

## Ch 11.2 Applications of Trees

- **Problems** can be studied using trees
- How should items in a list be stored so that an item can be easily located?
- What series of decisions should be made to find an object with a certain property in a collection of objects of a certain type?
- How should a set of characters be efficiently coded by bit strings?
- What sequence of moves does a player make in a game?

# Applications of Trees

- Binary search trees
  - A simple data structure for sorted lists
- Decision trees
  - Minimum comparisons in sorting algorithms
- Prefix codes
  - Huffman coding
- Game trees
  - Determine moves a player makes

# Applications of Trees

- Binary Search Trees

A binary search tree:

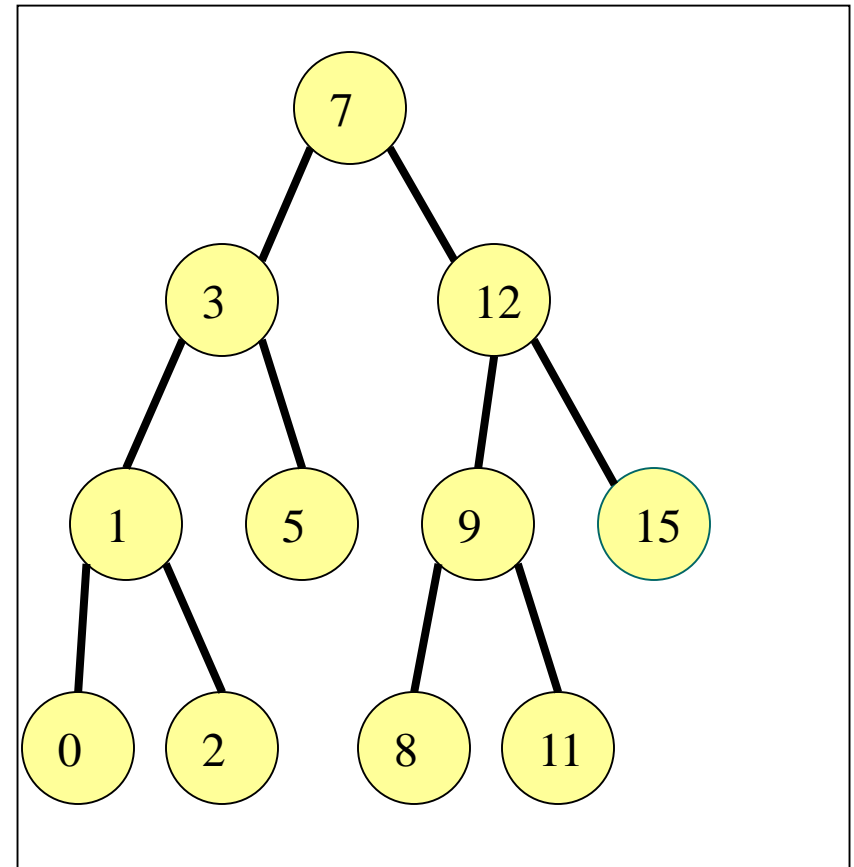
is a binary tree

if a node has value  $N$ , all values in its left sub-tree are less than or equal to  $N$ , and all values in its right sub-tree are greater than  $N$ .

# Applications of Trees

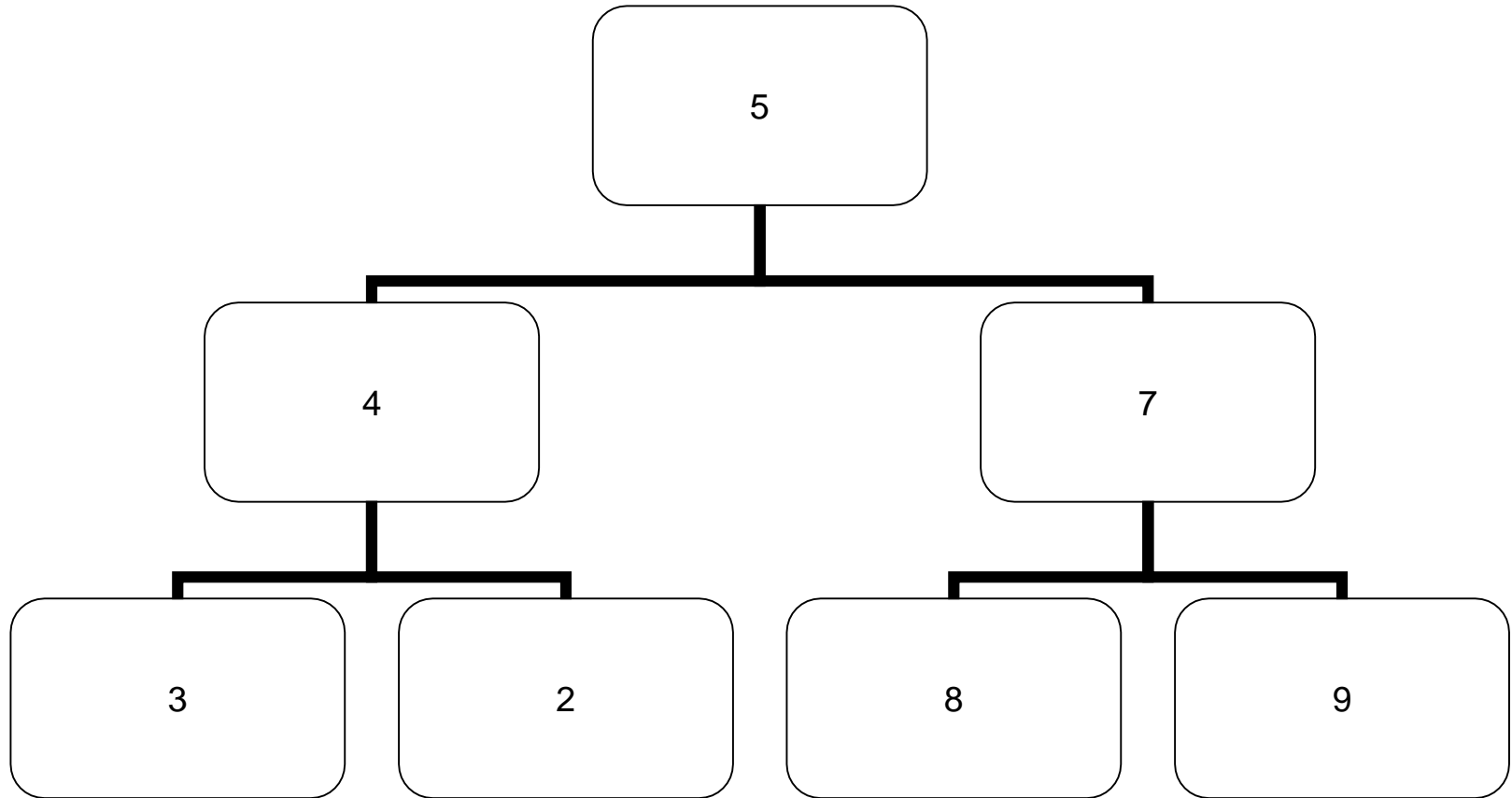
## Binary Search Tree Format

- Items are stored at individual tree nodes.
- We arrange for the tree to always obey this invariant:
- For every item  $x$ ,
  - Every node in  $x$ 's left subtree is less than  $x$ .
  - Every node in  $x$ 's right subtree is greater than  $x$ .



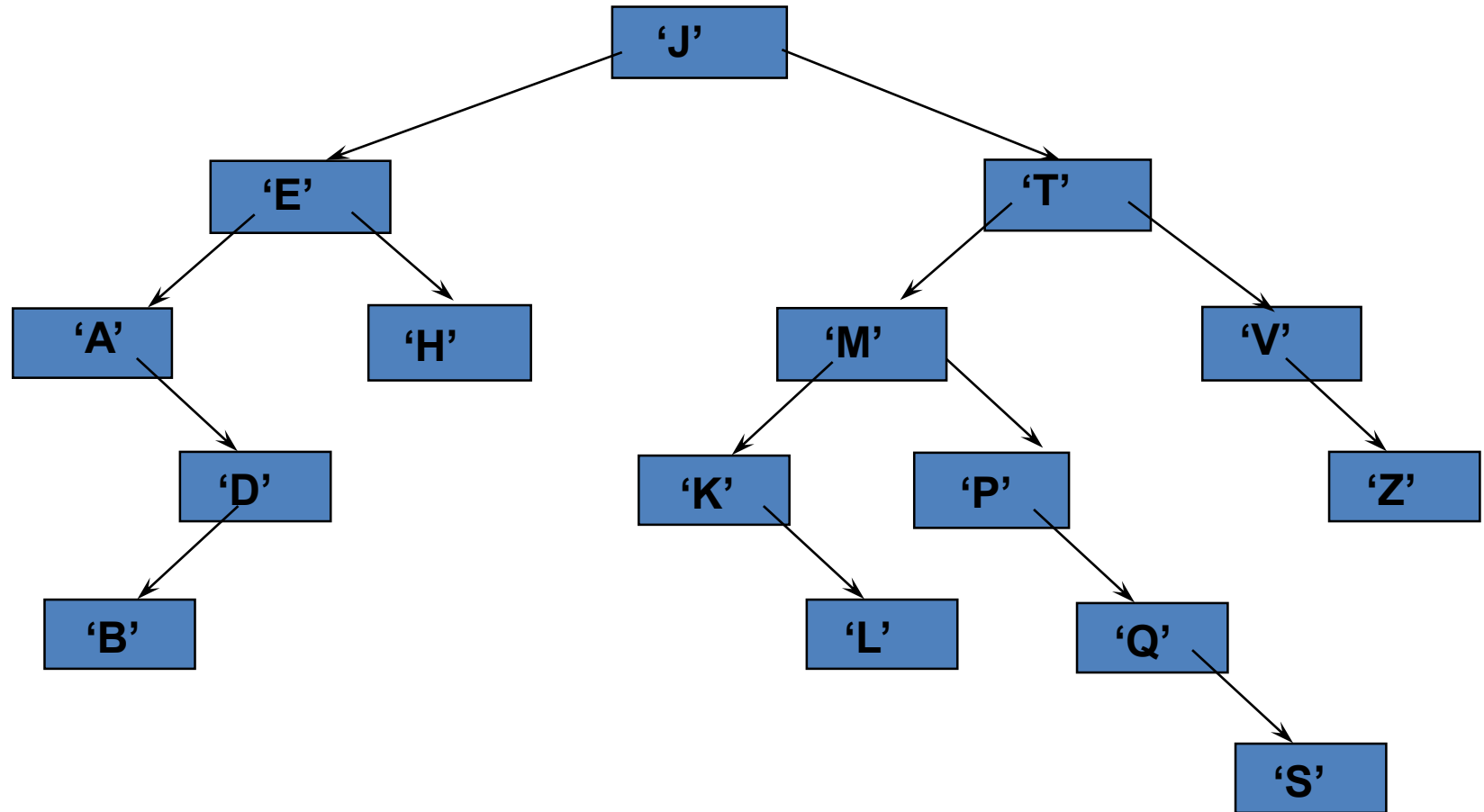
# Applications of Trees

Is this a binary search tree?



# Applications of Trees

Is this a binary search tree?



# Binary Search Trees

mathematics

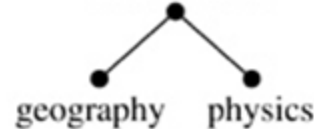


mathematics



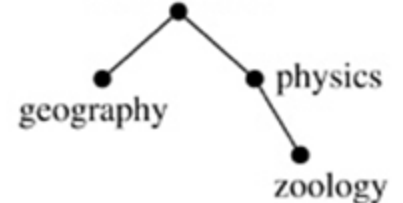
physics > mathematics

mathematics



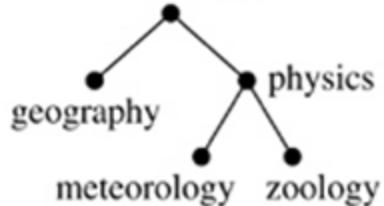
geography < mathematics

mathematics



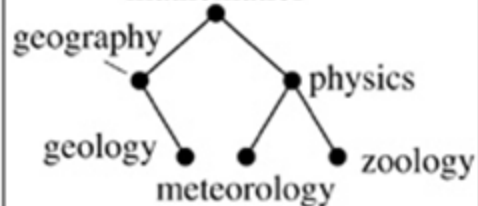
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zoology > physics

mathematics



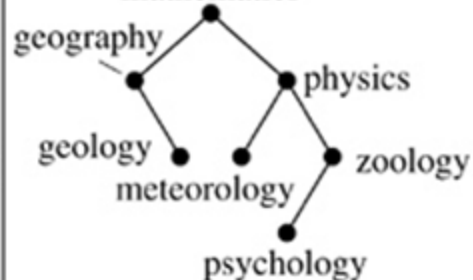
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meteorology < physics

mathematics



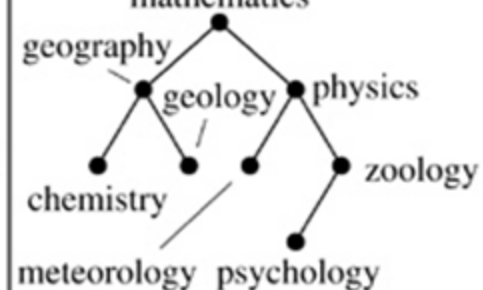
geology < mathematics  
geology > geography

mathematics



psychology > mathematics  
psychology > physics  
psychology < zoology

mathematics



chemistry < mathematics  
chemistry < geography

# Applications of Trees

## Searching a binary search tree

```
search(t, s) {  
  if(s == label(t))  
    return t;  
  if(t is leaf) return null  
  if(s < label(t))  
    search(t's left tree, s)  
  else  
    search(t's right tree, s)}
```



# Applications of Trees

## Decision Trees

- A decision tree represents a *decision-making process*
- each internal vertex corresponds to a “decision point”
- a sub-tree at these vertices corresponds to each possible outcome of the decision
- In the extended decision trees used in *decision analysis* - also include nodes that represent random events and their outcomes

# Applications of Trees

## Coin-Weighing Problem

- Imagine you have 8 coins
  - One of which is a **lighter counterfeit**
  - A **free-beam balance**
- 
- How many weighings are needed to guarantee that the counterfeit coin will be found?

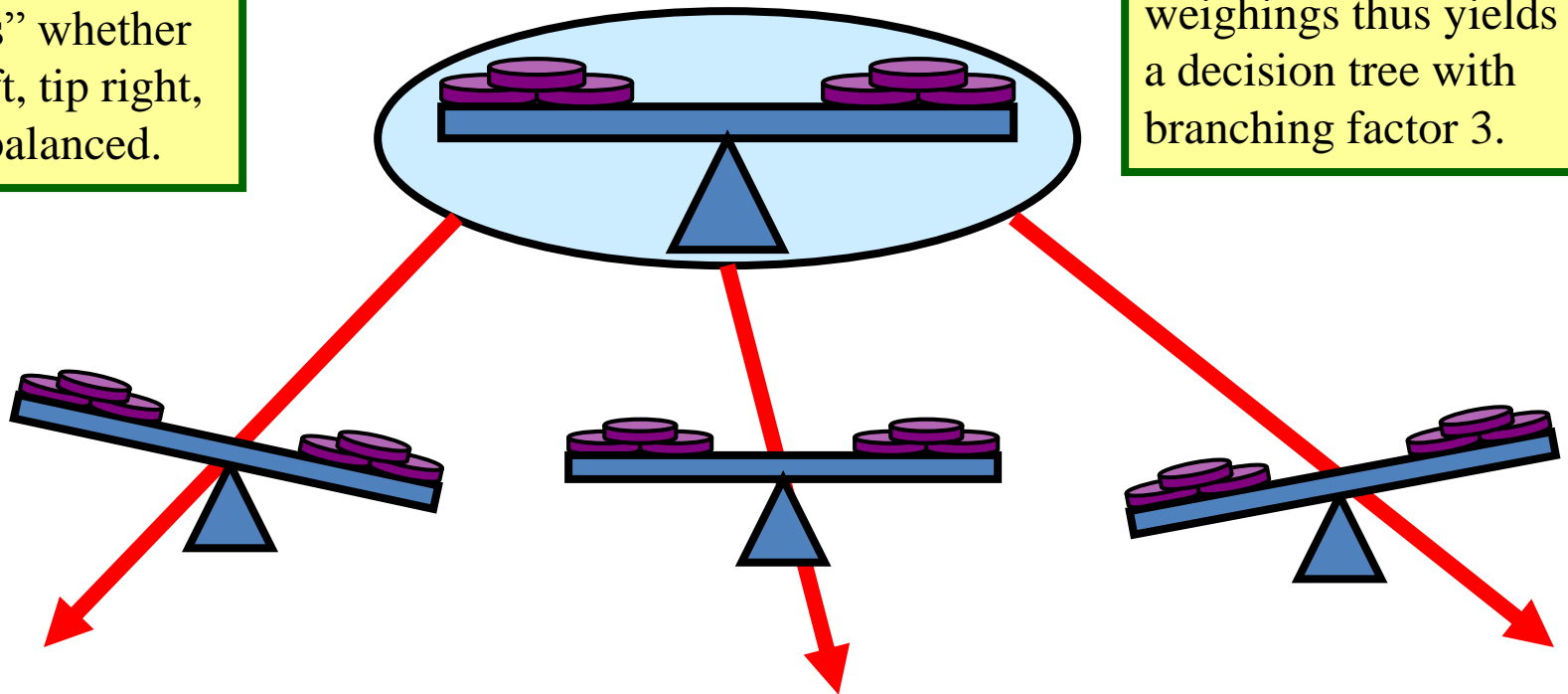


# Applications of Trees

- In each situation, we pick two disjoint and equal-size subsets of coins to put on the scale.

The balance then “decides” whether to tip left, tip right, or stay balanced.

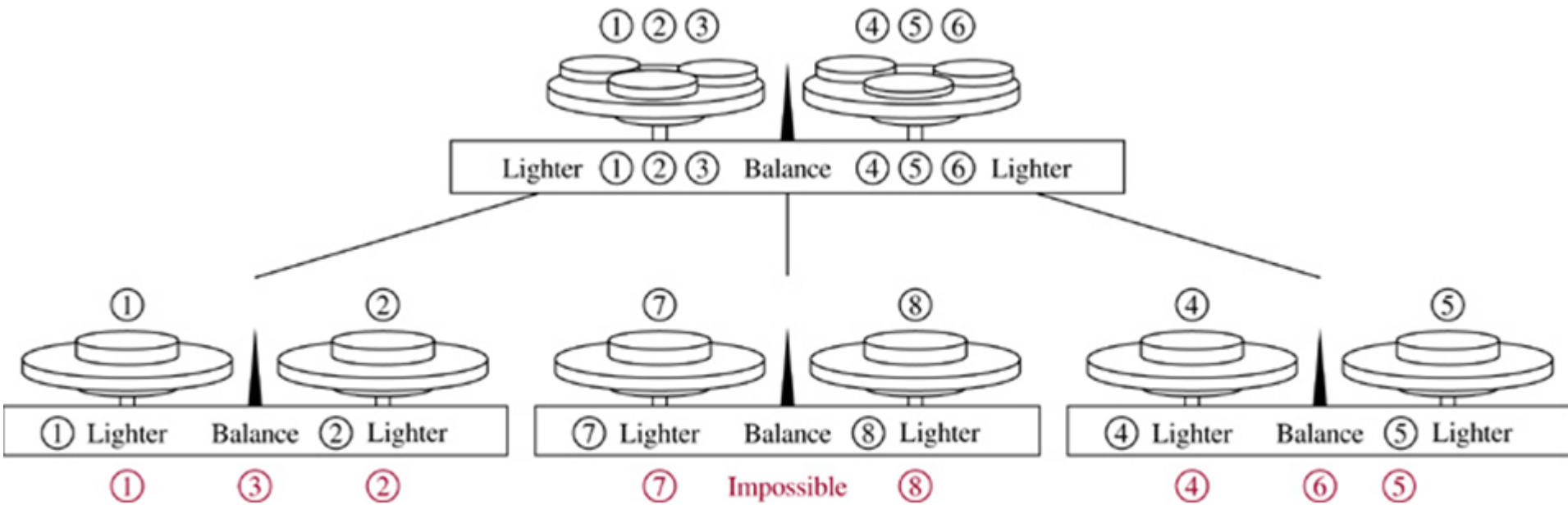
A given sequence of weighings thus yields a decision tree with branching factor 3.



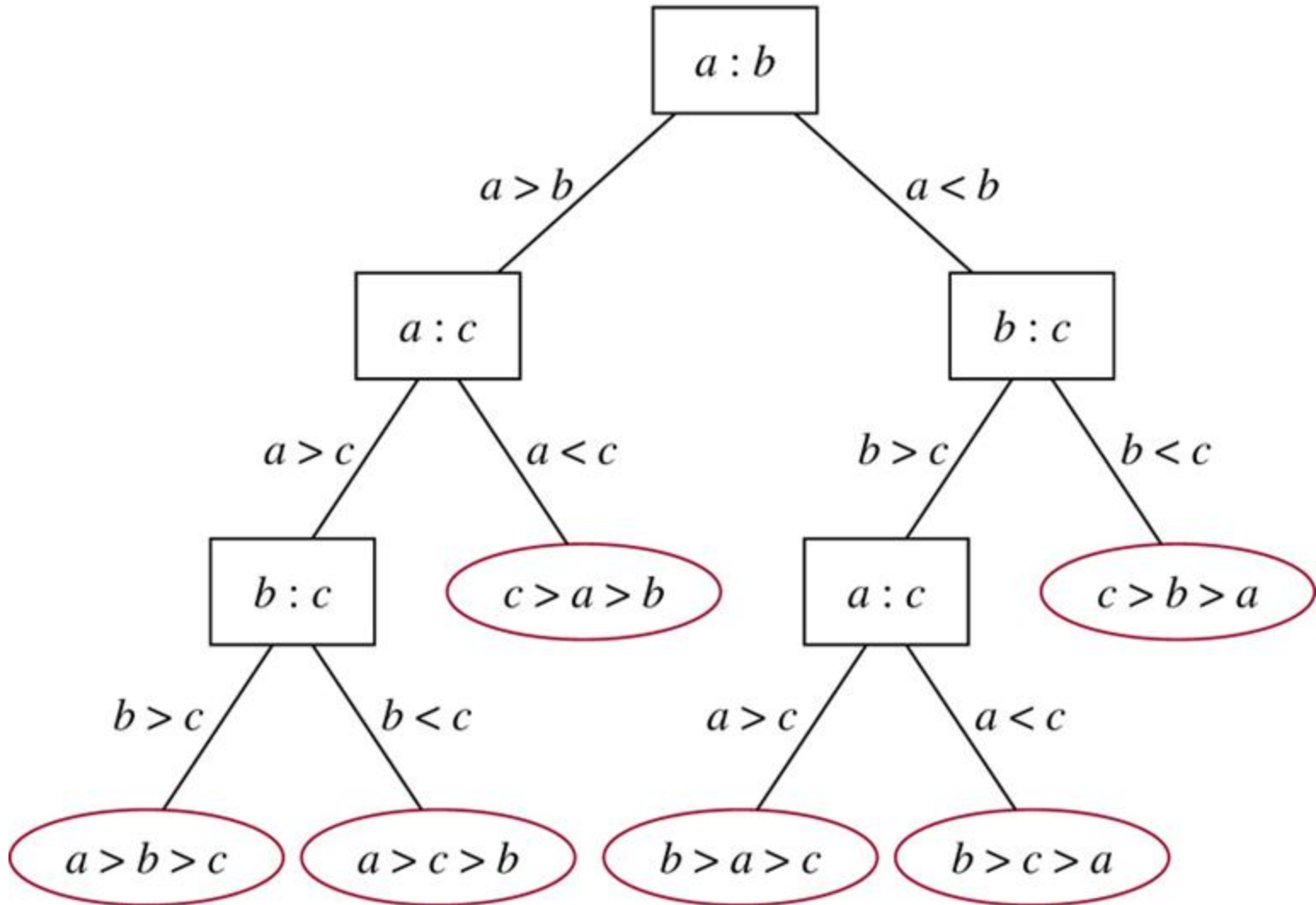
# Applications of Trees

- Applying the Tree Height Theorem
  - The decision tree must have at least 8 leaf nodes, since there are 8 possible outcomes.
    - In terms of which coin is the counterfeit one.
  - Recall the **tree-height theorem**,  $h \geq \lceil \log_m \ell \rceil$ 
    - Thus the decision tree must have height  $h \geq \lceil \log_3 8 \rceil = \lceil 1.893... \rceil = 2$
  - Let's see if we solve the problem with *only* 2 weightings...

# Decision Trees



# Decision Trees



# Applications of Trees

## ■ Data Compression

- Suppose we have 3GB character data file that we wish to include in an email.
- Suppose file only contains 26 letters  $\{a, \dots, z\}$ .
- Suppose each letter  $\alpha$  in  $\{a, \dots, z\}$  occurs with frequency  $f_\alpha$ .
- Suppose we encode each letter by a binary code
- If we use a fixed length code, we need 5 bits for each character
- The resulting message length is  $5(f_a + f_b + \dots + f_z)$
- **Can we do better?**

# Applications of Trees

- Suppose the file only has 6 letters {a,b,c,d,e,f} with frequencies

<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>	<i>f</i>	
.45	.13	.12	.16	.09	.05	
000	001	010	011	100	101	Fixed length
0	101	100	111	1101	1100	Variable length

- Fixed length =  $3 \cdot (0.45 + 0.13 + 0.12 + 0.16 + 0.09 + 0.05) = 3G$
- Variable length =  $(.45 \bullet 1 + .13 \bullet 3 + .12 \bullet 3 + .16 \bullet 3 + .09 \bullet 4 + .05 \bullet 4) = 2.24G$



# Applications of Trees

- Is it possible to find a coding scheme of these letters such that, when data are coded, fewer bits are used?
- Use **Prefix Codes**
- Save memory
- Reduce transmittal time

# Applications of Trees

## Prefix Codes

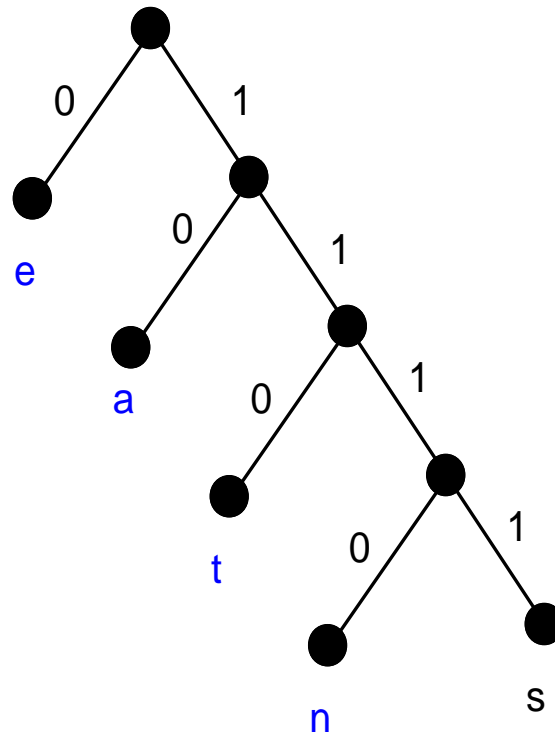
- Bit string for a letter **never occurs** as the first part of the bit string for another letter
- Cannot encode  $t$  as **01** and  $x$  as **01101**
  - since **01** is a prefix of **01101**
- Can encode  $e = 0$ ,  $a = 10$ ,  $t = 11$ 
  - word can be recovered, string **10110** - ate

# Applications of Trees

- **Binary tree representation for Prefix Codes**  
characters are the labels of the leaves in the tree
- **Label edges**  
edge leading to a left child is assigned a 0  
edge leading to a right child is assigned a 1
- **Encoding a character**  
sequence of labels of the edges in the unique path  
from the root to the leaf that has this character as its  
label

# Applications of Trees

- Binary tree with a Prefix code
- $e = 0$ ,  $a = 10$ ,  $t = 110$ ,  $n = 1110$ ,  $s = 1111$



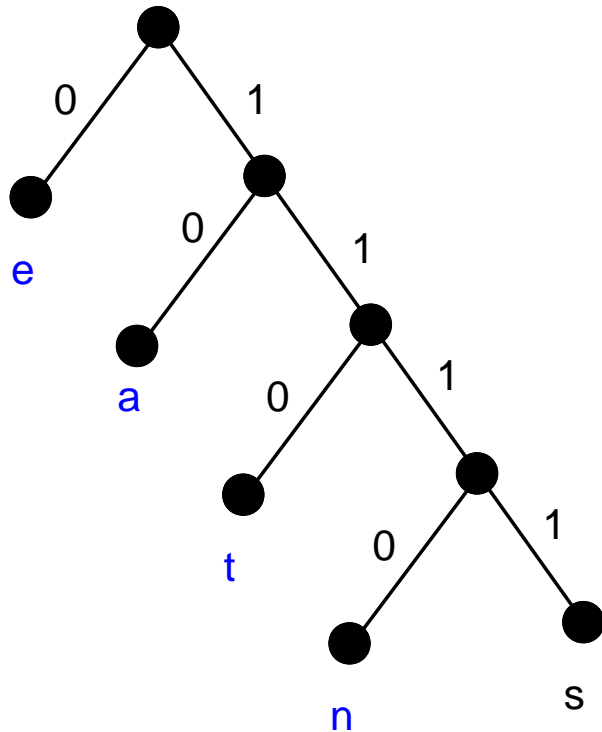
# Applications of Trees

- Decoding prefix codes

- Tree representing a code can be used to decode a bit string
- Follow the tree until it reaches a **leaf**, and then **repeat**
- A message can be decoded uniquely

# Applications of Trees

## Prefix codes allow easy decoding



Decode:

11111011100

s 1011100

sa 11100

san 0

sane

# Applications of Trees

## Huffman Coding

- Fundamental algorithm in **data compression**
- Used extensively to compress bit string representing text
- Compress image and audio files
- **Input** - the frequencies of symbols in a string
- **Output** - A **prefix code** that encodes a string using the **fewest possible bits**, among all possible binary prefix codes for these symbols

# Applications of Trees

## David Huffman's idea

- Build the tree bottom-up in a greedy fashion
- Each tree has a weight in its root and symbols are labels of the leaves
- Start - **forest of one vertex trees** representing the input symbols
- Recursively merge two trees whose sum of weights is minimal until we have only **one tree**



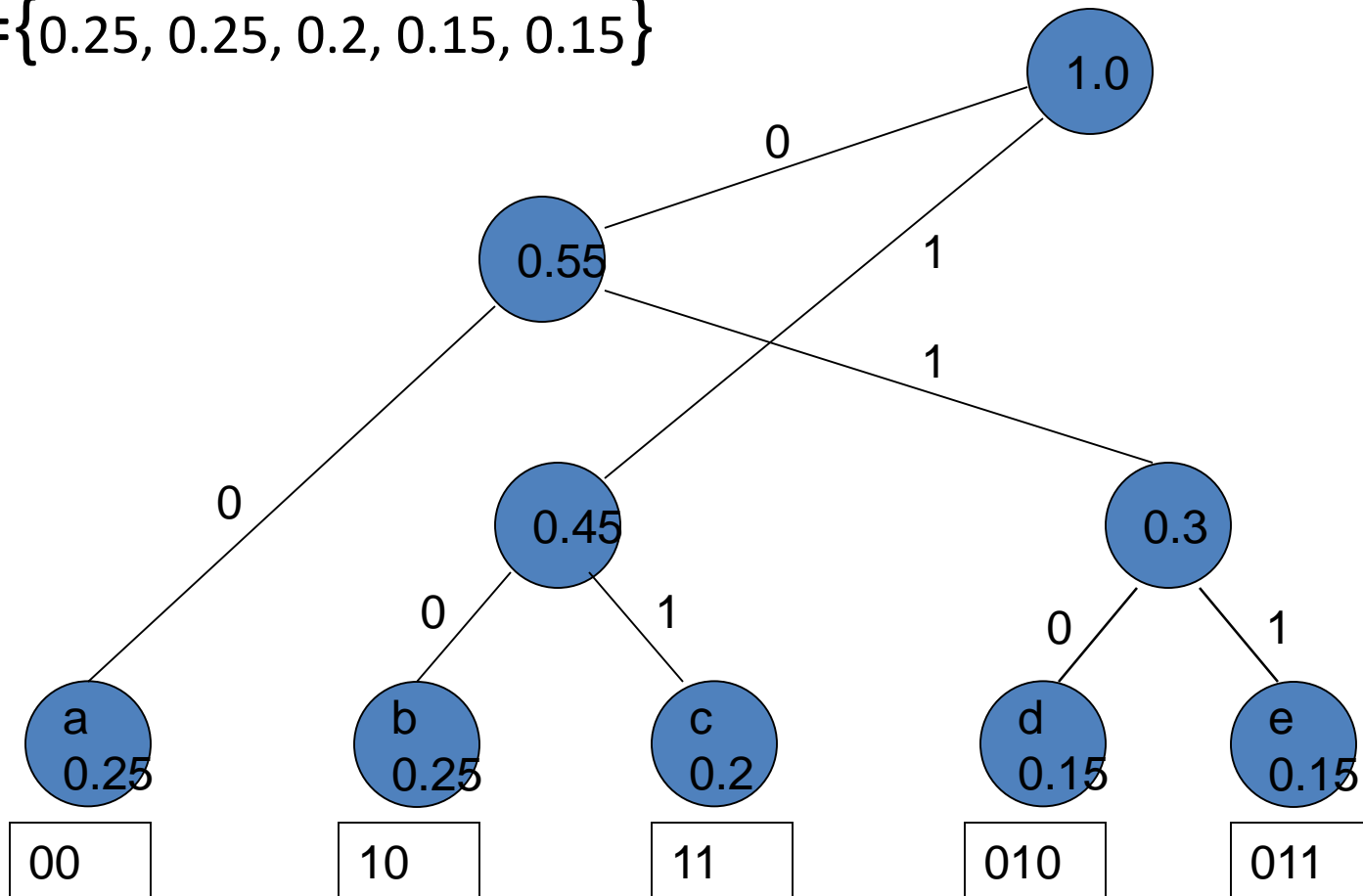
# Applications of Trees

## Huffman Coding Algorithm

1. Take the two least probable symbols in the alphabet
2. Combine these two symbols into a single symbol, and repeat

# Applications of Trees

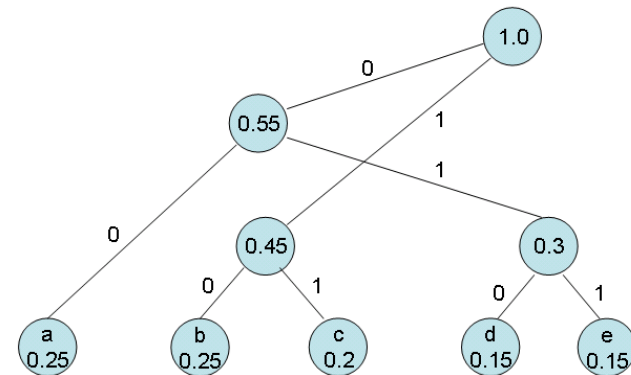
- $A_x = \{ a, b, c, d, e \}$
- $P_x = \{0.25, 0.25, 0.2, 0.15, 0.15\}$



# Applications of Trees

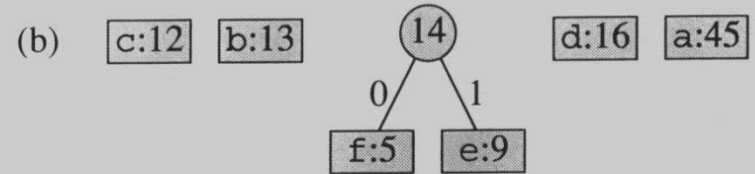
- $A_x = \{ a, b, c, d, e \}$
- $P_x = \{ 0.25, 0.25, 0.2, 0.15, 0.15 \}$

$a_i$	$p_i$	$h(p_i)$	$l_i$	$c(a_i)$
a	0.25	2.0	2	00
b	0.25	2.0	2	10
c	0.2	2.3	2	11
d	0.15	2.7	3	010
e	0.15	2.7	3	011



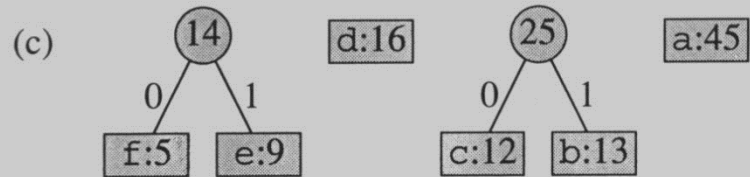
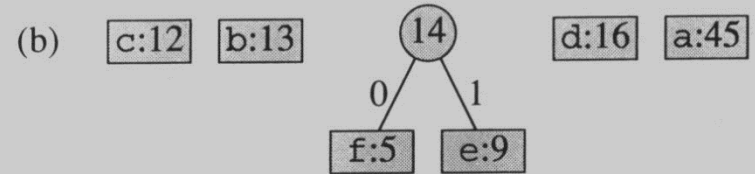
# Building the Encoding Tree

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



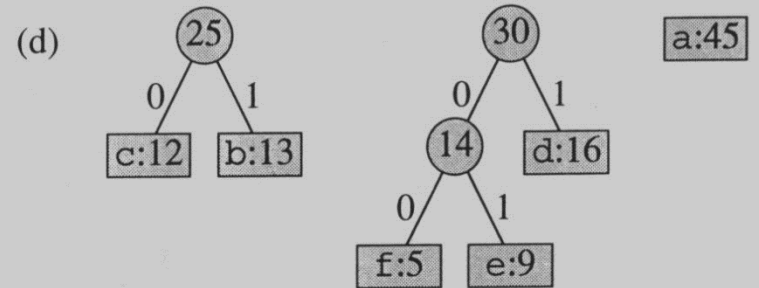
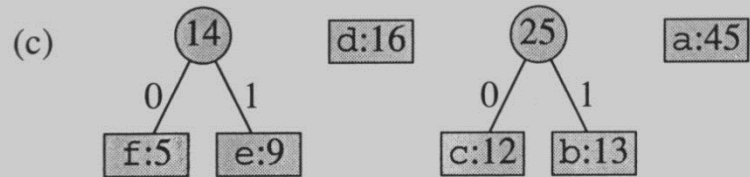
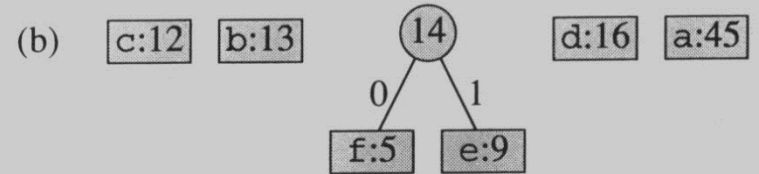
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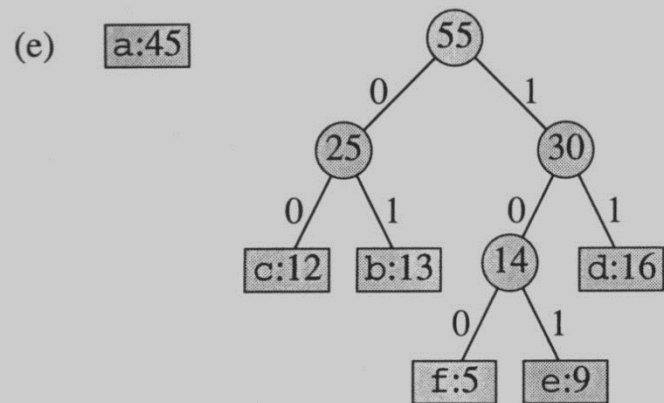
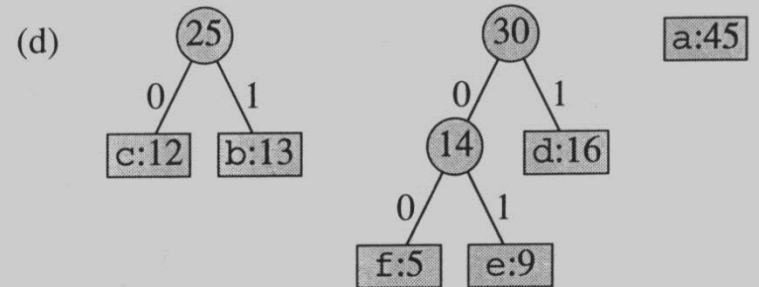
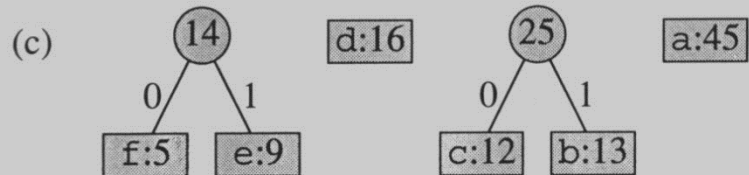
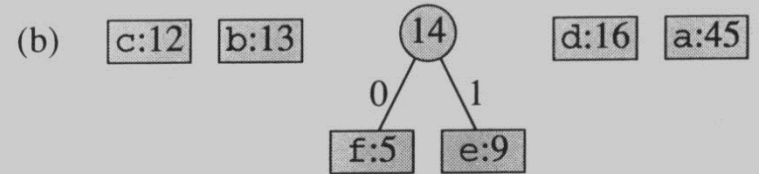
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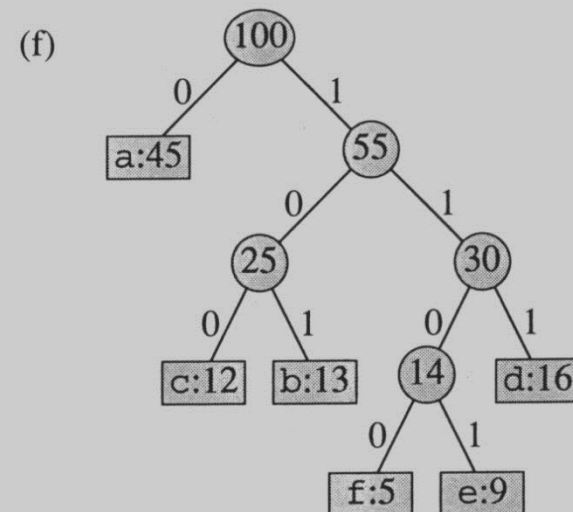
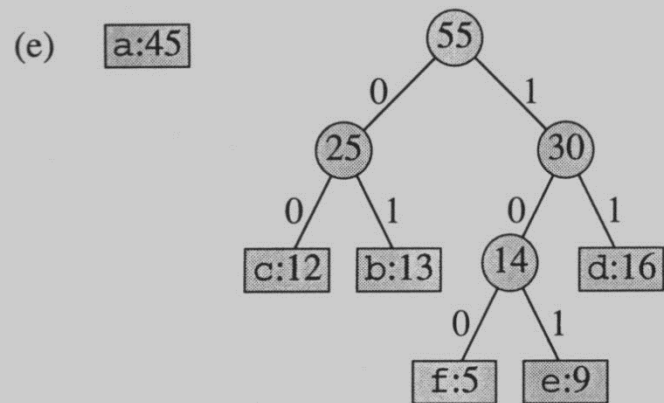
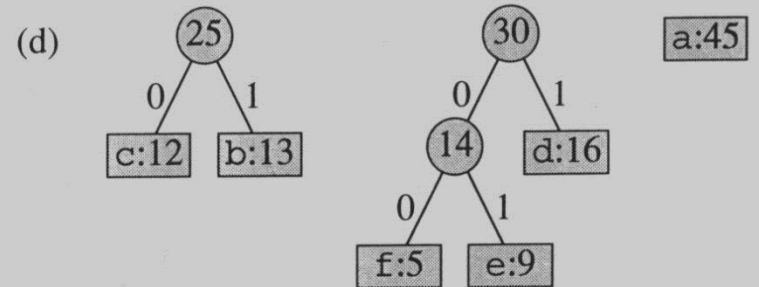
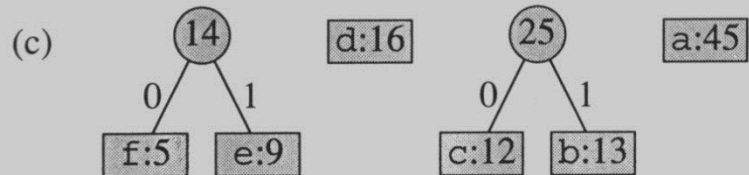
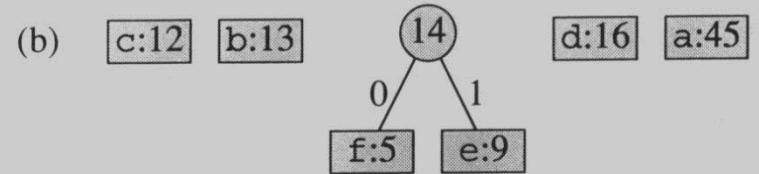
# Building the Encoding Tree

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



# Building the Encoding Tree

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





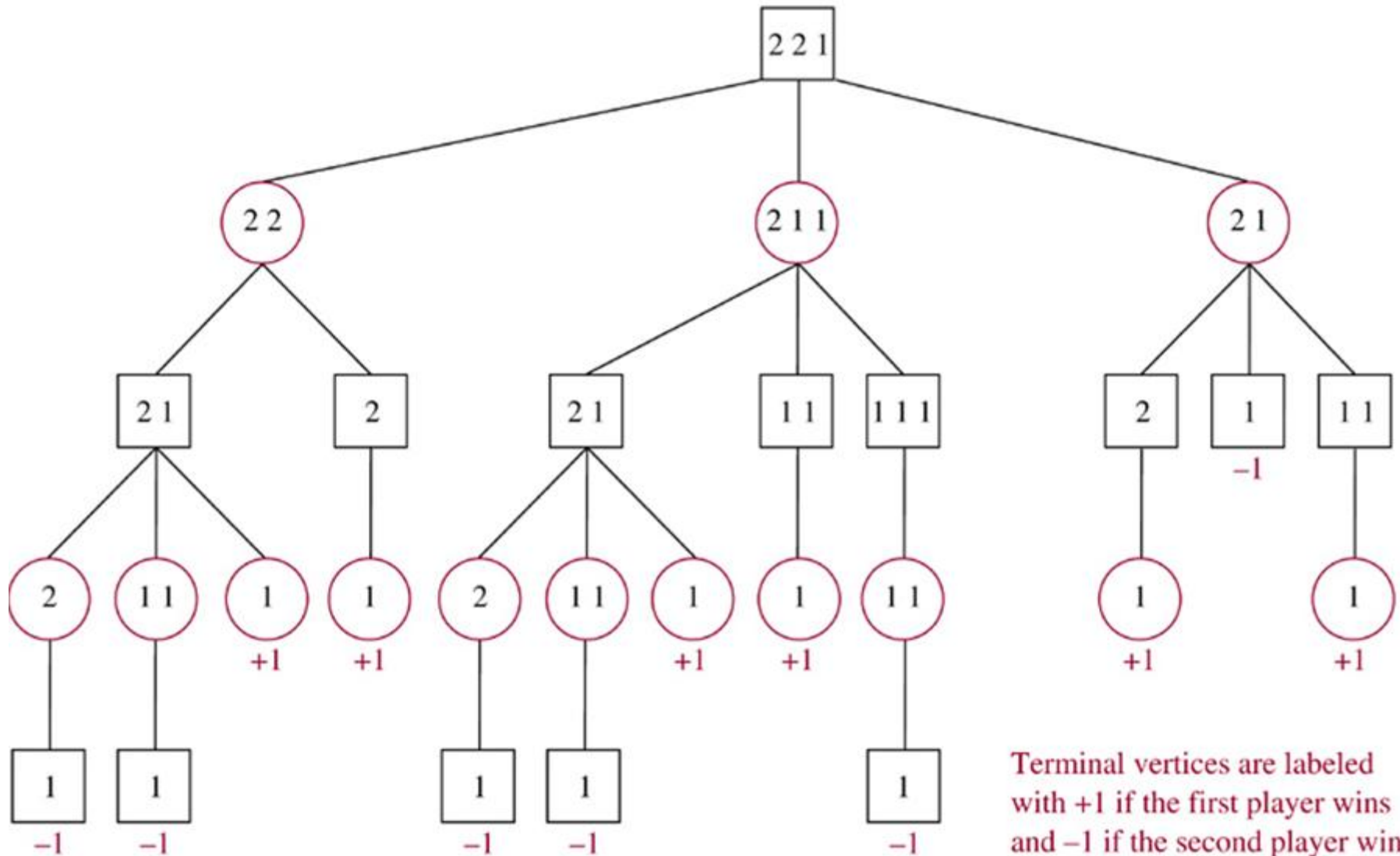
# Applications of Trees

- Game Trees – Analyze certain types of games
- Tic-tac-toe, checkers, nim, chess
- Vertices – positions that a game can be in as it progresses
- Edges – legal moves between these positions
- Root – Starting position

# Applications of Trees

- Game of Nim
- Piles of Stones
- Legal move
  - removing one or more stones from one or more piles
  - without removing all the stones left
- A player without a legal move loses

# Game Trees

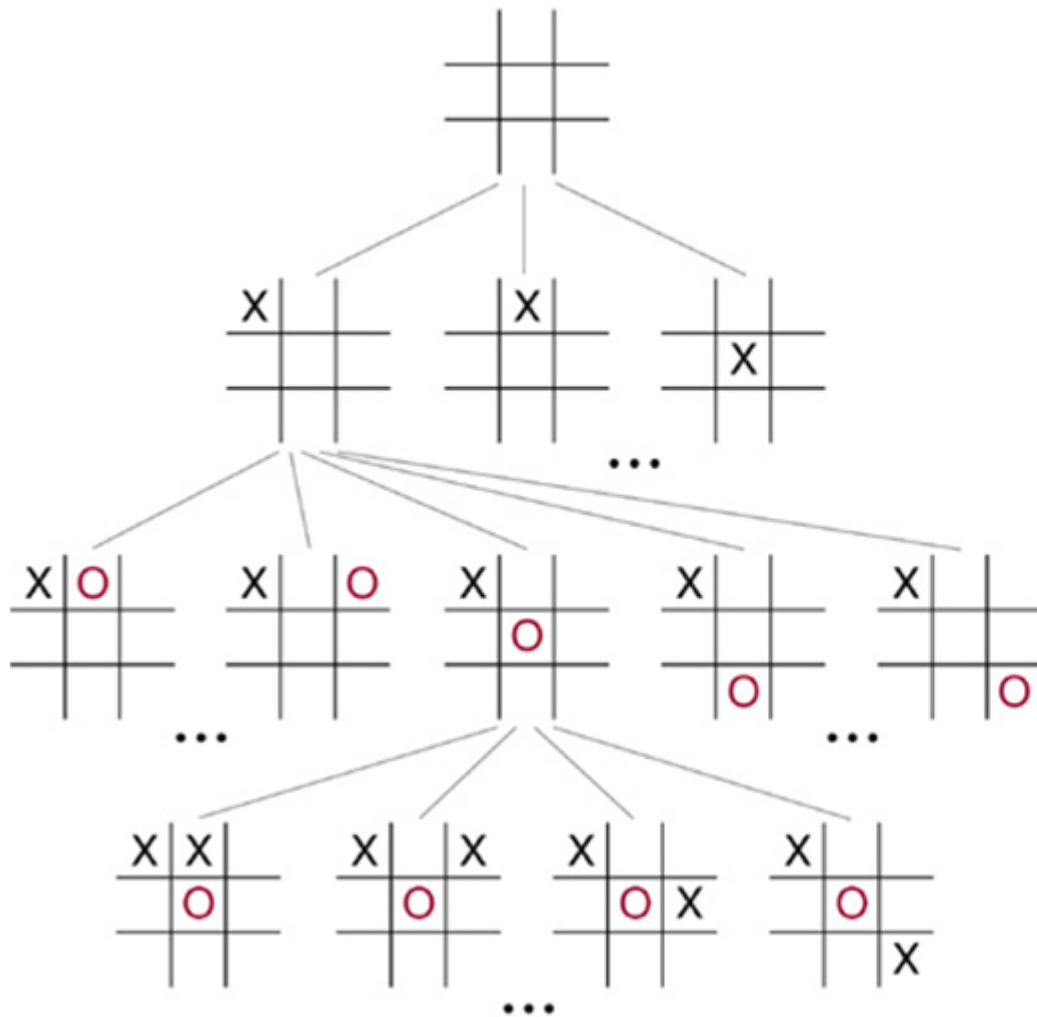


# Applications of Trees

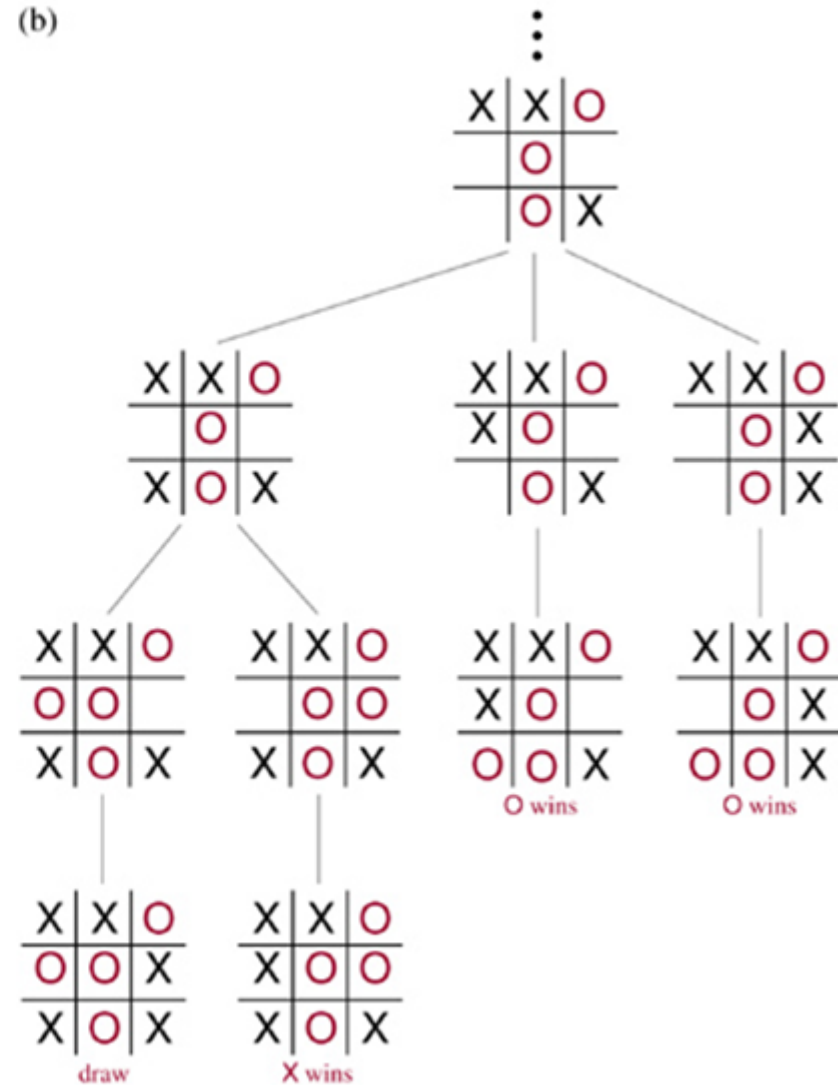
- Tic Tac Toe Game
  - Three possible initial moves
  - Subtree of the game
  - Terminal positions
  - Win, draw

# Game Trees

(a)



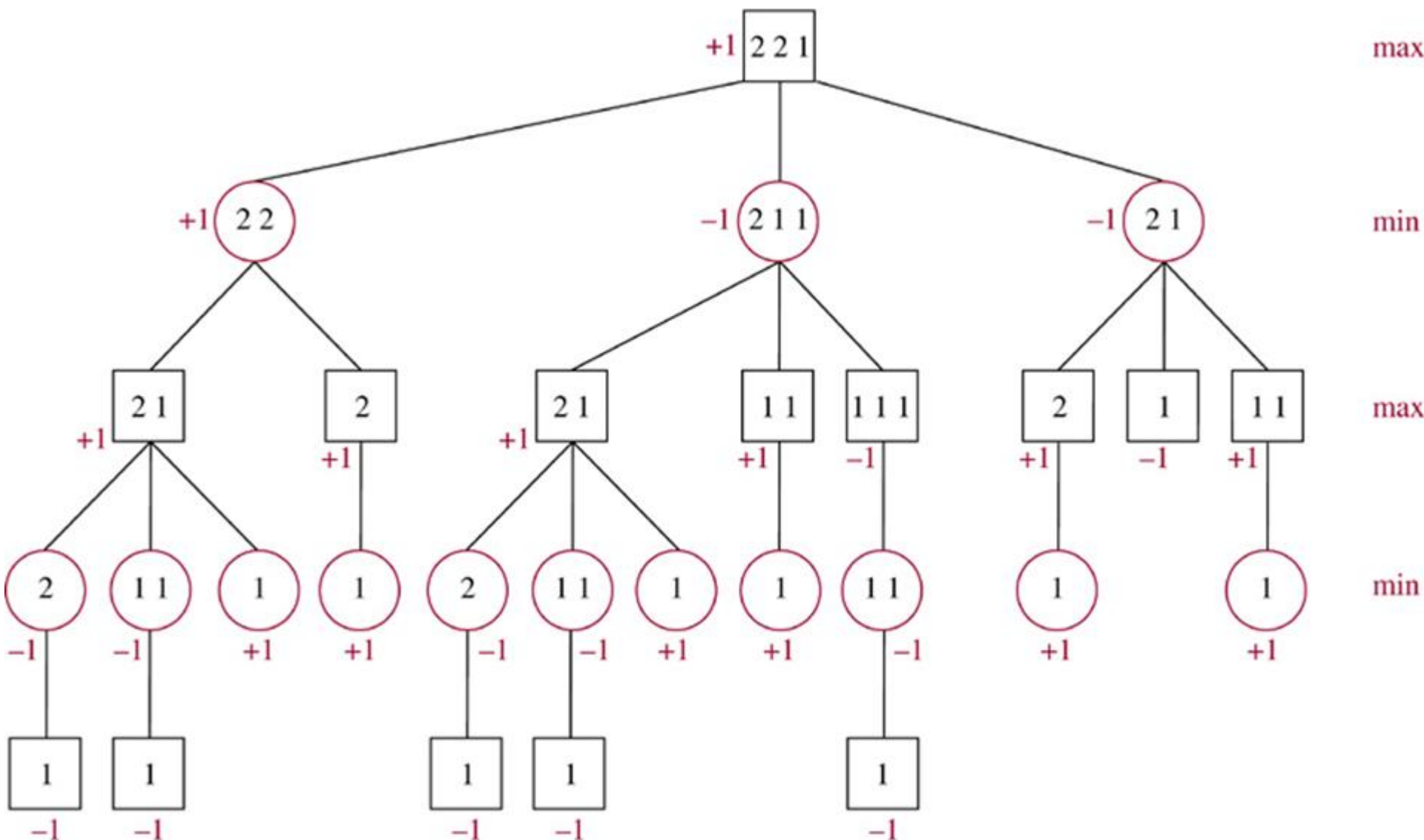
(b)



# Applications of Trees

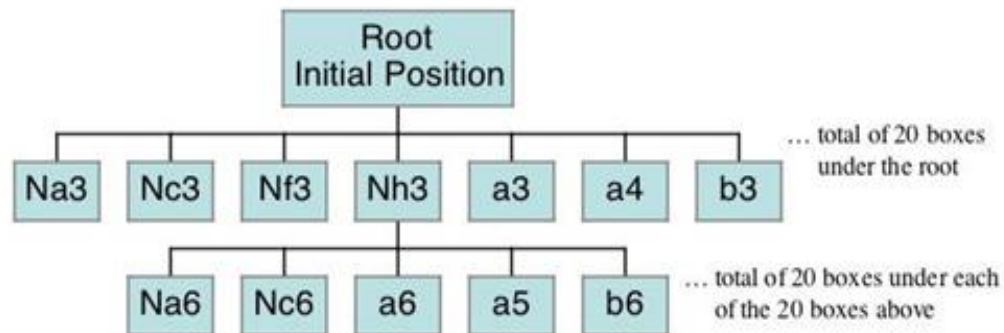
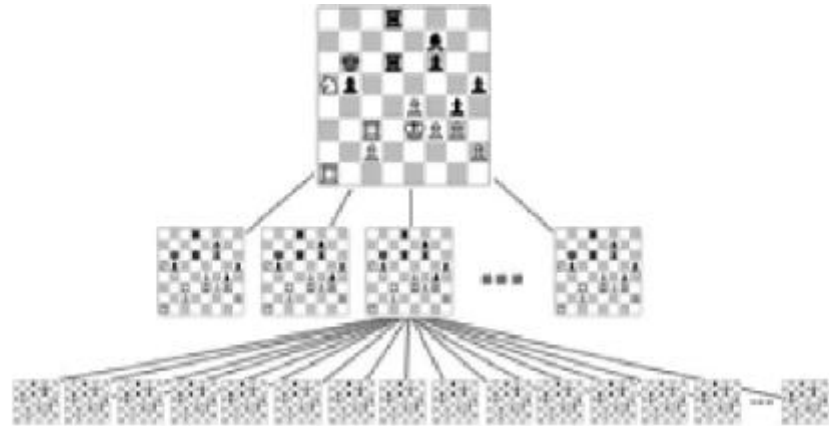
- Game of Nim
- Inductive Hypothesis
- Minmax strategy
- First player – position with largest value
- Second player – position with least value

# Game Trees



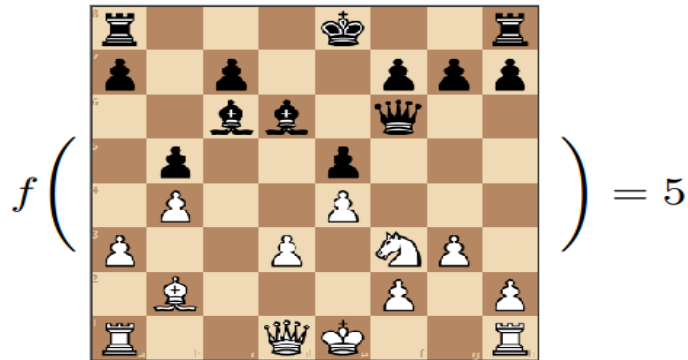
# Game Trees

## ■ Game of Chess

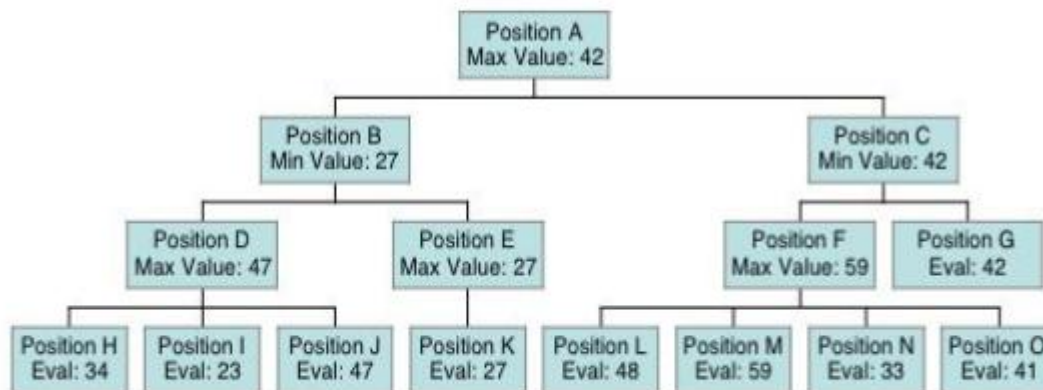




# Game Trees



## Game of Chess – Minmax Strategy



Opponent's move

Your move

Opponent's move

Your move