoding tree

Choose leaf  $i$  of maximal depth

Full tree  $\Rightarrow$  must have sibling  $j$

depth( $i$ ) maximal  $\Rightarrow j$  is leaf



exchange  $f_1, f_2$   
with  $f_i, f_j$   
if needed

$\Rightarrow$  cost can only go down  $\Rightarrow$  new optimal tree with property from claim

Lemma: Huffman finds optimal tree

Pf by induction:

Base:  $n=2$  trivial

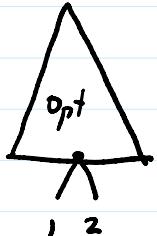
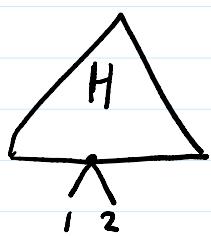


PF:  $n \rightarrow n+1$

$T_{n+1}$  optimal. By Claim 1

$\Rightarrow \exists T_{n+1}$  s.th.  $T_{n+1}$  is optimal and 1 and 2 are leaves

Define  $T_n$  by pruning  $T_{n+1}$



$$\text{cost}(H_{n+1}) = f_1 + f_2 + \text{cost}(H_n)$$

$$\text{cost}(T_{n+1}) = f_1 + f_2 + \text{cost}(T_n)$$

By induction

$$\text{cost}(H_n) \leq \text{cost}(T_n)$$

$$\Rightarrow \text{cost}(H_{n+1}) \leq \text{cost}(T_{n+1})$$

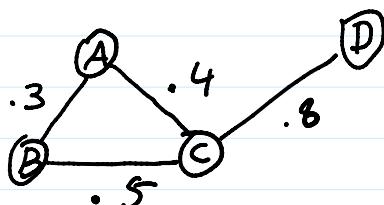
$H_{n+1}$  is optimal

■

Kruskal and Prim

Given Graph

$$G = (V, E)$$



Goal: Find edge subset  $T \subseteq E$  with minimal

total weight  $W(T) = \sum_{e \in T} w_e$  which keeps  $G$

connected!

Rem: We can choose  $T$  to have no cycles,  
i.e., to be a tree

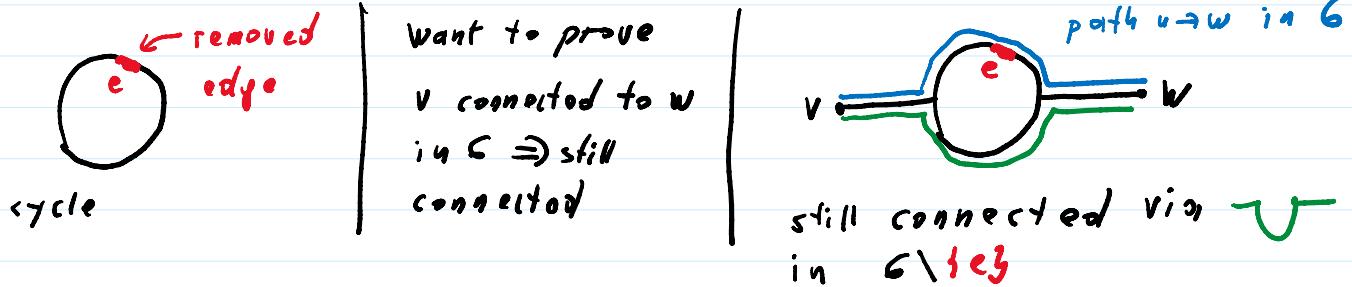
⇒ Problem become to find  
minimum spanning tree (MST)

### Trees

Def: An undirected connected graph  
without cycles

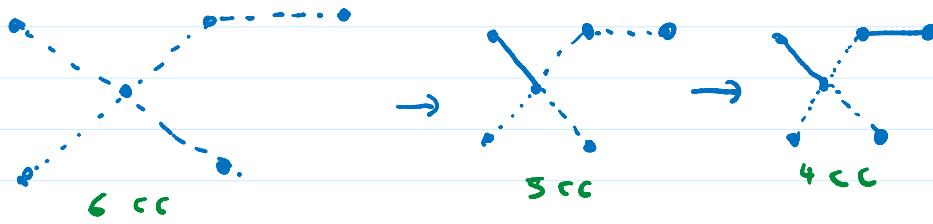
Claim 1: If  $G$  is connected and contains a  
cycle, removing any edge  $e$  on a cycle can't  
disconnect it

Pf by Picture:



Claim 2: A tree  $T$  with  $n$  nodes has  $n-1$  edges

Pf: Remove all edges, add them back one by one.  
Each time, we reduce # of connected components (cc) by 1



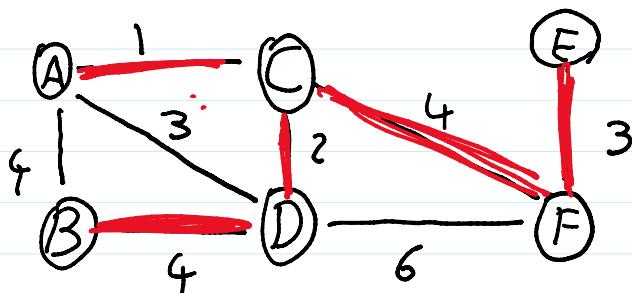
Note: we can never add an edge within a CC, since that would create a cycle.

Claim 3: IF  $G$  is connected with  $n$  nodes and  $n-1$  edges  $\Rightarrow G$  is a tree

Pf: Follows from Claim 1 + 2

### Greedy Algorithm (Kruskal)

- Choose edges in order of weights
- Skip an edge if it creates cycle



- Prove it is optimal!
- Find data structure to implement it

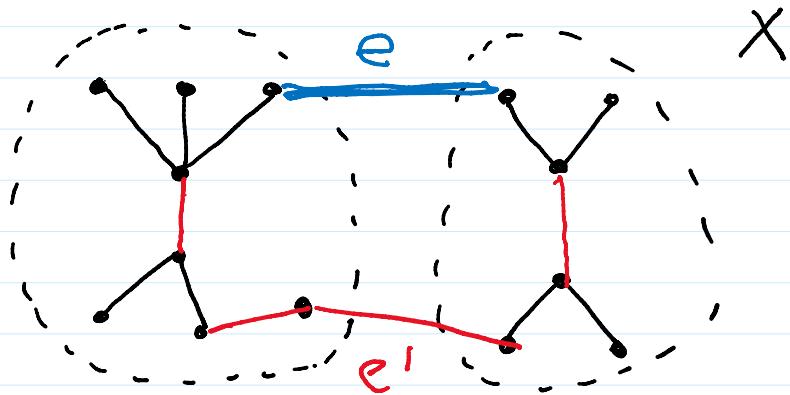
### The Cut Property:

Suppose  $X \subseteq E$  is part of a MST of  $G$

Let  $S \subseteq V$  s.t.  $X$  has no edge from  $S$  to  $V \setminus S$

Let  $e$  be the lightest edge from  $S$  to  $V \setminus S$

Then:  $X \cup e$  is part of some MST



PF: let  $T$  be the MST s.t.  $X \subseteq T$

let  $e' \in T$  s.t. it connects  $S$  to  $V \setminus S$

add  $e$  to  $T \Rightarrow$  creates cycle

remove  $e' \Rightarrow$  still connected

$n-1 + 1 - 1$  edges  $\Rightarrow$  new tree  $T'$

$$W(T') = W(T) - w_{e'} + w_e \leq W(T)$$

Rem: The partition  $S, \bar{S} = V \setminus S$  is called  
a cut

Prove Kruskal finds MST

Recall: Adds lightest edge  $e$  not creating cycle

$X$  edges at time  $t \Rightarrow$



$\Rightarrow$  If  $X$  is part of MST, so is  $X \cup \{e\}$

### Proof (K finds MST)

By induction

Base Case  $X = \emptyset$

$|X| = k \rightarrow |X| = k+1$  Cut property

### Implementation of Kruskal

How to check for cycles?

Keep track of connected comp. (CC)

### Disjoint Set Datastructure ("Union Find")

- $\text{makeset}(x)$  makes singleton containing  $x$
- $\text{Find}(x)$  which set does  $x$  belong to
- $\text{union}(x,y)$  merges sets contain.  $x, y$

### Kruskal(G, w)

For all  $v \in V$   $\text{makeset}(v)$

$X = \{\}$

Sort edges in  $E$  by  $w(\cdot)$

$\forall \{u, v\} \in E$  in that order

if  $\text{Find}(u) \neq \text{Find}(v)$

add  $\{u, v\}$  to  $X$

$\text{union}(u, v)$

return  $X$

$$n = |V|, m = |E|$$

$n$  makeset

$$\begin{aligned} &\text{sort } O(m \log m) \\ &= O(m \log n) \end{aligned}$$

$2m$  Find

$n-1$  union

## Running time

makeset O(1) union, find log n

total:  $O((m+n) \log n)$

## Master Algorithm

$$X = \emptyset$$

repeat until  $|X| = n-1$

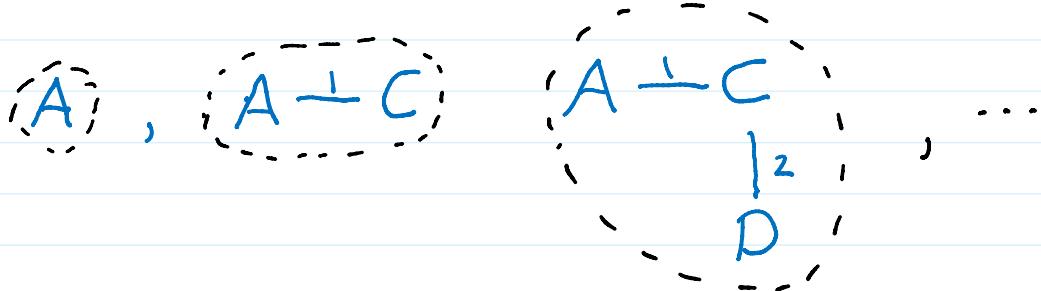
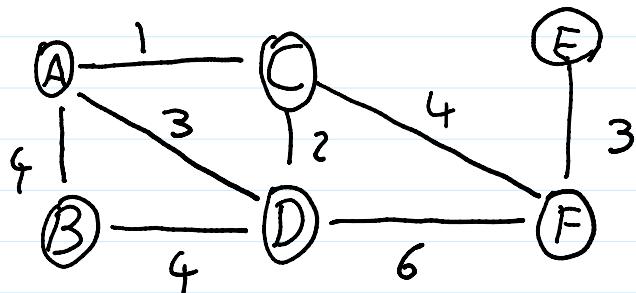
pick  $S \subseteq V$  s.t.  $X$  contains no edge between  $S \cup \bar{S}$

let  $e$  be minimum weight edge between  $S \cup \bar{S}$

$$X = X \cup \{e\}$$

## Prims Alg:

Choose  $S$  to be connected



Effectively, need to minimize

$$\text{cost}(v) = \min_{u \in S} w(v, u)$$

to decide which new vertex  $v$  to add

### Prim(G, w)

$\forall u \in V \ cost(u) = \infty, \ prev(u) = \text{nil}$

Pick any  $u_0 \in V$

$cost(u_0) = 0$

$\forall v \in V \ insert \ key(v, cost(v))$

while queue non empty

$v = \text{DeleteMin}$

$\forall \{v, u\} \in E$

if  $cost(u) > w(v, u)$

$cost(u) = w(v, u)$

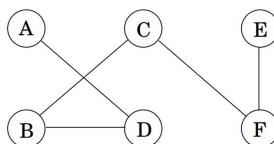
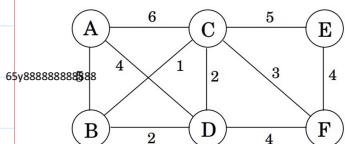
$prev(u) = v$

$\text{DecreaseKey}(u)$

$O(n)$  insert, delete  $O(m)$  decrease key

$\rightarrow O((n+m) \log n)$  running time

### Example



Set $S$	$A$	$B$	$C$	$D$	$E$	$F$
{}	0/nil	$\infty/\text{nil}$	$\infty/\text{nil}$	$\infty/\text{nil}$	$\infty/\text{nil}$	$\infty/\text{nil}$
$A$		$5/A$	$6/A$	$4/A$		$\infty/\text{nil}$
$A, D$		$2/D$	$2/D$		$\infty/\text{nil}$	$\infty/\text{nil}$
$A, D, B$			$1/B$		$\infty/\text{nil}$	$4/D$
$A, D, B, C$					$5/C$	$4/D$
$A, D, B, C, F$					$4/F$	$3/C$

← cost/pre