

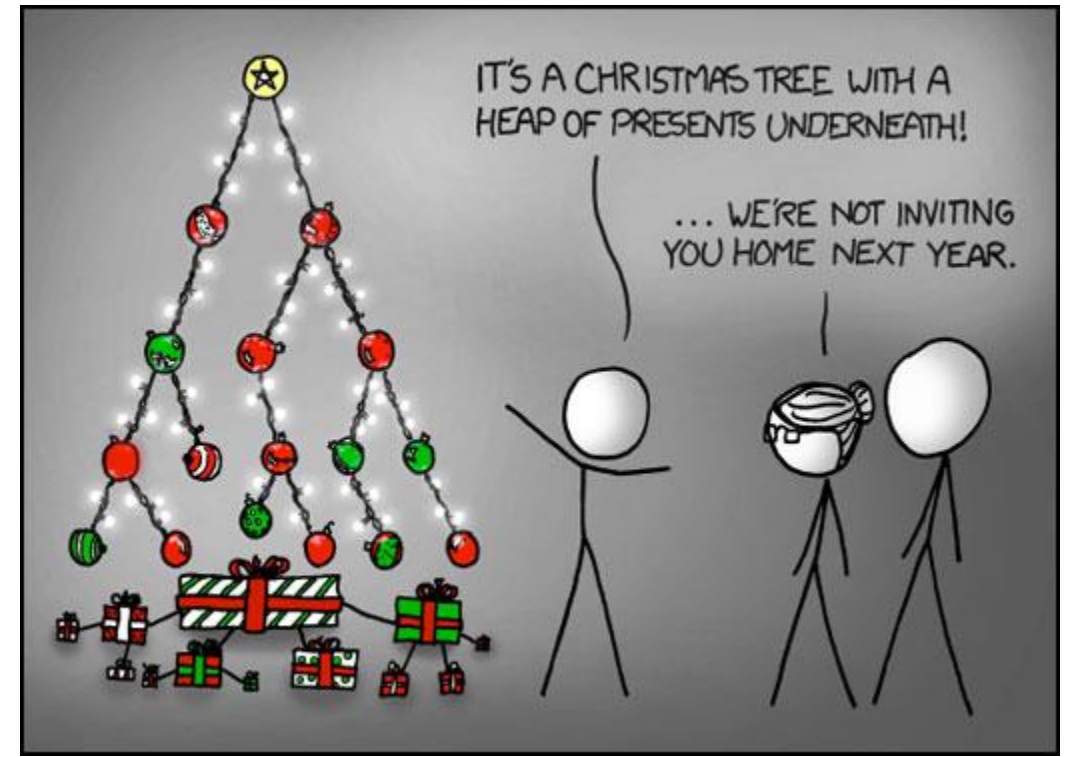


TREES

School of Artificial Intelligence

PREVIOUSLY ON DS&A

- Trees
- Terminologies
- Binary Trees

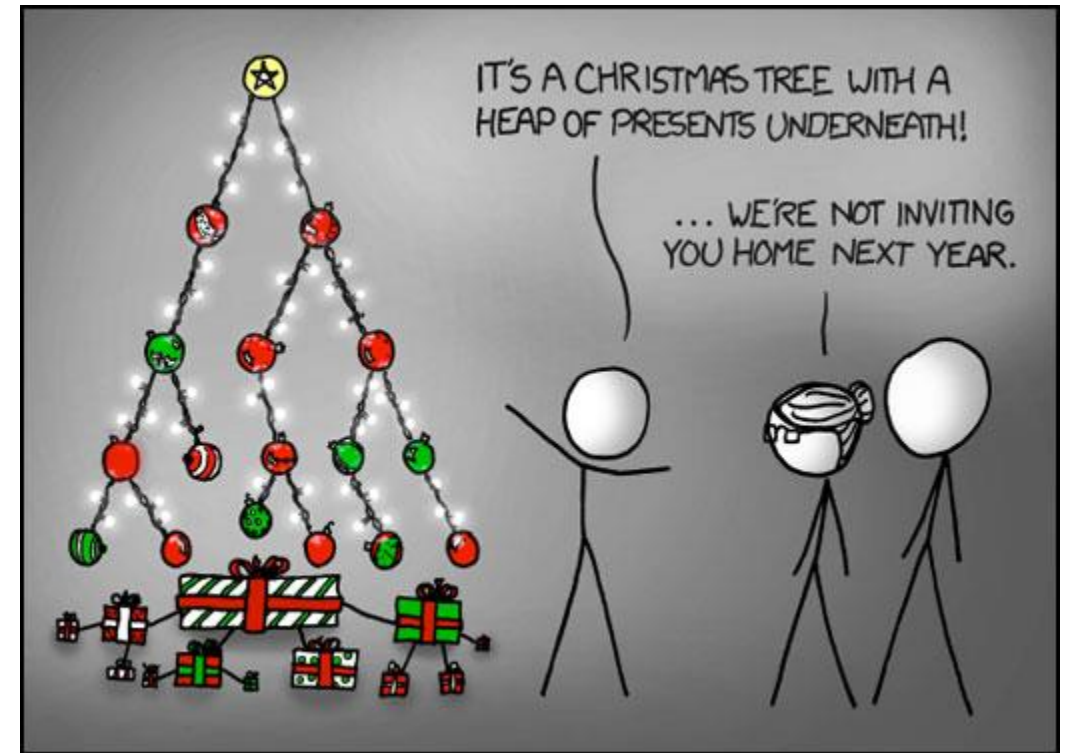


PREVIOUS LECTURE

- Definition of a Tree
 - If T is non-empty, it has a special node, called the **root** of T , that has no parent
 - Each node v of T different from the root has a *unique* **parent** node w , every node with parent w is a **child** of w
- Siblings(兄弟结点): two nodes that are children of the same parent
- External node (外部结点) /leaves (叶结点) : if node v has no children
- Internal node (内部结点) : if node v has one or more children
- Edge: pair of nodes (u,v) such that u is the parent of v , or vice versa.
- Path: sequence of nodes such that any two consecutive nodes in the sequence form an edge
- Depth of a tree?
 - If p is the root then depth of p is 0
 - Otherwise, the depth of p is one plus the depth of the parent of p
- Height of a tree?
 - If p is a leaf, its height is 0
 - Otherwise, the height of p is one more than the maximum of the heights of p 's children
- Binary Tree?
 - A binary tree is either empty or consists of:
 - A node r , called the root of T , that stores an element
 - A binary tree (may be empty), called the left subtree of T
 - A binary tree (may be empty), called the right subtree of T

THIS LECTURE

- Implementation of Trees
- Tree traversal algorithms



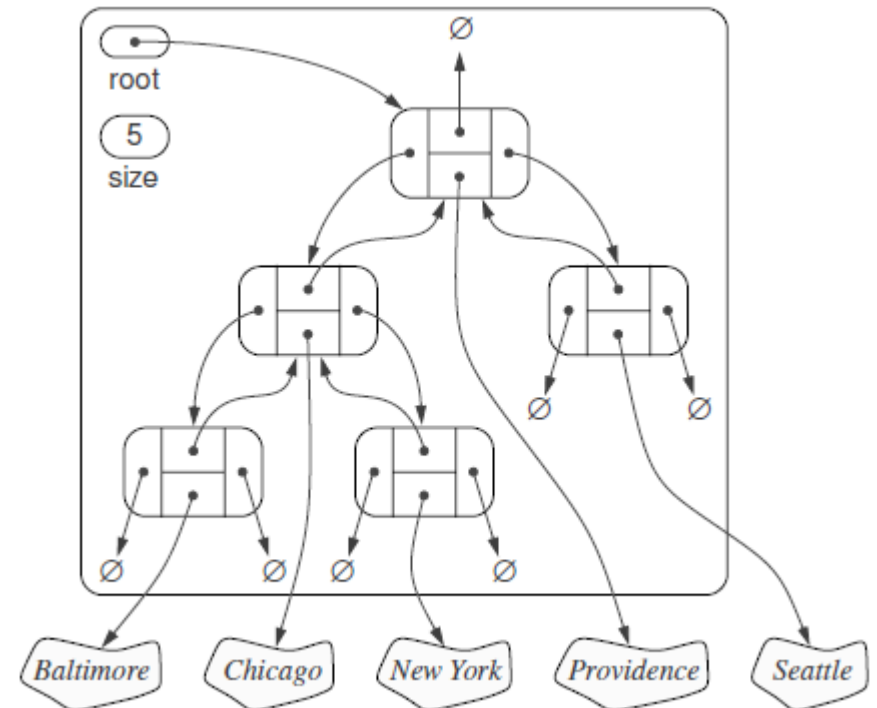
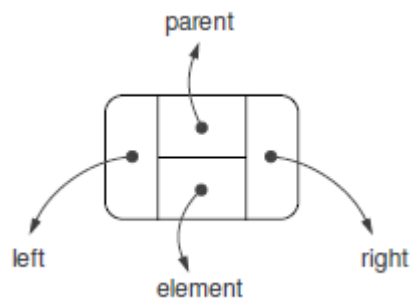


IMPLEMENTING TREES

- Trees we have looked so far: abstract classes
- Abstract class:
 - Key functions are empty: an error is raised when the functions are called
 - Cannot be directly instantiated: an instance of it would be illegal
- Choices for internal representation of trees
 - Intuitive: linked-based implementation
 - Less intuitive: array-based implementation
- We will consider: binary trees for now

LINKED STRUCTURE FOR BINARY TREES

- Intuitive: linked structure allows the use of references
- For each node at position p:
 - Element
 - Parent: None if p is Root
 - Left, right: None if p does not have a left/right



LINKED STRUCTURE FOR BINARY TREES

- `LinkedBinaryTree` that extends the binary tree ADT we previously defined
- Fundamental element
 - `Node`: defined as an internal, non-public class
 - `Position`: public class, wraps a `Node` inside
 - `_validate` function to check if the position is legal
 - `_make_position` to wrap a node as a position

```
1 class LinkedBinaryTree(BinaryTree):
2     """Linked representation of a binary tree structure."""
3
4     class _Node:          # Lightweight, nonpublic class for storing a node.
5         __slots__ = '_element', '_parent', '_left', '_right'
6         def __init__(self, element, parent=None, left=None, right=None):
7             self._element = element
8             self._parent = parent
9             self._left = left
10            self._right = right
```

LINKED STRUCTURE FOR BINARY TREES

- Position
- Constructor: `__init__()`
- `element()`
- `__eq__()`

```
12 class Position(BinaryTree.Position):
13     """An abstraction representing the location of a single element."""
14
15     def __init__(self, container, node):
16         """Constructor should not be invoked by user."""
17         self._container = container
18         self._node = node
19
20     def element(self):
21         """Return the element stored at this Position."""
22         return self._node._element
23
24     def __eq__(self, other):
25         """Return True if other is a Position representing the same location."""
26         return type(other) is type(self) and other._node is self._node
```


LINKED STRUCTURE FOR BINARY TREES

- Position
- _validate()
- _make_position()

```
28 def _validate(self, p):
29     """Return associated node, if position is valid."""
30     if not isinstance(p, self.Position):
31         raise TypeError('p must be proper Position type')
32     if p._container is not self:
33         raise ValueError('p does not belong to this container')
34     if p._node._parent is p._node: # convention for deprecated nodes
35         raise ValueError('p is no longer valid')
36     return p._node
37
38 def _make_position(self, node):
39     """Return Position instance for given node (or None if no node)."""
40     return self.Position(self, node) if node is not None else None
```

LINKED STRUCTURE FOR BINARY TREES

- Operations for updating a Linked Binary Tree
- `T.add_root(e)`: create a root for an empty tree, store `e` as the element, and return the position of the root
- `T.add_left(p, e)`: create a node storing element `e`, link the node as the left child of position `p`, and return the position
- `T.replace(p, e)`: replace the element at position `p` with element `e`, and return the previous value stored at `p`
- `T.delete(p)`: remove the node at position `p`, replace it with its child, if any, and return the element stored previously at `p`
 - Error when `p` has two children
- `T.attach(p, T1, T2)`: attach the internal structure of trees `T1` and `T2`, as left and right subtrees of leaf position `p`; reset `T1` and `T2` to empty trees
 - Error if `p` is not a leaf

LINKED STRUCTURE FOR BINARY TREES

- Constructor
- Utility methods

```
42  def __init__(self):
43      """ Create an initially empty binary tree."""
44      self._root = None
45      self._size = 0
46
47      #----- public accessors -----
48  def __len__(self):
49      """ Return the total number of elements in the tree."""
50      return self._size
```

LINKED STRUCTURE FOR BINARY TREES

- Accessors

```
52  def root(self):
53      """Return the root Position of the tree (or None if tree is empty)."""
54      return self._make_position(self._root)
55
56  def parent(self, p):
57      """Return the Position of p's parent (or None if p is root)."""
58      node = self._validate(p)
59      return self._make_position(node._parent)
60
61  def left(self, p):
62      """Return the Position of p's left child (or None if no left child)."""
63      node = self._validate(p)
64      return self._make_position(node._left)
65
66  def right(self, p):
67      """Return the Position of p's right child (or None if no right child)."""
68      node = self._validate(p)
69      return self._make_position(node._right)
```

LINKED STRUCTURE FOR BINARY TREES

- Accessors

```
71 def num_children(self, p):
72     """Return the number of children of Position p."""
73     node = self._validate(p)
74     count = 0
75     if node._left is not None:      # left child exists
76         count += 1
77     if node._right is not None:    # right child exists
78         count += 1
79     return count
```


LINKED STRUCTURE FOR BINARY TREES

- Updaters
 - `_add_root()`

```
80 def _add_root(self, e):
81     """ Place element e at the root of an empty tree and return new Position.
82
83     Raise ValueError if tree nonempty.
84     """
85     if self._root is not None: raise ValueError('Root exists')
86     self._size = 1
87     self._root = self._Node(e)
88     return self._make_position(self._root)
```

LINKED STRUCTURE FOR BINARY TREES

- Updatators
 - `_add_left()`

```
90  def _add_left(self, p, e):
91      """Create a new left child for Position p, storing element e.
92
93      Return the Position of new node.
94      Raise ValueError if Position p is invalid or p already has a left child.
95      """
96      node = self._validate(p)
97      if node._left is not None: raise ValueError('Left child exists')
98      self._size += 1
99      node._left = self._Node(e, node) # node is its parent
100     return self._make_position(node._left)
```

LINKED STRUCTURE FOR BINARY TREES

- Updatators
 - `_add_right()`

```
102 def _add_right(self, p, e):
103     """ Create a new right child for Position p, storing element e.
104
105     Return the Position of new node.
106     Raise ValueError if Position p is invalid or p already has a right child.
107     """
108     node = self._validate(p)
109     if node._right is not None: raise ValueError('Right child exists')
110     self._size += 1
111     node._right = self._Node(e, node) # node is its parent
112     return self._make_position(node._right)
```

LINKED STRUCTURE FOR BINARY TREES

- Updatators
 - `_replace()`

```
114 def _replace(self, p, e):
115     """ Replace the element at position p with e, and return old element."""
116     node = self._validate(p)
117     old = node._element
118     node._element = e
119     return old
```

- Updatators
 - `_delete()`

```
120 def _delete(self, p):
121     """Delete the node at Position p, and replace it with its child, if any.
122
123     Return the element that had been stored at Position p.
124     Raise ValueError if Position p is invalid or p has two children.
125     """
126     node = self._validate(p)
127     if self.num_children(p) == 2: raise ValueError('p has two children')
128     child = node._left if node._left else node._right      # might be None
129     if child is not None:
130         child._parent = node._parent      # child's grandparent becomes parent
131     if node is self._root:
132         self._root = child               # child becomes root
133     else:
134         parent = node._parent
135         if node is parent._left:
136             parent._left = child
137         else:
138             parent._right = child
139     self._size -= 1
140     node._parent = node                  # convention for deprecated node
141     return node._element
```


LINKED STRUCTURE FOR BINARY TREES

- Updaters
 - `_attach()`

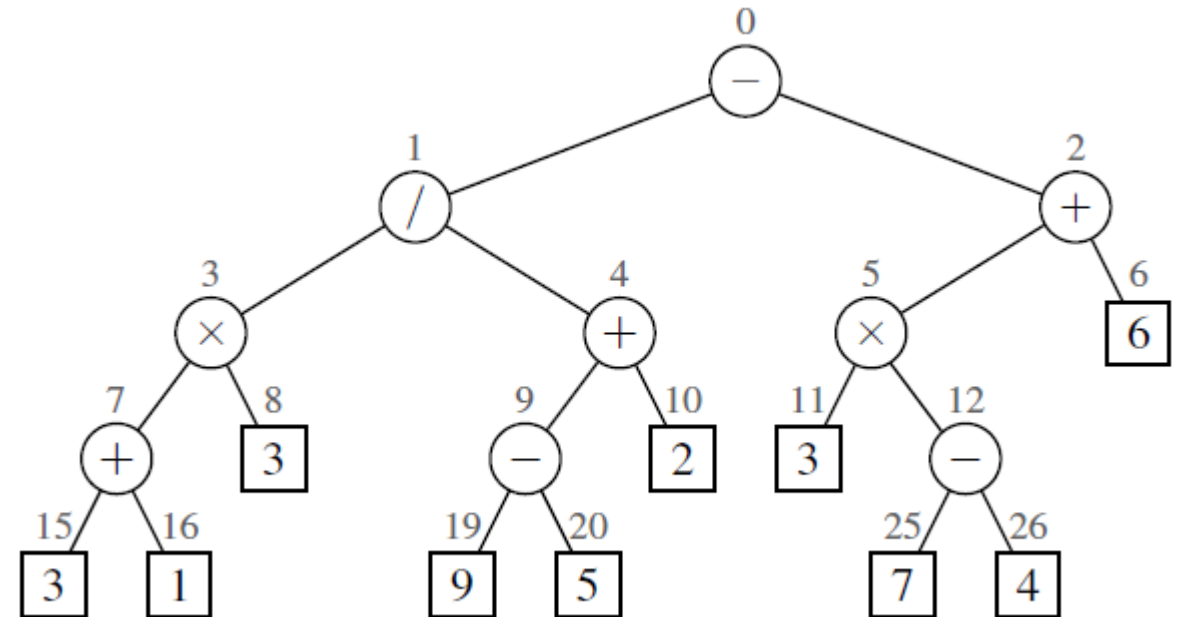
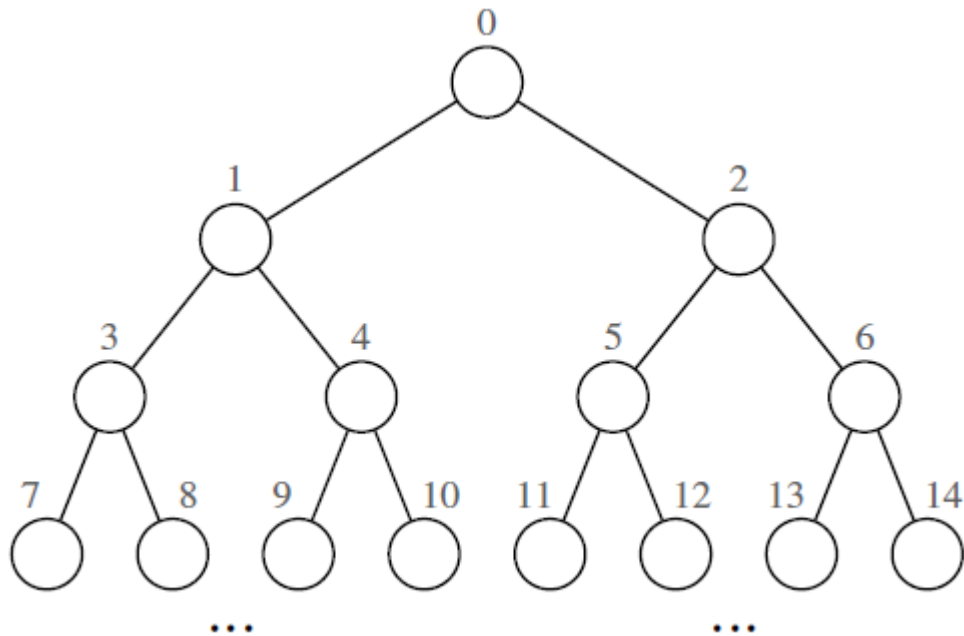
```
143 def _attach(self, p, t1, t2):
144     """ Attach trees t1 and t2 as left and right subtrees of external p."""
145     node = self._validate(p)
146     if not self.is_leaf(p): raise ValueError('position must be leaf')
147     if not type(self) is type(t1) is type(t2): # all 3 trees must be same type
148         raise TypeError('Tree types must match')
149     self._size += len(t1) + len(t2)
150     if not t1.is_empty(): # attached t1 as left subtree of node
151         t1._root._parent = node
152         node._left = t1._root
153         t1._root = None # set t1 instance to empty
154         t1._size = 0
155     if not t2.is_empty(): # attached t2 as right subtree of node
156         t2._root._parent = node
157         node._right = t2._root
158         t2._root = None # set t2 instance to empty
159         t2._size = 0
```

LINKED STRUCTURE FOR BINARY TREES

- Performance of Linked Binary Tree Implementation
- `len()`: $O(1)$ because we keep track of the size of the tree
- `root()`, `left()`, `right()`, `parent()`, `num_children`: $O(1)$
- `is_root()`, `is_leaf()`: $O(1)$
- `depth()`: $O(d + 1)$, d depth of a node
- `height()`: $O(n)$ as we previously discussed
- `add_root()`, `add_left()`, `add_right()`, `replace()`, `delete()`, `attach()`: $O(1)$

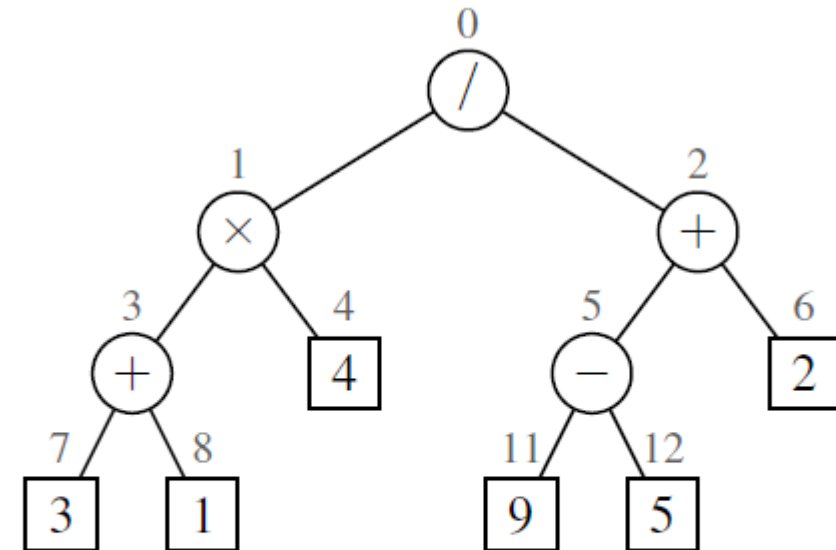
ARRAY BASED STRUCTURE FOR BINARY TREES

- For every position p of T , let $f(p)$ be the integer defined as follows
 - If p is the root of T , then $f(p) = 0$
 - If p is the left child of position q , then $f(p) = 2f(q) + 1$
 - If p is the right child of position q , then $f(p) = 2f(q) + 2$



ARRAY BASED STRUCTURE FOR BINARY TREES

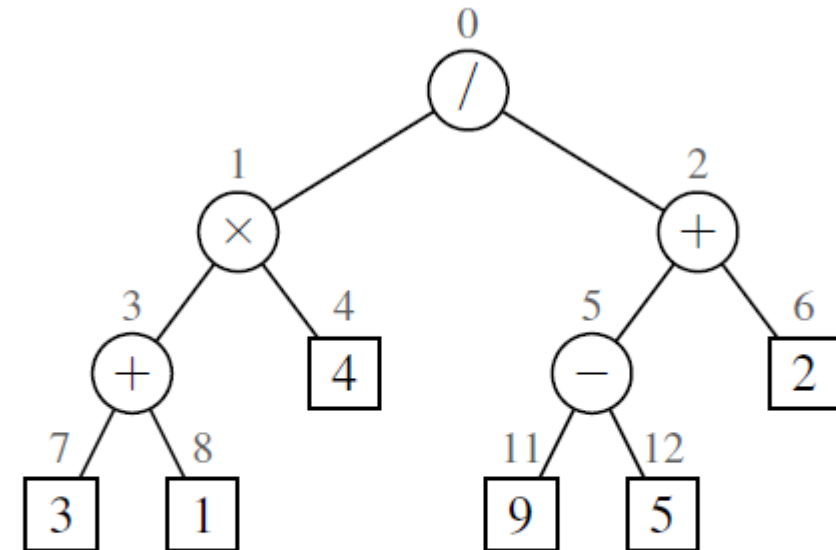
- Level numbering: numbers the positions on each level of T in increasing order from left to right (even if there are no children for some nodes)
- Array-based structure for a binary tree based on level numbering



/	x	+	+	4	-	2	3	1			9	5		
0	1	2	3	4	5	6	7	8	9	10	11	12	13	14

ARRAY BASED STRUCTURE FOR BINARY TREES

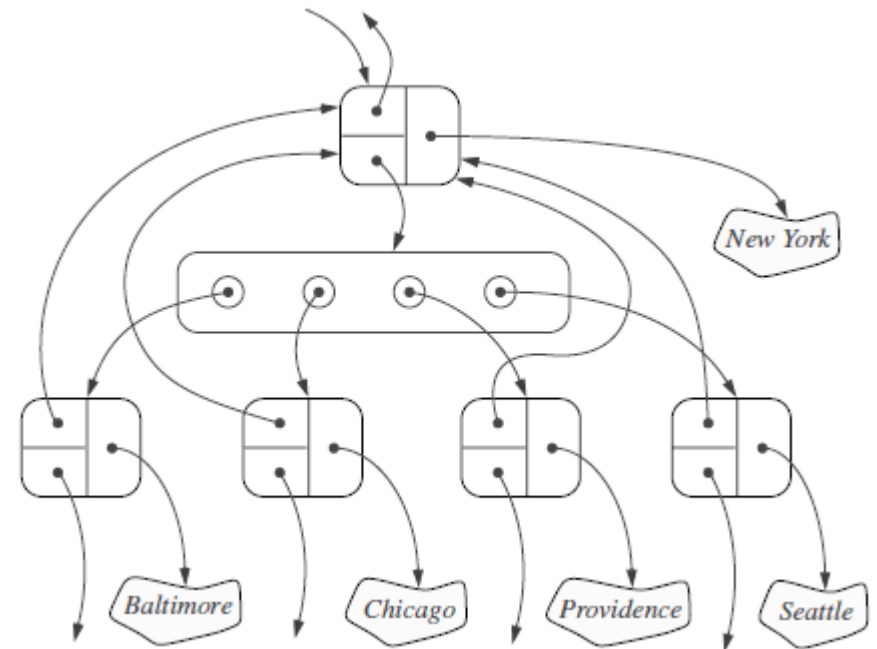
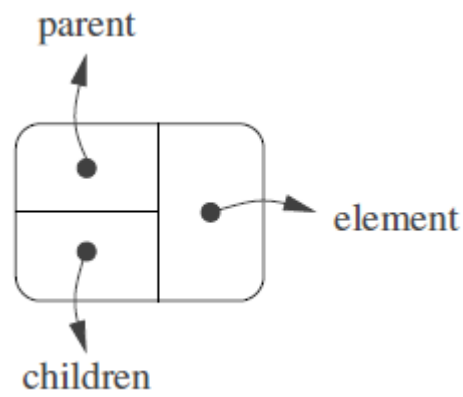
- Positions are represented by single integers
- Methods such as `root()`, `parent()`, `left()` and `right()` can be performed using arithmetic operations on the number $f(p)$
 - Left of p : $2f(p) + 1$
- Space usage: depends on the shape of the tree
 - n = number of nodes of T
 - f_M = maximum value of $f(p)$ over all nodes of T
 - Array length $N = 1 + f_M$
 - Worst case: $N = 2^n - 1$



/	x	+	+	4	-	2	3	1			9	5		
0	1	2	3	4	5	6	7	8	9	10	11	12	13	14

LINKED STRUCTURE FOR GENERAL TREES

- Similar to Binary Tree, except there is no notion of left and right
- Single container of reference to its children



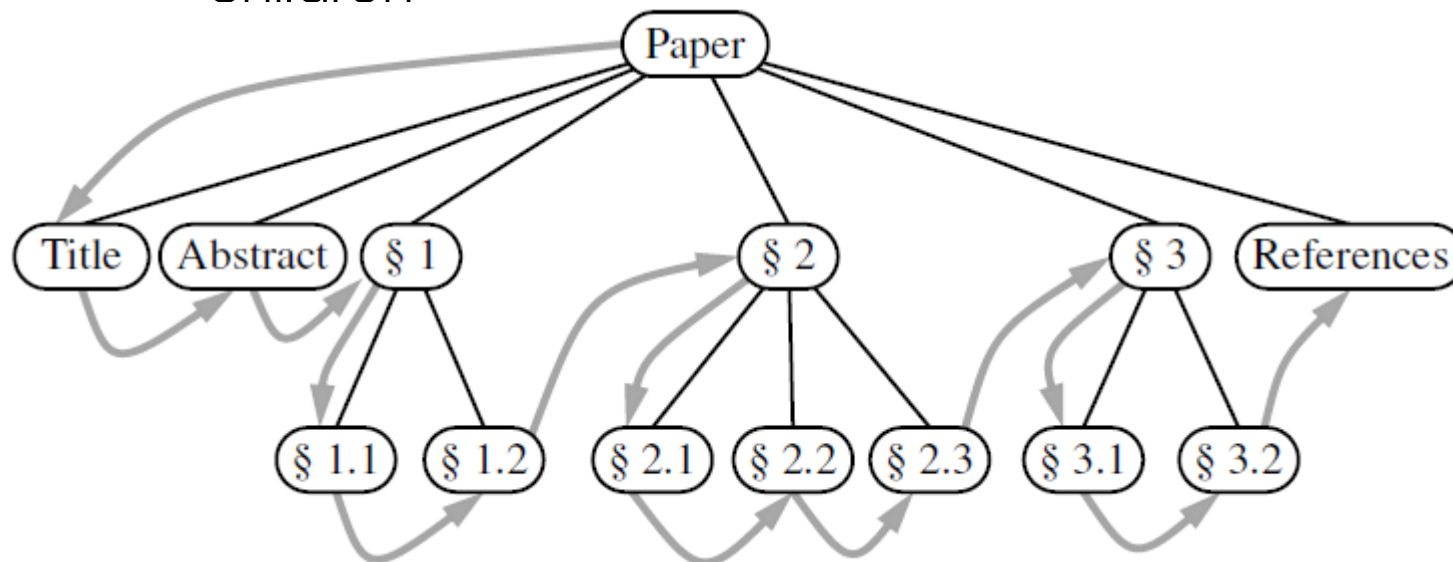
LINKED STRUCTURE FOR GENERAL TREES

- Performance
- $\text{len}(): O(1)$
- $\text{root}(), \text{parent}(), \text{is_root}(), \text{is_leaf}(): O(1)$
- $\text{children}(p): O(c_p + 1)$, c_p number of children of a position p
- $\text{depth}(): O(d_p + 1)$
- $\text{height}(): O(n)$

Operation	Running Time
$\text{len}, \text{is_empty}$	$O(1)$
$\text{root}, \text{parent}, \text{is_root}, \text{is_leaf}$	$O(1)$
$\text{children}(p)$	$O(c_p + 1)$
$\text{depth}(p)$	$O(d_p + 1)$
height	$O(n)$

TREE TRAVERSAL ALGORITHMS

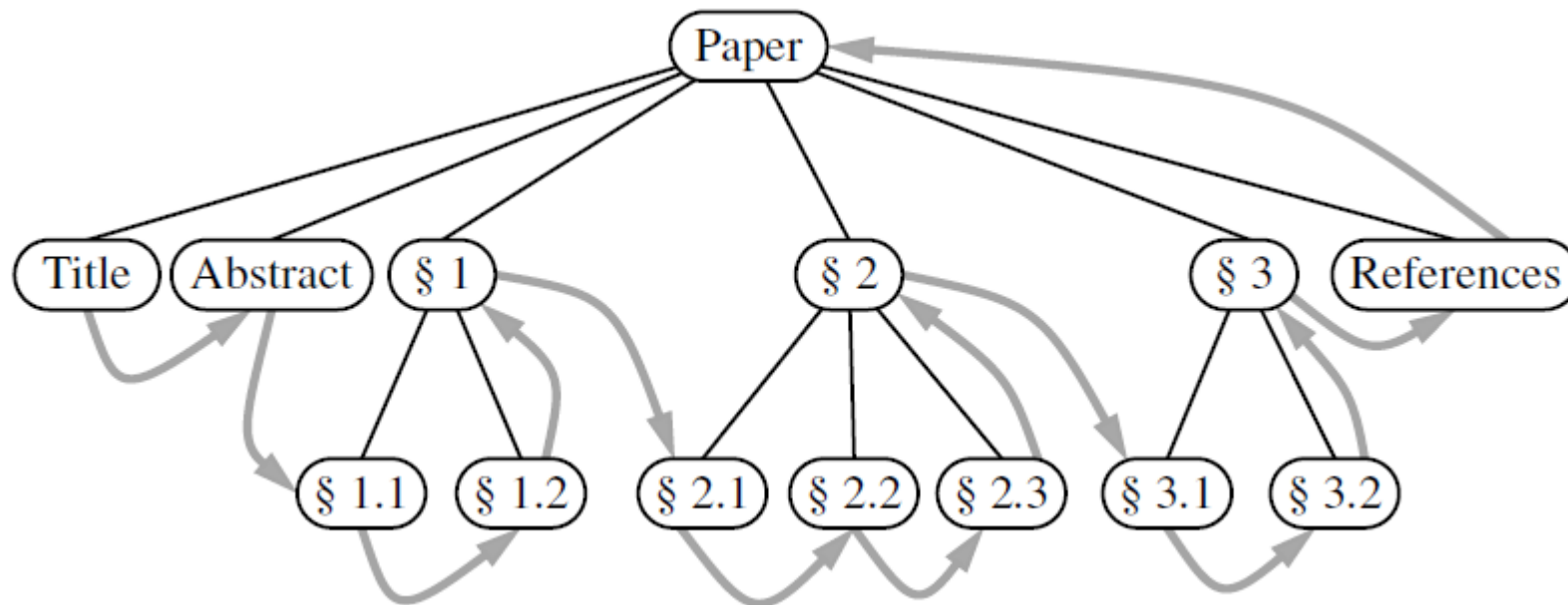
- Traversal: a systematic way of accessing or 'visiting' all the positions of T
- Preorder traversal:
 - visit root of T first and then visit the sub-trees recursively
 - If tree is ordered, then the subtrees are traversed according to the order of the children



Algorithm preorder(T, p):
perform the “visit” action for position p
for each child c in $T.children(p)$ **do**
 preorder(T, c)
 {recursion}

TREE TRAVERSAL ALGORITHMS

- Postorder traversal:
 - The opposite of preorder traversal
 - Recursively traverses the subtrees at the children of the root first and then visits the root



Algorithm postorder(T, p):
 for each child c in $T.children(p)$ **do**
 postorder(T, c)
 perform the “visit” action for position p

TREE TRAVERSAL ALGORITHMS

- Running time
- At each position p , non-recursive part: $O(c_p + 1)$
 - c_p number of children of p
- Overall: $O(n)$

Algorithm preorder(T, p):

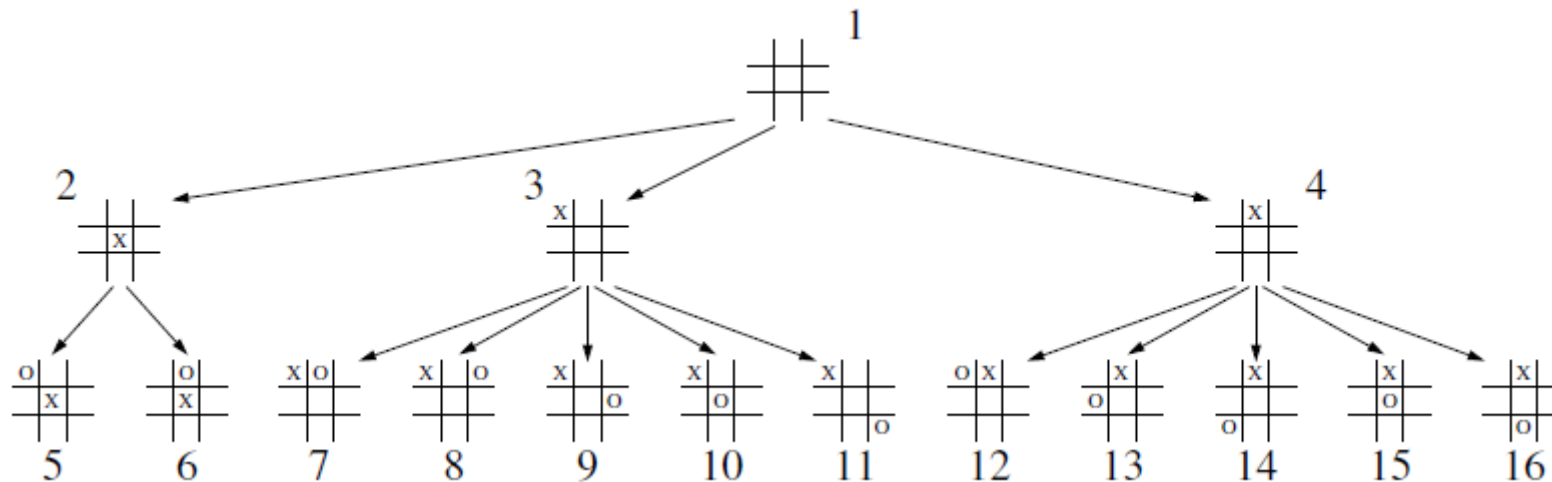
```
perform the “visit” action for position  $p$ 
for each child  $c$  in  $T.children(p)$  do
    preorder( $T, c$ )                                {recu
```

Algorithm postorder(T, p):

```
for each child  $c$  in  $T.children(p)$  do
    postorder( $T, c$ )                                {recu
perform the “visit” action for position  $p$ 
```


TREE TRAVERSAL ALGORITHMS

- Breadth-First Tree Traversal
 - Visit all the position at depth d before visit the position at depth $d+1$
- Commonly used in software for playing games



TREE TRAVERSAL ALGORITHMS

- Breadth-First Tree Traversal
 - Visit all the position at depth d before visit the position at depth $d+1$
- $O(n)$ running time: n calls to `enqueue()` and n calls to `dequeue()`

Algorithm `breadthfirst(T)`:

Initialize queue Q to contain `T.root()`

while Q not empty **do**

$p = Q.dequeue()$

 { p is the oldest entry in the queue}

 perform the “visit” action for position p

for each child c in `T.children(p)` **do**

$Q.enqueue(c)$ {add p 's children to the end of the queue for later visits}

TREE TRAVERSAL ALGORITHMS

- In-order Traversal of a Binary Tree
 - Visit left
 - Visit node
 - Visit right

Algorithm inorder(p):

if p has a left child lc **then**

 inorder(lc)

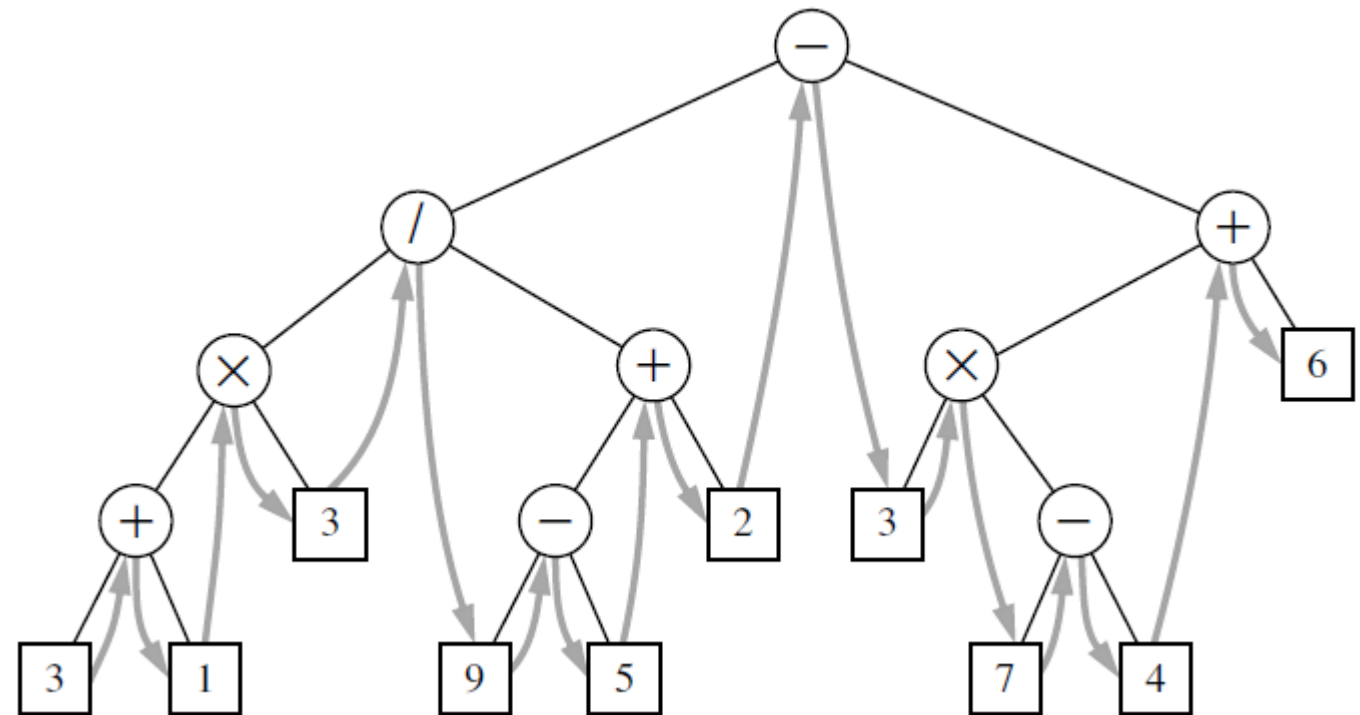
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 perform the “visit” action for position p

if p has a right child rc **then**

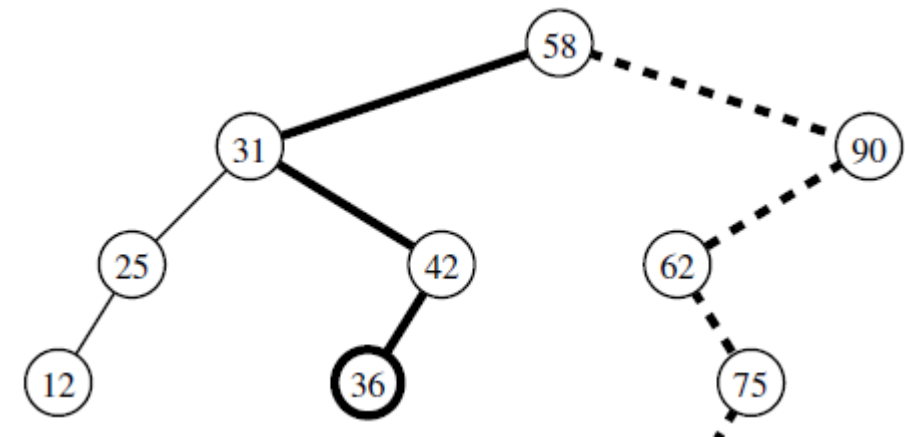
 inorder(rc)

{rec



BINARY SEARCH TREES

- Binary search tree: using tree to store an ordered sequence of elements in a binary tree
- Let S be a set whose unique elements have an order relation
- A binary search tree for S is a binary tree T such that
 - Position p stores an element of S , denoted as $e(p)$
 - Elements stored in the left subtree of p are less than $e(p)$
 - Elements stored in the right subtree of p are greater than $e(p)$
- Running time for finding an occurrence?
 - Proportional to the height of T
 - How you organize the tree really matters
 - Best case?
 - Worst case?



SMALL QUIZ FOR THIS WEEK:

- A stream of 1s and 0s are coming.
- At any time, we have to tell that the binary number from the 1s and 0s is divisible by 3 (or not)
- For example:
 - 1 – not divisible
 - 11 – divisible
 - 110 – divisible
 - 1100 – divisible
- Try to write an algorithm that check any random binary number



THANKS

See you in the next session!