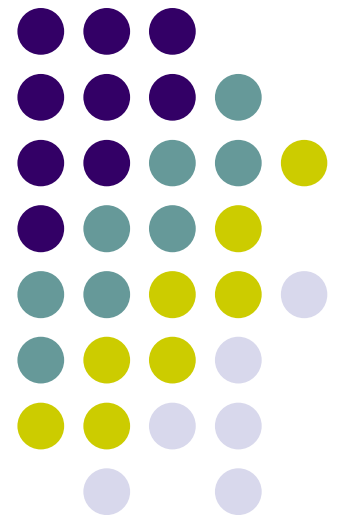


# Algorithms

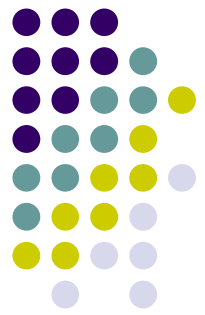
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## Lesson #3: Greedy Algorithms (cont.)

(Based on slides by Prof. Dana Shapira)



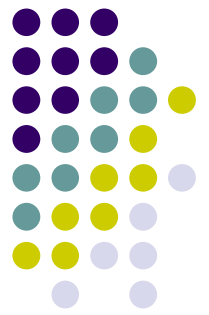
# Binary codes



## Example

	a	b	c	d	e	f	
Frequency	45	13	12	16	9	5	
Fixed-length Codeword ( $C_1$ )	000	001	010	011	100	101	$L(C_1) = 300$
Variable-length codeword ( $C_2$ )	0	101	100	111	1101	1100	$L(C_2) = 224$

Which one is cheaper?



# Prefix-free Codes

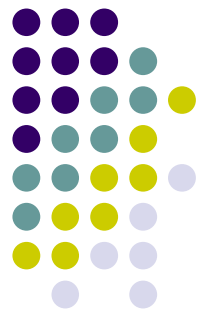
- Codes in which no codeword is also a prefix of some other codeword.
  - Example:

	a	b	c	d	e	f
Variable-length codeword	0	101	100	111	1101	1100

110001001101

- Easy to encode and decode using prefix-free codes.
- No Ambiguity !! **Uniquely Decipherable (UD)**

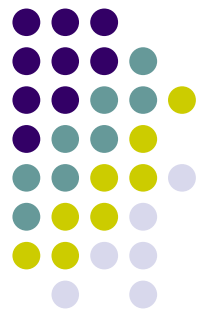
# Prefix-free Codes



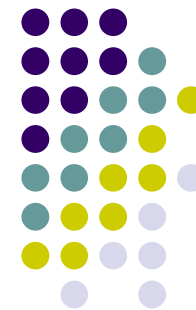
	a	b	c	d	e	f
Variable-length codeword	0	101	100	111	<del>1101</del>	1100
	0	101	100	111	110	1100

- $1100 = 110\ 0 = \text{"f"}$
- or
- $1100 = 110 + 0 = \text{"ea"}$

# Prefix-free Codes



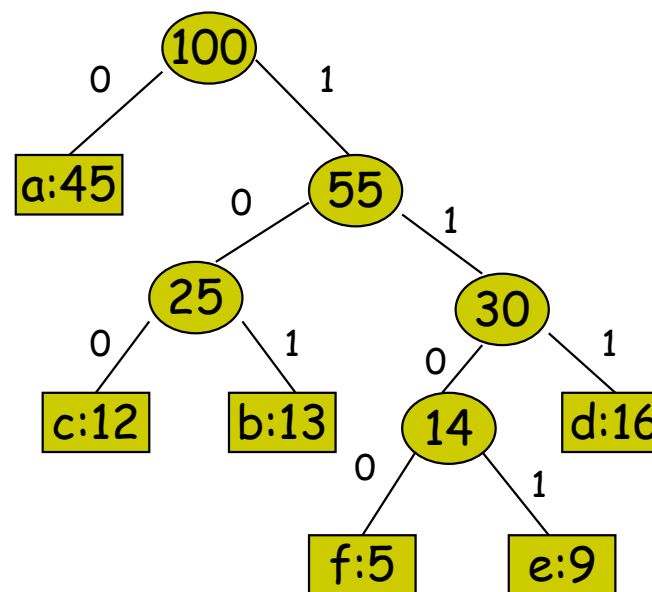
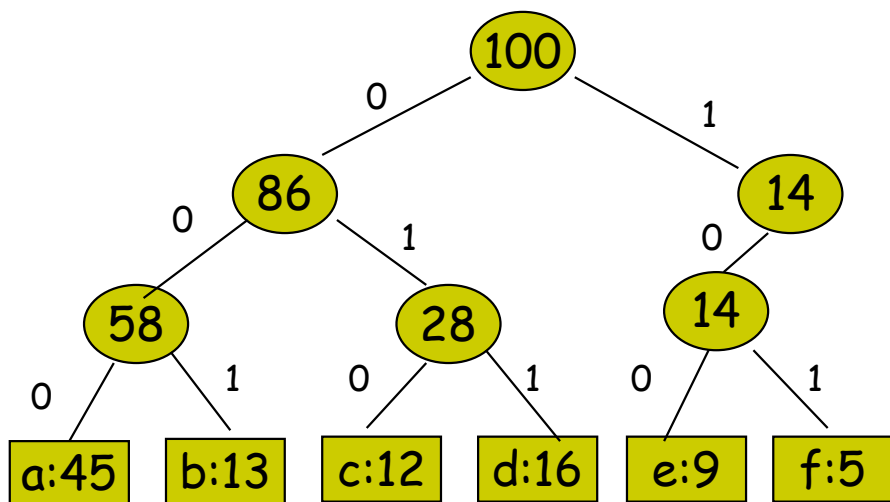
- Represented as a binary tree
  - each **edge** represents either 0 (left) or 1 (right)
  - each **leaf** corresponds to a codeword which is the sequence of 0s and 1s traversed from the root to reach it.
- Since no prefix is shared, all codewords are at the leaves, and decoding a string means following edges, according to the sequence of 0s and 1s in the string, until a leaf is reached.



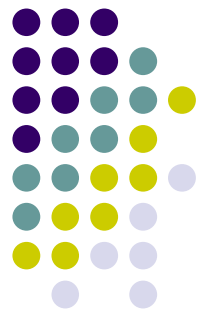
# Tree Representation

	a	b	c	d	e	f
Frequency	45	13	12	16	9	5
Fixed-length codeword	000	001	010	011	100	101

	a	b	c	d	e	f
Frequency	45	13	12	16	9	5
Variable-length codeword	0	101	100	111	1101	1100

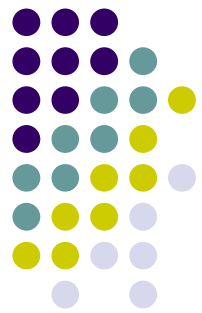


# Building an optimal binary code



**Problem:** We are given a set of symbols with frequencies.  
How can we build an optimal code for them?

V	W	X	Y	Z
7	15	6	5	6



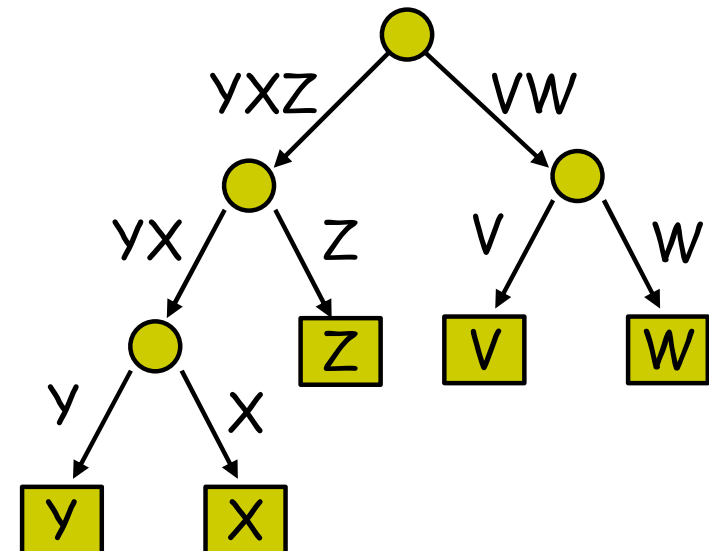
# Shannon-Fano algorithm

- Sort the symbols by frequency
- Always split as close to the middle as possible (w.r.t. frequency)

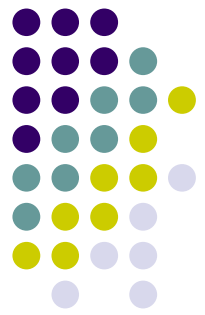
V	W	X	Y	Z
7	15	6	5	6

Y	X	Z	V	W
5	6	6	7	15
	17		22	
Y	X	Z		
5	6	6		
11		6		

Total: 39

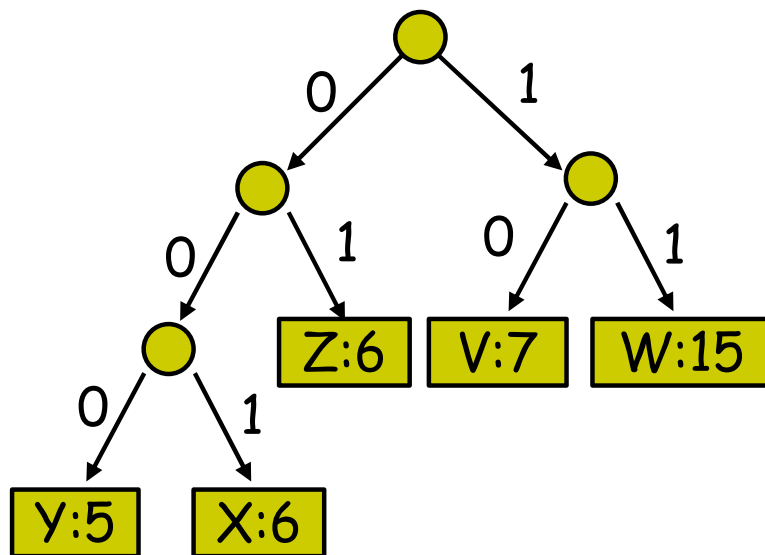






V	W	X	Y	Z
7	15	6	5	6

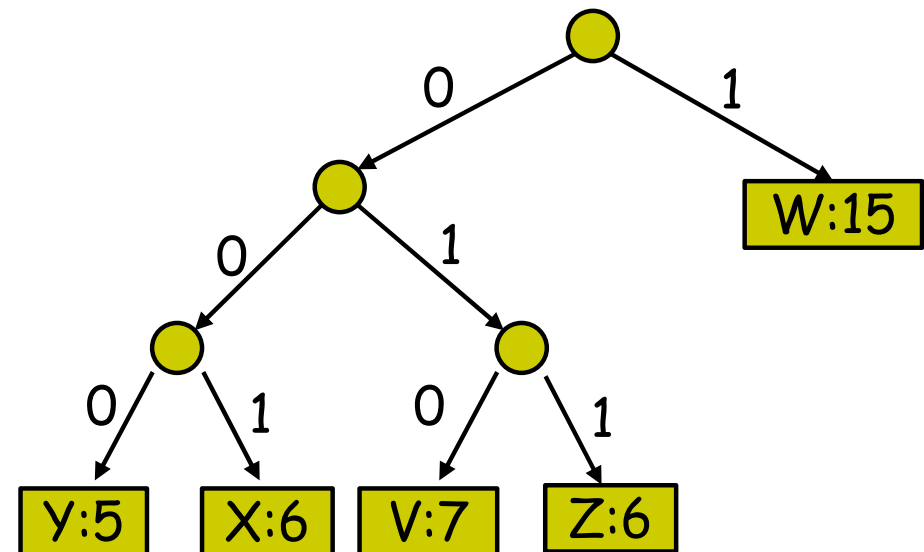
The Shannon-Fano code:



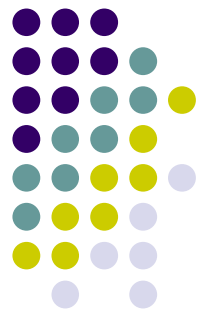
$$L = 89$$

Is this optimal?

A better code:



$$L = 87$$

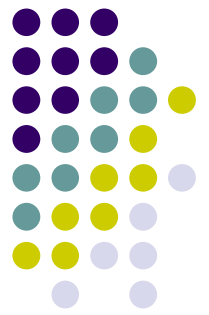


# Huffman Algorithm

- Greedy
  - The two smallest nodes are chosen at each step, and this local decision results in a globally optimal encoding tree.
- bottom-up manner
  - Starts with a set of  $|\Sigma|$  leaves and performs a sequence of  $|\Sigma| - 1$  "merging" operations to create the final tree.

Professor David A. Huffman  
(August 9, 1925 - October 7, 1999)





# Huffman Algorithm

**HUFFMAN** ( $\Sigma$ )

1  $n \leftarrow |\Sigma|$

2  $Q \leftarrow \Sigma$

3 for  $i \leftarrow 1$  to  $n - 1$

4     do **ALLOCATE-NODE** ( $z$ )

5          $left[z] \leftarrow x \leftarrow \text{EXTRACT-MIN}(Q)$

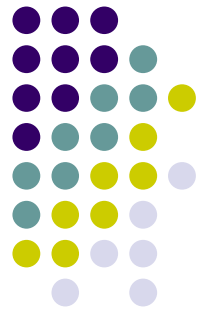
6          $right[z] \leftarrow y \leftarrow \text{EXTRACT-MIN}(Q)$

7          $w[z] \leftarrow w[x] + w[y]$

8         **INSERT** ( $Q, z$ )

9 return **EXTRACT-MIN** ( $Q$ )

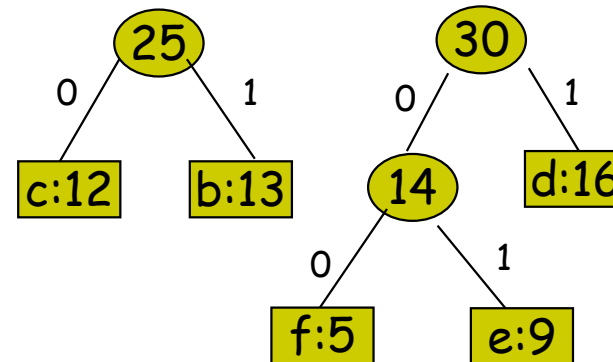
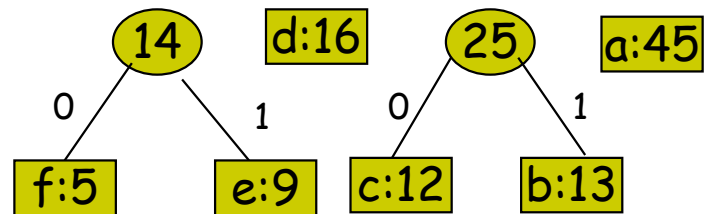
What is the running time?



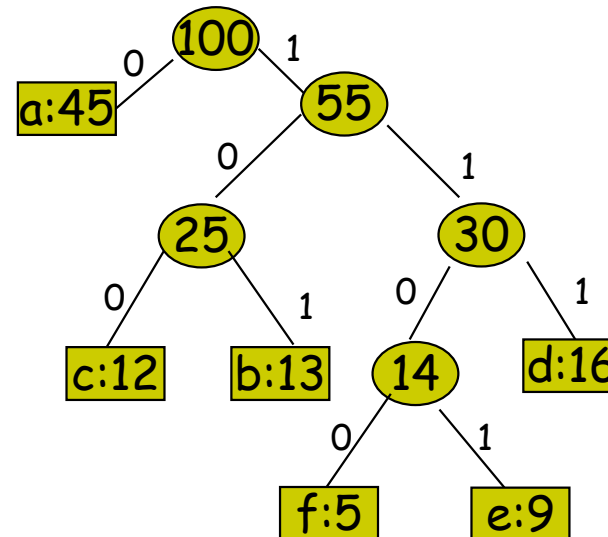
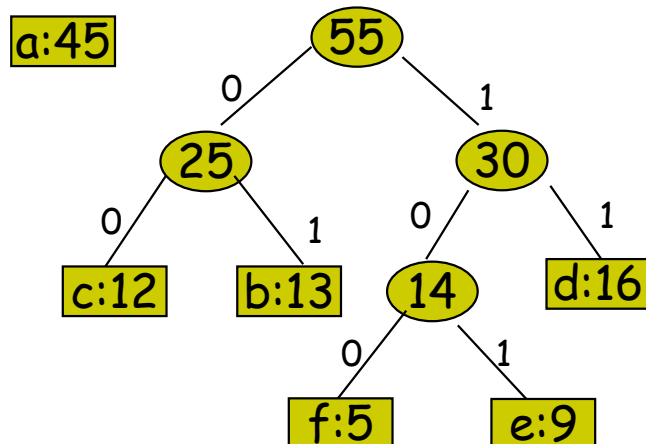
# Huffman Algorithm

f:5 e:9 c:12 b:13 d:16 a:45

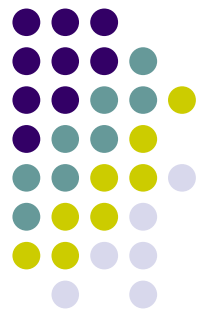
c:12 b:13 14 d:16 a:45



a:45



# Optimality of Huffman Codes



## Theorem:

Given weights  $w_1, \dots, w_n$ . Huffman Algorithm assigns code lengths  $l_1, \dots, l_n$  such that  $L = \sum w_i l_i$  is minimal.

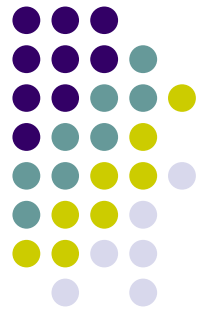
## Lemma 1:

An optimal code for a file is always represented by a full binary tree, in which every non-leaf node has two children.

## Lemma 2:

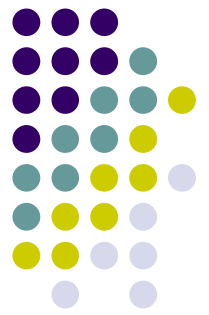
In an optimal tree the two lowest weights  $w_{n-1}$  and  $w_n$  are in the lowest level.

# Optimality of Huffman Codes



## Lemma 3:

In an optimal tree the two lowest weights  $w_{n-1}$  and  $w_n$  can be assumed to be brothers.

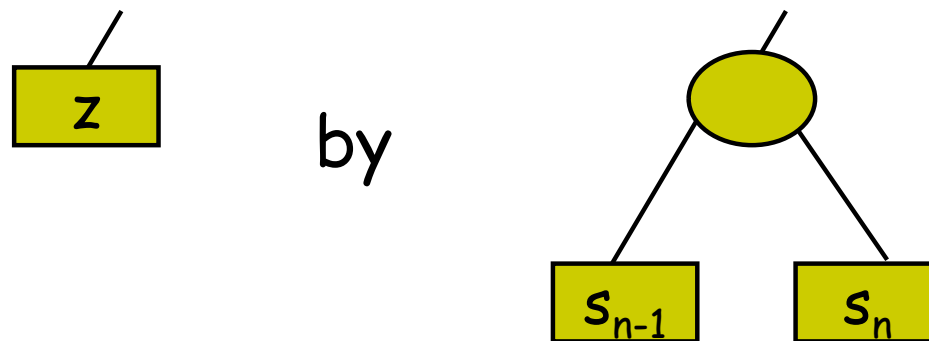


# Optimality of Huffman Codes

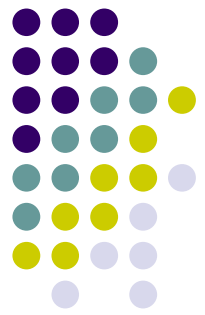
## Proof that Huffman is optimal:

By induction on  $n$ .

Given  $\Sigma = (s_1, \dots, s_n)$  with multiplicities  $(w_1, \dots, w_n)$ , Huffman replaces symbols  $s_{n-1}, s_n$  by a new symbol  $z$  with multiplicity  $w_{n-1} + w_n$ , then constructs a tree  $T'$  for  $\Sigma' = (s_1, \dots, s_{n-2}, z)$ , then obtains  $T$  by replacing



By induction assumption,  $T'$  is optimal

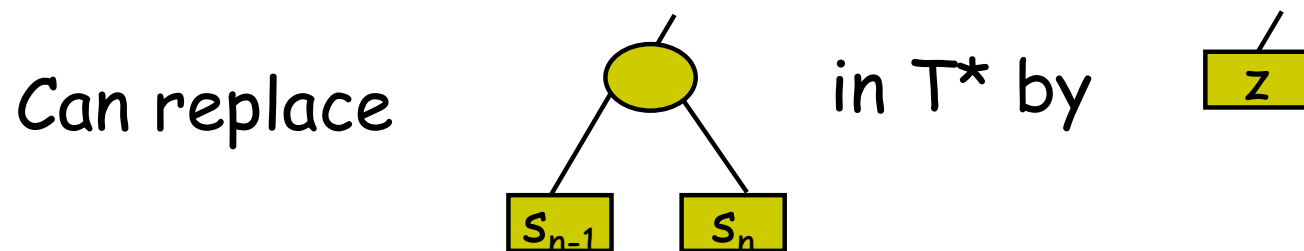


What is the relation between  $L(T)$  and  $L(T')$ ?

$$L(T) = L(T') + w_{n-1} + w_n \quad (1)$$

Suppose for a contradiction that there exists a tree  $T^*$  for  $\Sigma$  with  $L(T^*) < L(T)$

W.l.o.g.  $s_{n-1}, s_n$  are neighbors in  $T^*$



By (1), we got a tree for  $\Sigma'$  better than  $T'$ . **Contradiction**