

# **CS 106**

# **INTRODUCTION TO**

# **DATA STRUCTURES**

**SPRING 2020**

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**HVERFORD COLLEGE**

# MIDTERM 2 NOTES

- Midterm 2: take during a **2 hour block this Thurs/Fri** (in any time zone, including ones you are not in)
- Let me know by TONIGHT if you will be unable to take the exam in this time frame
- Can use **self-created “cheat-sheet”** (double-sided), but no other notes or resources
- Please no Piazza posts related to exam review Thurs/Fri

# PREPARING/SUBMITTING YOUR EXAM

## Options:

- 1) Print exam, write on exam, take pictures of exam
- 2) Look at exam on-screen, write answers on paper, take pictures of answers
- 3) Look at exam on-screen, type answers in word processor (draw diagrams by hand, take pictures and combine)
- 4) Previous option, but create diagrams on-screen (may take too much time if you're not familiar with a similar process)

**In all cases: submit as a single PDF file on Moodle  
within 30 minutes of your end time**

# EXAM: WRITE DOWN START AND END TIME

11. Sign below (or print your name on your submission) to indicate that you will **abide by the Honor Code** in taking this examination:

---

Regardless of how you submit your work, include the following information (include timezone too):

START TIME: \_\_\_\_\_

END TIME: \_\_\_\_\_

# MY OFFICE HOURS THIS WEEK

**Tuesday 4:30-6pm** (can stay late)

**Wednesday 8:30-9:30am** (cannot stay late)

Will rotate through questions in the order people join and I will use the whiteboard (similar to Midterm 1 office hours).

You are welcome to just come and listen even if you don't have questions.

# **APR 28 OUTLINE**

- **Highlight important concepts from this course and other takeaways**
- **Review recap based on Google form**
- **Review problems**

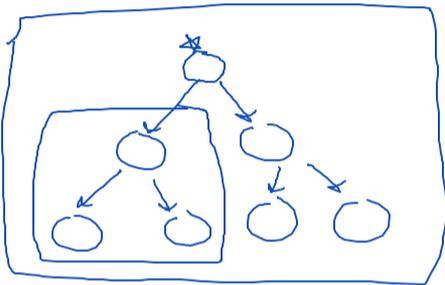
# APR 28 OUTLINE

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# NOTES FOR FUTURE CS CLASSES

- **LinkedList Node is a recursive data structure like a BinaryTree**



- Hash maps are **dictionaries**
- Java is an **imperative language**
  - Use statements/commands to change state in a specific way

# Pure Functional Programming

How do we think about computer code?

Option 1: more advanced reasoning techniques

- commands that change state in a specific way

Option 2: limit programming techniques

- don't change name/object relationships
- don't change object/value relationships
- known as "pure functional programming"

# Creating Unchanging Objects

If we can't *change* an object, how can we insert in a heap/tree/etc?

Instead of "mutator" methods, create new objects

- Examples

- `heap.insert(x)` → `newHeap1 = heap.with(x)`
- `heap.remove(x)` → `newHeap2 = heap.withOut(y)`

# TOP DOWN DESIGN

- We haven't practiced this too much, but I wanted to highlight this idea as something to continue working on in the future
- Start with “main” and pretend you have all the methods working (develop a “wish list” of methods and data structures)
- For each method or data structure you need, do the same thing!
- When you finally reach simple methods, start implementing them and work your way up
- Overall: recursive approach to design 😊

# OBJECT-ORIENTED DESIGN

## Goals

- **Robustness**
  - Capable of handling unexpected inputs
  - Gracefully recover from errors
  - Exception handling is a concrete way we can do this in Java
- **Adaptability**
  - Be able to evolve and respond to changing conditions/data
  - Argument passing is a concrete way to do this in Java
- **Reusability**
  - Code should work in a variety of different situations
  - Implementing an interface is a concrete way to do this in Java

# OBJECT-ORIENTED DESIGN

## Principles

- **Abstraction**
  - Developing a mathematical model of a structure or algorithm
  - Creating an interface is an example in Java
- **Encapsulation**
  - Do not need to reveal inner workings – users only need to know the method signatures
  - Class structure (including public/private) aids encapsulation
- **Modularity**
  - Components can be implemented and tested separately, then work together smoothly
  - Debug data structure before using it or tying it to a specific application

# DESIGN PATTERNS

- **Recursion**
  - Binary search
  - Binary trees
  - Quick sort
  - Merge sort
- **Divide and conquer**
  - Quick sort
  - Merge sort
- **Greedy method**
  - Kruskal's algorithm

# THOUGHTS ABOUT CS AFTER GRADUATION...

*Ask me after this week!*

# APR 28 OUTLINE

- Highlight important concepts from this course and other takeaways
- **Review recap based on Google form**
- Review problems

# UNDERSTAND WELL

- **Queues**
- **Most sorting algorithms**
- **Heaps and priority queues**
- **Binary Trees**
- **Graphs**
- **Huffman coding**

# NEEDS MOST REVIEW

- **Abstract Data Type (ADT)**
- **Graphs**
- **Recursive aspects of binary trees**
- **Unbalanced trees and rotations**
- **Runtime**
- **Hash maps and different types of probing/collision handling**
- **Sets and Kruskal's algorithm**
- **Merge sort**
- **Radix sort**

# **GRAPH REVIEW**

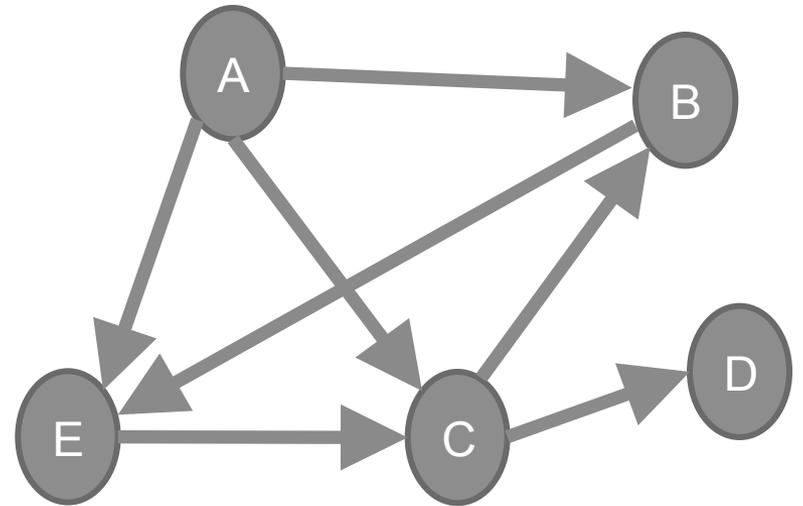
# ADT (ABSTRACT DATA TYPE)

- **Mathematical model of a data structure**
- **Says what operations should be possible**
- **Does not say how those operations are accomplished**
  
- **In practice: you can think of this as an interface with an understood description**

# ADT EXAMPLE: GRAPH



Method	Returns
<code>vertices()</code>	{A, B, C, D, E}
<code>numVertices()</code>	5
<code>numEdges()</code>	7
<code>outDegree(C)</code>	2
<code>inDegree(B)</code>	2
<code>outgoingEdges(A)</code>	{E, C, B}
<code>incomingEdges(B)</code>	{A, C}



# ADT EXAMPLE: GRAPH

```
/**
 * Simplified Graph interface
 */
public interface Graph {

    List<Vertex> vertices();

    int numVertices();

    Vertex insertVertex(String name);

    void insertEdge(Vertex u, Vertex v);

    boolean hasEdge(Vertex u, Vertex v);

    List<Vertex> outgoingEdges(Vertex v);

    List<Vertex> incomingEdges(Vertex v);

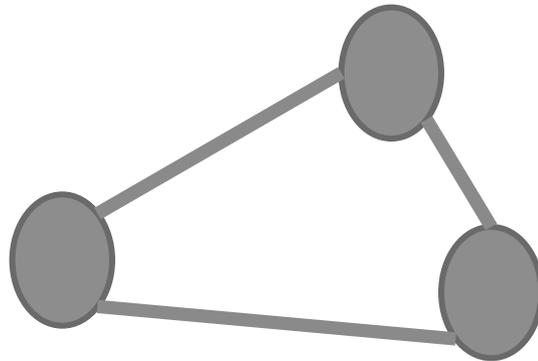
}
```

# GRAPHS

**Graphs** (aka networks) represent relationships between pairs of objects.

**Vertices** (aka nodes) are the objects. (Singular: vertex)

**Edges** (aka links) are the relationships.



Note: these are graph theory graphs, not charts or plots.

# NOTATION

A graph **G** is a set of vertices **V** and a set of edges **E**:

$$G = (V, E)$$

Each edge is a pair of vertices:

$$(u, v) \in V$$

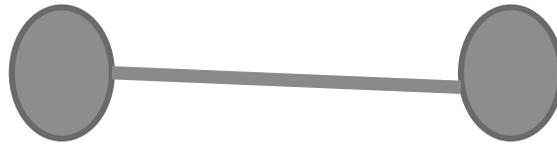
The total number of vertices in a graph is denoted **n**:

$$|V| = n$$

The total number of edges in a graph is denoted **m**:

$$|E| = m$$

# EDGE TERMINOLOGY



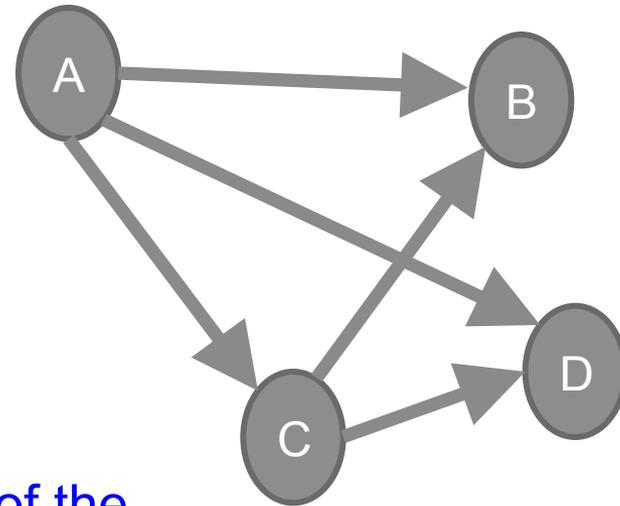
Two vertices are *adjacent* if they are joined by an edge.

Adjacent vertices are also known as *neighbors*.

# IN-DEGREE AND OUT-DEGREE

Identify the *in-degree* and *out-degree* for each of the nodes in the below graph:

Node	in-degree	out-degree
A	0	3
B	2	0
C	1	2
D	2	0



Q: What do you notice about the sums of the in-degrees and out-degrees?

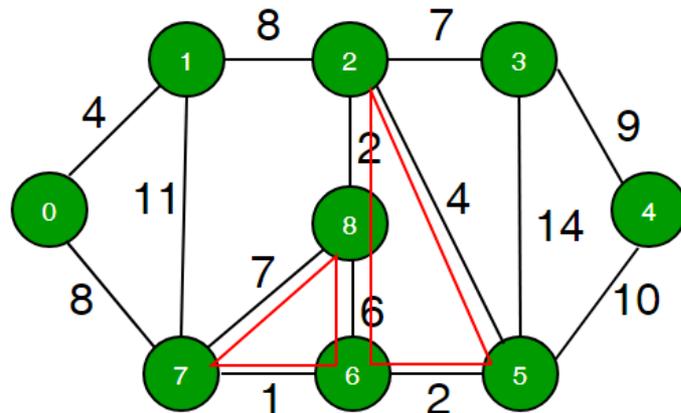
A: They are the same and equal to the number of edges! Because each edge has one origin and one destination.

# CYCLES

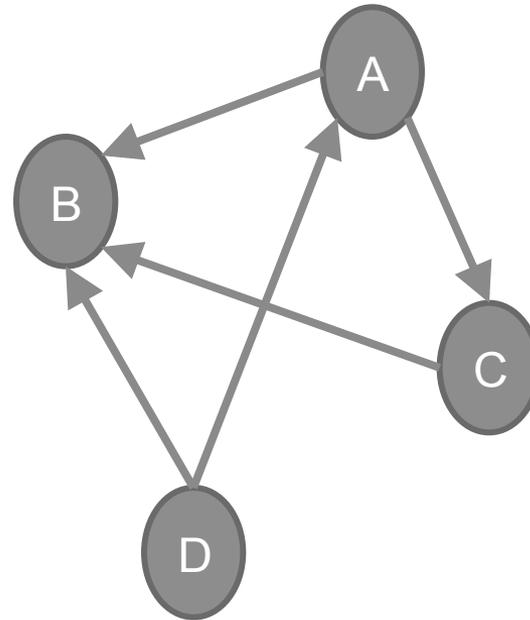
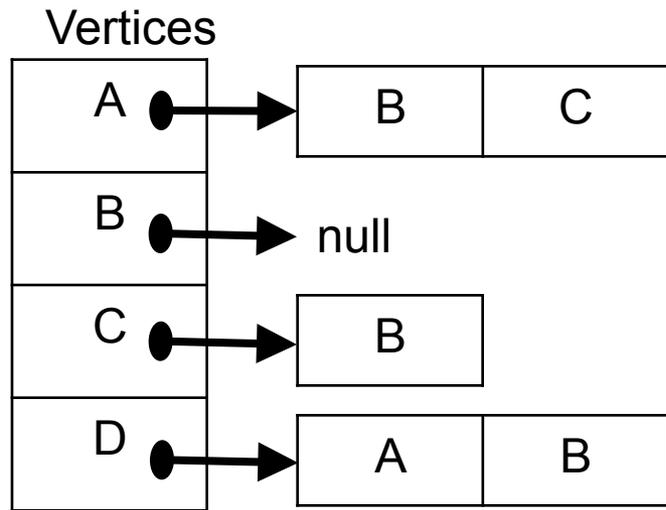
A **cycle** is a path that starts and ends at the same vertex and has at least one edge. A **directed cycle** is the same for a directed graph.

A directed graph is **acyclic** if it has no directed cycles.

(A **tree** is a special type of acyclic graph.)



# GRAPH ADJACENCY LIST REPRESENTATION



Each Vertex contains a list of destination edges

One instance variable:  
list of Vertices

See section 14.2 of the book for more info!

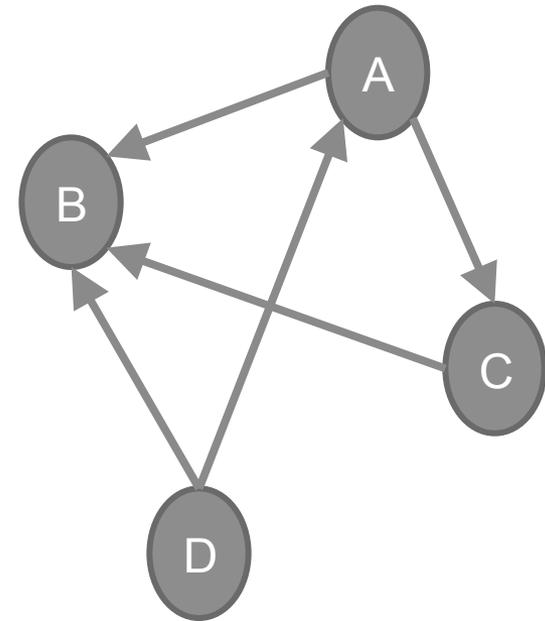
# GRAPH ADJACENCY LIST RUNTIMES

Let  $n$  be the number of vertices.

<code>List&lt;Vertex&gt; vertices()</code>	$O(1)$
<code>int numVertices()</code>	$O(1)$
<code>Vertex insertVertex(elem)</code>	$O(1)$
<code>void insertEdge(u,v)</code>	$O(1)$
<code>boolean hasEdge(u,v)</code>	$O(n)$
<code>List&lt;Vertex&gt; outgoingEdges(v)</code>	$O(1)$
<code>List&lt;Vertex&gt; incomingEdges(v)</code>	$O(n^2)$

# GRAPH ADJACENCY MATRIX REPRESENTATION

	A	B	C	D
A	0	1	1	0
B	0	0	0	0
C	0	1	0	0
D	1	1	0	0

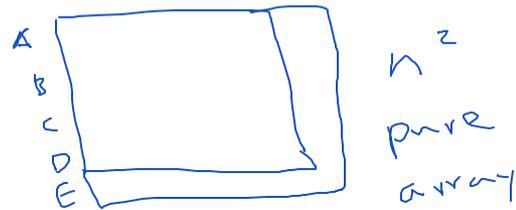
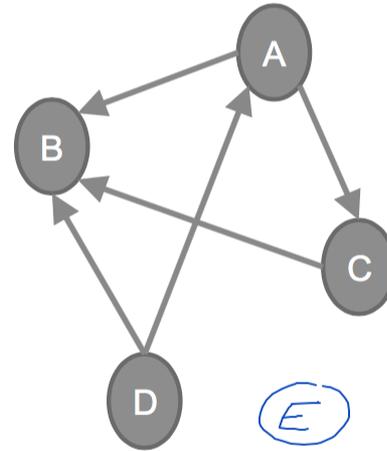


# GRAPH ADJACENCY MATRIX REPRESENTATION

	A	B	C	D
A	0	1	1	0
B	0	0	0	0
C	0	1	0	0
D	1	1	0	0

E

pure array  
`int [][C] arr = new int[4][4]`



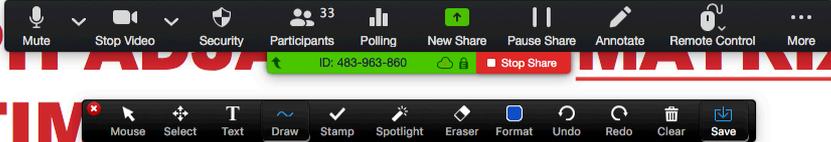
# GRAPH ADJACENCY MATRIX RUNTIMES

Let  $n$  be the number of vertices.

<code>List&lt;Vertex&gt; vertices()</code>	<code>O(1)</code>
<code>int numVertices()</code>	<code>O(1)</code>
<code>Vertex insertVertex(elem)</code>	<code>O(1)</code>
<code>void insertEdge(u,v)</code>	<code>O(1)</code>
<code>boolean hasEdge(u,v)</code>	<code>O(1)</code>
<code>List&lt;Vertex&gt; outgoingEdges(v)</code>	<code>O(n)</code>
<code>List&lt;Vertex&gt; incomingEdges(v)</code>	<code>O(n)</code>

# GRAPH ADJACENCY MATRIX

## RUNTIMES



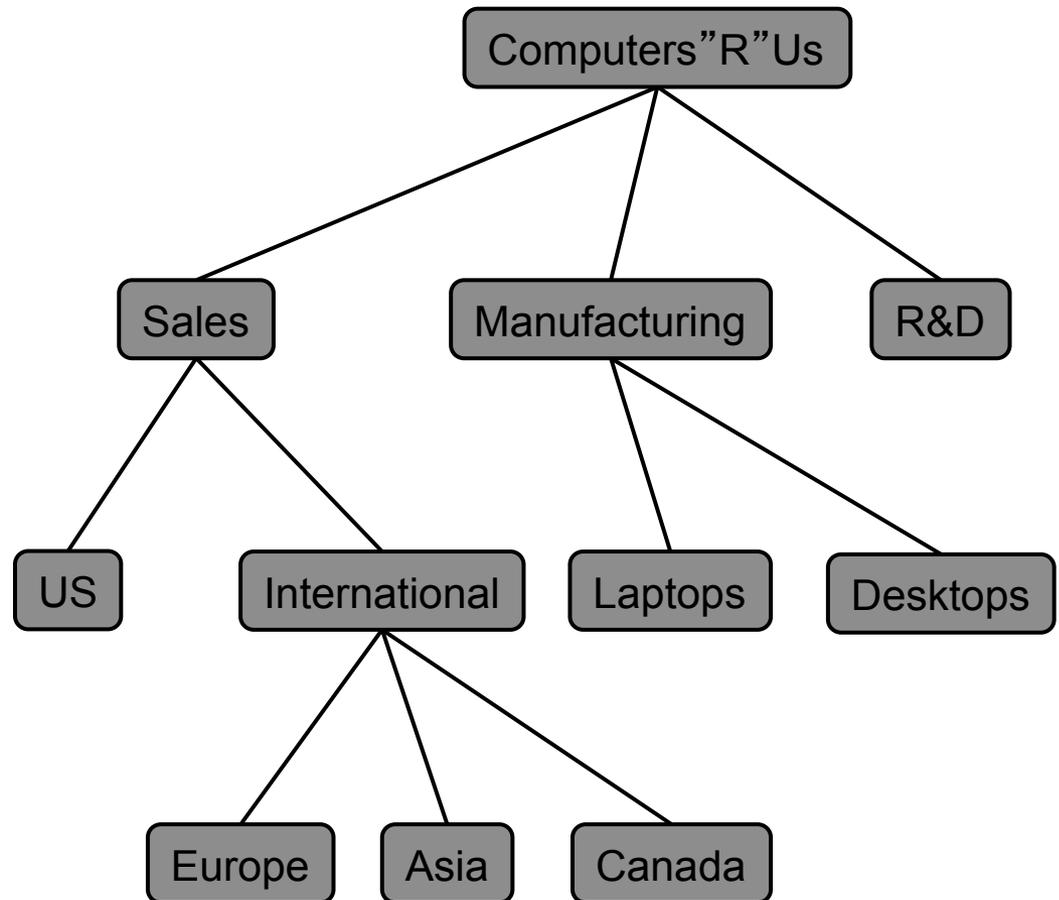
Let  $n$  be the number of vertices.

<code>List&lt;Vertex&gt; vertices()</code>		<code>0(1)</code>
<code>int numVertices()</code>		<code>0(1)</code>
<code>Vertex insertVertex(elem)</code>	<i>arraylist</i>	<code>0(1)</code>
<code>void insertEdge(u,v)</code>	<i>array: O(n^2)</i>	<code>0(1)</code>
<code>boolean hasEdge(u,v)</code>		<code>0(1)</code>
<code>List&lt;Vertex&gt; outgoingEdges(v)</code>		<code>0(n)</code>
<code>List&lt;Vertex&gt; incomingEdges(v)</code>		<code>0(n)</code>

# **TREE REVIEW**

# TREE DATA STRUCTURE

- Trees are **acyclic graphs**
- Nodes/vertices have a **parent-child** relationship



# TERMINOLOGY

**Root:** node with no parent (caveat, all nodes are roots of their subtree)

- A

**Leaf node:** node with no children:

- E, I, J, K, G, H, D

**Internal node:** node with at least one child

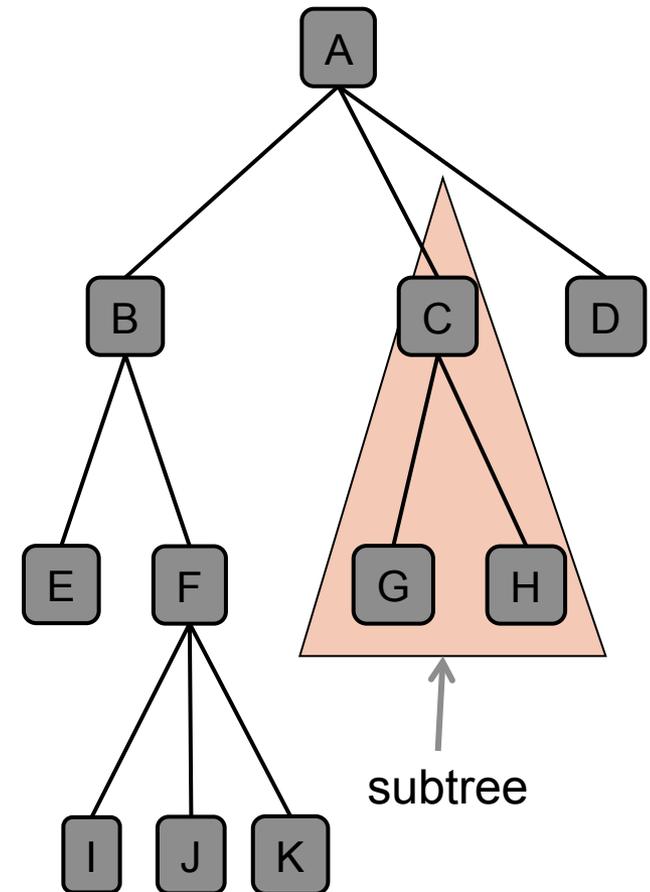
- A, B, C, F

**Parent / Child relationships:** two nodes connected by an edge. The node closer to the root is the parent.

- E.g., B (parent) and F (child)

**Ancestor / Descendent relationships:** ancestors of node X lie on the path from the root to X

- E.g., B (ancestor) and J (descendent)



# TERMINOLOGY

**Depth of a node:** length of the path (num edges) from the root to that node

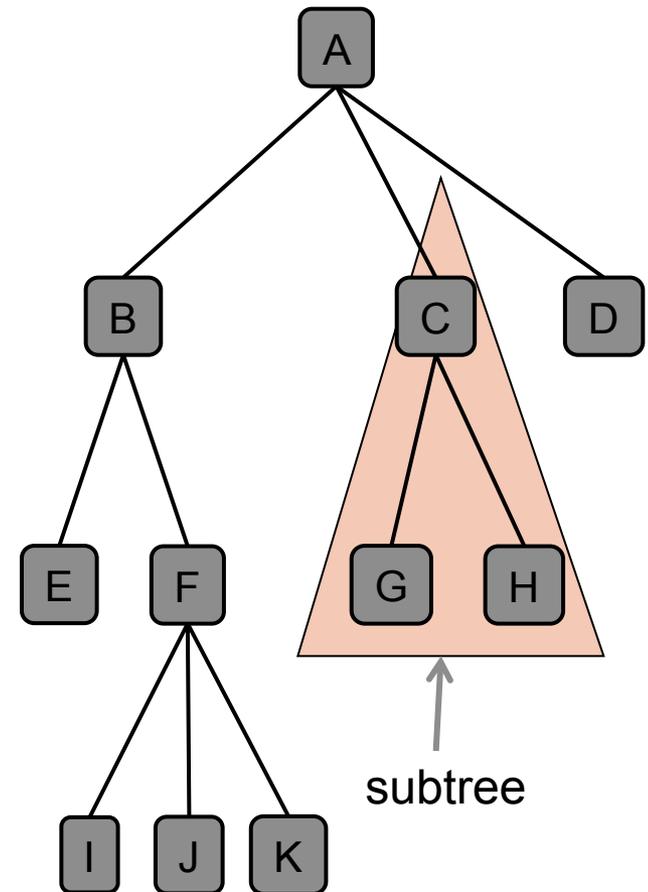
- e.g., depth of F = 2

**Height:** the maximum depth in the tree

- the height is 3

**Subtree:** a tree consisting of a node and its descendants

- the orange subtree with root C

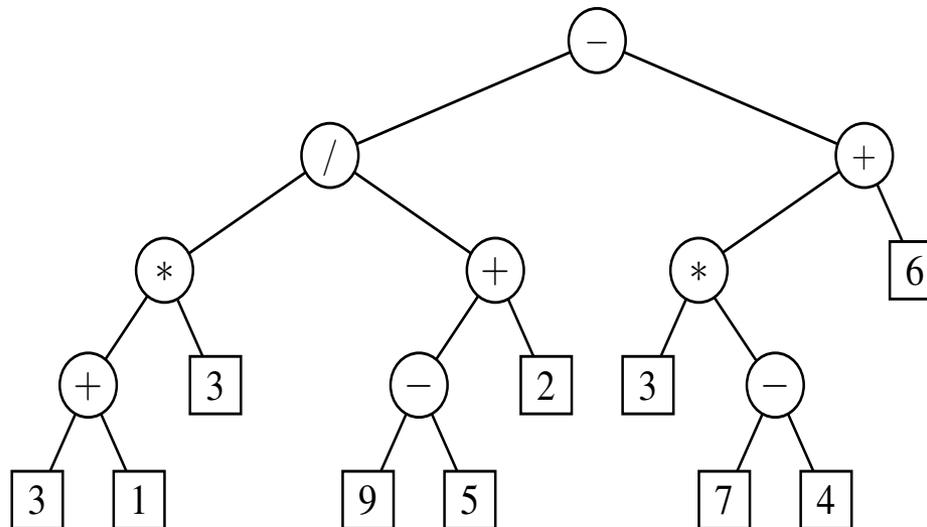


# BINARY TREE

An ordered tree with every node having at most two children  
– left and right

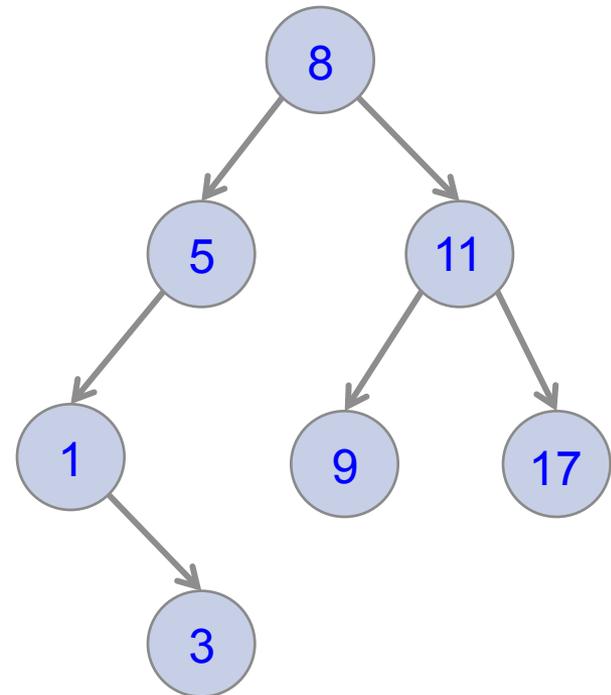
**Recursive definition:**

- base case: empty tree
- recursion: root with two subtrees



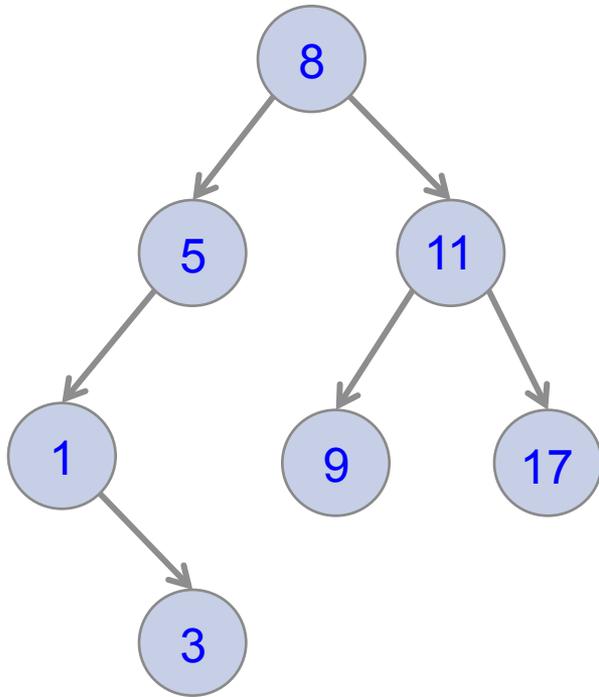
# BINARY SEARCH TREE (BST)

- Left child less than parent
- Right child greater than parent
- Typically no duplicates  
(alternative: store number of occurrences of each value with the node)



# INSERTION SORT WITH TREES

Input: {8, 11, 5, 17, 1, 9, 3}



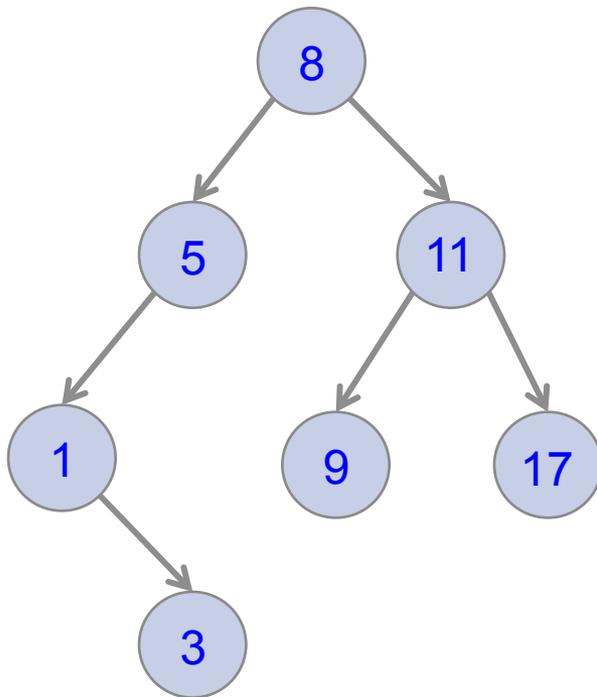


# INSERTION SORT WITH TREES

Input: {8, 11, 5, 17, 1, 9, 3}

$d$  = number of levels or number of comparisons

$$d \approx \log(n)$$



Expected runtime of **insertion sort** with binary tree:

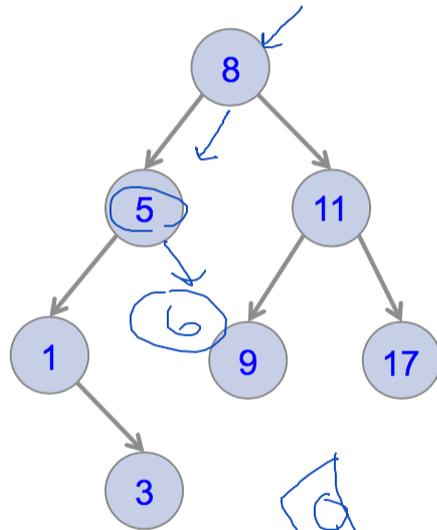
$$O(n \log n)$$

Worst case?

- Note: we still need to run an “in-order” traversal afterward

# INSERTION SORT WITH TREES

Input: {0, 11, 5, 17, 1, 9, 3}



$d = \text{number of levels or number of comparisons}$   
 $d \approx \log(n)$

insert (6)

Expected runtime of insertion sort with binary tree:

$$O(n \log n)$$

Worst case?

$$O(n^2)$$

- Note: we still need to run an "in-order" traversal afterward

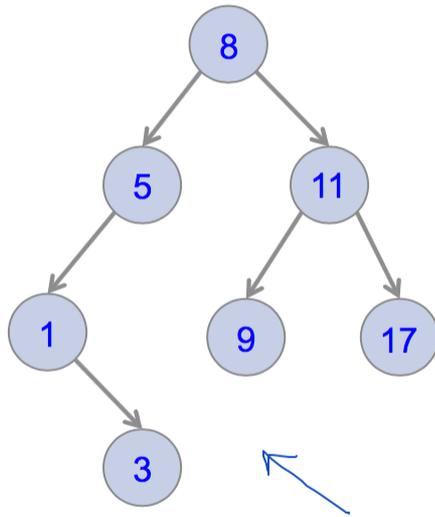
# INSERTION SORT WITH TREES

Input:

10, 11, 5, 17, 1, 9, 3

$d$  = number of levels or number of comparisons

$$d \approx \log(n)$$



Expected runtime of **insertion sort** with binary tree:

$$O(n \log n)$$

~~$O(n^2)$~~   
=

Worst case?



- Note: we still need to run an "in-order" traversal afterward

# REMOVE

`boolean remove(E element) ;`

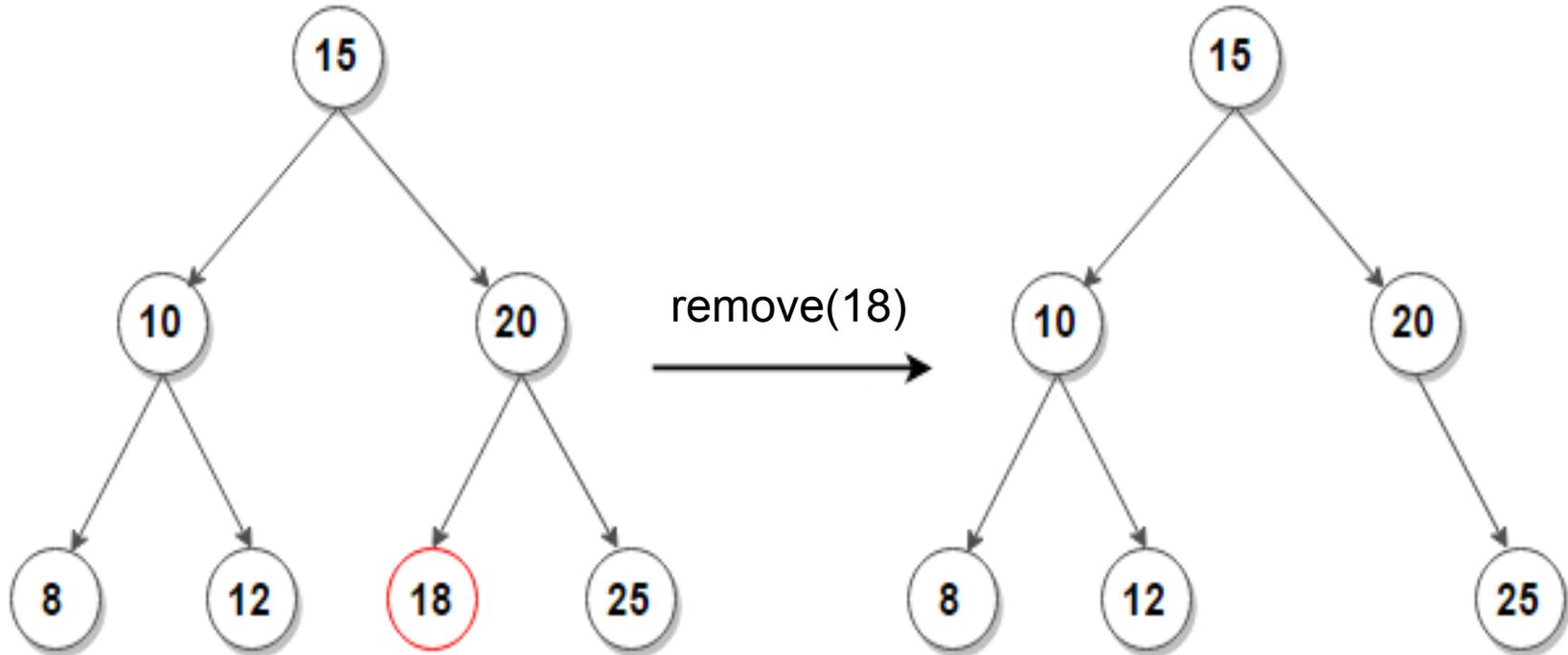
**returns true if element existed and was removed and false otherwise**

## Cases

- element not in tree
- element is a leaf
- element has one child
- element has two children

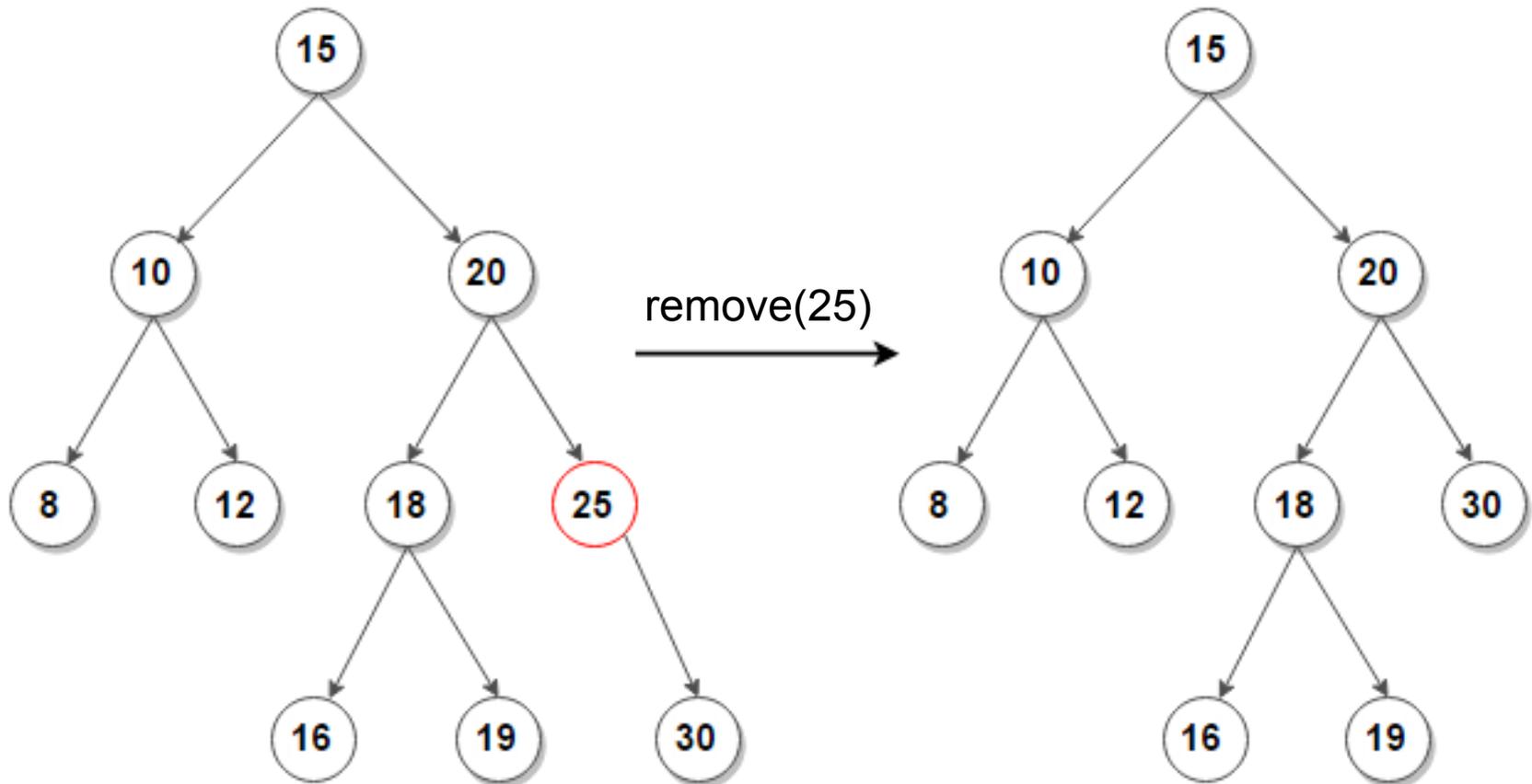
# LEAF

Just delete



# ONE CHILD

Replace with child



# TWO CHILDREN

Replace with in-order predecessor or in-order successor

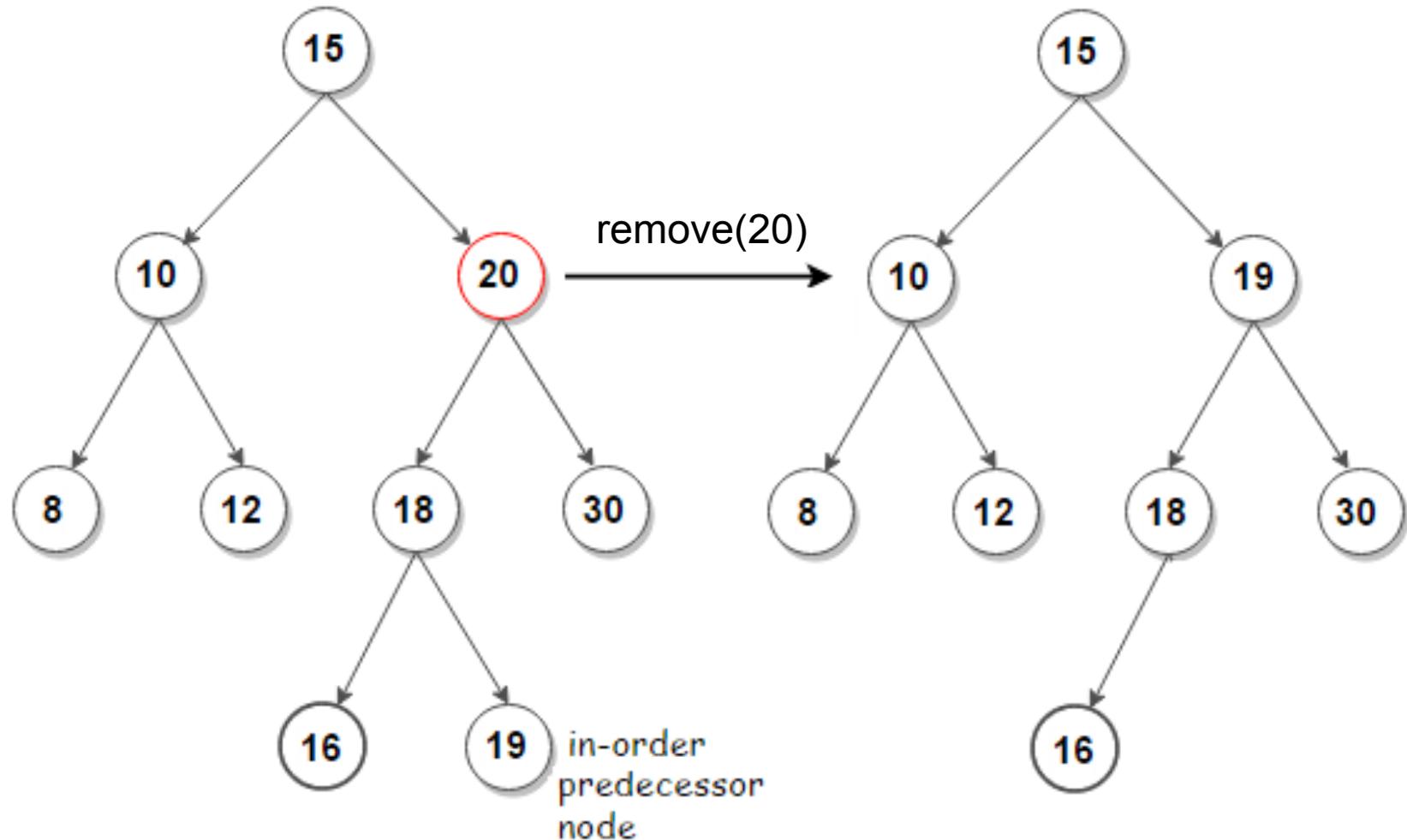
**in-order predecessor**

- rightmost child in left subtree
- max-value child in left subtree

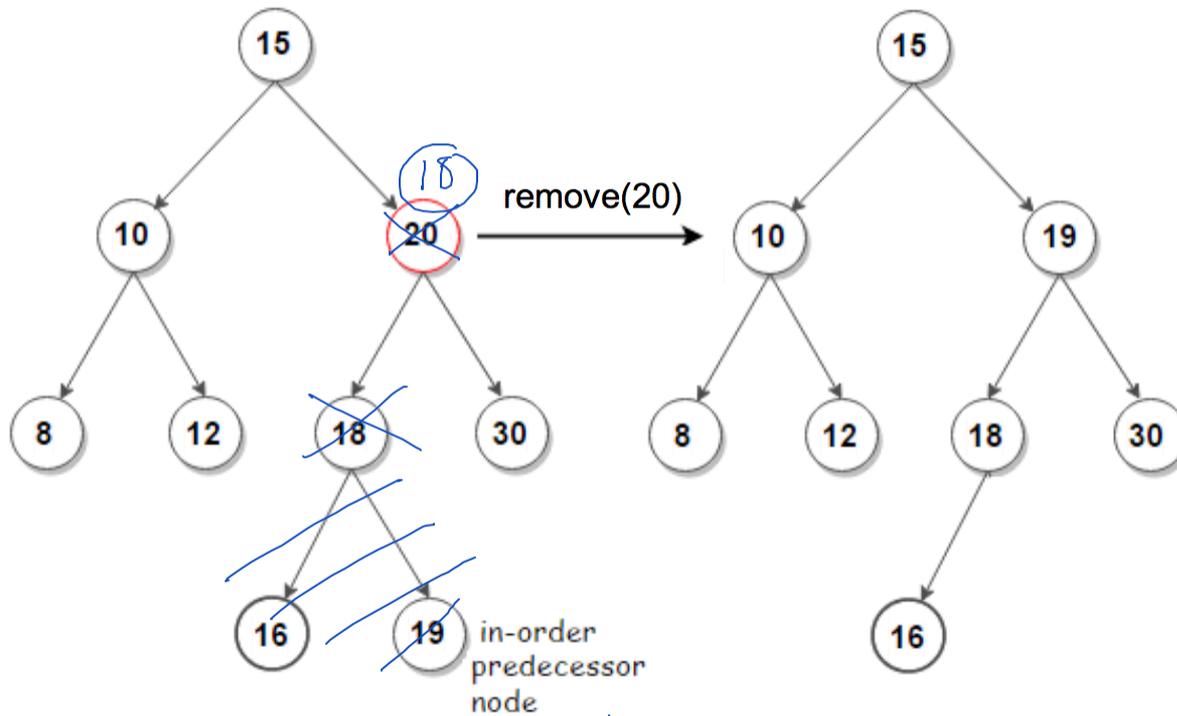
**in-order successor**

- leftmost child in right subtree
- min-value child in right subtree

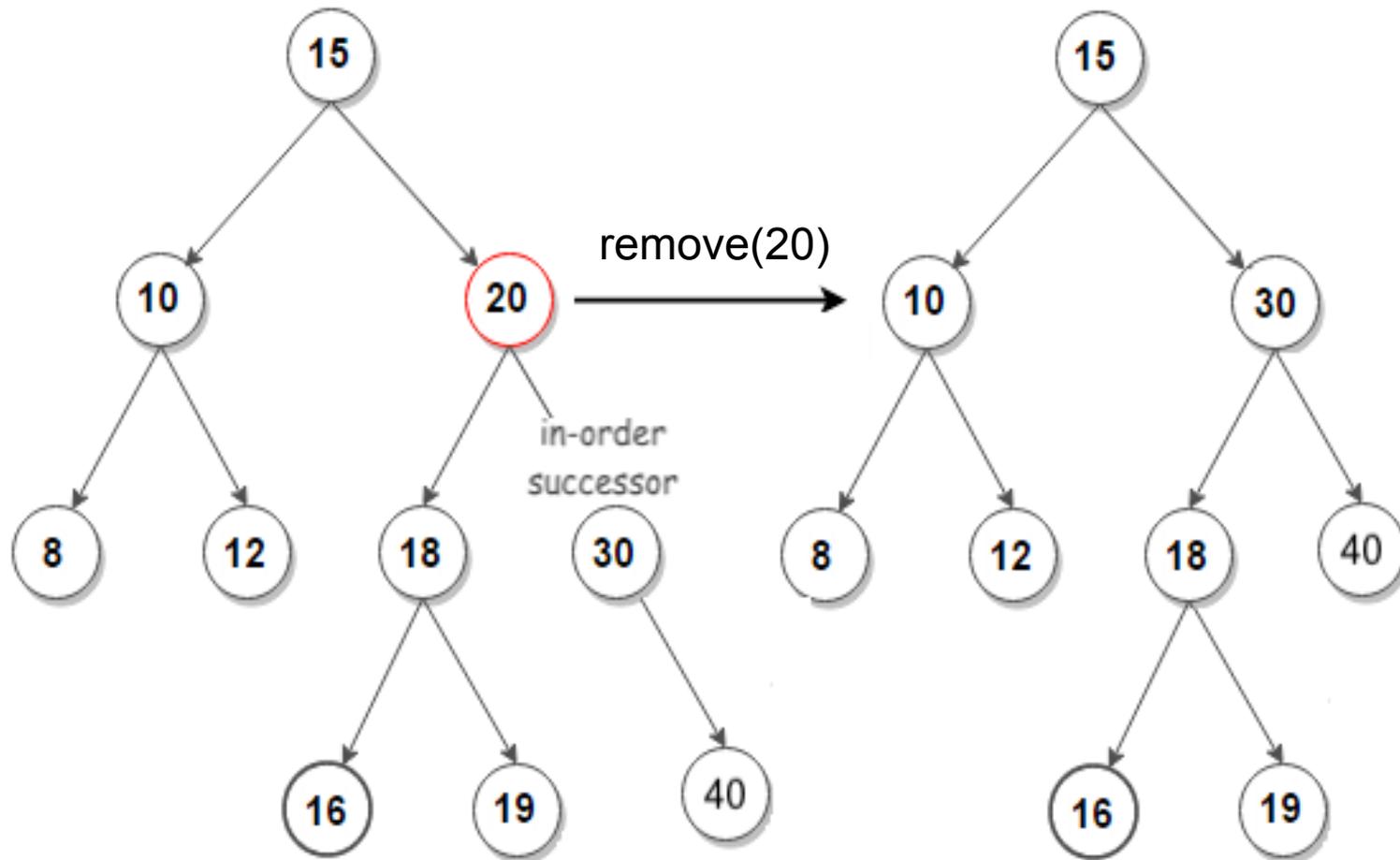
# REPLACE WITH PREDECESSOR



# REPLACE WITH PREDECESSOR



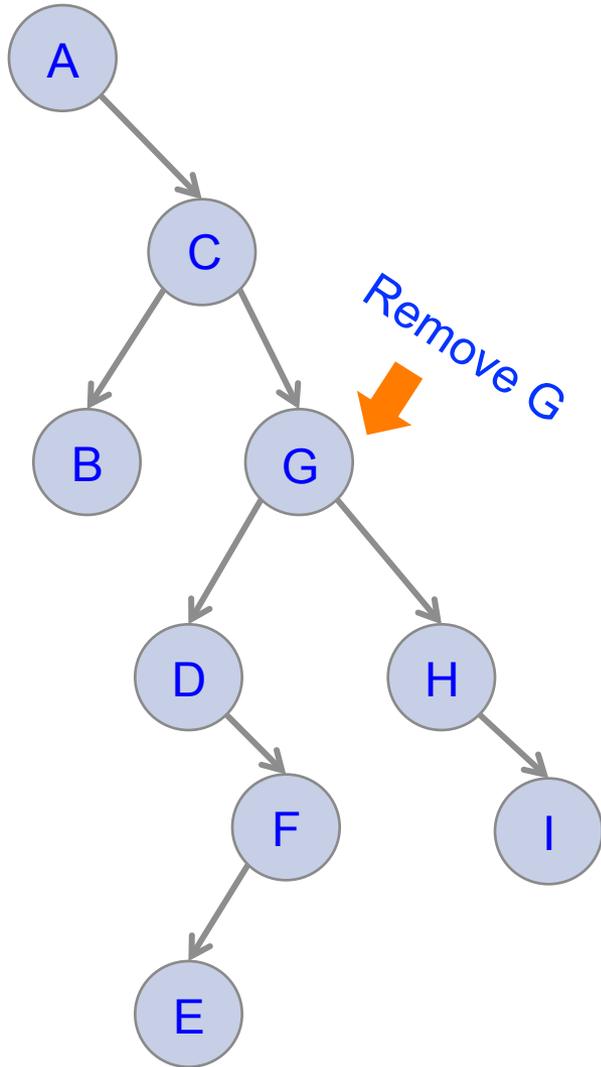
# REPLACE WITH SUCCESSOR



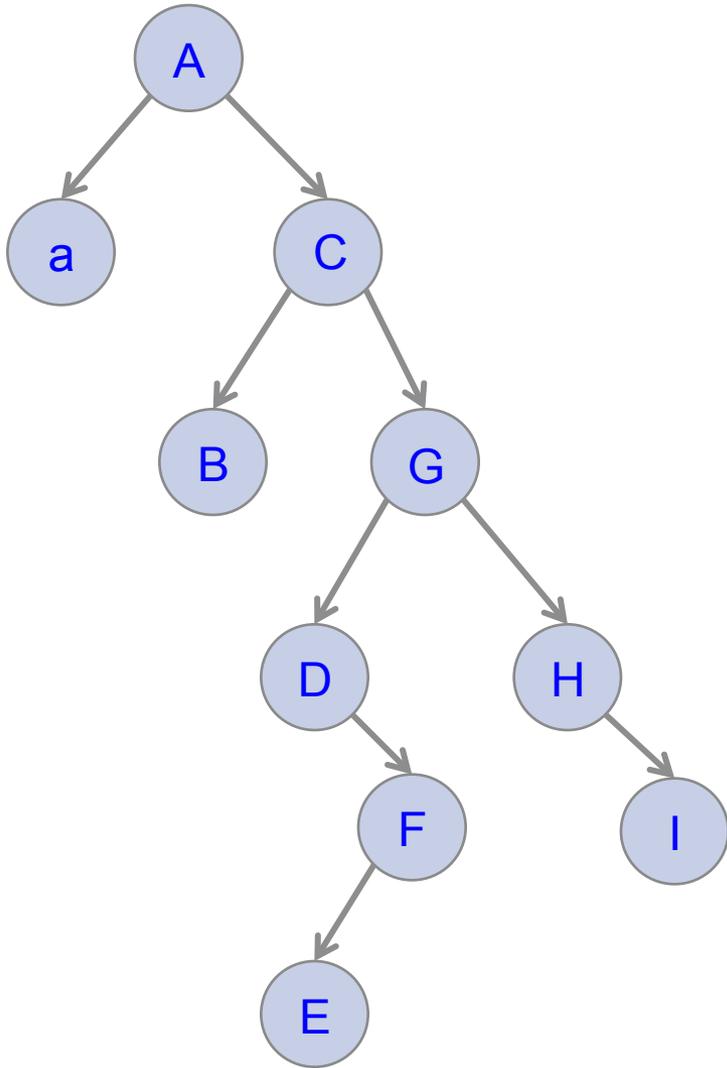
Note: this is a special case when successor is also child (replace entire node, just data)

# DELETION EXAMPLE: G

Try as an exercise!



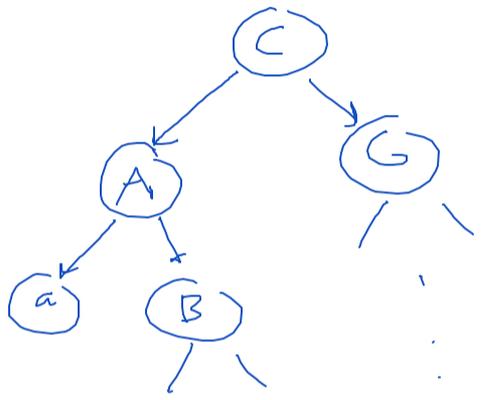
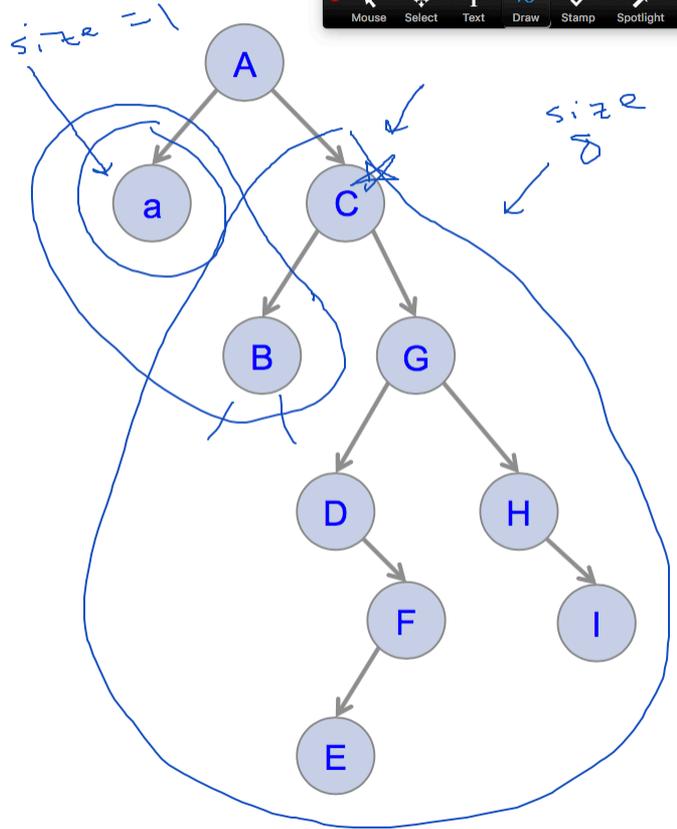
# REBALANCING EXAMPLE



# REBALANCING B-TREE

Mute Stop Video Security Participants 29 Polling New Share Pause Share Annotate Remote Control More  
ID: 483-963-860 Stop Share

Mouse Select Text Draw Stamp Spotlight Eraser Format Undo Redo Clear Save



# **HASH TABLE REVIEW**

# MAP

**A searchable collection of key-value pairs**

**Multiple entries with the same key are not allowed**

**Also known as dictionaries, hash tables, etc**

# MAP ADT

## (MANY WAYS OF DEFINING)

**lookup** (**k**) : if the map  $M$  has an entry with key  $k$ , return its associated value; else, return null

**insert** (**k**, **v**) : insert entry  $(k, v)$  into the map  $M$ ; if key  $k$  is not already in  $M$ , then return null; else, replace old value with  $v$  and return old value associated with  $k$

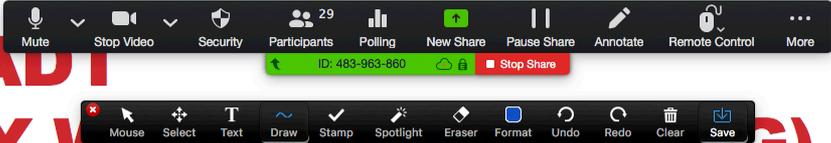
**remove** (**k**) : if the map  $M$  has an entry with key  $k$ , remove it from  $M$  and return its associated value; else, return null

**size** (), **isEmpty** ()

**entrySet** () : return an iterable collection of the entries in  $M$

**keySet** () : return an iterable collection of the keys in  $M$

**values** () : return an iterable collection of the values in  $M$



# MAP ADT (MANY WAYS OF DEFINING)

*get*  
**lookup** ( $k$ ): if the map  $M$  has an entry with key  $k$ , return its associated value; else, return null

*put*  
**insert** ( $k$ ,  $v$ ): insert entry  $(k, v)$  into the map  $M$ ; if key  $k$  is not already in  $M$ , then return null; else, replace old value with  $v$  and return old value associated with  $k$

**remove** ( $k$ ): if the map  $M$  has an entry with key  $k$ , remove it from  $M$  and return its associated value; else, return null

**size** (), **isEmpty** ()

**entrySet** (): return an iterable collection of the entries in  $M$

**keySet** (): return an iterable collection of the keys in  $M$

**values** (): return an iterable collection of the values in  $M$

# EXAMPLE IMPLEMENTATION WITHOUT GENERICS

```
private class TableRow {  
    int key;  
    String value;  
    TableRow(int key, String value) {  
        this.key = key;  
        this.value = value;  
    }  
}
```

# EXAMPLE IMPLEMENTATION WITHOUT GENERICS

```
/**
 * Return the default position (index)
 * where this key is stored
 */
private int hash(int key) {
    return key % rows.length;
}

/**
 * Locates the position (index) where the
 * specified key can be found, or where it
 * should be inserted if it is not already
 * in the table
 */
private int locate(int key) {
    int pos = hash(key);

    // this is the linear probing part
    while (rows[pos] != null && rows[pos].key != key) {
        pos = (pos + 1) % rows.length;
    }
    return pos;
}
```

# HASH TABLE RUNTIMES

Let  $n$  be the number of elements in the hash table

	Hash Expected	Hash Worst
lookup	$O(1)$	$O(n)$
insert	$O(1)$	$O(n)$
remove	$O(1)$	$O(n)$
min/max	$O(n)$	$O(n)$

# PROBING DISTANCE

Given a hash value  $h(x)$ , linear probing generates  $h(x)$ ,  $h(x) + 1$ ,  $h(x) + 2$ , ...

Primary clustering – the bigger the cluster gets, the faster it grows

Quadratic probing –  $h(x)$ ,  $h(x) + 1$ ,  $h(x) + 4$ ,  $h(x) + 9$ , ...

Quadratic probing leads to secondary clustering, more subtle, not as dramatic, but still systematic

# DOUBLE HASHING

**Interval between probes is fixed but computed by a second hash function**

**Use a secondary hash function  $d(k)$  to handle collisions by placing an item in the first available cell of the series**

$$i + jd(k) \% N, 0 \leq j \leq N-1$$

$$d(k) \neq 0$$

**$N$  must be prime**

$$d(k) = q - k \% q, q < N, q \text{ is prime}$$

Extra info: great talk on dictionaries in Python!

<https://www.youtube.com/watch?v=npw4s1QTmPg>

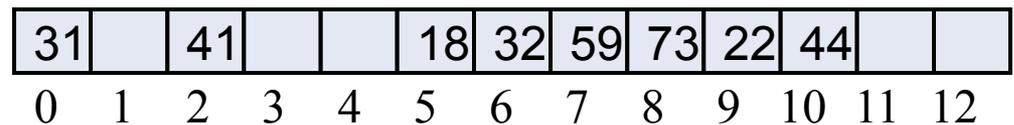
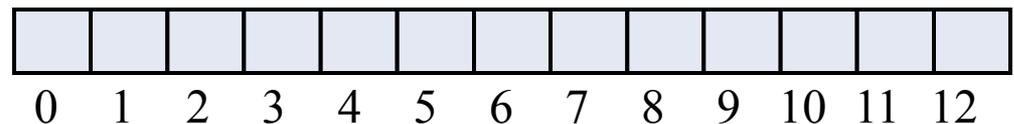
# DOUBLE HASHING EXAMPLE

Double hashing:

- $N = 13$
- $h(k) = k \% 13$
- $d(k) = 7 - k \% 7$

Insert: 18, 41, 22, 44,  
59, 32, 31, 73

$k$	$h(k)$	$d(k)$	Probe Indices	
18	5	3	5	
41	2	1	2	
22	9	6	9	
44	5	5	5	10
59	7	4	7	
32	6	3	6	
31	5	4	5	9 0
73	8	4	8	



# PRACTICE PROBLEM EXAMPLE: LINEAR



# PRACT

Mute Stop Video Security Participants 29 Polling New Share Pause Share Annotate Remote Control More

ID: 483-963-960 Stop Share

# LE:

# LINEAR ✂

Mouse Select Text Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

35, -10, 21, 7, 0, 2

		# probes	load factor
7/6	0	1	1/7
	1	2	
	2	3	
	3	4	
	4	1	2/7
	5	4	
6			

35 % 7 = 0  
 -10 % 7 = 4  
 +14

avg =  $\frac{15}{6} = 2.5$

$h(k) = k \% 7$

$\alpha = \frac{n}{N}$

↑  
0(1)

# PRACTICE PROBLEM EXAMPLE: QUADRATIC

0	
1	
2	
3	
4	
5	
6	

Mute Stop Video Security Participants 29 Polling New Share Pause Share Annotate Remote Control More  
 ID: 483-963-960 Stop Share  
 Mouse Select Text Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

		# probes
0	35	1
1	21	2
2	7	4
3		
4	-10	1
5		
6		

35, -10, 21, 7, 0, 2

$0 \times 7 = 0$   
 $0 + 1 \times 7 = 7$   
 $0 + 4 \times 7 = 28$   
 $0 + 9 \times 7 = 63$

$0 \times 7 = 0$   
 $0 + 1 \times 7 = 7$   
 $0 + 4 \times 7 = 28$   
 $0 + 9 \times 7 = 63$   
 $0 + 16 \times 7 = 112$

# PRACTICE PROBLEM EXAMPLE: DOUBLE HASHING



$d(k) = p - (k \% p)$     35, -10, 21, 7, 0, 2

0	35
1	
2	7
3	21
4	-10
5	2
6	0

$d(21) = 3 - \frac{0}{21 \% 3}$   
 $= 3$

$d(7) = 3 - \frac{1}{7 \% 3}$   
 $= 2$

$d(0) = 3 - \frac{0}{0 \% 3}$   
 $= 3$

avg # probes = 2.16

# APR 28 OUTLINE

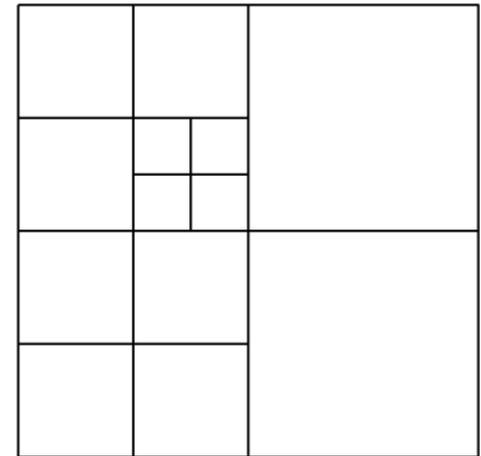
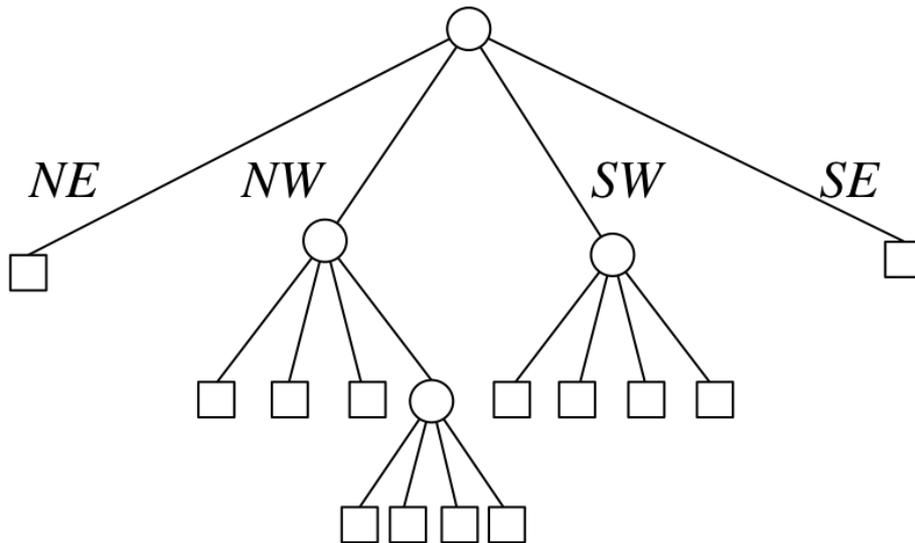
- Highlight important concepts from this course and other takeaways
- Review recap based on Google form
- **Review problems**

# QUADTREE INTRO

# QUADTREE

A tree with four children at each node

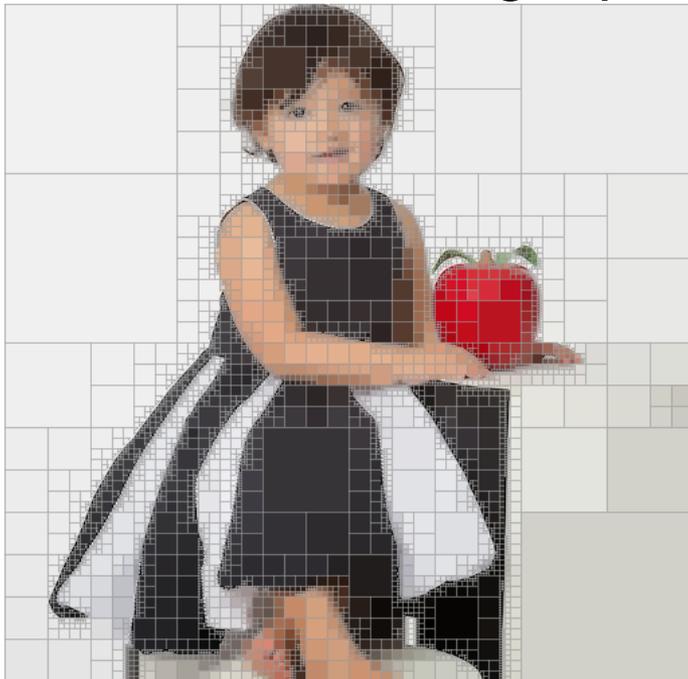
Typically used for recursive space subdivision



# QUADTREE AND IMAGE PROCESSING

## Subdivide into four sub-images

- stop when some criteria are met
- or down to a single pixel



# QUADTREES

