

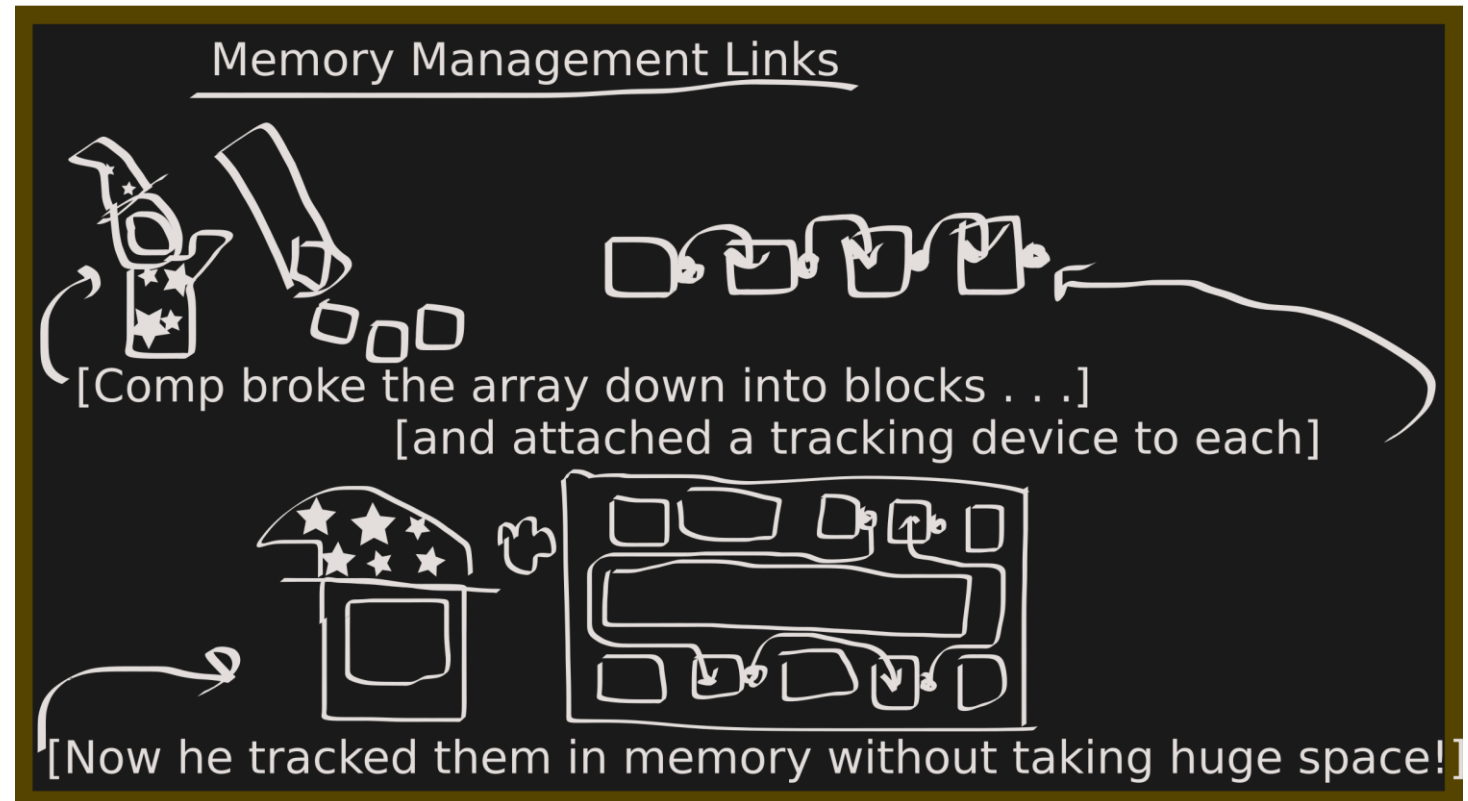


TREES

School of Artificial Intelligence

PREVIOUSLY ON DS&A

- LinkedList (链表)
- Singly Linked List (单链表)
- Doubly Linked List (双链表)
- Positional List
- Linked Based Sequence vs. Array Based Sequence



THE POSITIONAL LIST ADT

- Position ADT
 - `P.element()`: return the element stored at position `p`
- Positional List ADT
 - `L.first()`: first element of `L`, or `None` if `L` is empty
 - `L.last()`: last element of `L`, or `None` if `L` is empty
 - `L.before(p)`: the position in `L` immediately before `p`, or `None` if `p` is the first position
 - `L.after(p)`: the position in `L` immediately after `p`, or `None` if `p` is the last position
 - `L.is_empty()`: `true` if `L` is empty
 - `len(L)`: number of elements in the list
 - `iter(L)`: returns a forward iterator for the elements of the list

THE POSITIONAL LIST ADT

- Positional List ADT
 - `L.add_first(e)`: insert a new element `e` at the front of `L`, return the position of the new element
 - `L.add_last(e)`: insert a new element `e` at the back of `L`, return the position of the new element
 - `L.add_before(p, e)`: insert a new element `e` before position `p` in `L`, return the position of the new element
 - `L.add_after(p, e)`: insert a new element `e` after position `p` in `L`, return the position of the new element
 - `L.replace(p, e)`: replace the element at position `p` with element `e`, returning the element formerly at position `p`
 - `L.delete(p)`: remove and return the element at position `p` in `L`

DOUBLY LINKED LIST IMPLEMENTATION

- Validating a position
 - Necessary to avoid corrupting the list
 - P needs to be of type Position
 - The container of p is the linkedlist
 - Position is not valid if the node is not in the

```
25 #----- utility method -----
26 def _validate(self, p):
27     """ Return position's node, or raise appropriate error if invalid."""
28     if not isinstance(p, self.Position):
29         raise TypeError('p must be proper Position type')
30     if p._container is not self:
31         raise ValueError('p does not belong to this container')
32     if p._node._next is None: # convention for deprecated nodes
33         raise ValueError('p is no longer valid')
34     return p._node

35 #----- utility method -----
36 def _make_position(self, node):
37     """ Return Position instance for given node (or None if sentinel)."""
38     if node is self._header or node is self._trailer:
39         return None # boundary violation
40     else:
41         return self.Position(self, node) # legitimate position
```


LINKED-BASED VS. ARRAY BASED SEQUENCES

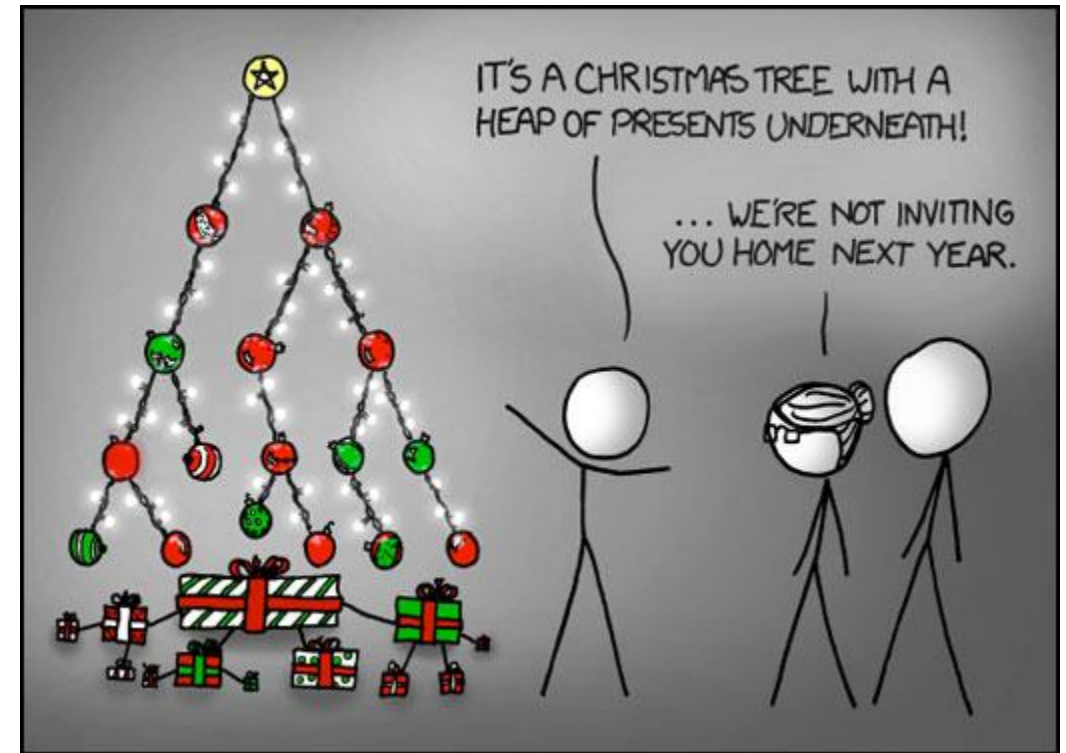
- Advantages of array-based sequences
 - $O(1)$ time to access an element based on an integer index
 - Getting the k^{th} element in a linkedlist takes $O(k)$ time, or $O(n-k)$ time
 - Operations with equivalent asymptotic bounds run more efficient with an array based structure
 - enqueue() operation for array: compute new index, increment of an integer, storing a reference to the element in the array
 - enqueue() operation for linkedlist: creating a new node, linking the nodes, increment of an integer
 - $O(1)$ time in either model, but more CPU time needed for linked list
 - Less memory than linked list
 - Linkedlist uses more auxiliary memory: reference to element, reference to next/prev

LINKED-BASED VS. ARRAY BASED SEQUENCES

- Advantages of link-based sequences
 - Worst-case time bounds can be obtained for operations in a linked list
 - Amortised bounds can be obtained by array-based sequence
 - But remember sequential applications vs. real-time applications
 - $O(1)$ time insertions and deletions
 - It is easy to insert and delete elements at any position in a linkedlist
 - `pop()` with index k needs $O(n-k+1)$ time, because of the shifting of elements

THIS LECTURE

- Trees
- Definition of a Tree
- Binary Trees

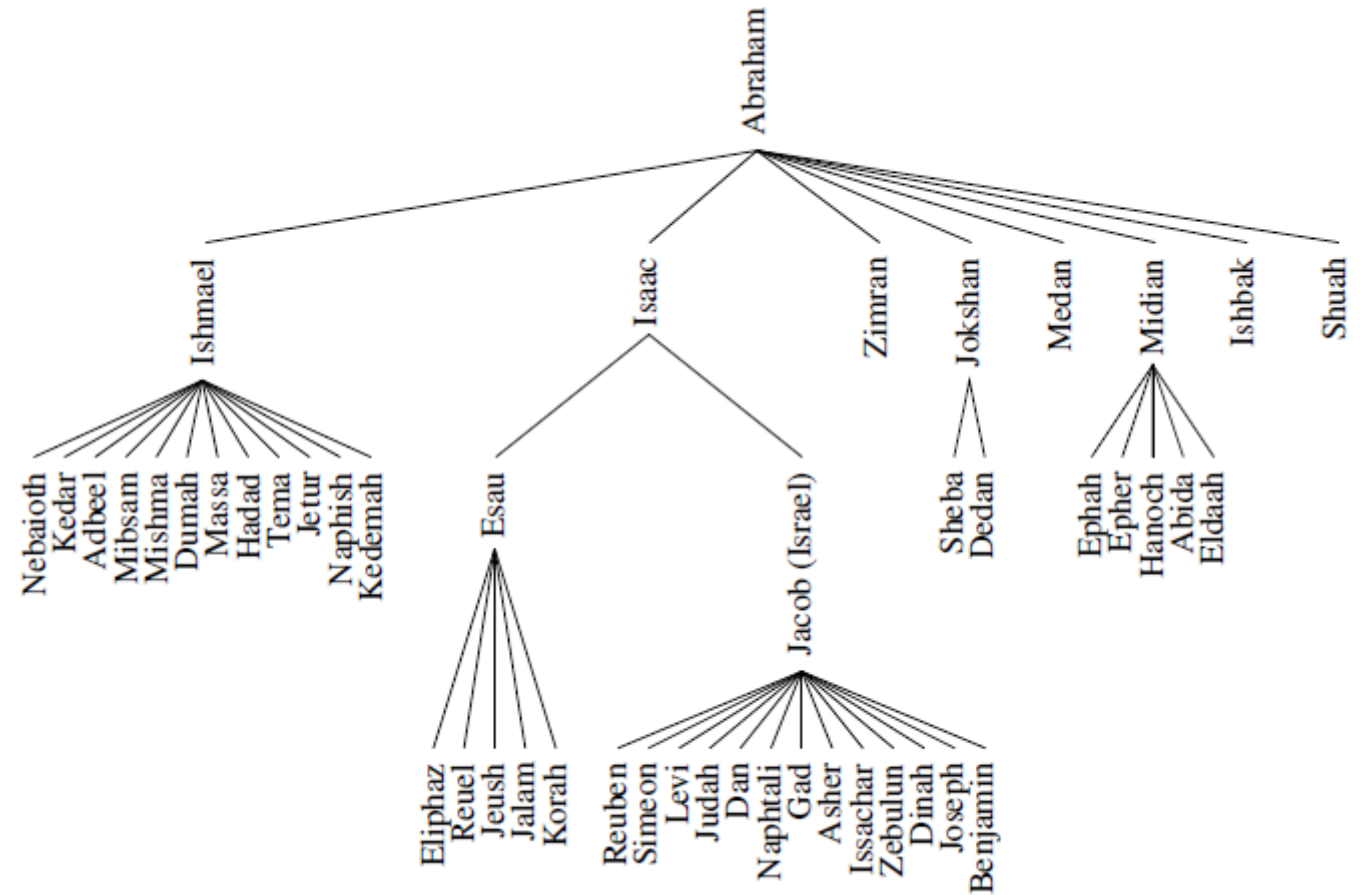


GENERAL TREES

- Tree: most important non-linear data structure in computing
- Why trees
 - some algorithms run much faster on trees than on linear data structures such as array-based lists or linked lists
 - Natural organisation for data - file systems, graphical user interfaces, databases, web sites
- Non-linear: an organizational relationship that is richer than the simple “before” and “after” relationship between objects in sequences
- Trees are hierarchical, with some objects being “above” and some “below” others

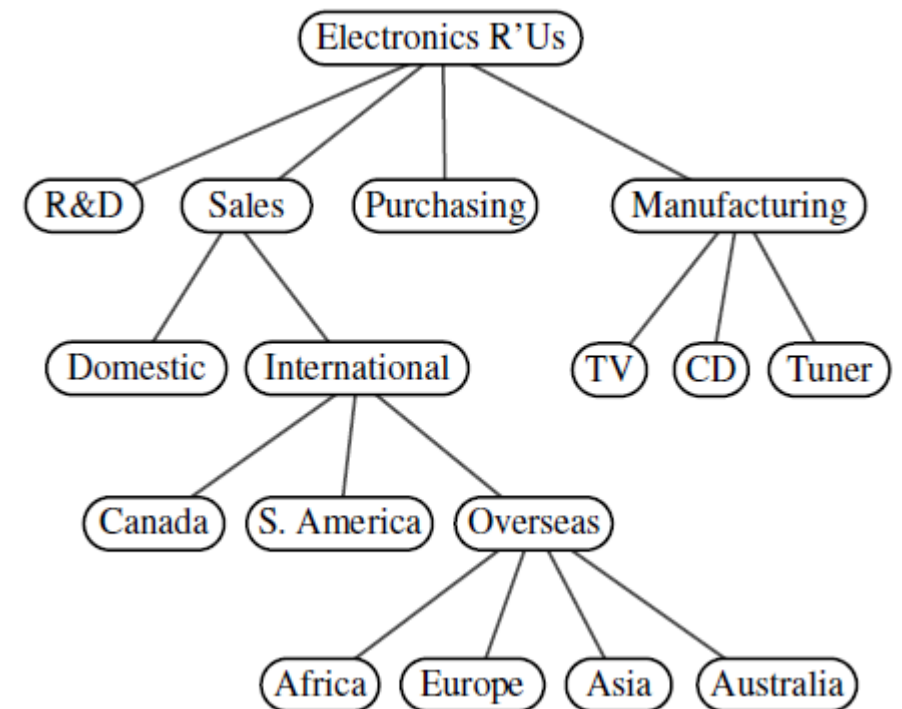
GENERAL TREES

- The terminology for *Tree* mostly originates from “family trees”
- The notion of “parent”, “child”, “ancestor” and “descendant”



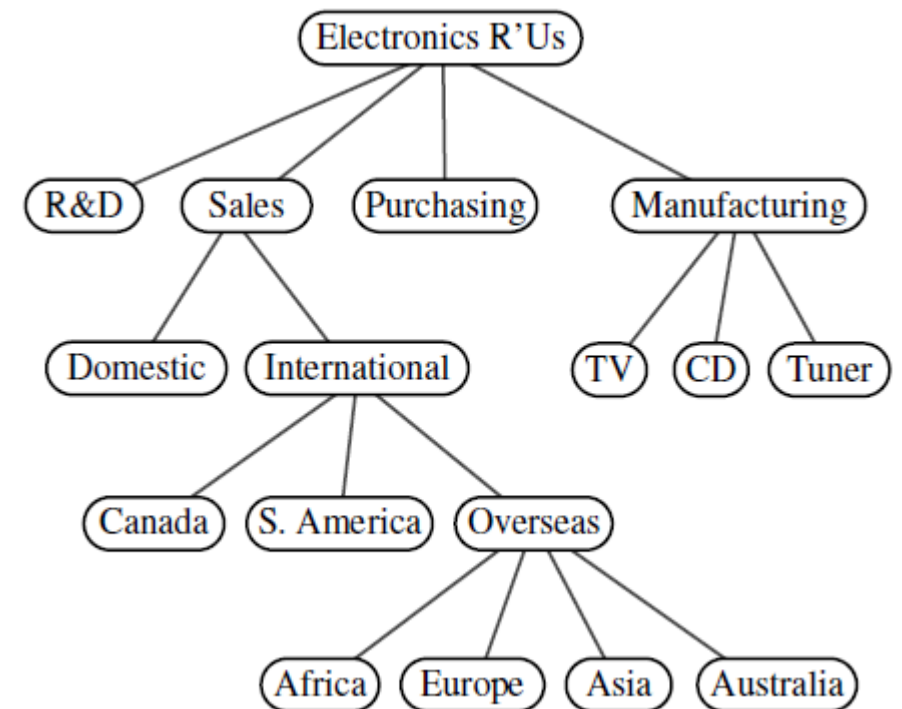
GENERAL TREES

- Definitions and properties
- Tree: abstract data type that stores elements hierarchically
- Node: a container that contains an element stored in the tree
- Parent node: a node directly connected and above
- Child node: a node directly connected and below
- Root: top level element



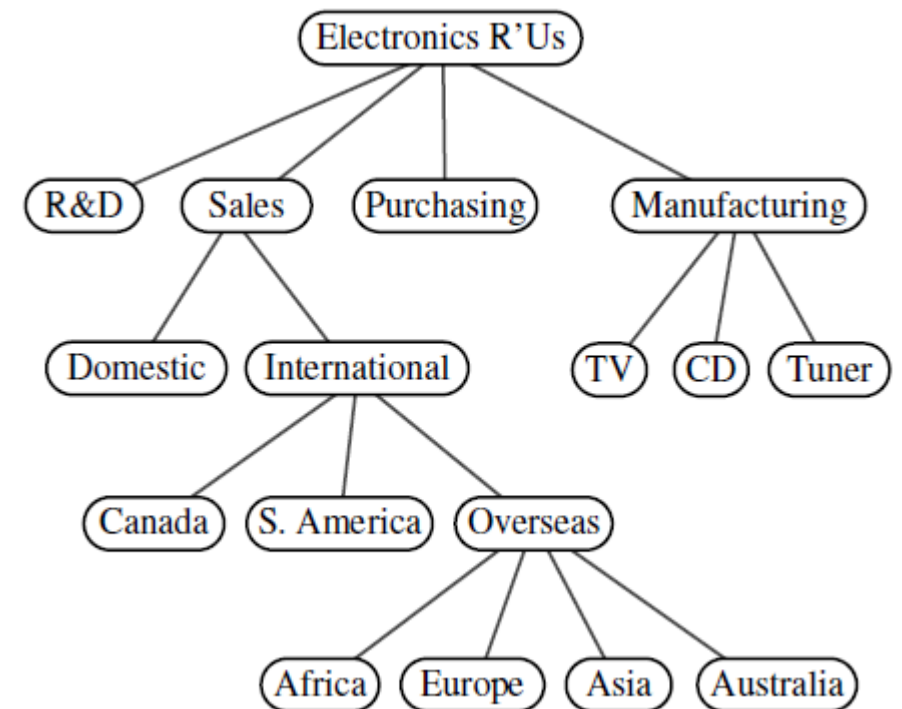
GENERAL TREES

- A tree T as a set of nodes storing elements such that the nodes have a parent-child relationships that satisfies the following properties:
 - 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
- Empty tree: no nodes at all
- “a tree T is either empty or consists of a node r , called the root of T , and a set of subtrees whose roots are the children of r ”



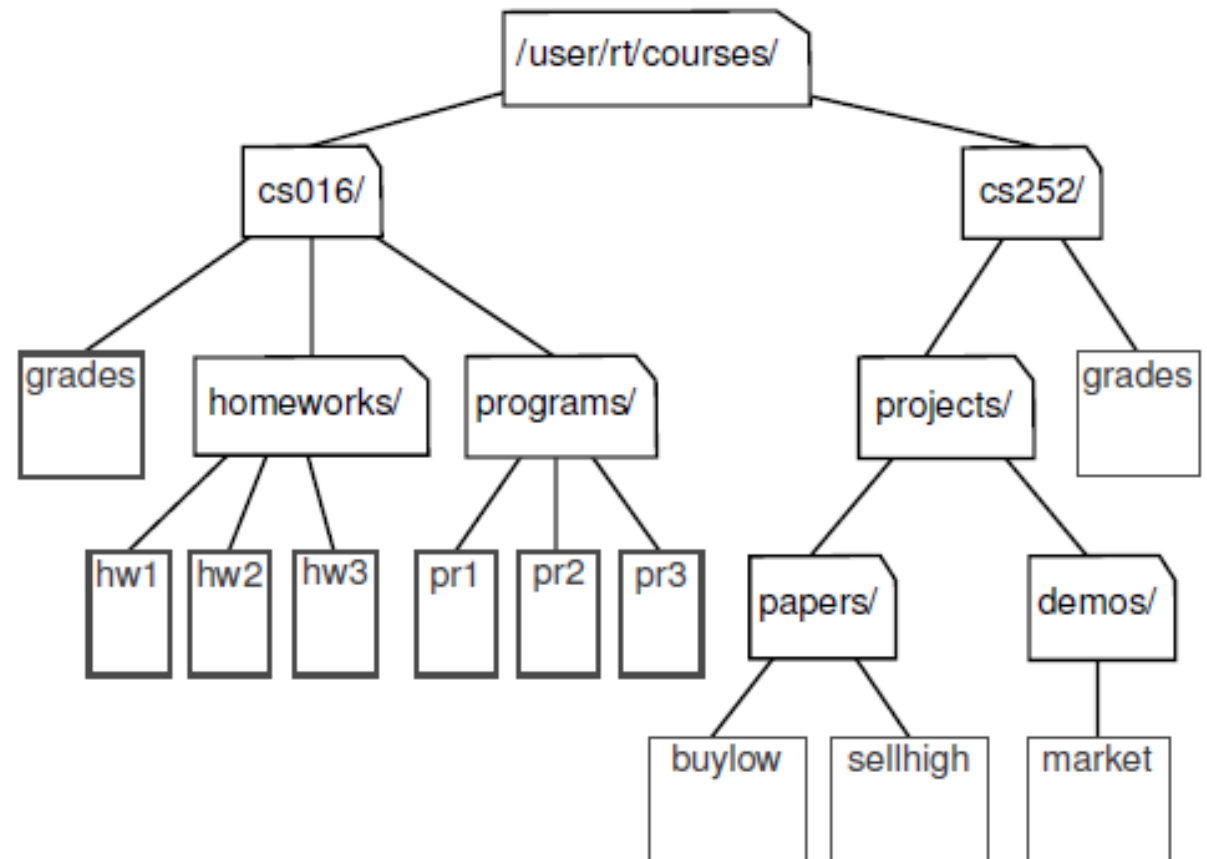
GENERAL TREES

- Siblings(兄弟结点): two nodes that are children of the same parent
- External node (外部结点) : if node v has no children
- Internal node (内部结点) : if node v has one or more children
- External nodes: a.k.a. **leaves** (叶结点)



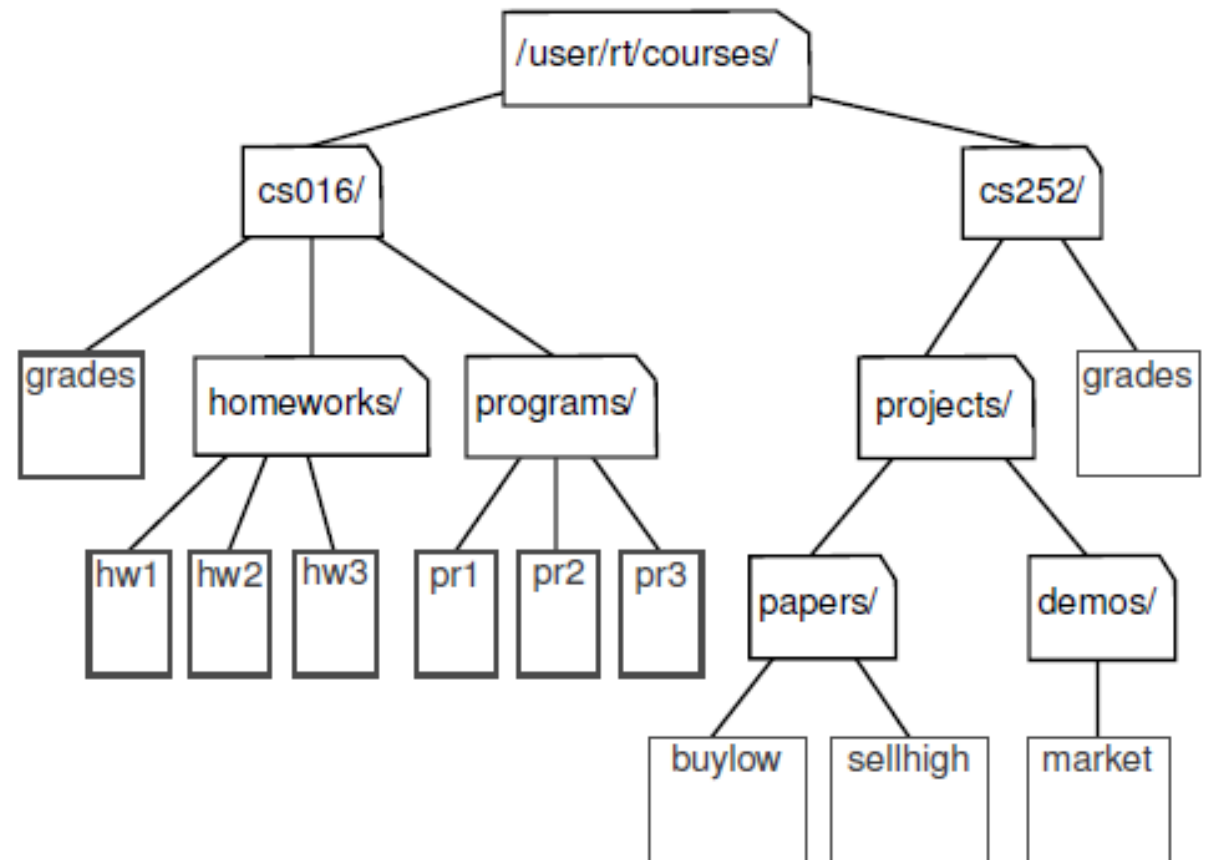
GENERAL TREES

- Internal nodes: folders
- Leaves: files
- Root: /user/rt/courses
 - This is a sub-tree, what's the "root" of the entire tree?



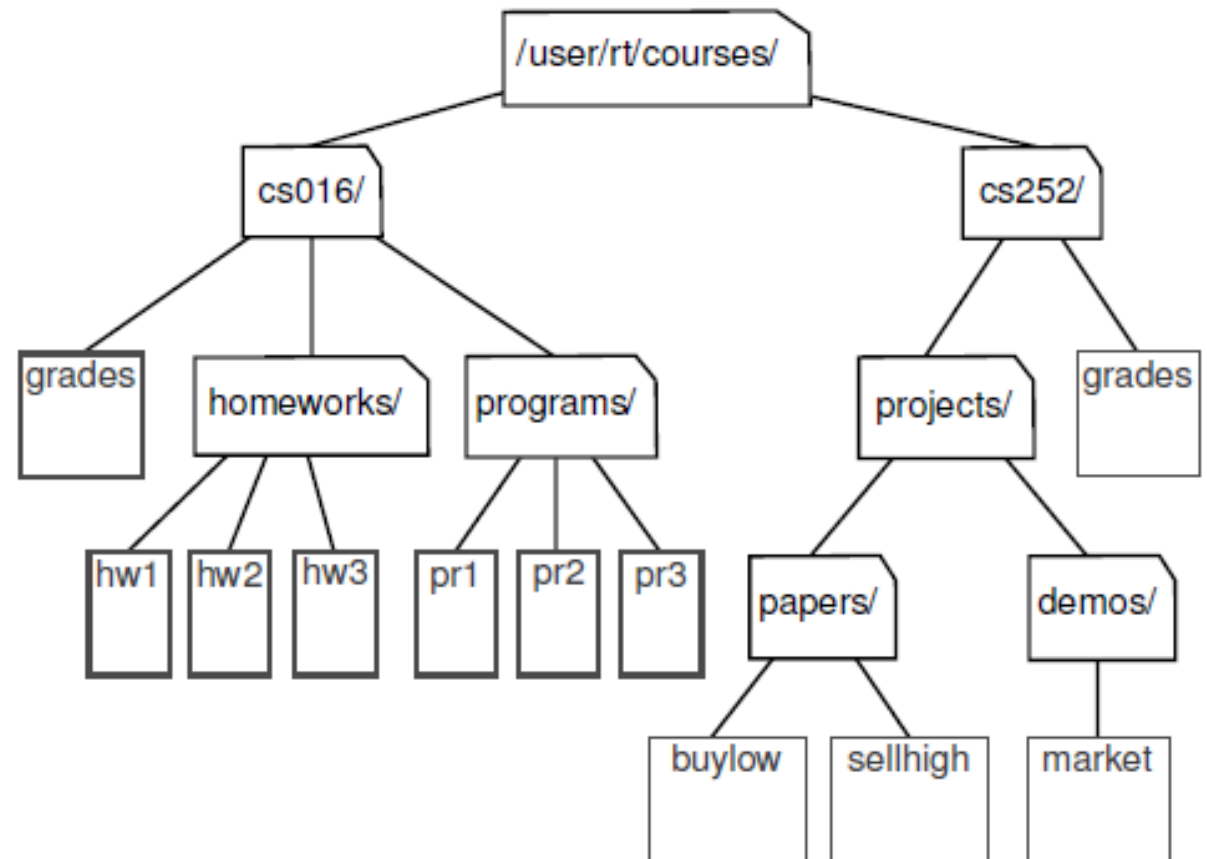
GENERAL TREES

- Ancestor(祖先结点): a node u is an ancestor of v , if 1) $u = v$; 2) u is an ancestor of the parent of v
- Descendant (子孙结点): v is a descendant of a node u if u is an ancestor of v
- `cs252/` is an ancestor of `/papers`
- `pr3` is a descendant of `cs016/`



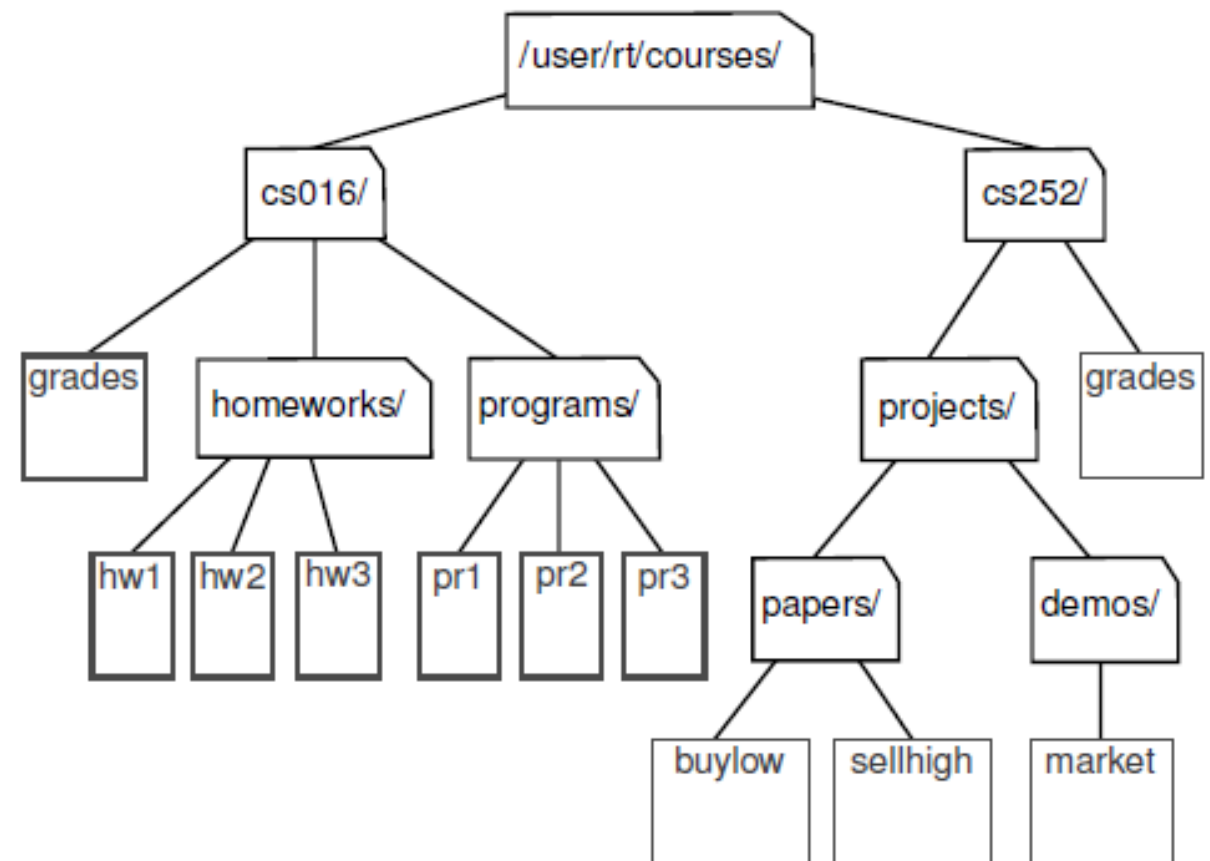
GENERAL TREES

- Subtree of T rooted at a node v is the tree consisting of all the descendants of v in T (including v)
- Subtree rooted at `cs016/`
 - `Cs016/`
 - `Grades/`
 - `Homeworks/`
 - `Programs/`
 - `Hw1`, `hw2`, `hw3`
 - `Pr1`, `pr2`, `pr3`



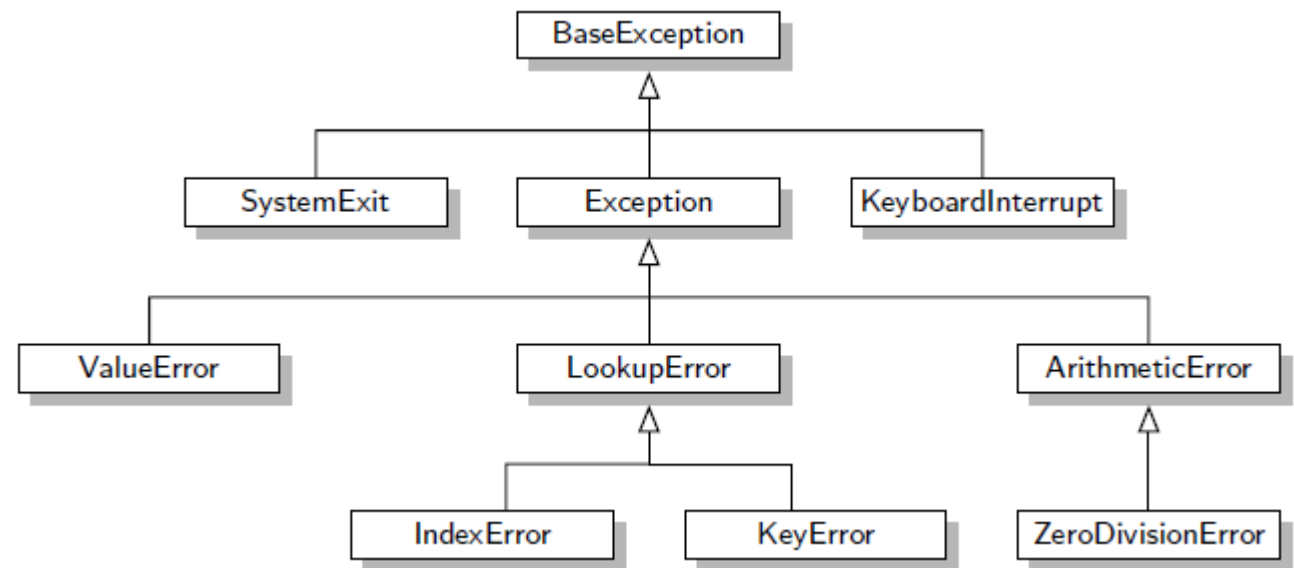
EDGES AND PATHS

- 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
- E.g.:
cs252/projects/demos/market



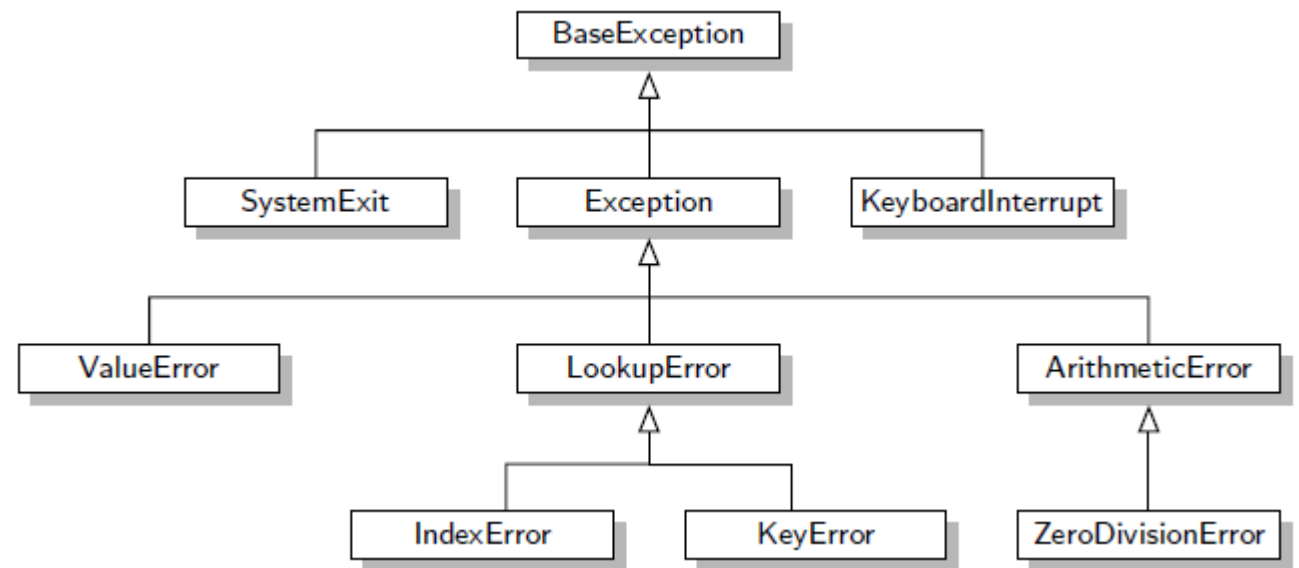
PYTHON'S INHERITANCE TREE

- Inheritance relation between classes in the Python language
- Root?
- Internal Nodes?
- External Nodes?
- Siblings?
- Ancestors?
- Descendants?



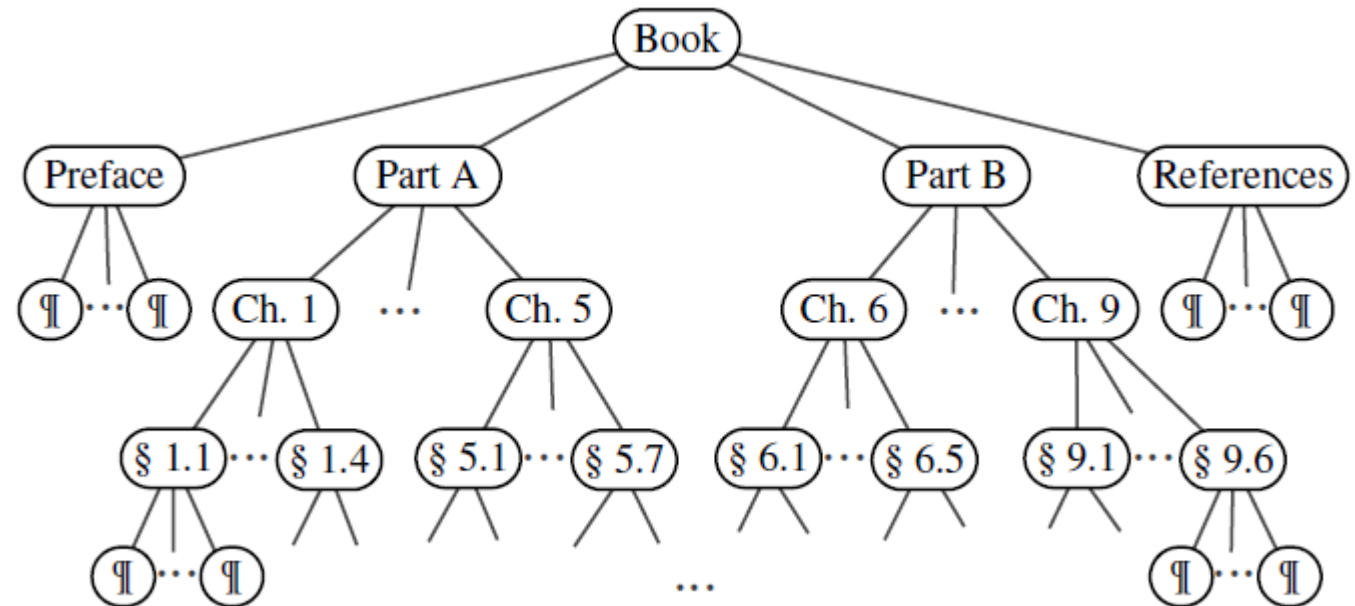
PYTHON'S INHERITANCE TREE

- But this is just a sub-tree
- In Python, there is an overall base class called object
- All other classes inherit object
- In other words, object is the ancestor of all other classes, including the ones that you create



ORDERED VS. UNORDERED

- A tree is ordered if there is a linear order among the children of each node
- Book is an ordered tree
 - Internal nodes: parts, chapters, sections, paragraphs, tables, figures, etc.
 - Root of the tree: book
- Examples of ordered trees?
- Examples of unordered trees?



THE TREE ADT

- Remember Positional list?
 - Operations on a positional list returns a position, which points to a location in the list that contains an element
 - We will do the same for tree
- Position ADT
 - `p.element()`: return the element stored at position `p`
- Tree ADT
 - `T.root()`: return the position of the root
 - `T.is_root(p)`: returns true if position `p` is the root of tree `T`
 - `T.parent(p)`: returns the position of the parent of position `p`, or `None` if `p` is the root of `T`
 - `T.num_children(p)`: returns the number of children of position `p`

THE TREE ADT

- Tree ADT
 - `T.children(p)`: returns a collection of the children of position `p`
 - `T.is_leaf(p)`: returns true if position `p` does not have any children (i.e. it is a leaf node)
 - `len(T)`: returns the number of elements in `T`
 - `T.is_empty()`: returns true if `T` does not contain any elements
 - `T.positions()`: returns a collection of all positions of tree `T`
 - `Iter(T)`: returns a iterator of all elements stored in `T`
- All above functions should raise an error if position `p` is not in `T` (invalid)



THE TREE ADT

- Some remarks
- For ordered trees: `T.children(p)` returns the children in the natural order (leftmost sibling node to rightmost sibling node)
- If `p` is a leaf, then `T.children(p)` returns an empty collection
- If `T` is empty, then `T.positions()` and `iter(T)` returns an empty collection/iterator
- Mutating methods: discussed later when we implement trees

OBJECT ORIENTED PROGRAMMING

- An abstract base class for Tree
- Define default behaviours for operations
- Greater re-use
- Position class:
 - Element() and __eq__() not implemented
 - NotImplementedError when called
 - Typical for Object Oriented Programming
 - You need to define your own subclass for Position that overrides these two

```
1 class Tree:
2     """ Abstract base class representing a tree structure."""
3
4     #----- nested Position class -----
5     class Position:
6         """ An abstraction representing the location of a single element."""
7
8         def element(self):
9             """ Return the element stored at this Position."""
10            raise NotImplementedError('must be implemented by subclass')
11
12        def __eq__(self, other):
13            """ Return True if other Position represents the same location."""
14            raise NotImplementedError('must be implemented by subclass')
15
16        def __ne__(self, other):
17            """ Return True if other does not represent the same location."""
18            return not (self == other)           # opposite of __eq__
```

OBJECT ORIENTED PROGRAMMING

- Tree abstract base class
- `root()`, `parent()`,
`num_children()`, `children()`,
`__len__()` not implemented

```
20 # ----- abstract methods that concrete subclass must support -----
21 def root(self):
22     """Return Position representing the tree's root (or None if empty)."""
23     raise NotImplementedError('must be implemented by subclass')
24
25 def parent(self, p):
26     """Return Position representing p's parent (or None if p is root)."""
27     raise NotImplementedError('must be implemented by subclass')
28
29 def num_children(self, p):
30     """Return the number of children that Position p has."""
31     raise NotImplementedError('must be implemented by subclass')
32
33 def children(self, p):
34     """Generate an iteration of Positions representing p's children."""
35     raise NotImplementedError('must be implemented by subclass')
36
37 def __len__(self):
38     """Return the total number of elements in the tree."""
39     raise NotImplementedError('must be implemented by subclass')
```

OBJECT ORIENTED PROGRAMMING

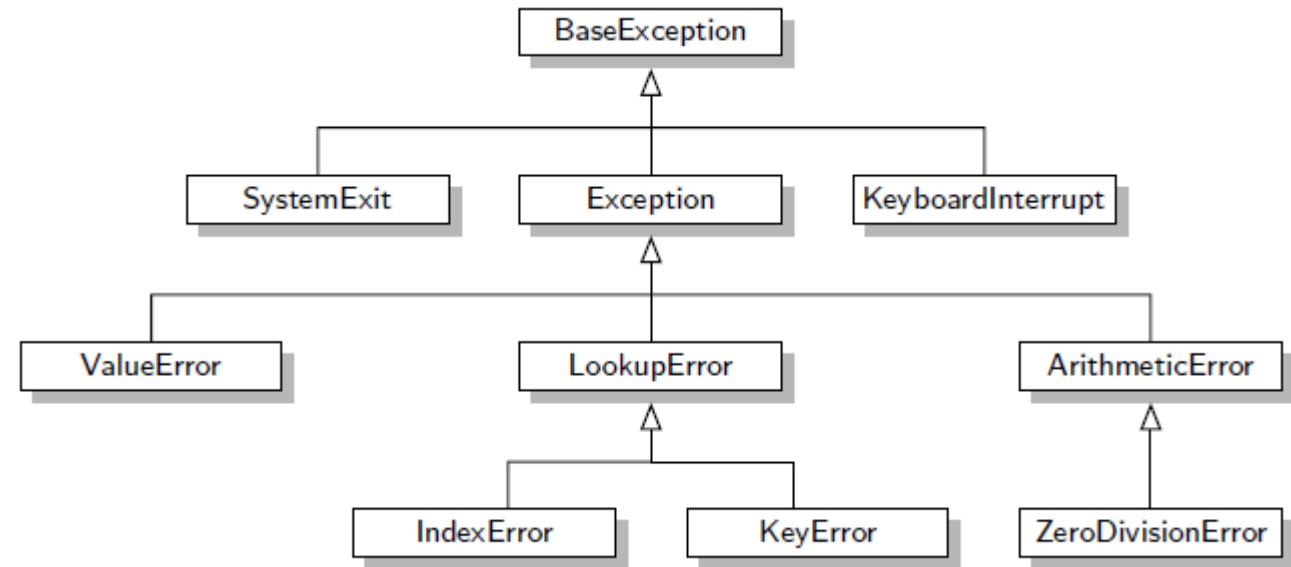
- Tree abstract base class
- Some functions are implemented as concrete methods
 - Why?
- Is it sensible to create a direct instance (实例) of the abstract Tree class?

```
40 # ----- concrete methods implemented in this class -----
41 def is_root(self, p):
42     """ Return True if Position p represents the root of the tree."""
43     return self.root( ) == p
44
45 def is_leaf(self, p):
46     """ Return True if Position p does not have any children."""
47     return self.num_children(p) == 0
48
49 def is_empty(self):
50     """ Return True if the tree is empty."""
51     return len(self) == 0
```

Code Fragment 8.2: Some concrete methods of our Tree abstract base class.

COMPUTING DEPTH

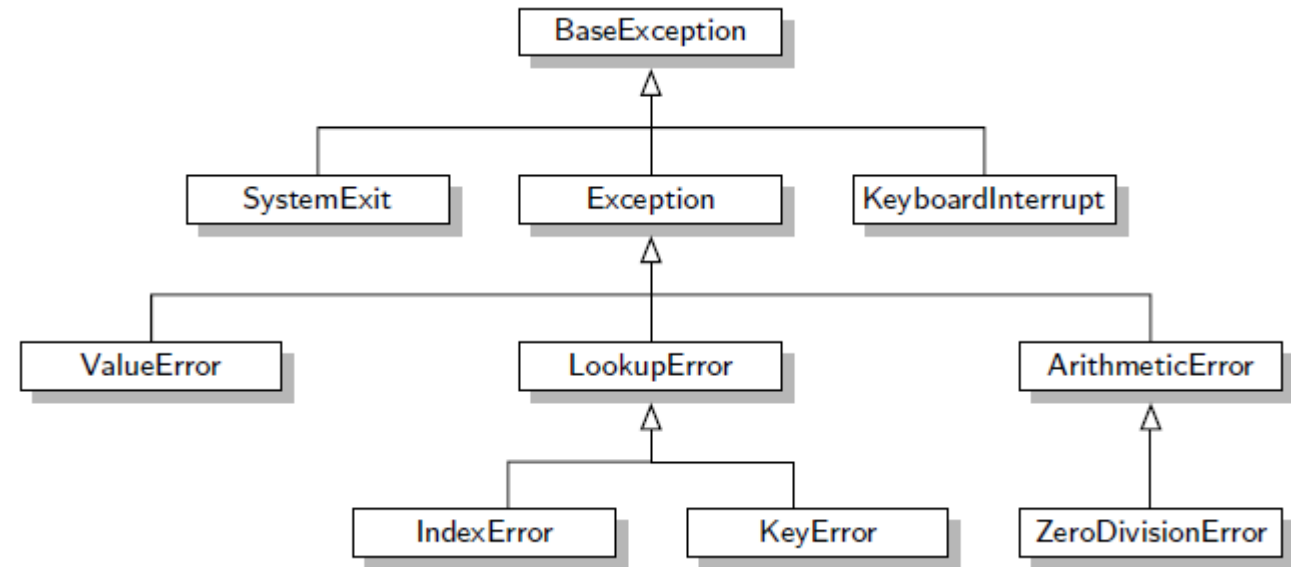
- Tree T, position of a node p
- The depth of p: number of ancestors of p, excluding p itself.
- Depth of LookUpError: 2
- Formal definition:
 - If p is the root then depth of p is 0
 - Otherwise, the depth of p is one plus the depth of the parent of p



```
52 def depth(self, p):
53     """Return the number of levels separating Position p from the root."""
54     if self.is_root(p):
55         return 0
56     else:
57         return 1 + self.depth(self.parent(p))
```

COMPUTING DEPTH

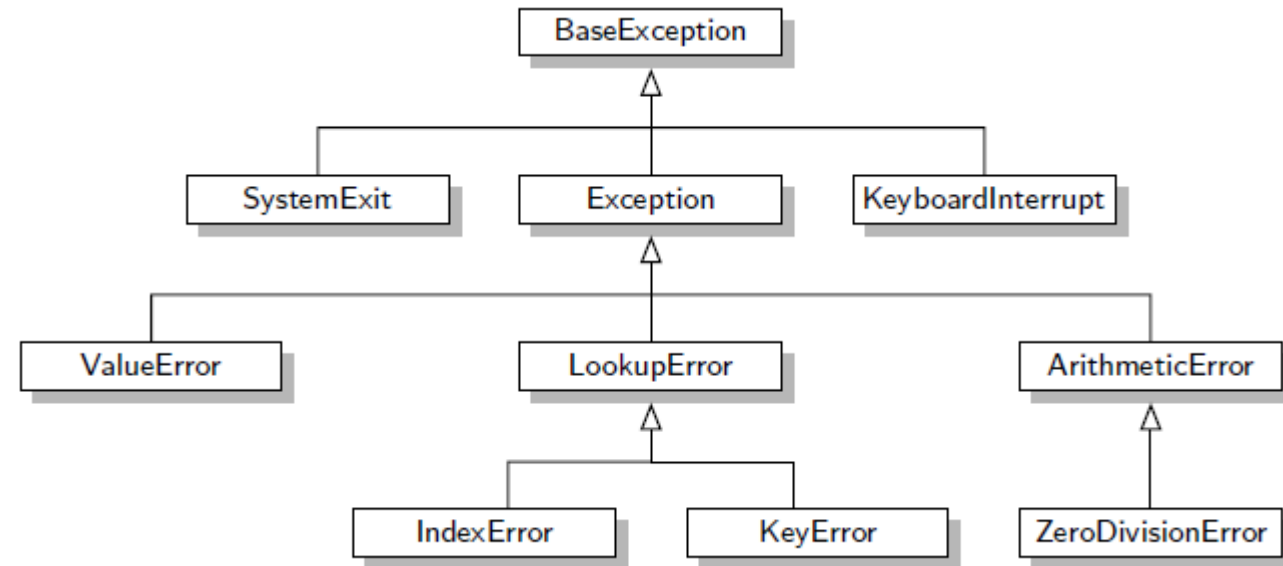
- Running time $T.\text{depth}(p)$?
- $O(d + 1)$: d = depth of p
- Worst case $O(n)$, n = total number of position of T



```
52 def depth(self, p):
53     """Return the number of levels separating Position p from the root."""
54     if self.is_root(p):
55         return 0
56     else:
57         return 1 + self.depth(self.parent(p))
```


COMPUTING HEIGHT

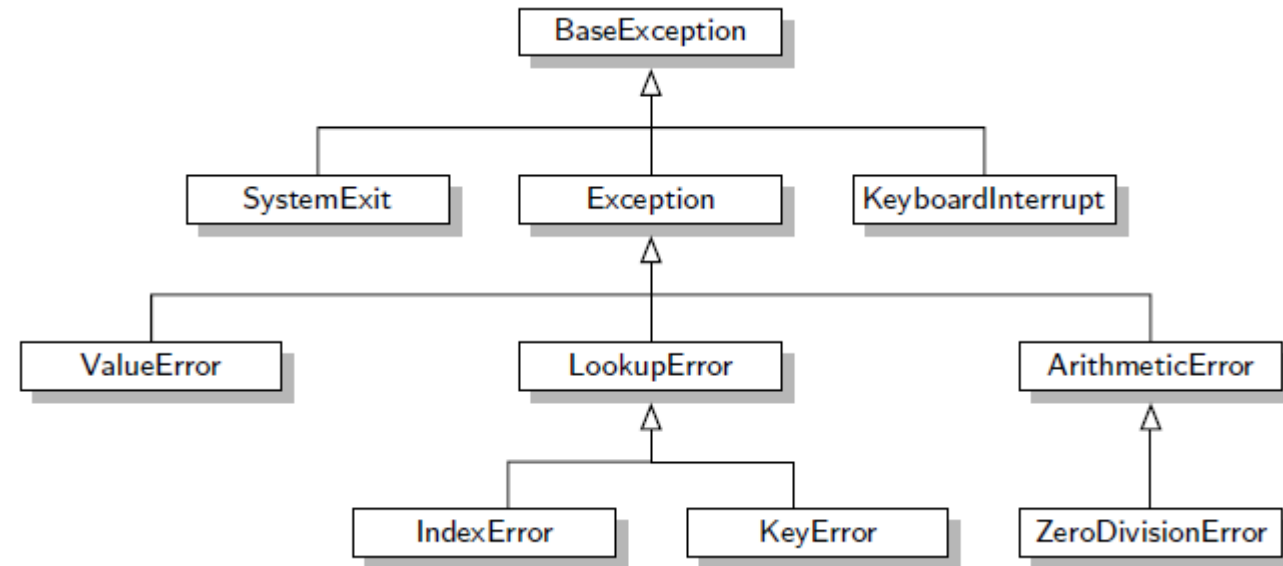
- Height of a position p in tree T :
 - If p is a leaf, its height is 0
 - Otherwise, the height of p is one more than the maximum of the heights of p 's children
- Height of a nonempty T is the height of the root of T
- The Exception tree has a height 3
- The height of a non-empty tree = the maximum of the depths of its leaf positions



```
58 def _height1(self):                                     # works, but  $O(n^2)$  worst-case time
59     """Return the height of the tree."""
60     return max(self.depth(p) for p in self.positions() if self.is_leaf(p))
```

COMPUTING HEIGHT

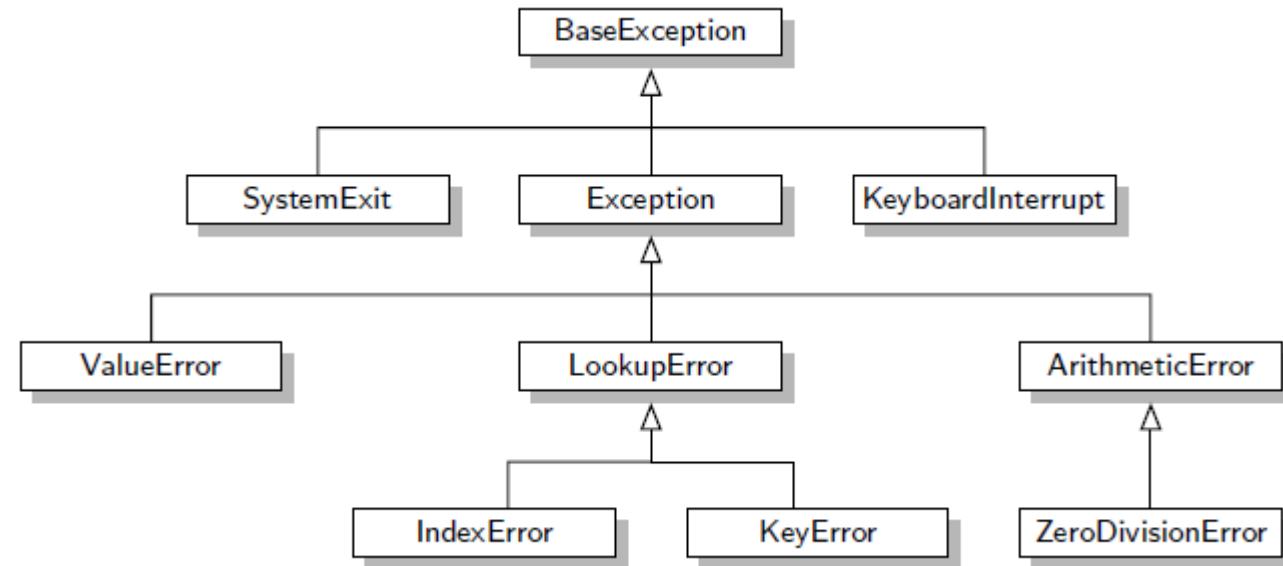
- Complexity of `height1()`?
- `positions()`: can run $O(n)$
- `Depth(p)`: we have established that this can run in $O(n)$
- `Height1()`: $O(n^2)$



```
58 def _height1(self):                                     # works, but  $O(n^2)$  worst-case time
59     """Return the height of the tree."""
60     return max(self.depth(p) for p in self.positions() if self.is_leaf(p))
```

COMPUTING HEIGHT

- An improved version with recursion
- Complexity?



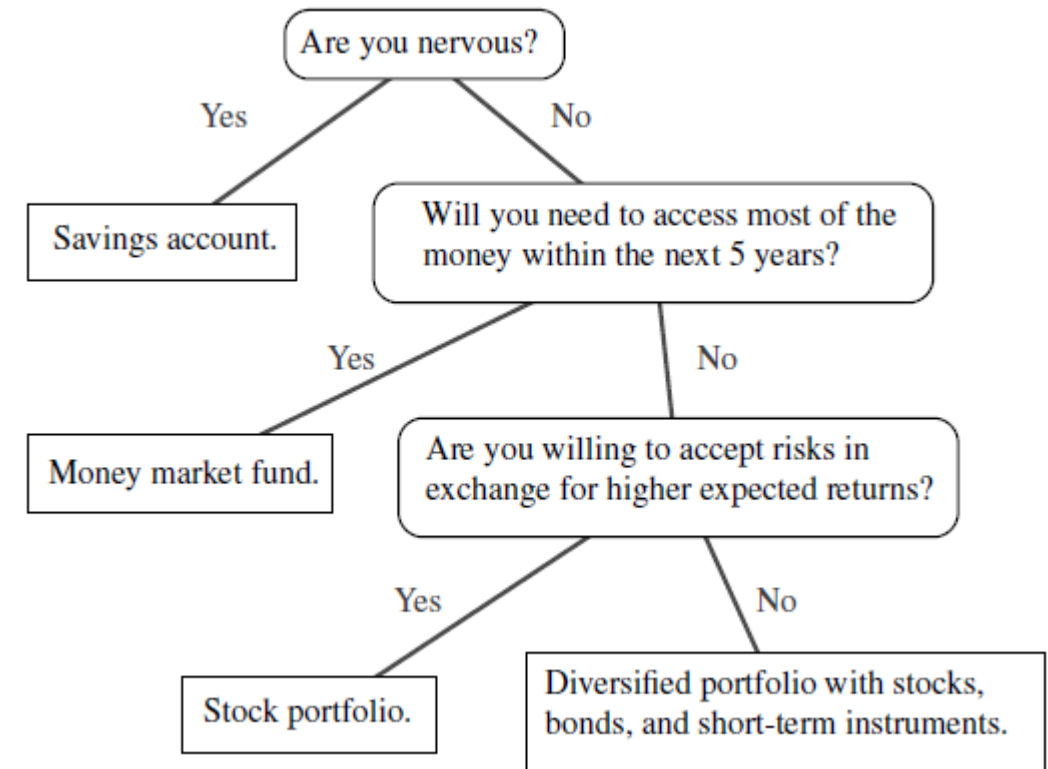
```
61 def _height2(self, p):                                     # time is linear in size of subtree
62     """Return the height of the subtree rooted at Position p."""
63     if self.is_leaf(p):
64         return 0
65     else:
66         return 1 + max(self._height2(c) for c in self.children(p))
```

BINARY TREES (二叉树)

- Binary tree: ordered tree such that
 1. Every node has at most two children
 2. Each child node is labeled as being either a **left child** or a **right child**
 3. A left child precedes a right child in the order of children of a node
- Subtrees: left subtree and right sub tree
- A binary tree is **proper** (标准的/完全) if each node has either zero or two children
 - Also full binary trees

BINARY TREES

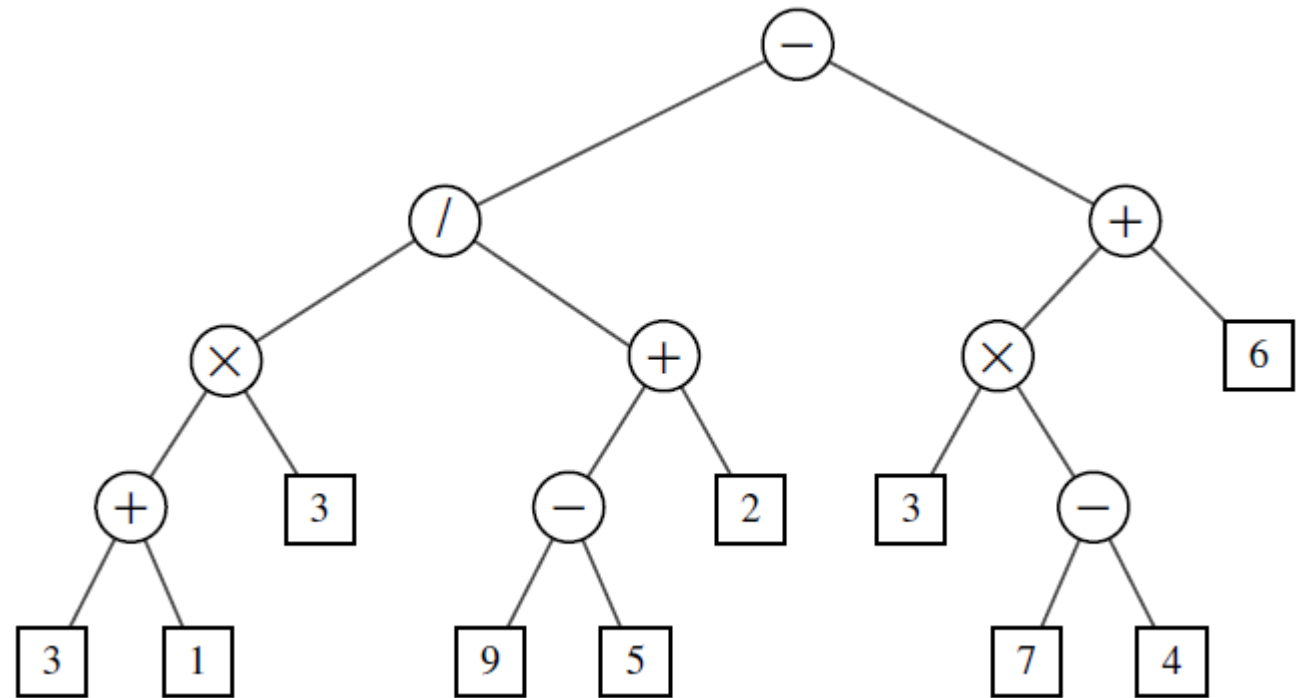
- Example: decision trees
- A number of different outcomes based on answers to yes-no questions





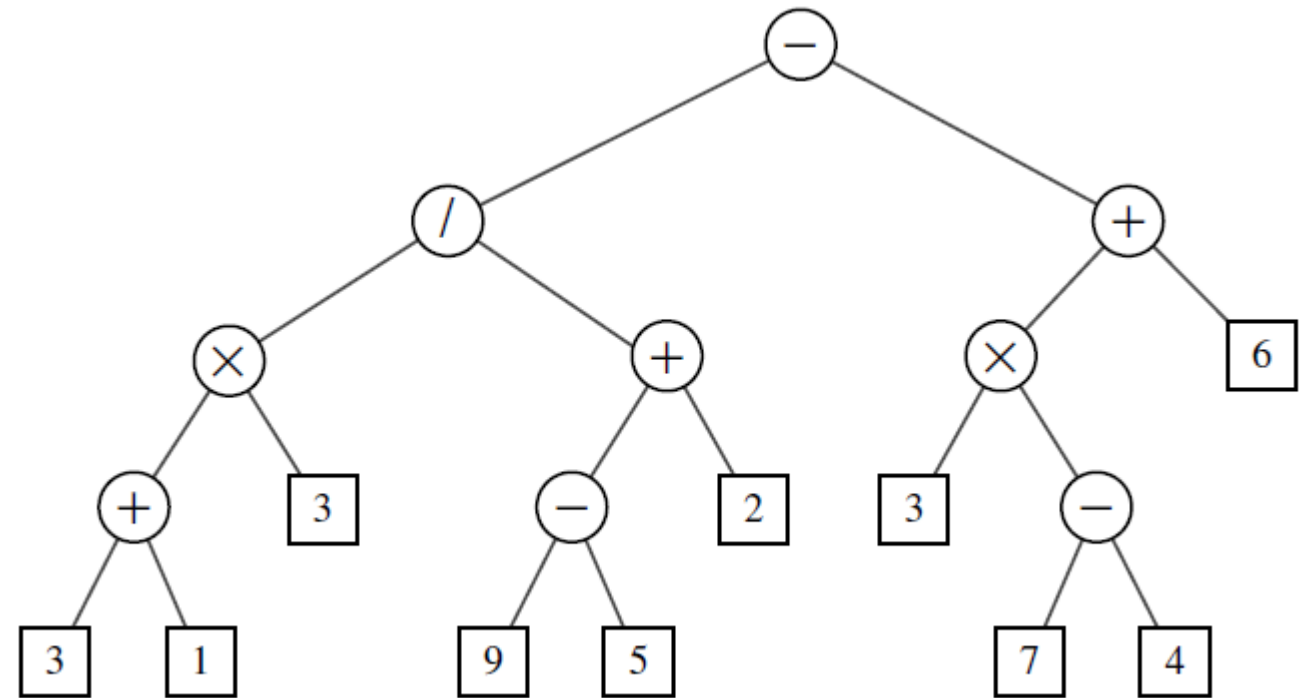
BINARY TREES

- Example: Arithmetic expression tree
- If a node is leaf, then its value is that of its variable or constant
- If a node is internal, its value is defined by applying the operator to its children
- $((3+1) \times 3) / ((9-5)+2) - ((3 \times (7-4)) + 6)$



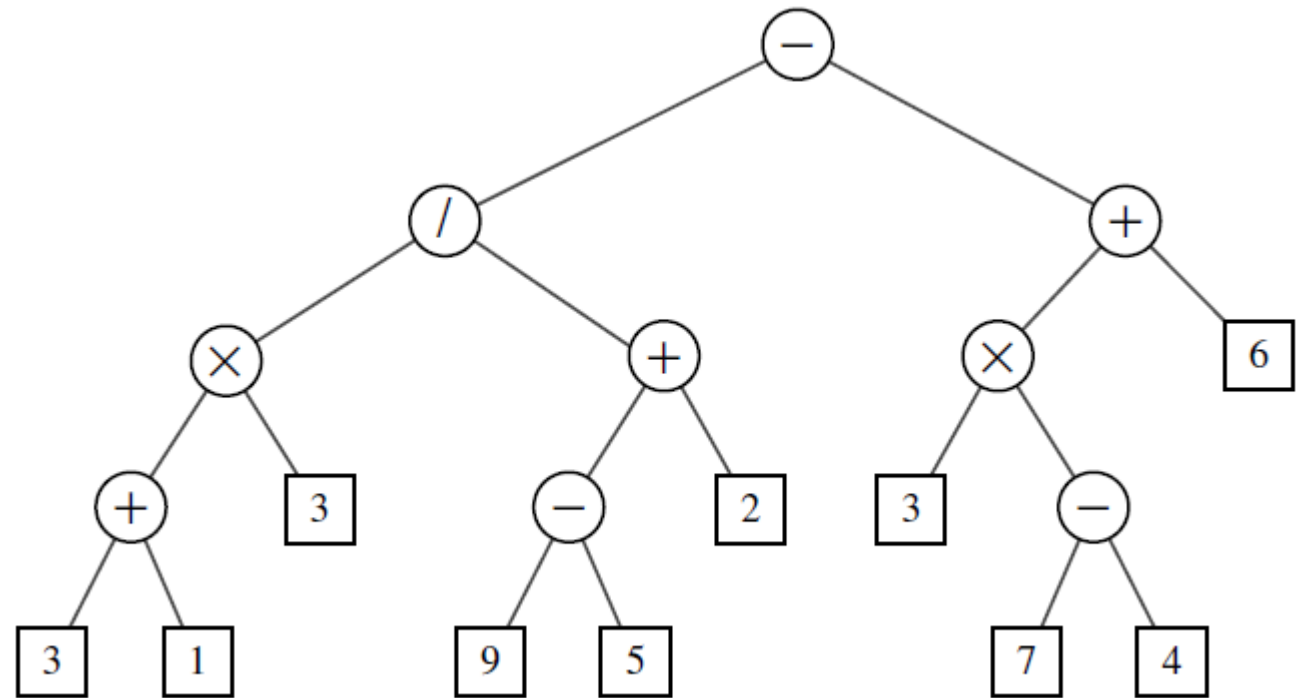
BINARY TREES

- Recursive definition
- 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



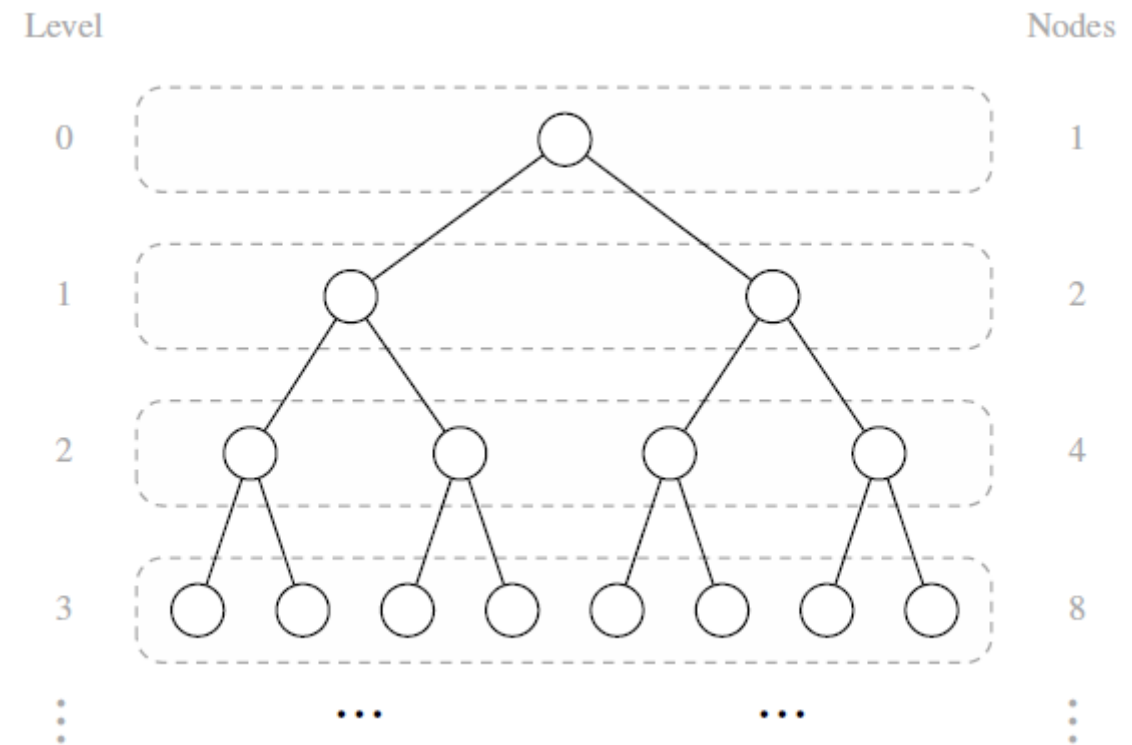
BINARY TREE ADT

- $T.\text{left}(p)$: returns the position that represents the left child of p
- $T.\text{right}(p)$: returns the position of the right child of p
- $T.\text{sibling}(p)$: returns the sibling of p



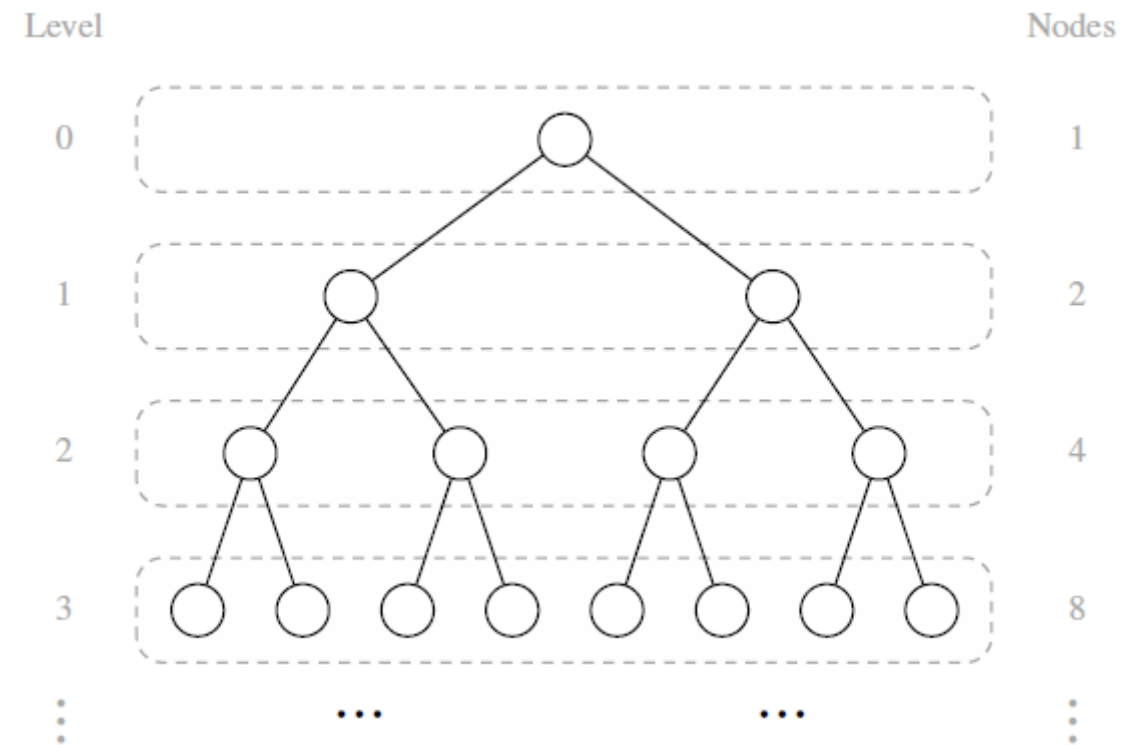
PROPERTIES OF BINARY TREES

- Depth d as level d of T
- Level 0: at most one node
- Level 1: at most 2 nodes
- Level 2: at most 4 nodes
- Level d : at most 2^d nodes



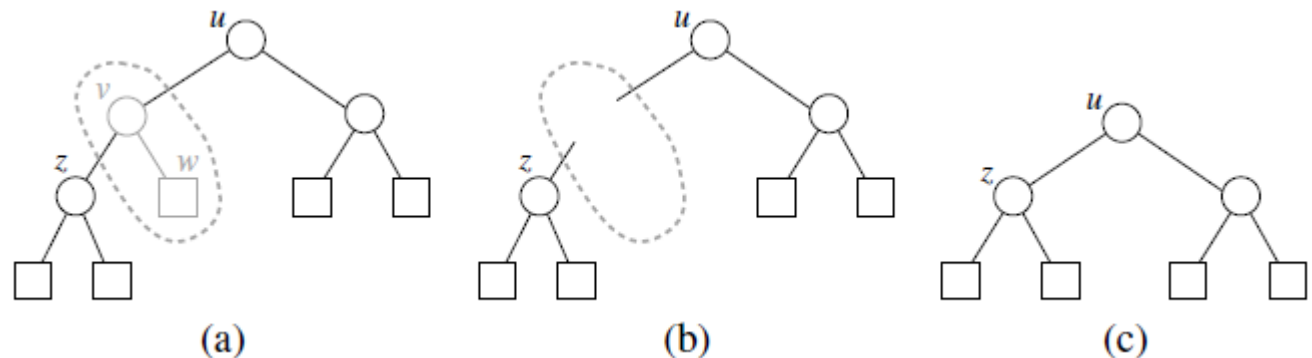
PROPERTIES OF BINARY TREES

- Let n , n_e , n_i and h denote number of nodes, number of external nodes, number of internal nodes, and height of T , then:
- $h+1 \leq n \leq 2^{h+1} - 1$
- $1 \leq n_e \leq 2^h$
- $h \leq n_i \leq 2^h - 1$
- $\log(n+1) - 1 \leq h \leq n-1$



PROPERTIES OF BINARY TREES

- In a proper binary tree T , with n_e external nodes and n_i internal nodes, we have $n_e = n_i + 1$
- Justification:
- Case 1) if T has only one node v , remove v and place it to the external-node pile, we have $n_e = n_i + 1$
- Case 2) Otherwise, remove from T an external node w and its parent v .
 - place w on external-node pile and v on internal-node pile.
 - If v has a parent u , reconnect u with the former sibling z of w .
 - Repeat until case 1 appears



SUMMARY

- What is 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) : if node v has no children
- Internal node (内部结点) : if node v has one or more children
- External nodes: a.k.a. **leaves** (叶结点)
- 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

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!