

# ***Data Compression***

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3. minimize time of searching inside files.

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  2. **Problem:** encode message by assigning codes to symbols;
  3. table of codes is stored for decoding;

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- **traditional implementation:** when considering characters as symbols, it can comprise text in  $\approx 25\%$ ;
- when considering words as symbols, it can comprise text in  $\approx 60\%$ ;

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- Codes for the symbols are binary sequences;
- **Advantage of using prefix codes:** facility for encoding and decoding;



## **Huffman's Algorithm: encoding and decoding**

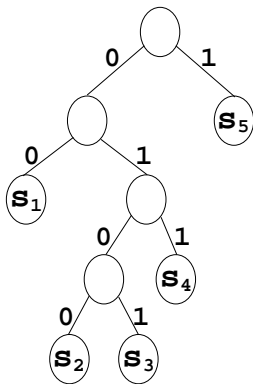
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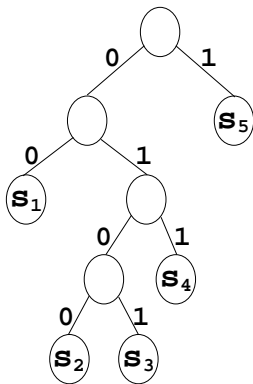
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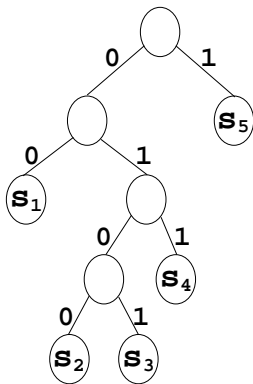


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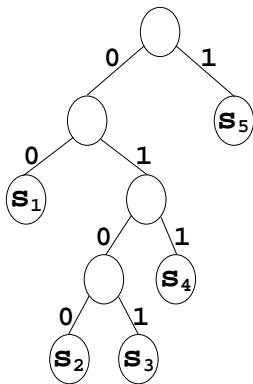


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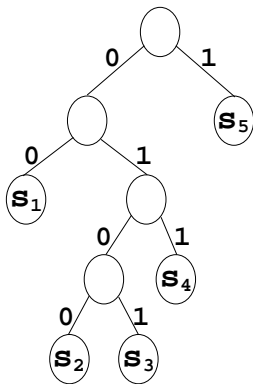


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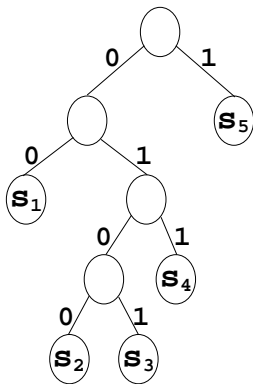


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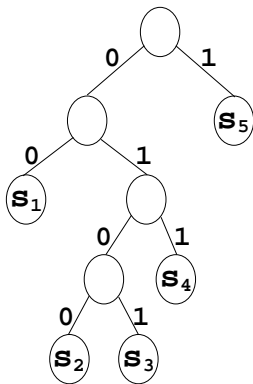
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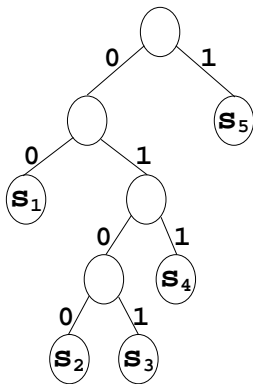


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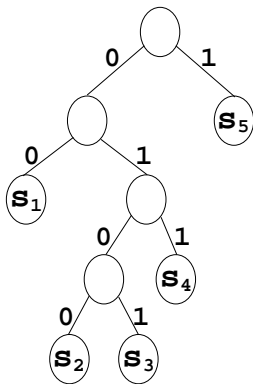


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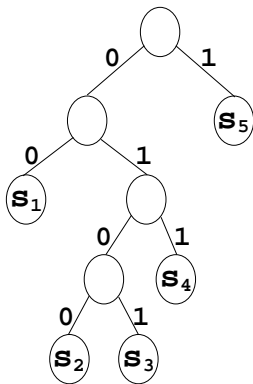


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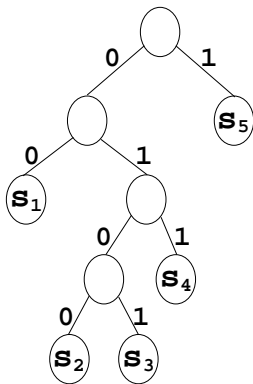


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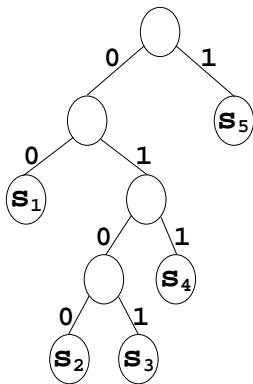


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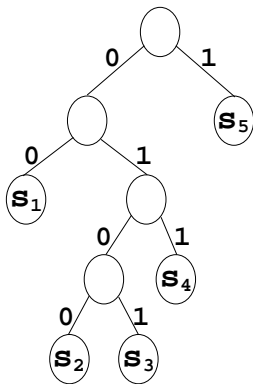


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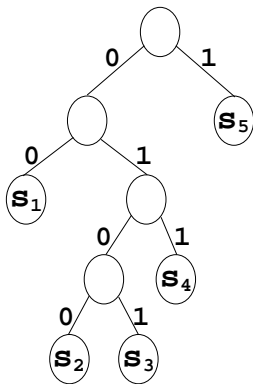


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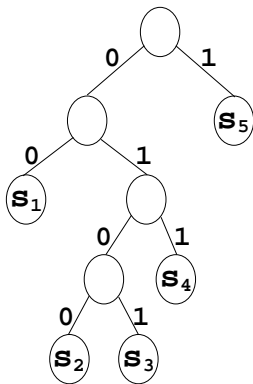
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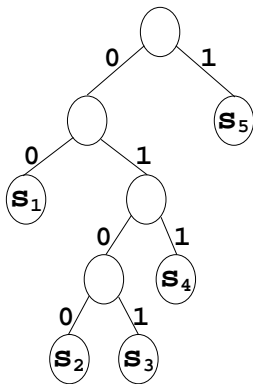


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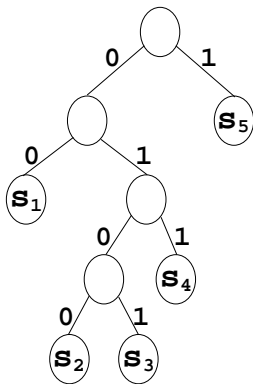


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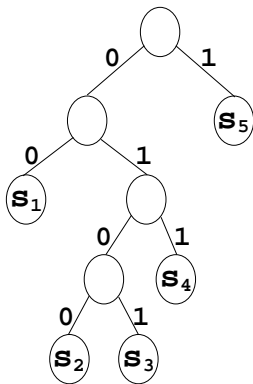


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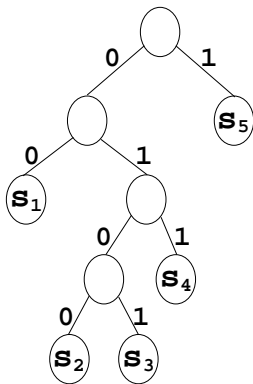


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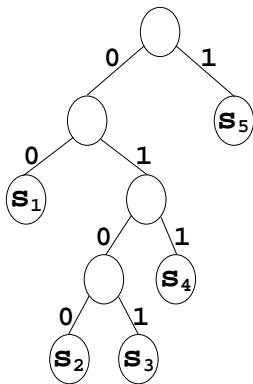


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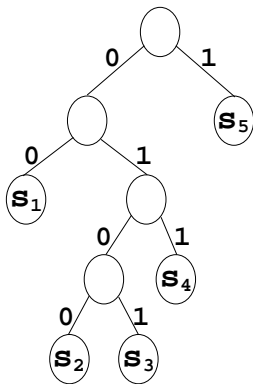


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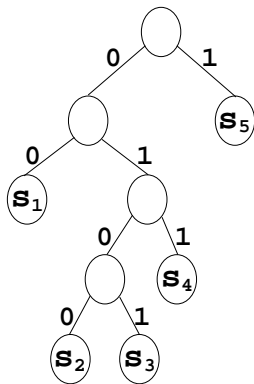


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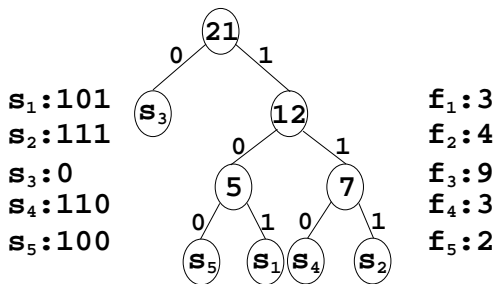
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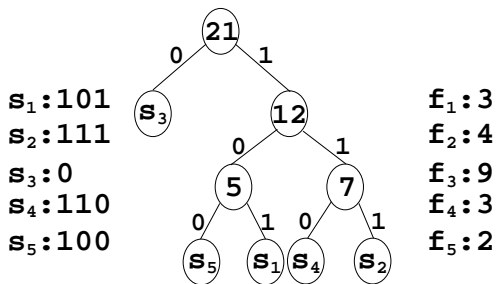
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- **Minimum Tree** or **Huffman tree**: prefix tree  $T$  with the lowest  $c(T)$ ;

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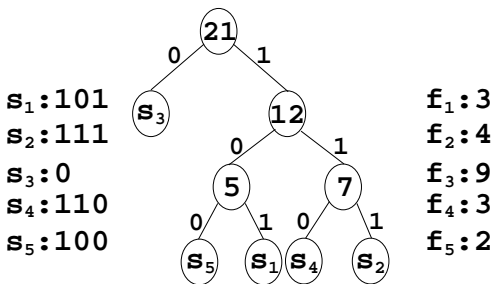


## Huffman's Algorithm



$s_4 s_3 s_3 s_1 s_3 s_1 s_4 s_5 s_1 s_3 s_3 s_3 s_3 s_2 s_3 s_5 s_2 s_2 s_2 s_4$  gives

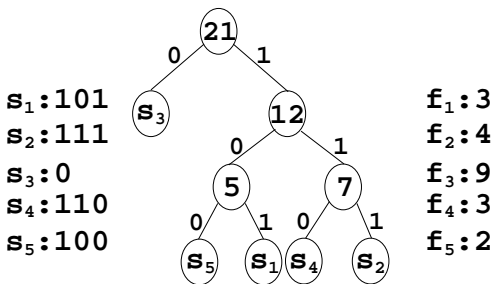
## Huffman's Algorithm



$s_4 s_3 s_3 s_1 s_3 s_1 s_4 s_5 s_1 s_3 s_3 s_3 s_3 s_2 s_3 s_5 s_2 s_2 s_2 s_4$  gives  
 11000101010111010010100000111010011111111110



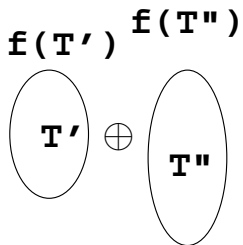
## Huffman's Algorithm



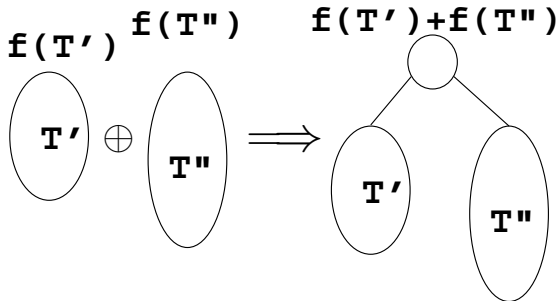
$s_4 s_3 s_3 s_1 s_3 s_1 s_4 s_5 s_1 s_3 s_3 s_3 s_3 s_2 s_3 s_5 s_2 s_2 s_2 s_4$  gives  
 11000101010111010010100000111010011111111110  
 which has  $c(T) = 45$  and it is the minimum.

## Huffman's Algorithm Idea

## Huffman's Algorithm Idea



## Huffman's Algorithm Idea

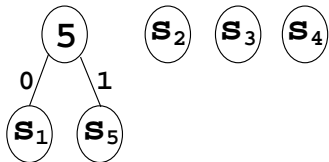


## Construction of Huffman Tree

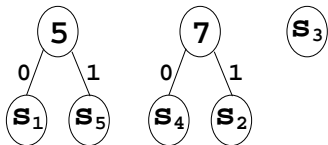
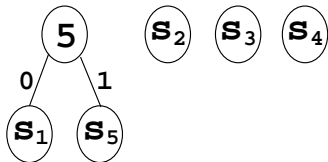
## Construction of Huffman Tree



## Construction of Huffman Tree

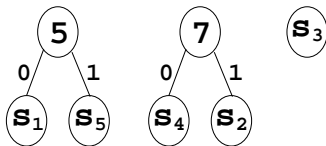


## Construction of Huffman Tree

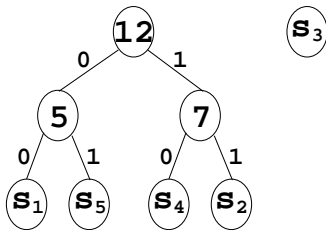
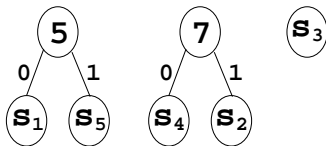




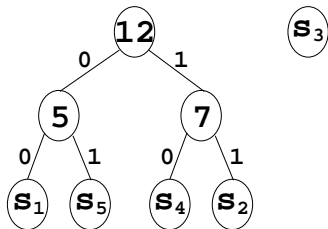
## Construction of Huffman Tree



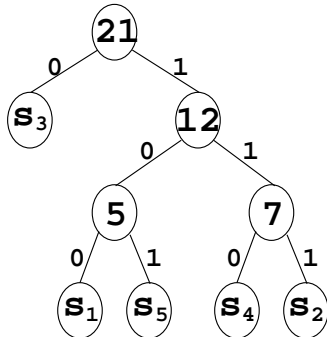
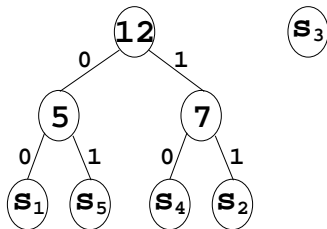
## Construction of Huffman Tree



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## Construction of Huffman Tree



## Huffman's Algorithm: inserting into a priority queue

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```
1  insert( $T, f, F$ ):  
2     $F[n + 1] \leftarrow T$   
3     $n++$   
4    ascend( $n$ )
```

## Huffman's Algorithm: inserting into a priority queue

```
1  insert( $T, f, F$ ):  
2     $F[n + 1] \leftarrow T$   
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4    ascend( $n$ )
```

```
1  ascend( $i$ ):  
2     $j = \lfloor i/2 \rfloor$   
3    if  $j \geq 1$  then  
4        if  $T[i] < T[j]$  then  
5             $T[i] \Leftrightarrow T[j]$   
6            ascend( $j$ )
```

## Huffman's Algorithm: inserting into a priority queue

```
1 insert( $T, f, F$ ):  
2    $F[n + 1] \leftarrow T$   
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1 ascend( $i$ ):  
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3   if  $j \geq 1$  then  
4       if  $T[i] < T[j]$  then  
5            $T[i] \Leftrightarrow T[j]$   
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```

- **insert( $T, f, F$ )** and **ascend( $i$ )**: priority queue methods implemented by a heap data structure;



## Huffman's Algorithm: deletion from priority queue

## Huffman's Algorithm: deletion from priority queue

```
1  minimum( $T, f, F$ ):  
2    if  $n \neq 0$  then  
3      remove  $T[1]$   
4       $T[1] \leftarrow T[n]$   
5       $n \leftarrow n - 1$   
6      descend(1,  $n$ )
```

## Huffman's Algorithm: deletion from priority queue

```
1  minimum( $T, f, F$ ):  
2      if  $n \neq 0$  then  
3          remove  $T[1]$   
4           $T[1] \leftarrow T[n]$   
5           $n \leftarrow n - 1$   
6          descend(1,  $n$ )
```

```
1  descend( $i, n$ ):  
2       $j = 2 * i$   
3      if  $j \leq n$  then  
4          if  $j < n$  then  
5              if  $T[j + 1] < T[j]$  then  
6                   $j = j + 1$   
7          if  $T[i] > T[j]$  then  
8               $T[i] \leftrightarrow T[j]$   
9              descend( $j, n$ )
```

## Huffman's Algorithm: deletion from priority queue

```
1  minimum( $T, f, F$ ):  
2    if  $n \neq 0$  then  
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7      if  $T[i] > T[j]$  then  
8         $T[i] \leftrightarrow T[j]$   
9        descend( $j, n$ )
```

- **minimum( $T, f, F$ ) and descend(1,  $n$ ):** priority queue methods implemented by a heap data structure;

## Huffman's Algorithm

```
1  huffman():  
2    for  $i \leftarrow 1$  to  $n - 1$  do  
3      minimum( $T'$ ,  $f$ ,  $F$ );  
4      minimum( $T''$ ,  $f$ ,  $F$ );  
5       $T \leftarrow T' \oplus T''$ ;  
6       $f(T) \leftarrow f(T') \oplus f(T'')$ ;  
7      insert( $T$ ,  $f$ ,  $F$ );
```

## Huffman's Algorithm

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- Operation of minimization or insertion in the priority queue:  $O(\log n)$ ;

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- Operation of minimization or insertion in the priority queue:  $O(\log n)$ ;
- operation  $\oplus$  requires constant number of steps;
- Total:  $n - 1$  iterations;
- **Complexity:**  
 $O(n \log n)$ ;

## Exercises

1. Draw a Huffman tree for the following set of keys and frequencies, respectively in the first and second lines of the table:

$s_1$	$s_2$	$s_3$	$s_4$	$s_5$	$s_6$	$s_7$	$s_8$
1	6	2	1	1	9	2	3

2. The resulting tree from Huffman's algorithm is unique, i.e., the algorithm always returns the same tree?

## Bibliography

SZWARCFITER, J. L. and MARKENZON, L. Estruturas de Dados e seus Algoritmos, LTC, 1994. (in Portuguese)

ZIVIANI, N. Projeto de Algoritmos: com implementações em Java e C++, Cengage Learning, 2009. (in Portuguese)

Questions?