

# EECS2011 Fundamentals of Data Structures

Lecture Notes

Winter 2022

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# Lecture 1

## Part A

### *Measuring Running Time via Experiments*

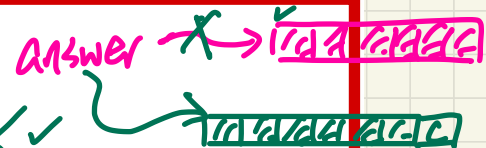
# Example Experiment

## Computational Problem:

- **Input:** A character  $c$  and an integer  $n$
- **Output:** A string consisting of  $n$  repetitions of character  $c$   
e.g., Given input `'*'` and 15, output `*****`.

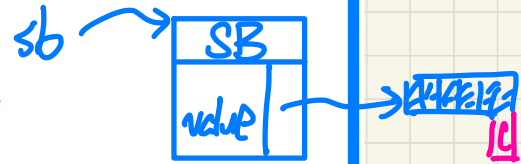
## Algorithm 1 using String Concatenations:

```
public static String repeat1(char c, int n) {  
    String answer = "";  
    for (int i = 0; i < n; i++) { answer += c; }  
    return answer; }  
answer = answer + c
```



## Algorithm 2 using StringBuilder append's:

```
public static String repeat2(char c, int n) {  
    StringBuilder sb = new StringBuilder();  
    for (int i = 0; i < n; i++) { sb.append(c); }  
    return sb.toString(); }  
sb
```



# Lecture 1

## Part B

### *Counting Primitive Operations*

# Primitive Operation (taking constant time)

## Attribute Access

In general, you may have to access an attribute using "multiple dots":  
obj. a1. a2. a3 ...

an

Context object

Account

reference type ✓

acc

balance

acc

cheap.  
(constant-time operation)

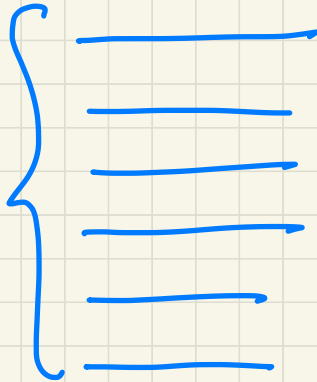
look up the address stored in variable acc  
reference

|         |     |
|---------|-----|
| Account |     |
| balance | 100 |

Method Call obj.m();

Case 1 PO

void m() {



all  
primitive  
operations

}

Case 2 non-PO

void m() {

for (int i = 0; i < a.length; i++)

⋮

mz();

}

int findMax ( int[] a , int  $\checkmark$  n )  
assumed to be a.length

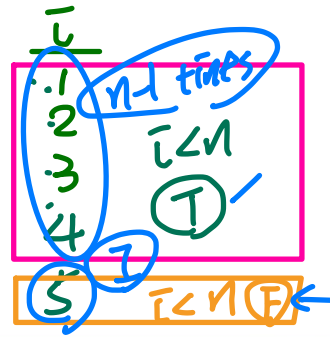
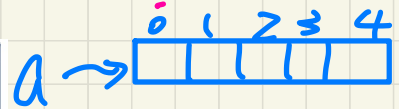
int[] seq = { 2, -1, 3, 1, 10 }

findMax ( seq , 5 )  
seq.length.

# Example 1: Counting Number of Primitive Operations

```

1 int findMax (int[] a, int n) {
2     currentMax = a[0];
3     for (int i = 1; i < n; ) {
4         if (a[i] > currentMax) {
5             currentMax = a[i];
6             i++;
7         }
8     }
9     return currentMax;
10 }
    
```



$i++$   
 $i = i + 1$   
 2 POs.

**Q.** # of times  $i < n$  in **Line 3** is executed?  

$$(n-1) + 1 = n$$
 (Note:  $i < n$  evaluates to  $\text{True}$  for the first  $n-1$  iterations, and  $i < n$  evaluates to  $\text{False}$  for the  $n$ th iteration.)  

$$2 + n + (n-1) \cdot 6 + 1 = (n+3) + (6n-6) + 1 = 7n - 2$$

**Q.** # of times loop body (Lines 4 to 6) is executed?  

$$n - 1 \rightarrow i < n \rightarrow \text{True} \rightarrow \text{exit from loop}$$



## Example 2: Counting Number of Primitive Operations

```
1  boolean foundEmptyString = false;
2  int i = 0;
3  while (!foundEmptyString && i < names.length) {
4      if (names[i].length() == 0) {
5          /* set flag for early exit */
6          foundEmptyString = true;
7      }
8      i = i + 1;
9  }
```

method call  
(in this case a PO).

String[] names;

i

0

1

2

⋮

$i < \overset{10}{names.length}$

(T)

names.length - 1

names.length  $i <$  vs. length

Q. # of times Line 3 is executed? (T)

names.length + 1

Q. # of times loop body (Lines 4 to 8) is executed? (F)

names.length

Q. # of POs in the loop body (Lines 4 to 8)?

# Lecture 1

## Part C

### *Asymptotic Upper Bound*

multiplicative constants

$$7n^1 + 2n^1 \cdot \log n + 3n^2$$

highest power

lower terms.

approx.

$$n^2$$

# Asymptotic Upper Bound: **Big-O**

need to be identified in order to prove that  $f(n) \in O(g(n))$

$f(n) \in O(g(n))$  if there are:

- o A real constant  $c > 0$
- o An integer constant  $n_0 \geq 1$

such that:

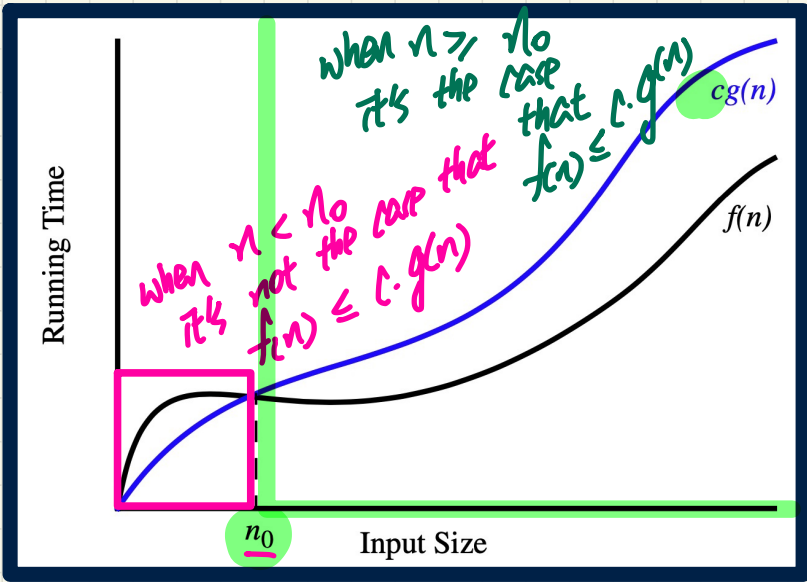
$f(n) \leq c \cdot g(n)$  for  $n \geq n_0$

*upper-bound effect*

Example:

$f(n) = 8n + 5$

$g(n) = n$



Prove:

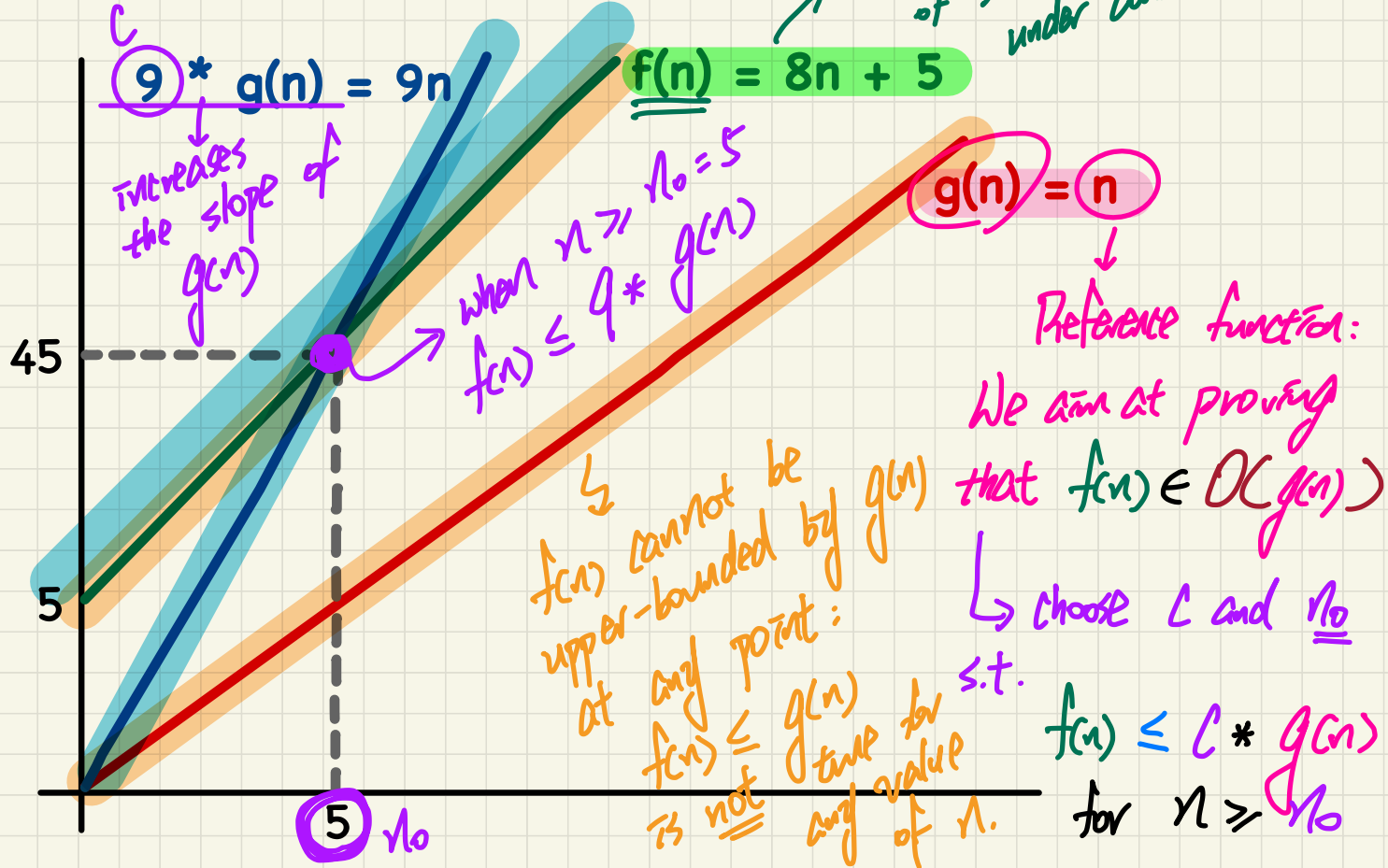
$f(n)$  is  $O(g(n))$

Choose:

$c = 9$

What about  $n_0$ ?

# Asymptotic Upper Bound: Example



# Proving $f(n)$ is $O(g(n))$

We prove by choosing

$$\begin{aligned} C &= |a_0| + |a_1| + \dots + |a_d| \\ n_0 &= 1 \end{aligned}$$

If  $f(n)$  is a polynomial of degree  $d$ , i.e.,

$$f(n) = a_0 \cdot n^0 + a_1 \cdot n^1 + \dots + a_d \cdot n^d$$

and  $a_0, a_1, \dots, a_d$  are integers (i.e., negative, zero, or positive), then  $f(n)$  is  $O(n^d)$ .

① int  $\bar{c} \cdot \bar{c} \leq |\bar{c}|$   
 ② int  $\bar{c} \cdot \bar{c}^x \leq \bar{c}^y$   
 $x \leq y$   
 $2^3 \leq 2^4$

✓ Upper-bound effect:  $n_0 = 1$ ?

$$[f(\underbrace{1}_{n_0}) \leq \underbrace{(|a_0| + |a_1| + \dots + |a_d|)}_C \cdot \underbrace{1^d}_{n_0}]$$

$$\begin{aligned} f(1) &= a_0 \cdot 1^0 + a_1 \cdot 1^1 + \dots + a_d \cdot 1^d \\ &\leq |a_0| \cdot 1^0 + |a_1| \cdot 1^1 + \dots + |a_d| \cdot 1^d = (|a_0| + |a_1| + \dots + |a_d|) \cdot 1^d \end{aligned}$$

Upper-bound effect holds?

$$[f(\underbrace{n}_{n_0}) \leq \underbrace{(|a_0| + |a_1| + \dots + |a_d|)}_C \cdot \underbrace{n^d}_{n_0}]$$

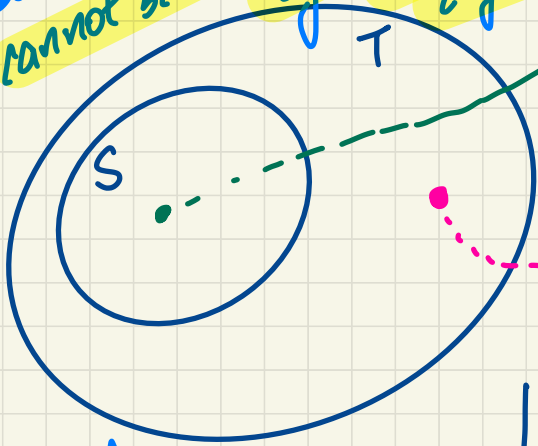
$(n \geq 1)$

$$\begin{aligned} f(n) &= a_0 \cdot n^0 + a_1 \cdot n^1 + \dots + a_d \cdot n^d \\ &\leq |a_0| \cdot n^0 + |a_1| \cdot n^1 + \dots + |a_d| \cdot n^d \leq (|a_0| + |a_1| + \dots + |a_d|) \cdot n^d \end{aligned}$$

# Proper Subset

e.g.

$f(n) = 2n + 1$  is upper bounded by  $n$ , but  $n$  cannot be upper bounded by  $f(n)$  for any  $c$  and  $n_0$ .

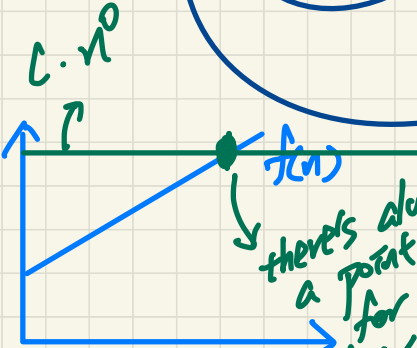


① Every member of  $S$  is also a member of  $T$ . **Not necessarily!**

② There is at least one member of  $T$  that's not a member of  $S$ .  
 all functions which can be upper bounded by  $n^x$

If a function is upper-bounded by  $n^x$  (e.g.  $n$ )

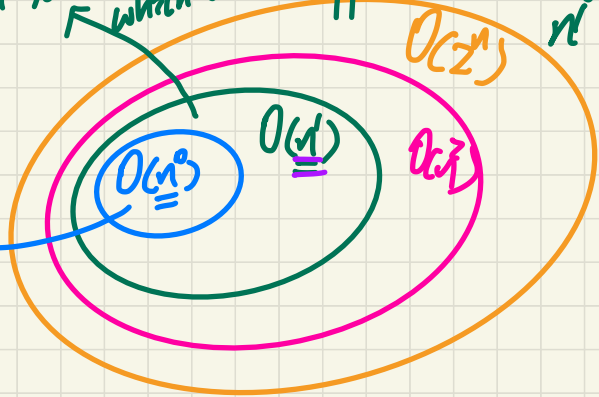
Can that function be upper-bounded by  $n^y$  (e.g.  $n^0$ ) ( $y < x$ )?



there's always a point for  $f(n) \leq c \cdot n$  to be false.

all functions which can be upper-bounded by  $n^0$

$$|S| < |T|$$



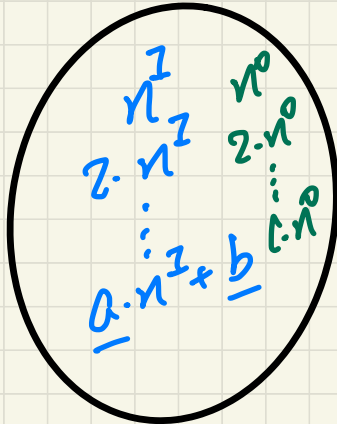
# $O(g(n))$ : A Set of Functions

Each member  $f(n)$  in  $O(g(n))$  is such that:

Highest Power of  $f(n) \leq$  Highest Power of  $g(n)$

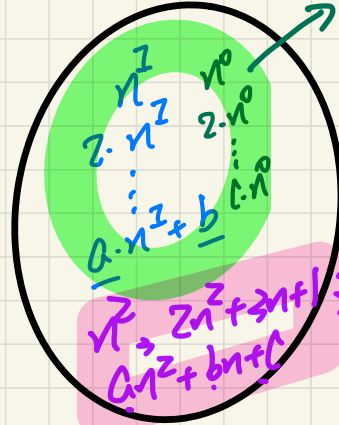
$O(n^1)$

C



$O(n^2)$

$O(n)$



cannot be upper-bounded by  $c \cdot n$ .



# Lecture 1

## Part D

### ***Asymptotic Upper Bounds of Math Functions***

## Asymptotic Upper Bounds: Example (1)

$$\underline{5}n^2 + \underline{3}n \cdot \log n + \underline{2}n + \underline{5} \text{ is } O(n^2)$$

$$O(\underline{n^2})$$

$$C = |5| + |3| + |2| + |5| = \underline{\underline{15}}$$

$$n_0 = 1$$

$$f(n) \leq 15 \cdot n^2 \quad \text{for } n \geq 1$$

## Asymptotic Upper Bounds: Example (2)

$$\underline{20n^3} + \underline{10n \cdot \log n} + \underline{5} \text{ is } O(n^3)$$

$$O(\underline{n^3})$$

$$C = |20| + |10| + |5| = 35 \checkmark$$

$$n_0 = \underline{1}$$

$$f(n) \leq 35 \cdot n^3 \text{ for } n \geq 1$$

# Asymptotic Upper Bounds: Example (3)

3 · logn + 2 is  $O(\log n)$

$$O(\log n)$$

$$c = |3| + |2| = 5$$

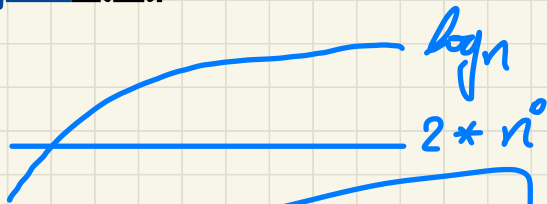
$$n_0 = 1 \times \underline{2}$$

$$f(n) = 3 \cdot \log n + 2$$

$$f(1) \leq 5 \cdot \log 1$$

$$3 \cdot \log 1 + 2$$

False



$$\log 1 = 0$$

$$\because 2^0 = 1$$

$$\log 2 = 1$$

$$f(2) \leq 5 \cdot \log 2$$

$$3 \cdot \log 2 + 2$$

5

True

## Asymptotic Upper Bounds: Example (4)

$$2^{n+2} \text{ is } O(2^n)$$

$$2^{n+2} = \boxed{2^2} \cdot \underline{\underline{2^n}}$$

$\textcircled{4}$

$$C = |4| = 4$$
$$n_0 = 1$$

## Asymptotic Upper Bounds: Example (5)

$$\underline{2n^2 + 100} \cdot \underline{\log n} \text{ is } O(n)$$

$$\hookrightarrow \underline{O(n)}$$

$$C = |2| + |100| = \underline{\underline{102}}$$

$$n_0 = \underline{\underline{1}}$$

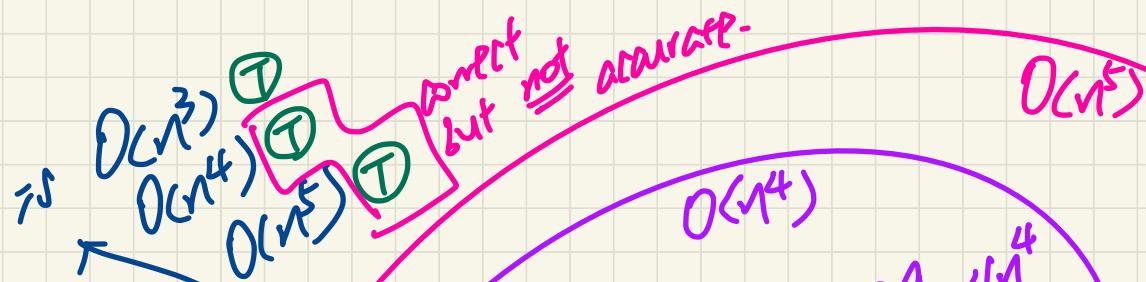
Exercise: Check if the upper-bound effort starts to hold when  $n = n_0 = 1$ :

$$f(1) \leq 102 \cdot 1$$

# Lecture 1

## Part E

### *Asymptotic Upper Bounds of Implemented Algorithms*

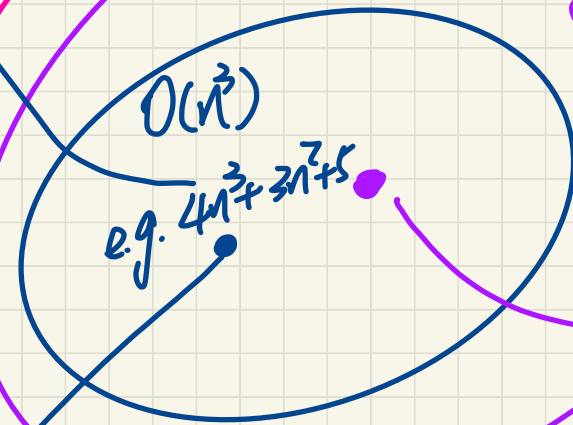


Hello World  
program

```
⇒ print("H.W.");
```

↳  $O(2^n)$

Correct but incorrect



functions upper-bounded by  $n^4$  cannot

necessarily be upper-bounded by  $n^3$

functions upper-bounded by  $n^3$  also be upper-bounded by  $n^4$  and  $n^5$



$$4n^2 + 6n + 9 \text{ is } O(n^2) \checkmark$$

$$4n^2 + 6n + 9 \text{ is } O(\underline{4n^2} + \cancel{3n}) \times$$

## Determining the Asymptotic Upper Bound (1)

```
1 int maxOf (int x, int y) {  
2   int max = x;  $O(1)$   
3   if (y > x) {  $O(1)$   
4     max = y;  $O(1)$   
5   }  
6   return max;  $O(1)$   
7 }
```

$$O(1+1+1+1) = O(1)$$

$$4 = 4 \cdot \underline{1}^0$$

## Determining the Asymptotic Upper Bound (2)

```
1 int findMax (int[] a, int n) {  
2   currentMax = a[0];  $O(1)$   
3   for (int i = 1; i < n; ) {  $O(n)$   
4     if (a[i] > currentMax) {  $O(1)$   
5       currentMax = a[i];  $O(1)$   
6     i ++  $O(1)$ .  
7   return currentMax; }  $O(1)$ 
```

$$\begin{aligned} & O(1 + 1 + n \cdot (1 + 1 + 1)) \\ &= O(2 + 3n) \\ &= O(n) \end{aligned}$$

## Determining the Asymptotic Upper Bound (3)

```
1 boolean containsDuplicate (int[] a, int n) {  
2   for (int i = 0; i < n; ) {  $O(n)$   
3     for (int j = 0; j < n; ) {  $O(n)$   
4       if (i != j && a[i] == a[j]) {  $O(1)$   
5         return true; }  $O(1)$   
6       j ++; }  $O(1)$   
7     i ++; }  $O(1)$   
8   return false; }  $O(1)$ 
```

$$O\left(n \cdot \left(\frac{n \cdot (1+1+1) + 1}{\approx n+1}\right) + 1\right)$$
$$= O(3n^2 + n + 1)$$
$$= O(n^2)$$

## Determining the Asymptotic Upper Bound (4)

```
1  int sumMaxAndCrossProducts (int[] a, int n) {  
2  int max = a[0];  $O(1)$  ✓  
3  for(int i = 1; i < n; i++) {  $O(n)$  ✓  
4  if (a[i] > max) { max = a[i]; }  $O(1)$   
5  }  
6  int sum = max;  $O(1)$  ✓  
7  for (int j = 0; j < n; j++) {  $O(n)$   
8  for (int k = 0; k < n; k++) {  $O(n)$   
9  sum += a[j] * a[k]; } }  
10 return sum; }  $O(1)$  ✓  $O(n^2)$ 
```

$$\begin{aligned} & O(1 + 1 + (n \cdot 1) + 1 + n \cdot n \cdot 1) \\ &= O(2 + n + 1 + n^2) \\ &= O(n^2) \end{aligned}$$

How many #'s in  $[a, b] = b - a + 1$

# Determining the Asymptotic Upper Bound (5)

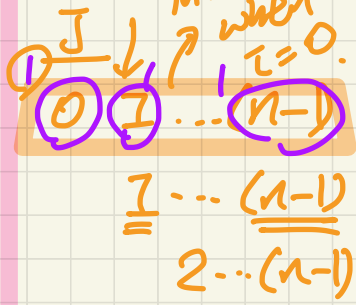
outer-loop

inner loop when  $i=0$

```

1 int triangularSum (int[] a, int n) {
2   int sum = 0;  $O(1)$ 
3   for (int i = 0; i < n; i++) {  $O(n)$ 
4     for (int j = i; j < n; j++) {
5       sum += a[j]; }  $O(1)$ 
6   return sum; }  $O(1)$ 

```



## Sum of Arithmetic Sequence

$$1 + 2 + 3 + \dots + n = \frac{(1+n) \cdot n}{2}$$

$$O(1 + n + (n-1) + \dots + 1)$$

when  $i=0$     when  $i=1$     when  $i=n-1$

$$= O(2 + 1 \cdot (n + (n-1) + \dots + 1))$$

$$(i + 0 \cdot c) + (i + 1 \cdot c) + (i + 2 \cdot c) + (i + 3 \cdot c) + \dots + (i + (n-1) \cdot c)$$

$+c$      $+c$      $+c$

$$= \frac{(i + (i + (n-1)c)) \cdot n}{2}$$

$$= O(2 + \frac{(n+1) \cdot n}{2})$$

$$= O(n^2)$$

## Lecture 2

### Part A

# ***Asymptotic Upper Bounds of Array Operations***

# Inserting into an Array

$$[0, i-1] = (i-1) - 0 + 1 = i$$

assume:  $0 \leq i \leq a.length - 1$

```
String[] insertAt(String[] a, int n, String e, int i)
String[] result = new String[n + 1];
for(int j = 0; j <= i - 1; j++){ result[j] = a[j]; }
result[i] = e;
for(int j = i + 1; j <= n; j++){ result[j] = a[j-1]; }
return result;
```

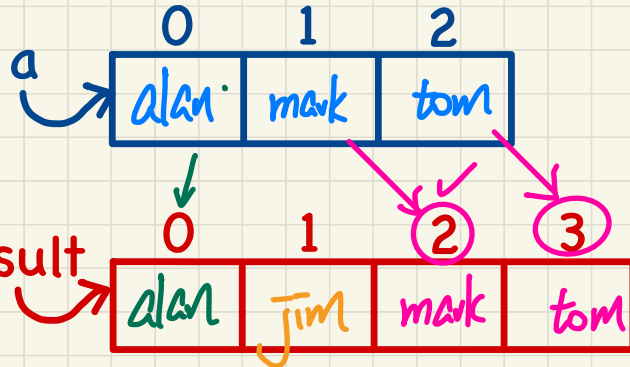
$O(n-1) = O(n)$   
 $O(n-1) = O(n)$

## Example:

$$[i+1, n] = n - (i+1) + 1 = n - i$$

insertAt({alan, mark, tom}, 3, jim, 1)

↳ n when i=0  
 max # of iterations



result[2] = a[2-1]  
 result[3] = a[3-1]

RT:  
 $O(1 + n + 1 + n + 1)$   
 $= O(n)$

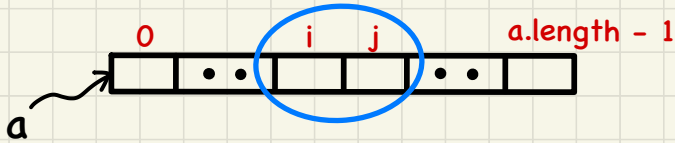


## Lecture 2

### Part B

***Asymptotic Upper Bounds  
Selection Sort vs. Insertion Sort***

# Sorting Orders of Arrays

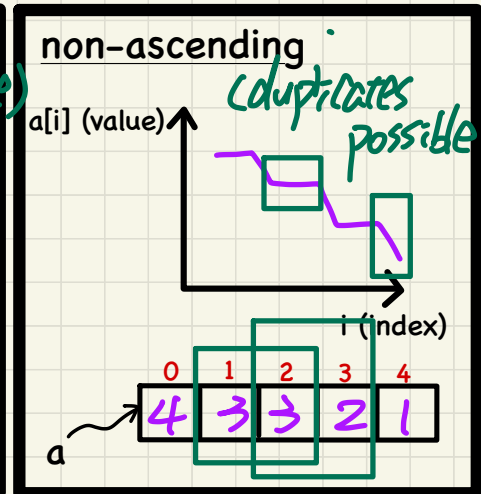
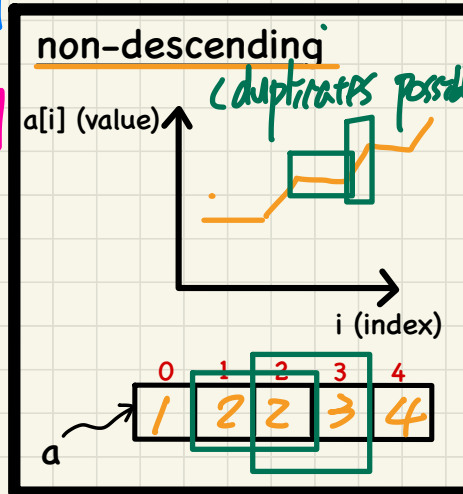
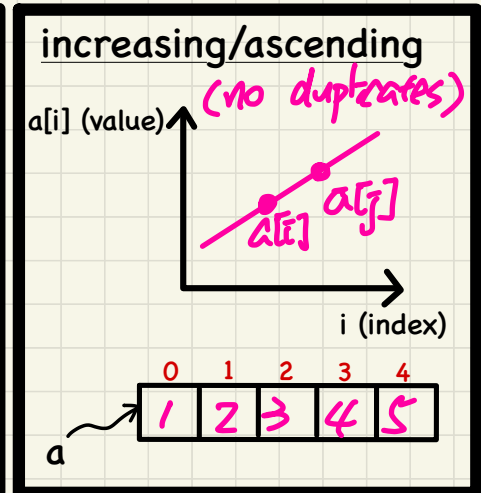
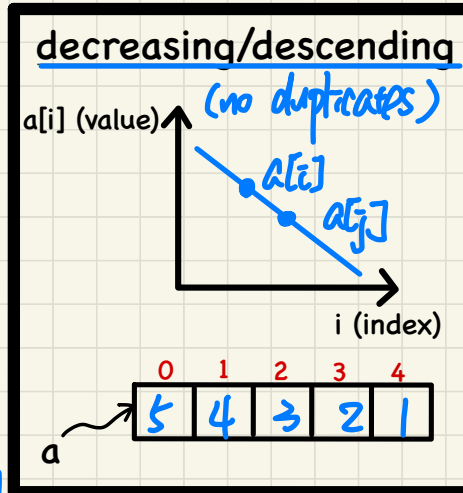


decreasing/descending:  $a[i] > a[j]$

increasing/ascending:  $a[i] < a[j]$

non-descending:  $\neg(a[i] > a[j])$   
 $\equiv a[i] \leq a[j]$

non-ascending:  $\neg(a[i] < a[j])$   
 $\equiv a[i] \geq a[j]$



# Selection Sort

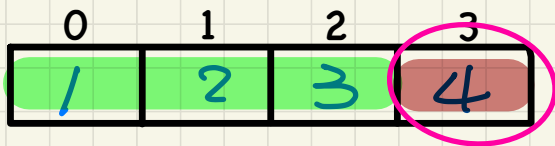
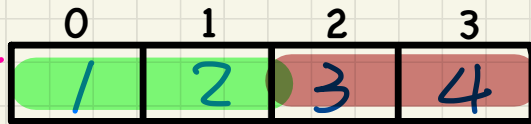
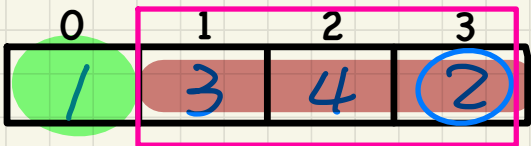
Keep selecting minimum from the **unsorted** portion and appending it to the end of sorted portion.

more EXPENSIVE

from L to R

cheaper

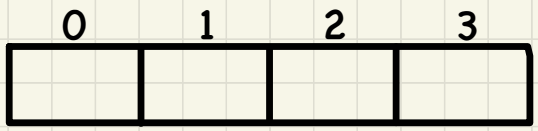
append  
 $n+1$   
 select  
 append  
 $(n-1)+1$   
 select  
 append  
 $1+1$   
 select



unsorted  
 sorted

$$O(n + (n+1) + n + \dots + 1)$$

$\downarrow$  append to end of sorted portion  
 $\downarrow$  1st selection  
 $\downarrow$  2nd selection  
 $O(n^2)$



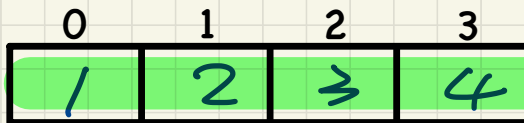
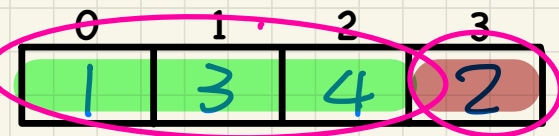
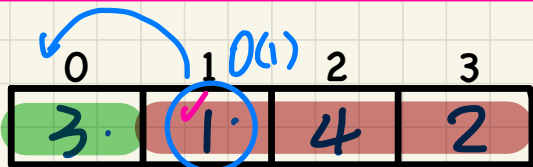
# Insertion Sort

Keep getting 1st element from the **unsorted** portion and **inserting** it to the **sorted** portion.

*cheaper*

*more expensive*

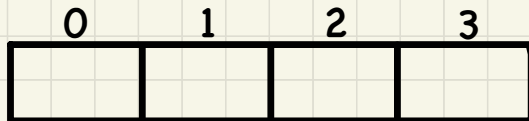
*get + 1 insert*  
*get + 2 insert*  
*get + ... insert*  
*get + (n-1) insert*



**unsorted**  
**sorted**

$$O(n) + \underbrace{(1)}_{\substack{\text{1st} \\ \text{insert}}} + \underbrace{(2)}_{\substack{\text{2nd} \\ \text{insert}}} + \dots + \underbrace{(n-1)}_{\substack{\text{1st} \\ \text{insert}}} = O(n^2)$$

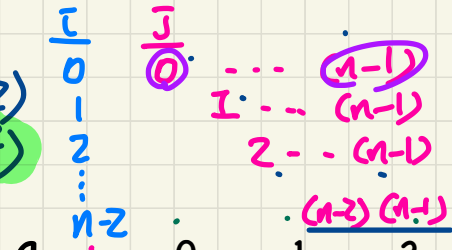
*get 1st elements of unsorted portion*



# Selection Sort in Java

$$O(n + (n-1) + (n-2) + \dots + 2 + 1) = O(n^2)$$

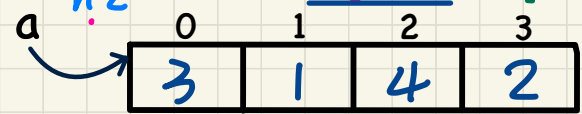
4 = 4  
= 4



```

1 void selectionSort(int[] a, int n)
2   for (int i = 0; i <= (n - 2); i++)
3     → int minIndex = i;
4     → for (int j = i; j <= (n - 1); j++)
5         → if (a[j] < a[minIndex]) { minIndex = j; }
6         → int temp = a[i];
7           a[i] = a[minIndex];
8           a[minIndex] = temp;
    
```

swap  $a[i]$  and  $a[\text{minIndex}]$   
 $i: 0$        $i: 3$



**Inner Loop:** select the next min from  $a[i]$  to  $a[n - 1]$  and put it to the end of the sorted region.

**Outer Loop:**  
At the end of each iteration of the for-loop,  $a$  is sorted from  $a[0]$  to  $a[i]$ .

| $i$      | inner loop: $j$ from ? to ?             | <u>midIndex</u> at L6 | after L6 - L8, $a$ becomes? |
|----------|---|-----------------------|-----------------------------|
| <u>0</u> | <u>0</u> 1 .. <u><math>(n-1)</math></u> | <u>1</u>              |                             |
| <u>1</u> | 1 .. <u><math>(n-1)</math></u>          | <u>3</u>              |                             |

$$O(2 + 3 + 4 + \dots + n) = O(n^2)$$

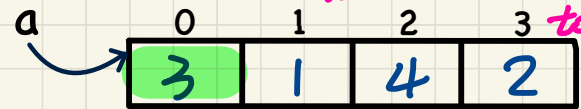
# Insertion Sort in Java

$$[0, n-1] = n$$

exit when:  $\neg(j > 0 \wedge a[j-1] > c)$   
 $= j \leq 0 \vee a[j-1] \leq c$   
 ↓ worst case for while-loop to exit

```

1 void insertionSort(int[] a, int n)
2   for (int i = 1; i < n; i++)
3     int current = a[i];
4     int j = i;
5     while (j > 0 && a[j-1] > current)
6       a[j] = a[j-1];
7       j--;
8     a[j] = current;
    
```



**Outer Loop:**  
 At the end of each iteration of the for-loop,  $a$  is sorted from  $a[0]$  to  $a[i]$ .

**Inner Loop:** find out where to insert  $current$  into  $a[0]$  to  $a[i]$  s.t. that part of  $a$  becomes sorted.

| $i$ | current after L3 | $\rightarrow j$ at L8 | after L8, $a$ becomes? | $i$   | $j$             |
|-----|------------------|-----------------------|------------------------|-------|-----------------|
| 1   | $a[1]$ 1         | 0                     |                        | 1     | 0               |
| 2   | $a[2]$ 4         | 2                     |                        | 2     | 0               |
| 3   | $a[3]$ 2         | 1                     |                        | $n-1$ | $(n-1) \dots 0$ |

# In-Place Sorting



Sort by modifying directly

the input array

(without intermediate storage)

## Lecture 2

### Part C

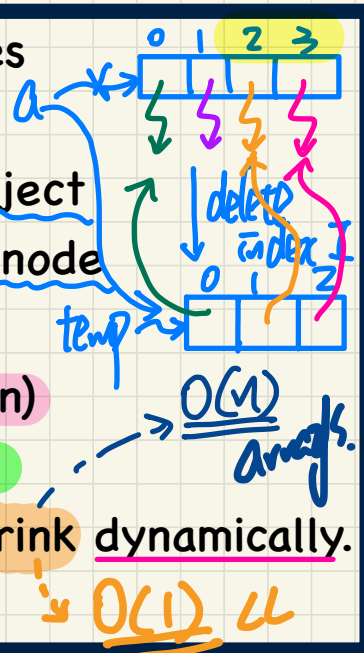
# ***Singly-Linked Lists - Intuitive Introduction***



# Singly-Linked Lists (SLL): Visual Introduction

```
int[] a = new int[0];
```

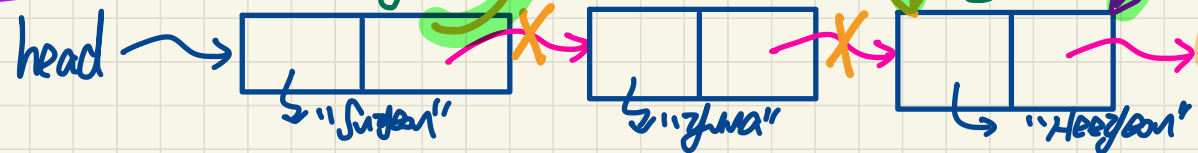
- A chain of connected nodes
- Each node contains:
  - + reference to a data object
  - + reference to the next node
- Accessing a node in a list:
  - + Relative positioning:  $O(n)$
  - + Absolute indexing:  $O(1)$
- The chain may grow or shrink dynamically.
- Head vs. Tail



(1) Empty SLL  
 head → null  
 tail → null  
 freed length

(2) SLL with size 1  
 head → [ ]  
 tail → null

(3) SLL with size 3



tail Ref. Aliasing  
 tail == head.next  
 True.

## Lecture 2

### Part D

***Singly-Linked Lists -  
Java Implementation: String Lists  
Initializing a List***

# Implementing SLL in Java: SinglyLinkedList vs. Node

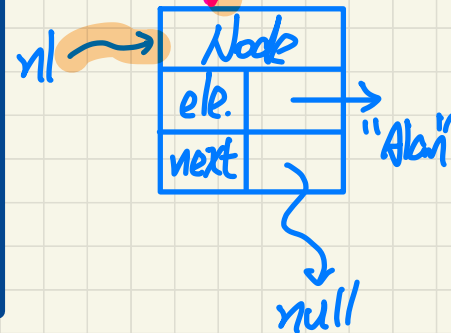
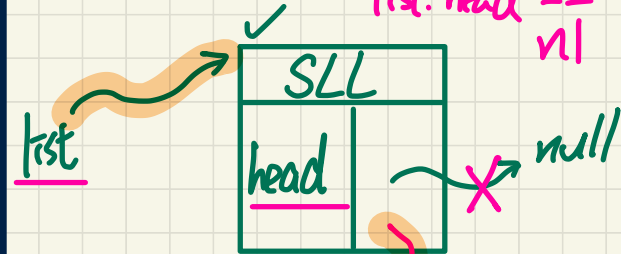
```
public class SinglyLinkedList {  
    private Node head = null;  
    public void setHead(Node n) { head = n; }  
    public int getSize() { ... }  
    public Node getTail() { ... }  
    public void addFirst(String e) { ... }  
    public Node getNodeAt(int i) { ... }  
    public void addAt(int i, String e) { ... }  
    public void removeLast() { ... }  
}
```

```
public class Node {  
    private String element;  
    private Node next;  
    public Node(String e, Node n) { element = e; next = n; }  
    public String getElement() { return element; }  
    public void setElement(String e) { element = e; }  
    public Node getNext() { return next; }  
    public void setNext(Node n) { next = n; }  
}
```

Runtime

Reference Address

lst.head ==  
n1



# SLL: Constructing a Chain of Nodes

## Ref. Aliasing

1. tom
2. mark.next
3. alan.next.next

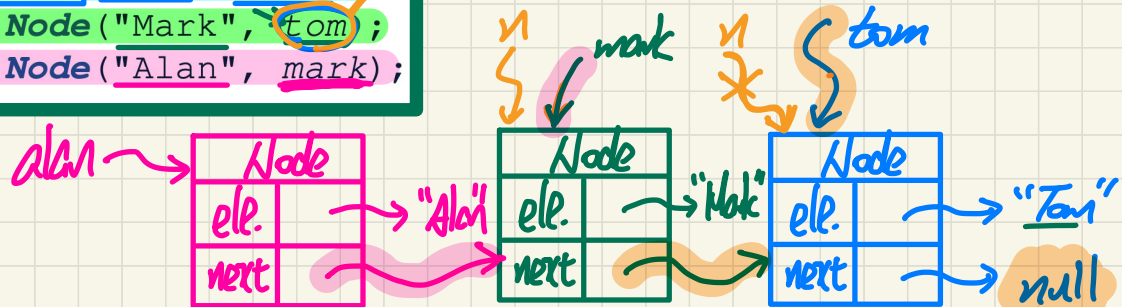
call by value

```
public class Node {  
    private String element;  
    private Node next;  
    public Node(String e, Node n) { element = e; next = n; }  
    public String getElement() { return element; }  
    public void setElement(String e) { element = e; }  
    public Node getNext() { return next; }  
    public void setNext(Node n) { next = n; }  
}
```

*n = tom*  
*n = mark.*  
*this.next*

## Approach 1

```
Node tom = new Node("Tom", null);  
Node mark = new Node("Mark", tom);  
Node alan = new Node("Alan", mark);
```



# SLL: Constructing a Chain of Nodes

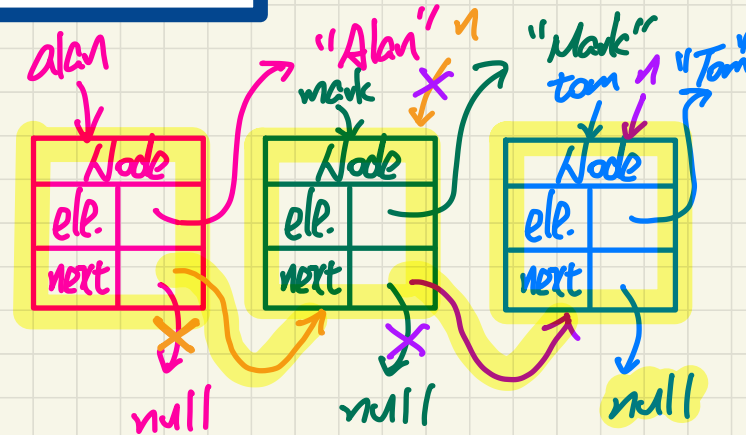
```
public class Node {  
    private String element;  
    private Node next;  
    public Node(String e, Node n) { element = e; next = n; }  
    public String getElement() { return element; }  
    public void setElement(String e) { element = e; }  
    public Node getNext() { return next; }  
    public void setNext(Node n) { next = n; }  
}
```

## Approach 2

```
Node alan = new Node("Alan", null);  
Node mark = new Node("Mark", null);  
Node tom = new Node("Tom", null);  
alan.setNext(mark);  
mark.setNext(tom);
```

Context object

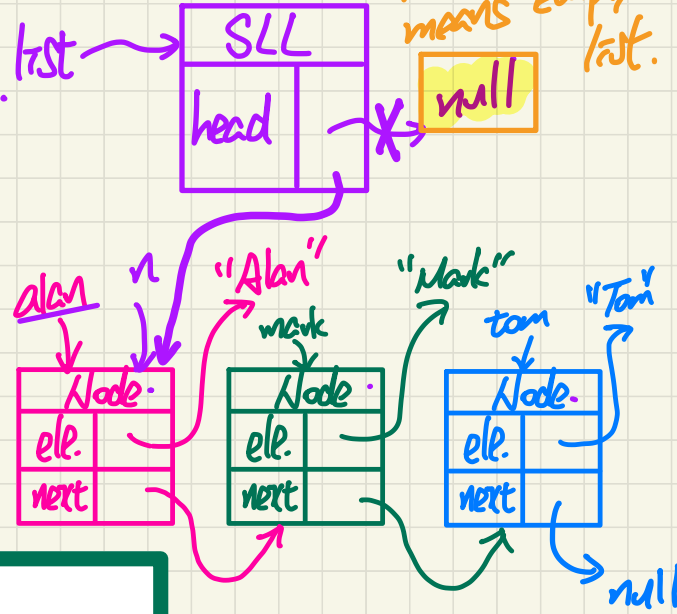
call by value  
alan mark  
n = mark  
n = tom



# SLL: Setting a List's Head to a Chain of Nodes

head == null /  
means empty list.

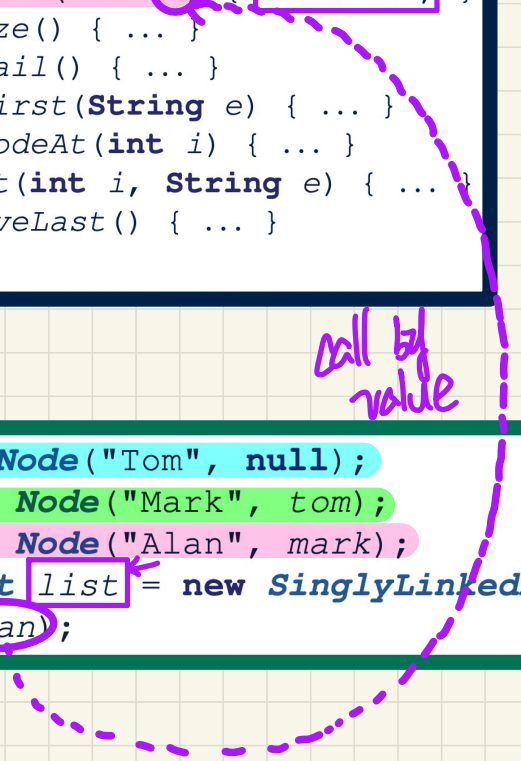
```
public class SinglyLinkedList {
    private Node head = null;
    public void setHead(Node n) { head = n; }
    public int getSize() { ... }
    public Node getTail() { ... }
    public void addFirst(String e) { ... }
    public Node getNodeAt(int i) { ... }
    public void addAt(int i, String e) { ... }
    public void removeLast() { ... }
}
```



## Approach 1

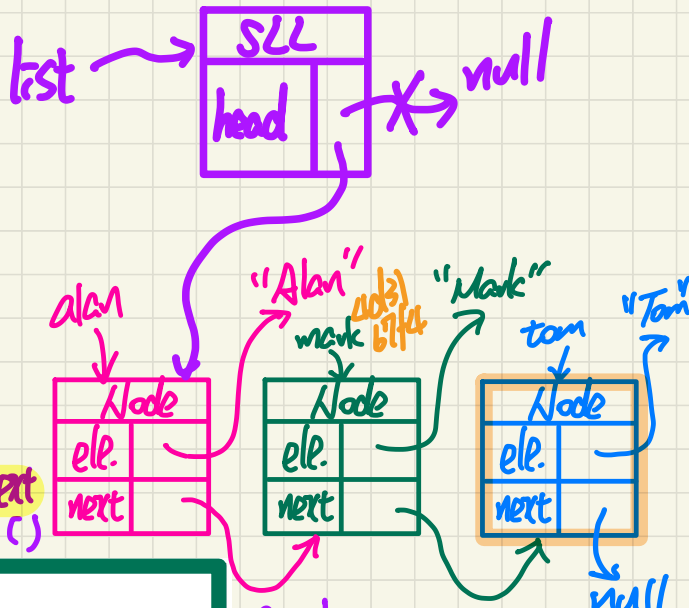
```
Node tom = new Node("Tom", null);
Node mark = new Node("Mark", tom);
Node alan = new Node("Alan", mark);
SinglyLinkedList list = new SinglyLinkedList();
list.setHead(alan);
```

call by value



# SLL: Setting a List's Head to a Chain of Nodes

```
public class SinglyLinkedList {
    private Node head = null;
    public void setHead(Node n) { head = n; }
    public int getSize() { ... }
    public Node getTail() { ... }
    public void addFirst(String e) { ... }
    public Node getNodeAt(int i) { ... }
    public void addAt(int i, String e) { ... }
    public void removeLast() { ... }
}
```



Approach 2  $\textcircled{1}$  list.getFirst().getNext().getNext()

```
Node alan = new Node("Alan", null);
Node mark = new Node("Mark", null);
Node tom = new Node("Tom", null);
alan.setNext(mark);
mark.setNext(tom);
SinglyLinkedList list = new SinglyLinkedList();
list.setHead(alan);
```

Q. How many paths to reach "Tom" object?

- ① tom
- ② mark.getNext()
- ③ alan.getNext().getNext()

## Lecture 2

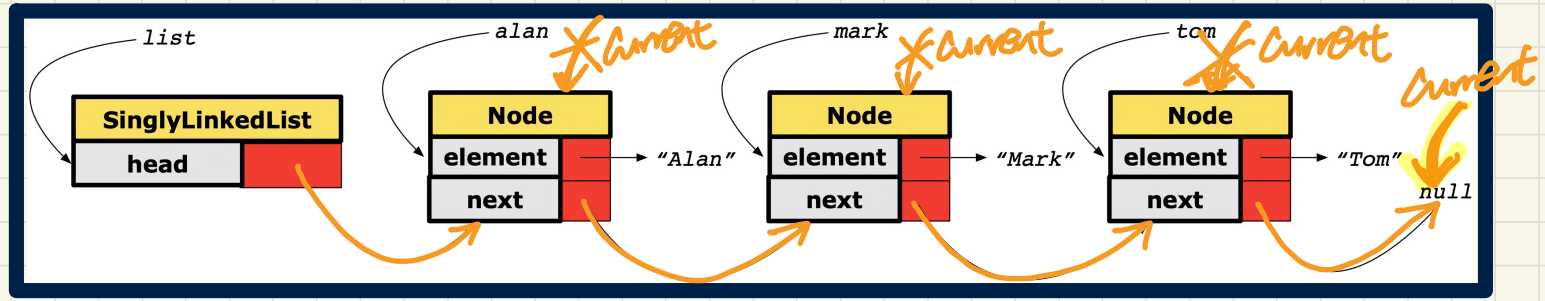
### Part E

***Singly-Linked Lists -  
Java Implementation: String Lists  
Operations on a List***



$$\bar{l} = \bar{l} + 1$$

# SLL Operation: Counting the Number of Nodes



## Trace: list.getSize()

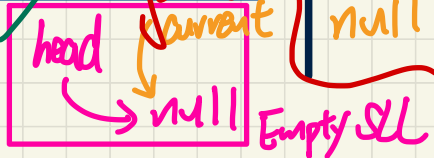
```

1 int getSize() {
2   int size = 0;
3   Node current = head;
4   while (current != null) {
5     current = current.getNext();
6     size++;
7   }
8   return size;
9 }

```

| current | current != null | End of Iteration | size |
|---------|-----------------|------------------|------|
| alan    | true            | 1                | 1    |
| mark    | true            | 2                | 2    |
| tom     | true            | 3                | 3    |
| null    | false           |                  |      |

- 1. Empty list
- 7. Non-empty list

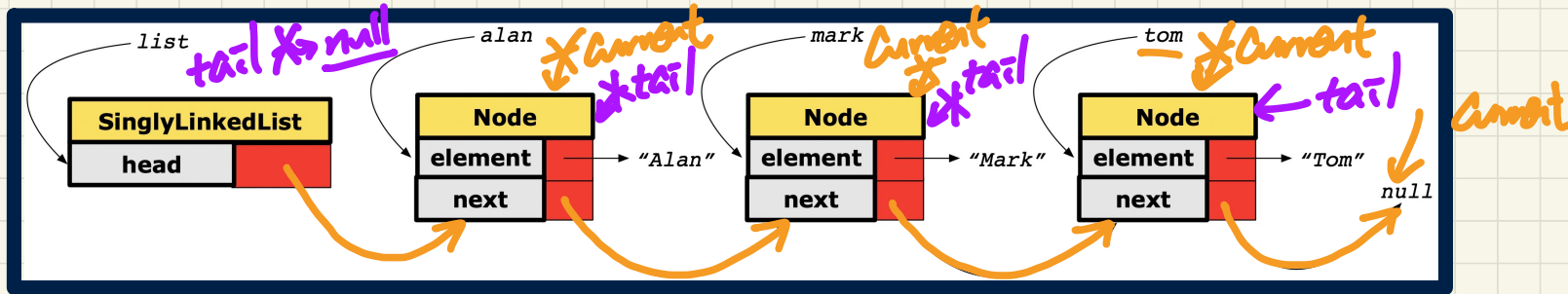


Start from 1st node in chain, we keep calling getNext() until null

reaching null. (n iterations)

$O(1)$

# SLL Operation: Finding the Tail of the List



```

1 Node getTail() {
2   → Node current = head;
3   → Node tail = null;
4   → while (current != null) {
5     → tail = current;
6     → current = current.getNext();
7   }
8   → return tail;
9 }
  
```

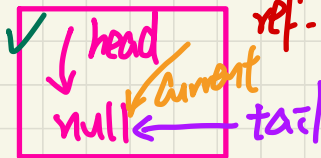
*O(n)*

*how many iterations before hitting null ref.*

## Trace: list.getTail()

| current | current != null | End of Iteration | tail |
|---------|-----------------|------------------|------|
| alan    | true            | 1                | alan |
| mark    | true            | 2                | mark |
| tom     | true            | 3                | tom  |
| null    | false           |                  |      |

→ 1. Empty list  
2. Non-empty list



Exercise: Use debugger to trace.

# SLL Operation: Inserting to the Front of the List

@Test

```
public void testSLL_02() {
```

```
    SinglyLinkedList list = new SinglyLinkedList();
```

```
    → assertTrue(list.getSize() == 0);
```

```
    → assertTrue(list.getFirst() == null);
```

```
    list.addFirst("Tom");
```

```
    list.addFirst("Mark");
```

```
    list.addFirst("Alan");
```

```
    assertTrue(list.getSize() == 3);
```

```
    assertEquals("Alan", list.getFirst().getElement());
```

```
    assertEquals("Mark", list.getFirst().getNext().getElement());
```

```
    assertEquals("Tom", list.getFirst().getNext().getNext().getElement());
```

```
}
```

user/caller friendly  
? att: Node n

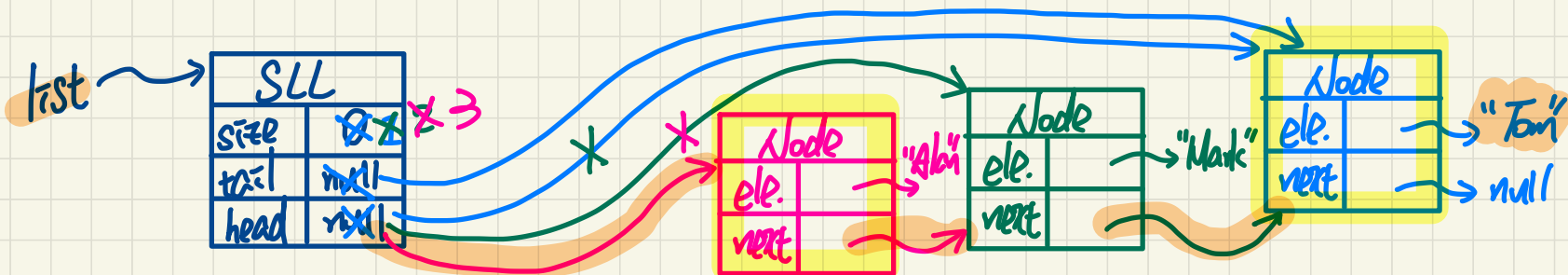
```
1 void addFirst (String e) {
2   → head = new Node(e, head);
3   → if (size == 0) {
4     → tail = head;
5   }
6   → size ++;
7 }
```

→ return values of att.  
size and head ⇒

O(1)

→ overhead of declaring

size as an attribute.



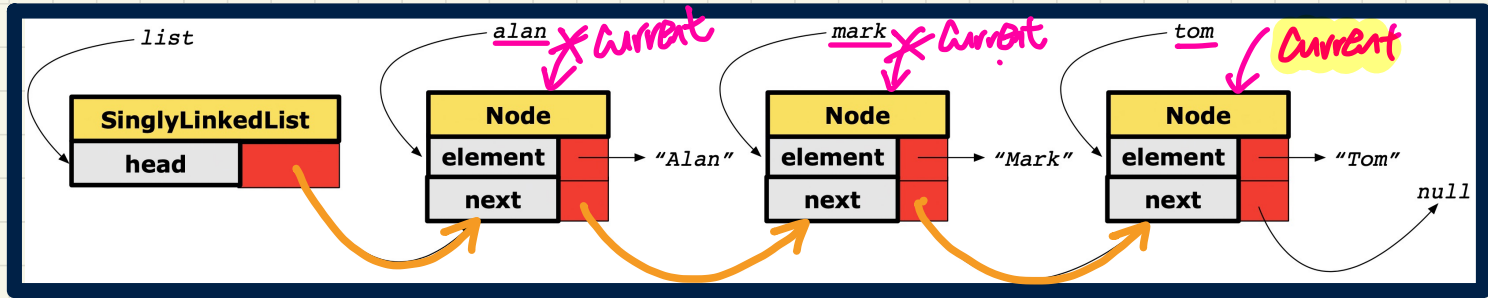
## Lecture 2

### Part E (continued)

***Singly-Linked Lists -  
Java Implementation: String Lists  
Operations on a List***

# Exercises on Non-Empty list: list.getNodeAt(-1) vs. list.getNodeAt(3)

## SLL Operation: Accessing the Middle of the List



```

1 Node getNodeAt (int x) {
2   if (x < 0 || x >= size) { /* error
3     else {
4       int index = 0;
5       Node current = head;
6       while (index < x) { /* exit when
7         index ++;
8         current = current.getNext();
9       }
10      return current;
11    }
12 }
  
```

Annotations:   
 - Line 2:  $x < 0$  and  $x \geq size$  are boxed in purple.   
 - Line 4: `int index = 0;` is boxed in purple.   
 - Line 5: `Node current = head;` is boxed in purple.   
 - Line 6: `while (index < x)` is boxed in purple.   
 - Line 8: `current = current.getNext();` is boxed in purple.   
 - Line 10: `return current;` is boxed in purple.   
 - Handwritten notes:   
 - "Exit: index >= 2" with an arrow pointing to the while loop.   
 - "Max # of iterations: O(1)" with an arrow pointing to the while loop.   
 - "Exit: index = 2" with an arrow pointing to the while loop.   
 - "O(1)" is written near the return statement.   
 - "No valid indices" is written in pink on the left.

## Trace: list.getNodeAt(2)

| current | index | index < 2 | Start of Iteration |
|---------|-------|-----------|--------------------|
| alan    | 0     | T         | 1                  |
| mark    | 1     | T         | 2                  |
| tom     | 2     | F         |                    |

Annotations:   
 - "max: size - 1" is written in pink below the table.   
 - "O(1)" is written in yellow below the table.   
 - "Exit: index = 2" is written in pink below the table.   
 - "O(1)" is written in yellow below the table.

1. Empty list   
 2. Non-Empty list

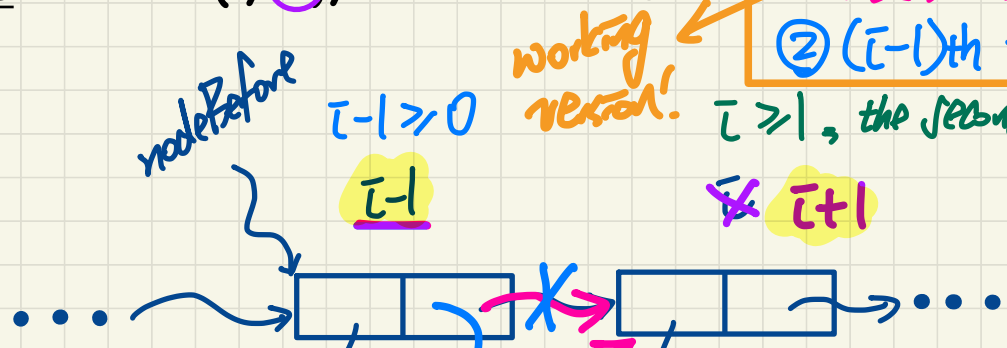
Diagram:   
 - A box labeled "head" with "size: 0" below it.   
 - An arrow labeled "tail" points from "head" to "null".   
 - An arrow points from "list.getNodeAt(0)" to the "head" box.

$0 < 0 \parallel 0 \geq 0 \rightarrow \text{True}$

# Idea of Inserting a Node at index $i$

Case: `addAt(i, e)`, where  $i > 0$

- ① The newnode's next is set to  $(i-1)$ th node's next. newnode.
- ②  $(i-1)$ th node's next set to newnode.



seq. of code does not work!

① The  $(i-1)$ th node's next is set to the newnode

② The newnode's next is set to the old  $i$ th node.

$e \rightsquigarrow "..."$

Q. Do we need the reference to the  $(i-1)$ th node?

YES!

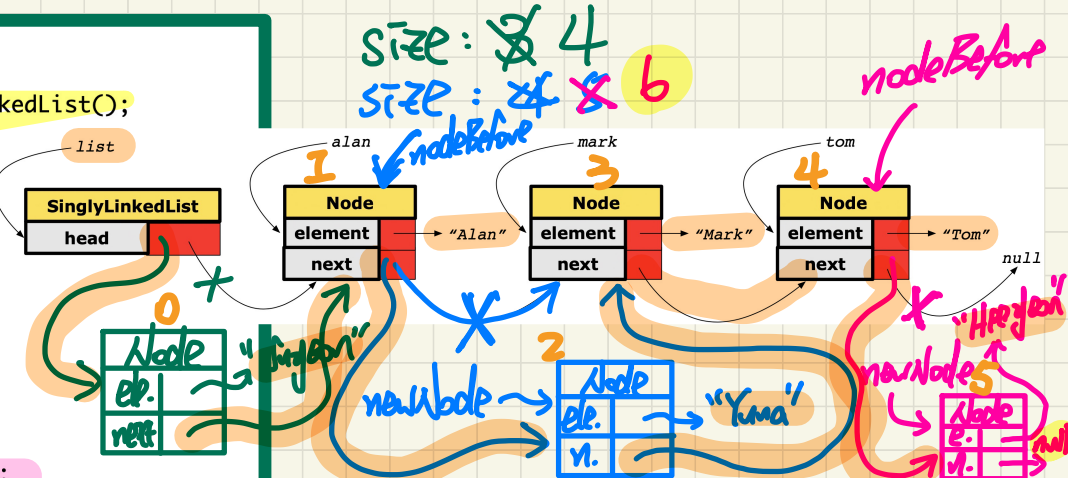
# SLL Operation: Inserting to the Middle of the List

@Test

```
public void testSLL_addAt() {
    SinglyLinkedList list = new SinglyLinkedList();
    assertTrue(list.getSize() == 0);
    assertTrue(list.getFirst() == null);

    list.addFirst("Tom");
    list.addFirst("Mark");
    list.addFirst("Alan");
    assertTrue(list.getSize() == 3);

    list.addAt(0, "Suyeon");
    list.addAt(2, "Yuna");
    list.addAt(list.getSize(), "Heeyeon");
    assertTrue(list.getSize() == 6);
    assertEquals("Suyeon", list.getNodeAt(0).getElement());
    assertEquals("Alan", list.getNodeAt(1).getElement());
    assertEquals("Yuna", list.getNodeAt(2).getElement());
    assertEquals("Mark", list.getNodeAt(3).getElement());
    assertEquals("Tom", list.getNodeAt(4).getElement());
    assertEquals("Heeyeon", list.getNodeAt(5).getElement());
}
```



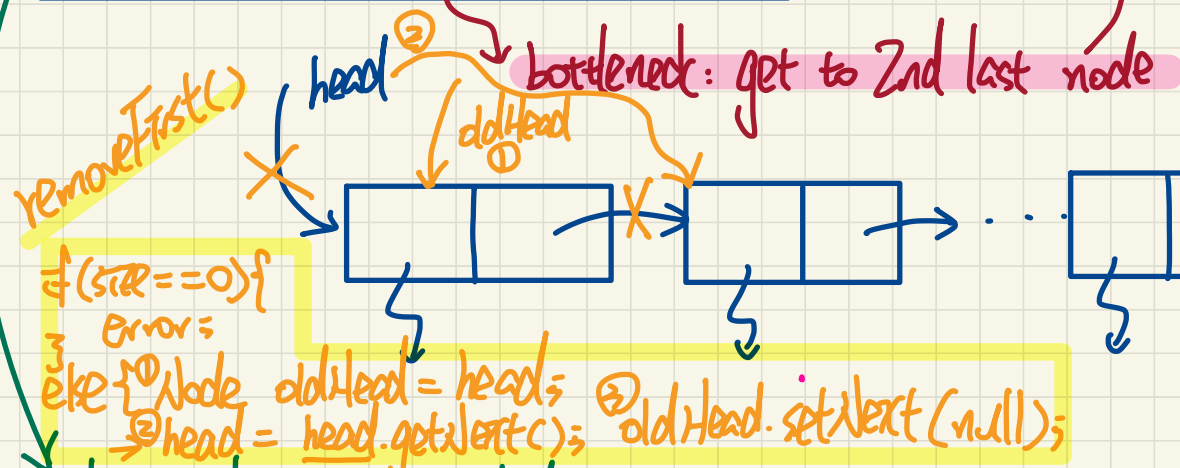
SIZE: ~~4~~  
 SIZE: ~~4~~ 6

```
void addAt (int i, String e) {
    if (i < 0 || i > size) {
        throw new IllegalArgumentException("Invalid Index.");
    }
    else {
        if (i == 0) {
            addFirst(e);
        }
        else {
            Node nodeBefore = getNodeAt(i - 1);
            Node newNode = new Node(e, nodeBefore.getNext());
            nodeBefore.setNext(newNode);
            size++;
        }
    }
}
```

$O(n)$  - dominated by  $getNodeAt$

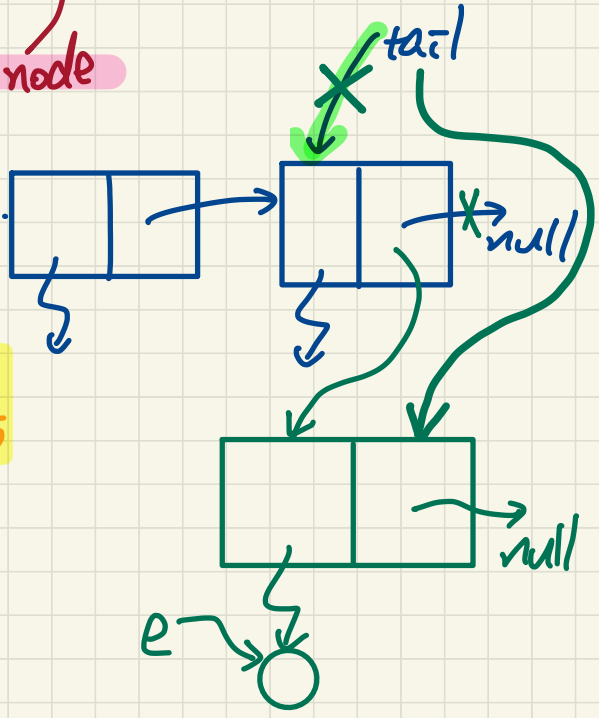
```

void addLast (String e) → O(1)
void removeLast () → O(n) ←
  
```



```

tail.setNext(new Node(e, null));
tail = tail.getNext();
size++;
  
```





# SLL Operation: Removing the End of the List

```

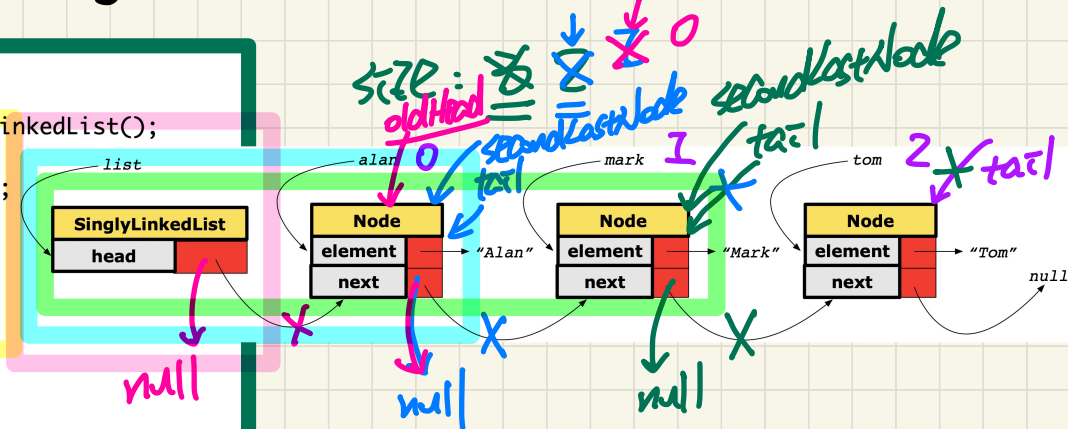
@Test
public void testSLL_removeLast() {
    SinglyLinkedList list = new SinglyLinkedList();
    assertTrue(list.getSize() == 0);
    assertTrue(list.getFirst() == null);

    list.addFirst("Tom");
    list.addFirst("Mark");
    list.addFirst("Alan");
    assertTrue(list.getSize() == 3);

    list.removeLast(); ✓
    assertTrue(list.getSize() == 2);
    assertEquals("Alan", list.getNodeAt(0).getElement());
    assertEquals("Mark", list.getNodeAt(1).getElement());

    list.removeLast();
    assertTrue(list.getSize() == 1);
    assertEquals("Alan", list.getNodeAt(0).getElement());

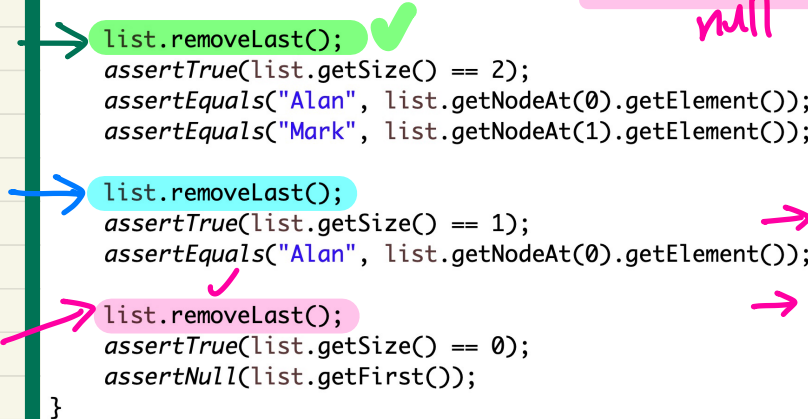
    list.removeLast();
    assertTrue(list.getSize() == 0);
    assertNull(list.getFirst());
}
    
```



```

1 void removeLast () {
2     if (size == 0) {
3         throw new IllegalArgumentException("Empty List.");
4     }
5     else if (size == 1) {
6         removeFirst();
7     }
8     else {
9         Node secondLastNode = getNodeAt(size - 2);
10        secondLastNode.setNext(null);
11        tail = secondLastNode;
12        size --;
13    }
14 }
    
```

*O(n) - dominating line*



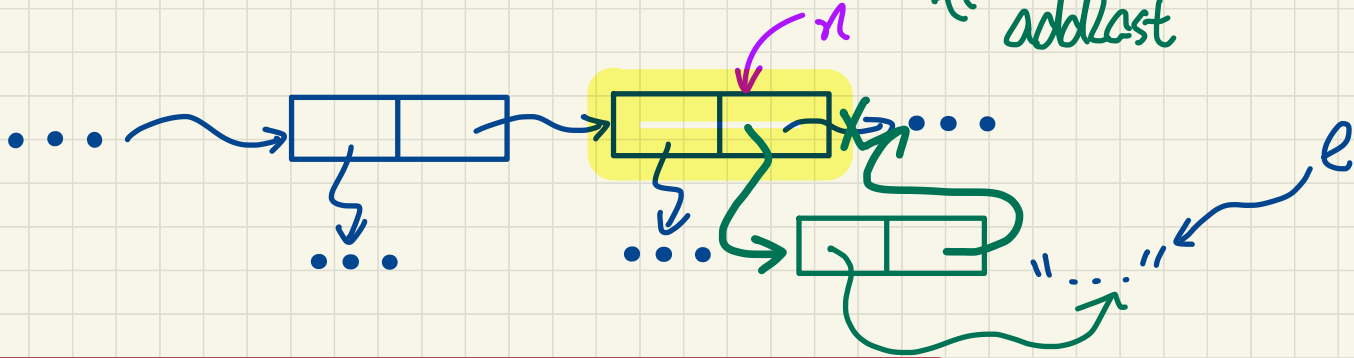
# Exercises: insertAfter vs. insertBefore

**Case:** insertAfter(Node n, String e)

reference node

$O(1)$

$\approx$  addLast

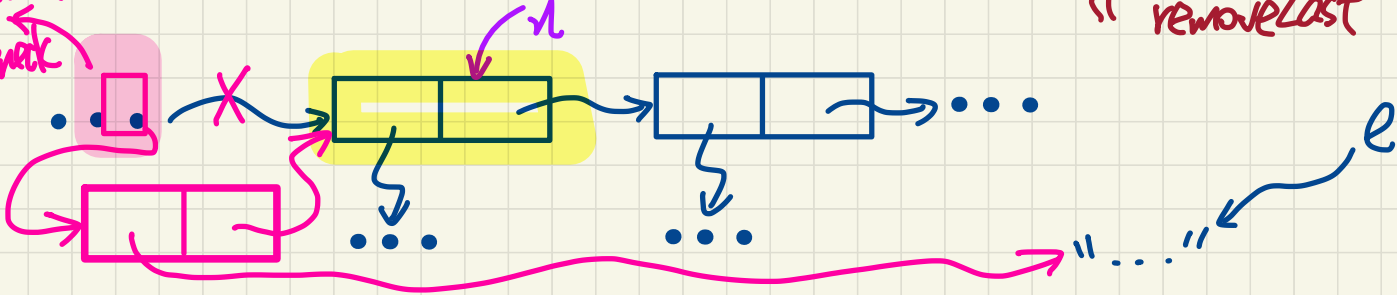


**Case:** insertBefore(Node n, String e)

$O(n)$

$\gg$  removeLast

performance bottleneck



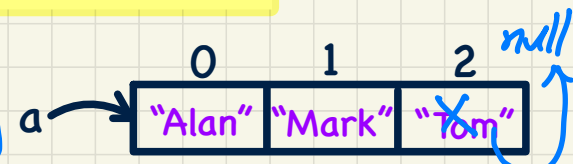
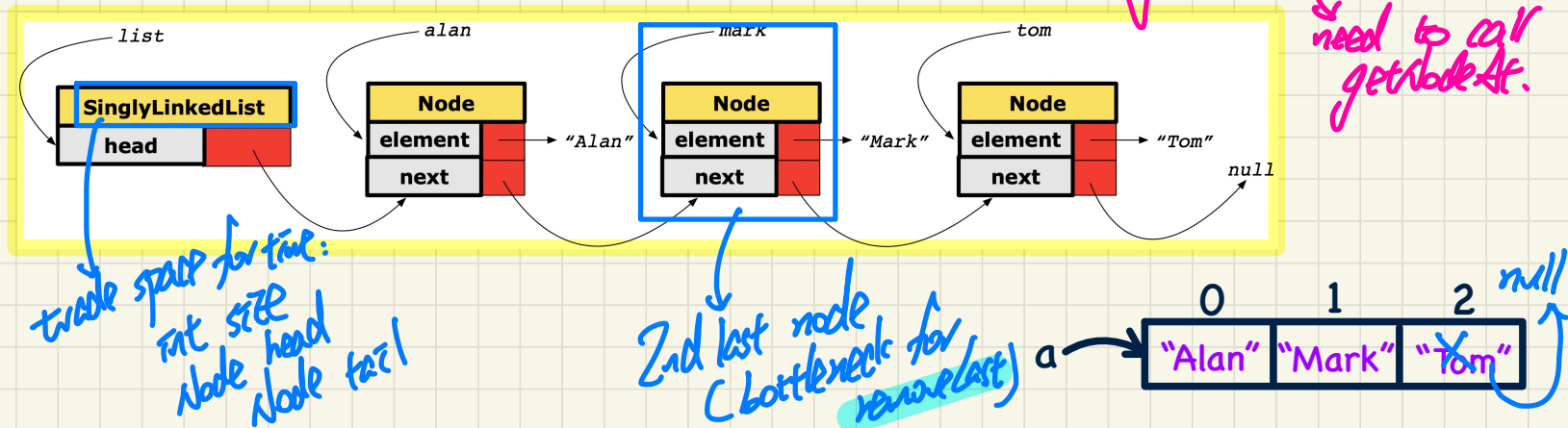
## Lecture 2

### Part F

# ***Singly-Linked Lists - Comparing Arrays and Singly-Linked Lists***

# Running Time: Arrays vs. Singly-Linked Lists

| DATA STRUCTURE                             |  | ARRAY              | SINGLY-LINKED LIST                        |
|--|--|--------------------|---|
| OPERATION                                  |  |                    |   |
| get size                                   |  | <i>no visiting</i> | $O(1)$                                    |
| get first/last element                     |  |                    |   |
| get element at index $i$                   |  | $O(1)$             | $O(n)$                                    |
| remove last element                        |  |                    | $O(n)$                                    |
| add/remove first element, add last element |  |                    | $O(1)$                                    |
| add/remove $i^{\text{th}}$ element         | given reference to $(i-1)^{\text{th}}$ element | $O(n)$             | $O(1)$ <i>no need to call get node at</i> |
|  | <u>not given</u>                               |                    | $O(n)$ <i>need to call get node at</i>    |



## Lecture 2

### Part G

# ***Singly-Linked Lists - Implementing Generic Lists in Java***

# Non-Generic Classes: Node vs. SinglyLinkedList

→ as an implementor, you must commit to a type for node elements

```
public class Node {
    private String element;
    private Node next;
    public Node(String e, Node n) { element = e; next = n; }
    public String getElement() { return element; }
    public void setElement(String e) { element = e; }
    public Node getNext() { return next; }
    public void setNext(Node n) { next = n; }
}
```

Everything else is tied to this String type accordingly.

```
public class SinglyLinkedList {
    private Node head = null;
    public void setHead(Node n) { head = n; }
    public int getSize() { ... }
    public Node getTail() { ... }
    public void addFirst(String e) { ... }
    public Node getNodeAt(int i) { ... }
    public void addAt(int i, String e) { ... }
    public void removeLast() { ... }
}
```

```
Node n1 = new Node("Alan", null);
Node n2 = new Node("Mark", n1);
Node n3 = new Node(23, null);
```

```
SLL list = new SLL();
list.setHead(n2);
list.addAt(0, "Tom");
list.addAt(1, 23);
```

↳ inconsistent with the committed String type.

```
Node n4 = list.getNodeAt(1);
String e = n4.getElement();
```

not compatible

# Generic Classes: Node and SinglyLinkedList

AS AN IMPLEMENTER, WE LEAVE THE CHOICE OF ELEMENT TYPE TO WHOEVER USES THESE CLASSES FOR DECLARATIONS.

```

public class Node<E> {
    private E element;
    private Node<E> next;
    public Node(E e, Node<E> n) { element = e; next = n; }
    public E getElement() { return element; }
    public void setElement(E e) { element = e; }
    public Node<E> getNext() { return next; }
    public void setNext(Node<E> n) { next = n; }
}
    
```

```

public class SinglyLinkedList<E> {
    private Node<E> head;
    private Node<E> tail;
    private int size;
    public void setHead(Node<E> n) { head = n; }
    public void addFirst(E e) { ... }
    Node<E> getNodeAt(int i) { ... }
    void addAt(int i, E e) { ... }
}
    
```

Node<E> list2.setHead(n1) = X  
 ↓ generic type parameter expected  
 but getting Node<String>

```

Node<String> n1 = new Node<>("Alan", null);
Node<String> n2 = new Node<>("Mark", n1);
Node<Integer> n3 = new Node<>(23, null);
Node<Integer> n4 = new Node<>(46, n3);
Node<Integer> n5 = new Node<>("Tom", null);
Node<Integer> n6 = new Node<>(46, n2);
    
```

```

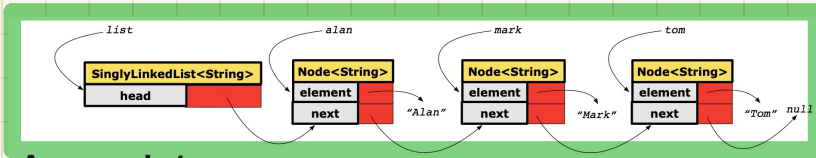
SLL<String> list1 = new SLL<>();
list1.setHead(n2);
list1.addAt(0, "Tom");
Node<String> n7 = list1.getNodeAt(1);
String e1 = n7.getElement();
    
```

```

SLL<Integer> list2 = new SLL<>();
list2.setHead(n4);
list2.addAt(0, 68);
Node<Integer> n8 = list2.getNodeAt(1);
Integer e2 = n8.getElement();
    
```

expecting Node<Integer> but getting Node<String>

# List Constructions



## Approach 1

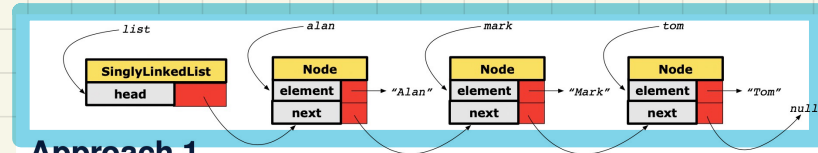
```
Node<String> tom = new Node<String>("Tom", null);  
Node<String> mark = new Node<>("Mark", tom);  
Node<String> alan = new Node<>("Alan", mark);  
SinglyLinkedList<String> list = new SinglyLinkedList<>();  
list.setHead(alan);
```

## Approach 2

```
Node<String> alan = new Node<String>("Alan", null);  
Node<String> mark = new Node<>("Mark", null);  
Node<String> tom = new Node<>("Tom", null);  
alan.setNext(mark);  
mark.setNext(tom);  
SinglyLinkedList<String> list = new SinglyLinkedList<>();  
list.setHead(alan);
```

## Generic List

```
Node<String> alan = new Node<String>(---);  
new Node<>(---);
```



## Approach 1

```
Node tom = new Node("Tom", null);  
Node mark = new Node("Mark", tom);  
Node alan = new Node("Alan", mark);  
SinglyLinkedList list = new SinglyLinkedList();  
list.setHead(alan);
```

## Approach 2

```
Node alan = new Node("Alan", null);  
Node mark = new Node("Mark", null);  
Node tom = new Node("Tom", null);  
alan.setNext(mark);  
mark.setNext(tom);  
SinglyLinkedList list = new SinglyLinkedList();  
list.setHead(alan);
```

## Non-Generic List



## List Methods

class SLL <E> {  
SP

SLL <String>  
SLL <Person>  
Generic List

```
void addFirst (E e) {  
    head = new Node<E>(e, head);  
    if (size == 0) { tail = head; }  
    size ++;  
}
```

```
Node<E> getNodeAt (int i) {  
    if (i < 0 || i >= size) {  
        throw new IllegalArgumentExceptionExcept  
    } else {  
        int index = 0;  
        Node<E> current = head;  
        while (index < i) {  
            index ++;  
            current = current.getNext();  
        }  
        return current;  
    }  
}
```

## Non-Generic List

```
void addFirst (String e) {  
    head = new Node(e, head);  
    if (size == 0) {  
        tail = head;  
    }  
    size ++;  
}
```

```
Node getNodeAt (int i) {  
    if (i < 0 || i >= size) { /* error  
    } else {  
        int index = 0;  
        Node current = head;  
        while (index < i) { /* exit when  
            index ++;  
            current = current.getNext();  
        }  
        return current;  
    }  
}
```

## Lecture 2

### Part H

#### ***Doubly-Linked Lists - Intuitive Introduction***

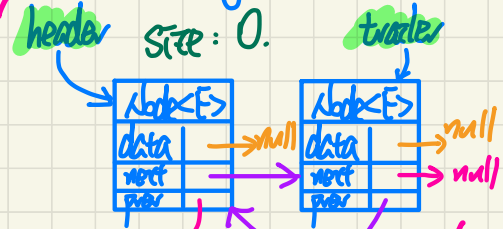
# Doubly-Linked Lists (DLL): Visual Introduction

- A chain of bi-directionally connected nodes
- Each node contains:
  - + reference to a data object
  - + reference to the next node
  - + reference to the previous node
- A DLL is also a SLL: *not vice versa* 1. prev. ref. 2. header vs. trailer
  - + many methods implemented the same way
  - + some method implemented more efficiently
- Accessing a node in a list: *removeLast*
  - + Relative positioning:  $O(n)$  *2nd last node*
  - + Absolute indexing:  $O(1)$  *trailer.prev.prev*
- The chain may grow or shrink dynamically.  $O(1)$
- Dedicated Header vs. Trailer Nodes  
(no head reference and no tail reference)

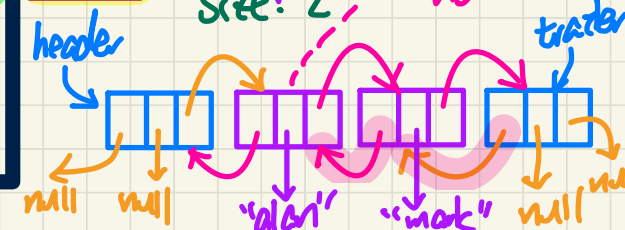
*next ref. is available*



Case 1: Empty DLL



Case 2: Non-Empty List



## Lecture 2

### Part I

***Doubly-Linked Lists -  
Java Implementation: Generic Lists  
Initializing a List***

# Generic DLL in Java: DoublyLinkedList vs. Node

```

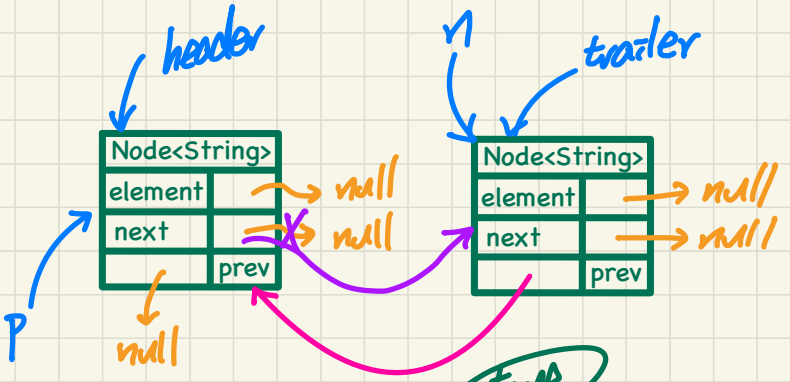
public class DoublyLinkedList<E> {
    private int size = 0;
    public void addFirst(E e) { ... }
    public void removeLast() { ... }
    public void addAt(int i, E e) { ... }
    private Node<E> header;
    private Node<E> trailer;
    public DoublyLinkedList() {
        header = new Node<>(null, null, null);
        trailer = new Node<>(null, header, null);
        header.setNext(trailer);
    }
}
    
```

```

@Test
public void test_String_DLL_Empty_List() {
    DoublyLinkedList<String> list = new DoublyLinkedList<>();
    assertTrue(list.getSize() == 0);
    assertTrue(list.getFirst() == null);
    assertTrue(list.getLast() == null);
}
    
```

```

public class Node<E> {
    private E element;
    private Node<E> next;
    public E getElement() { return element; }
    public void setElement(E e) { element = e; }
    public Node<E> getNext() { return next; }
    public void setNext(Node<E> n) { next = n; }
    private Node<E> prev;
    public Node<E> getPrev() { return prev; }
    public void setPrev(Node<E> p) { prev = p; }
    public Node(E e, Node<E> p, Node<E> n) {
        element = e;
        prev = p;
        next = n;
    }
}
    
```



$header.getNext() == trailer$   
 $trailer.getPrev() == header$

|              |      |
|--------------|------|
| Node<String> |      |
| element      |      |
| next         |      |
|              | prev |

## Lecture 2

### Part J

***Doubly-Linked Lists -  
Java Implementation: Generic Lists  
Operations on a List***

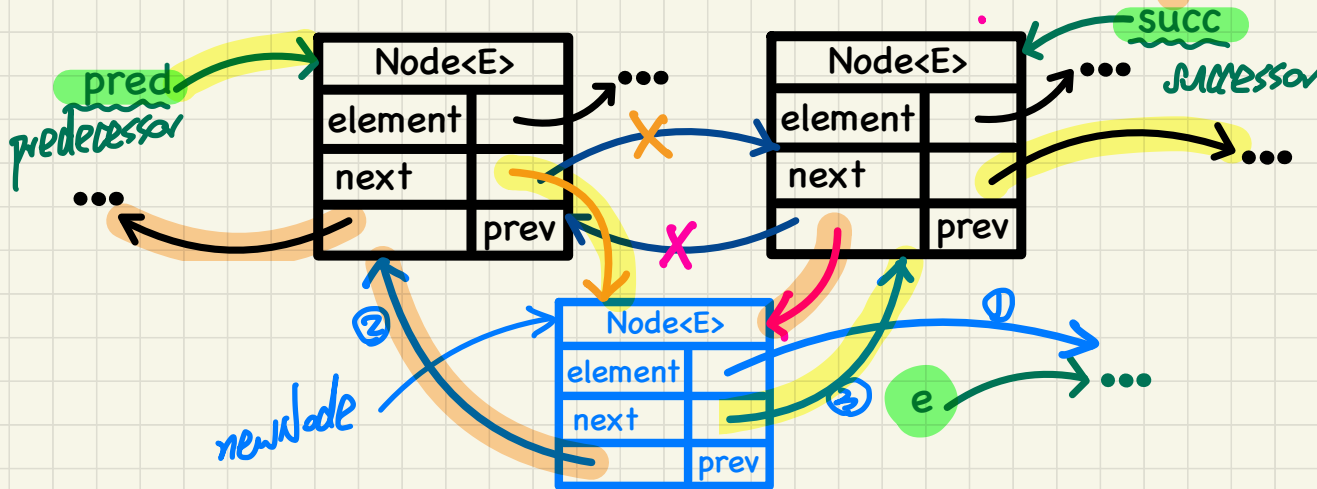
# Generic DLL in Java: Inserting between Nodes

| Node<E> |      |
|---------|------|
| element |      |
| next    |      |
|         | prev |

```
1 void addBetween(E e, Node<E> pred, Node<E> succ) {  
2   ✓ Node<E> newNode = new Node<>(e, pred, succ);  
3   ✓ pred.setNext(newNode);  
4   ✓ succ.setPrev(newNode);  
5   size++;  
6 }
```

RT: O(1)

**Assumption:** pred and succ are directly connected.



# Generic DLL in Java: Inserting to the Front/End

|              |      |
|--------------|------|
| Node<String> |      |
| element      |      |
| next         |      |
|              | prev |

```
@Test
public void test_String_DLL_Insert_Front_End() {
    DoublyLinkedList<String> list = new DoublyLinkedList<>();
    list.addFirst("Mark");
    list.addFirst("Alan");

    assertTrue(list.getSize() == 2);
    assertEquals("Alan", list.getFirst().getElement());
    assertEquals("Mark", list.getFirst().getNext().getElement());
}
```

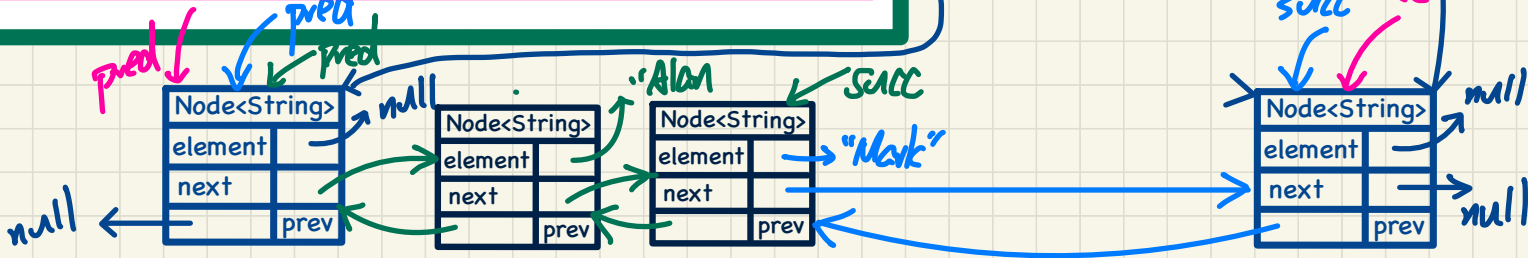
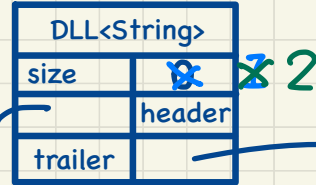
```
void addFirst(E e) {
    addBetween(e, prev header, SUCCESS header.getNext());
}
```

```
void addLast(E e) {
    addBetween(e, prev trailer.getPrev(), SUCCESS trailer);
}
```

```
list = new DoublyLinkedList<>();
list.addLast("Mark");
list.addLast("Alan");

assertTrue(list.getSize() == 2);
assertEquals("Alan", list.getLast().getElement());
assertEquals("Mark", list.getLast().getPrev().getElement());
}
```

*EXERCISE: Tracing*





# Generic DLL in Java: Inserting to the Middle

|              |      |
|--------------|------|
| Node<String> |      |
| element      |      |
| next         |      |
|              | prev |

```
@Test
public void test_String_DLL_addAt() {
    DoublyLinkedList<String> list = new DoublyLinkedList<>();
    list.addAt(0, "Alan");
    list.addAt(1, "Tom");
    list.addAt(1, "Mark");

    assertTrue(list.getSize() == 3);
    assertEquals("Alan", list.getFirst().getElement());
    assertEquals("Mark", list.getFirst().getNext().getElement());
    assertEquals("Tom", list.getFirst().getNext().getNext().getElement());
}
```

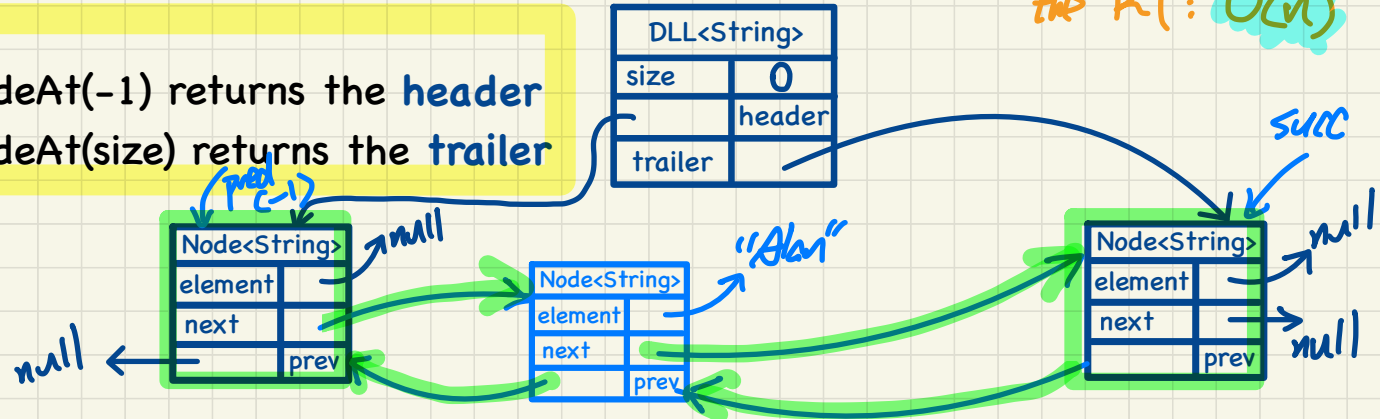
*Exercise: Tracing.*

```
addAt(int i, E e) {
    if (i < 0 || i > size) {
        throw new IllegalArgumentException();
    } else {
        Node<E> pred = getNodeAt(i - 1);
        Node<E> succ = pred.getNext();
        addBetween(e, pred, succ);
    }
}
```

*still dominates the RT:  $O(n)$*

## Notes.

- + getNodeAt(-1) returns the header
- + getNodeAt(size) returns the trailer



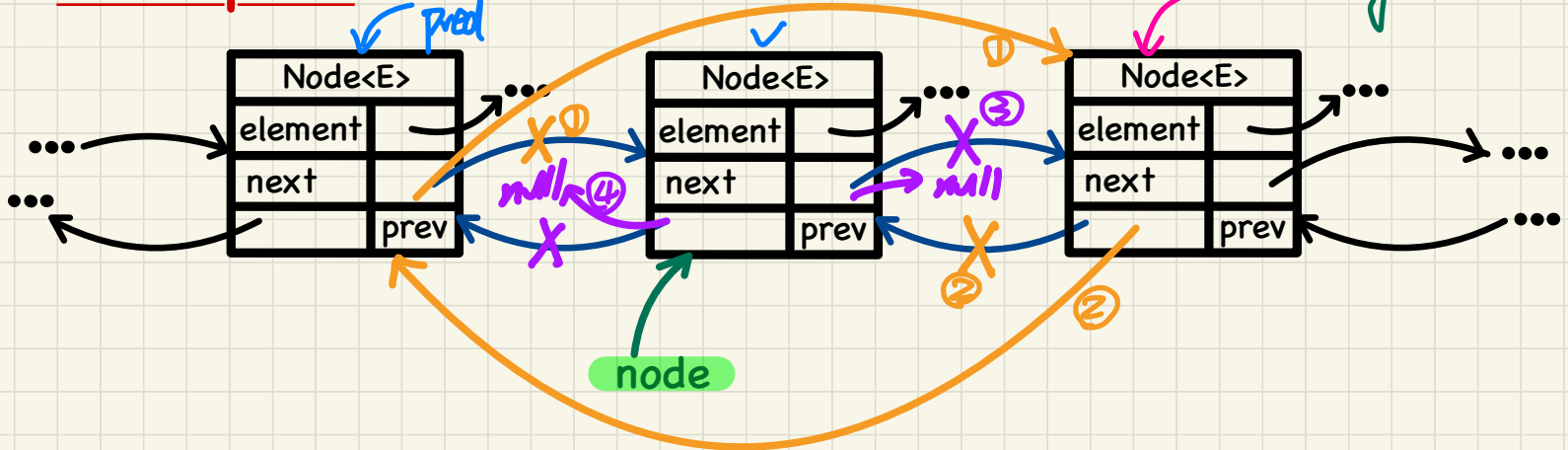
# Generic DLL in Java: Removing a Node

```
1 void remove (Node<E> node) {  
2   → Node<E> pred = node.getPrev();  
3   → Node<E> succ = node.getNext();  
4   ① pred.setNext(succ);  
5   ② succ.setPrev(pred);  
6   ③ node.setNext(null);  
7   ④ node.setPrev(null);  
8   size --;  
9 }
```

RT:  $O(1)$

efficient solely because  
the ref. of the node to  
remove is given.

Assumption: node exists in some DLL.



# Generic DLL in Java: Removing from the Front/End

```

@Test
public void test_String_DLL_Remove_Front_End() {
    DoublyLinkedList<String> list = new DoublyLinkedList<>();
    list.addFirst("Mark");
    list.addFirst("Alan");
    list.removeFirst();
    list.removeFirst();
    assertTrue(list.getSize() == 0);

    list = new DoublyLinkedList<>();
    list.addFirst("Mark");
    list.addFirst("Alan");
    list.removeLast();
    list.removeLast();
    assertTrue(list.getSize() == 0);
}
    
```

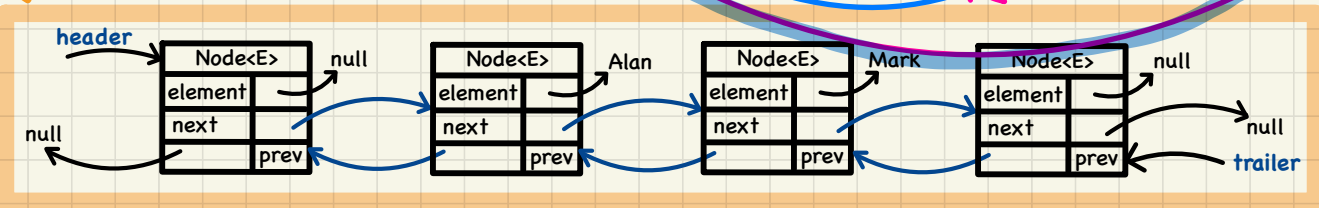
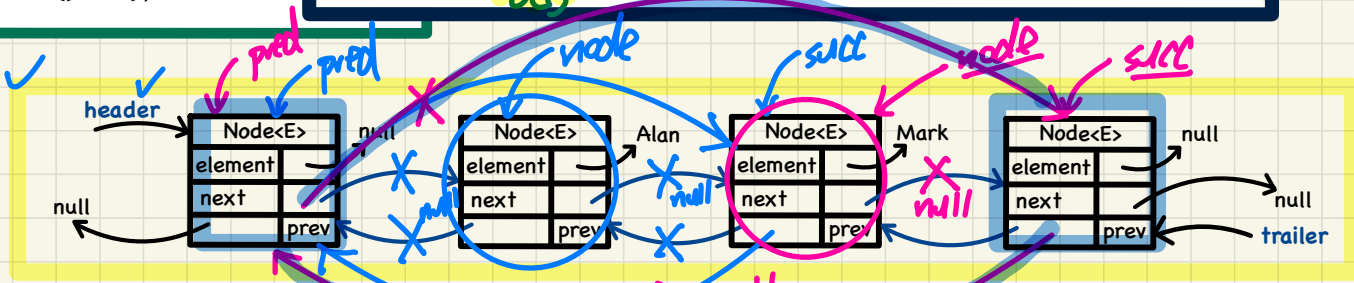
```

void removeFirst() {
    if (size == 0) { throw new IllegalArgumentException("Empty"); }
    else { remove(header.getNext()); }
}
    
```

```

void removeLast() {
    if (size == 0) { throw new IllegalArgumentException("Empty"); }
    else { remove(trailer.getPrev()); }
}
    
```

EXERCISE:  
Tracing



# Generic DLL in Java: Removing from the Middle

```

@Test
public void test_String_DLL_removeAt() {
    DoublyLinkedList<String> list = new DoublyLinkedList<>();
    list.addFirst("Mark");
    list.addFirst("Alan");
    list.addFirst("Tom");
    assertTrue(list.getSize() == 3);
    list.removeAt(1);
    assertTrue(list.getSize() == 2);
    list.removeAt(0);
    assertTrue(list.getSize() == 1);
    list.removeAt(0);
    assertTrue(list.getSize() == 0);
}
    
```

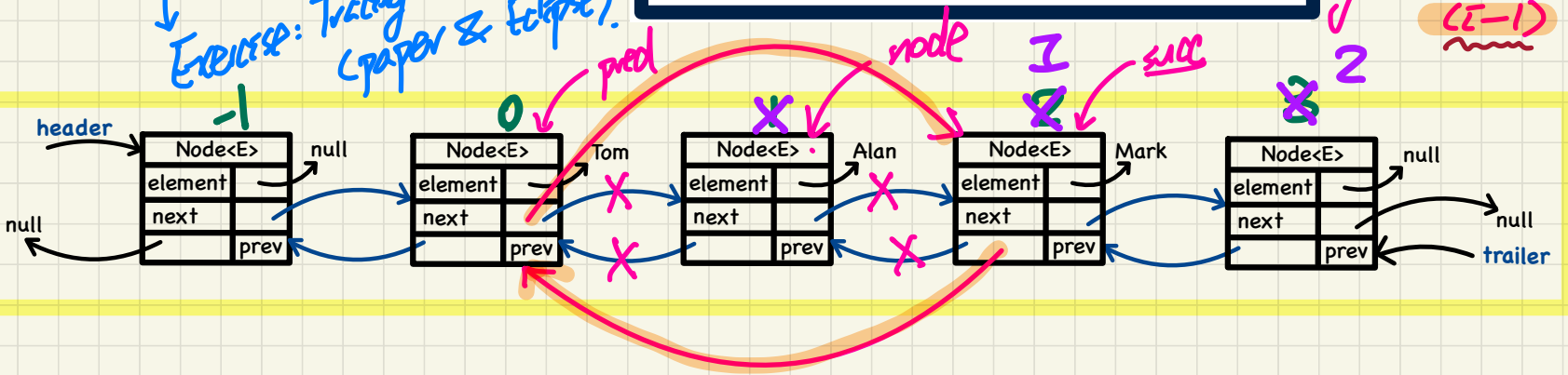
```

removeAt (int i) {
    if (i < 0 || i >= size) {
        throw new IllegalArgumentException
    } else {
        Node<E> node = getNodeAt(i);
        remove (node);
    }
}
    
```

dominates RT:  $O(n)$

Contrast  
SLL removeAt:  $getNodeAt(i-1)$

Exercise: Tracing (paper & Eclipse)



## Lecture 2

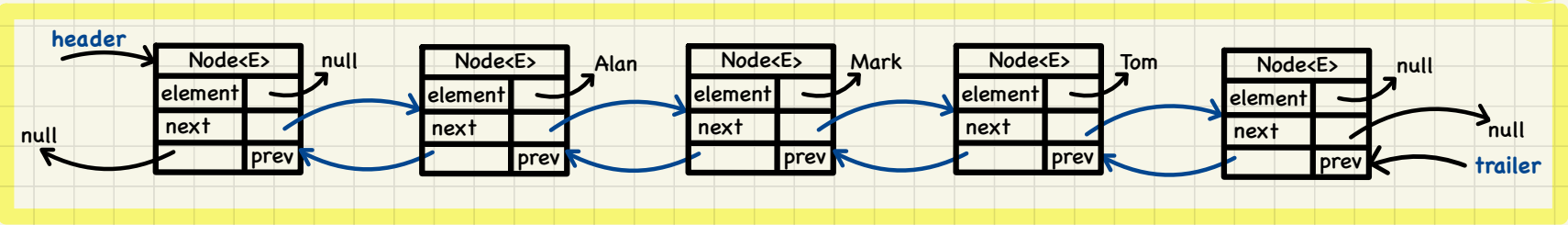
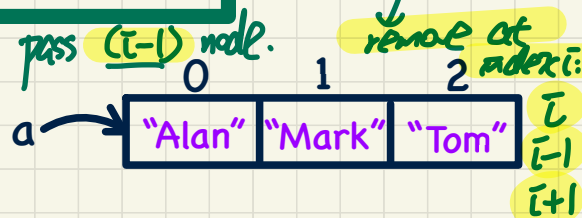
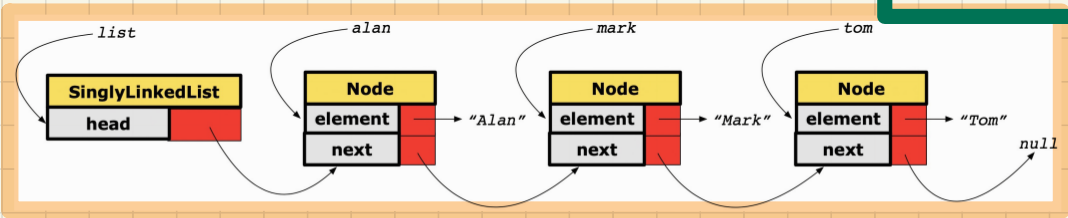
### Part K

#### ***Doubly-Linked Lists - Comparing Arrays, SLL, and DLL***

# Running Time: Arrays vs. SLL vs. DLL

see discussion end of SLL.

| DATA STRUCTURE                             | ARRAY  | SINGLY-LINKED LIST  | DOUBLY-LINKED LIST |
|--|--------|---|--------------------|
| OPERATION                                  |        |   |                    |
| size                                       |        | $O(1)$  |                    |
| first/last element                         |        | $O(1)$  |                    |
| element at index $i$                       | $O(1)$ | $O(n)$  | $O(n)$             |
| remove last element                        |        | $O(1)$  | $O(1)$             |
| add/remove first element, add last element |        | $O(n)$  | $O(1)$             |
| add/remove $i^{\text{th}}$ element         |        | given reference to $(i-1)^{\text{th}}$ element: $O(1)$<br>not given: $O(n)$ |                    |



## Lecture 3

### Part A

# ***Modularity, Abstract Data Types (ADTs) - Definition & Terminology***

# Supplier vs. Client in OOP

```
class Microwave {
    private boolean on;
    private boolean locked;
    void power() {on = true;}
    void lock() {locked = true;}
    void heat(Object stuff) {
        /* Assume: on && locked */
        /* stuff not explosive. */
    }
}
```

```
class MicrowaveUser {
    public static void main(...) {
        Microwave m = new Microwave();
        Object obj = ???;
        m.power(); m.lock();
        m.heat(obj);
    }
}
```

supplier class (callee)  
client class (caller)

cheat  
fulfilling obligation

Contractual relation in effect

given client's fulfilling their obligations, supplier must fulfill their obligations.  
supplier method/service used in the context of the client class.

pre-state (pre-execution of supplier method)

m.heat(obj);

supplier's obligation must be fulfilled.

post-state (post-execution of supplier method)

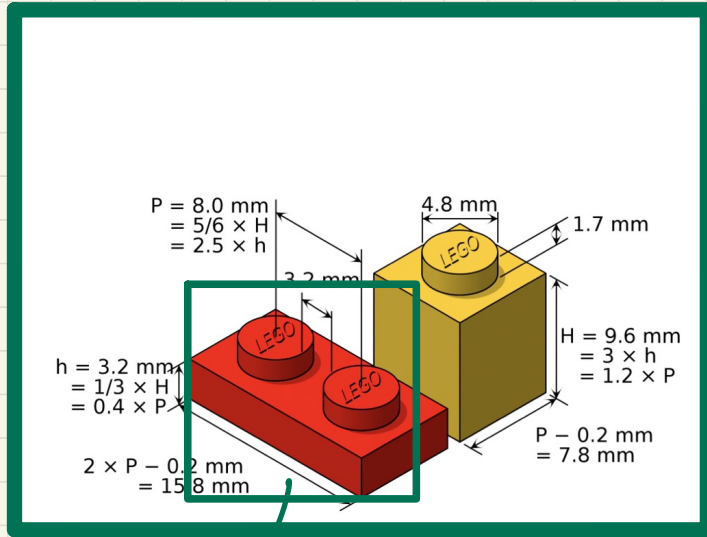
postcondition (Conditions for supplier to satisfy) + the supplier's method.

client's obligation must be fulfilled

precondition (Conditions for client to satisfy in order to use in Java: exceptions.)



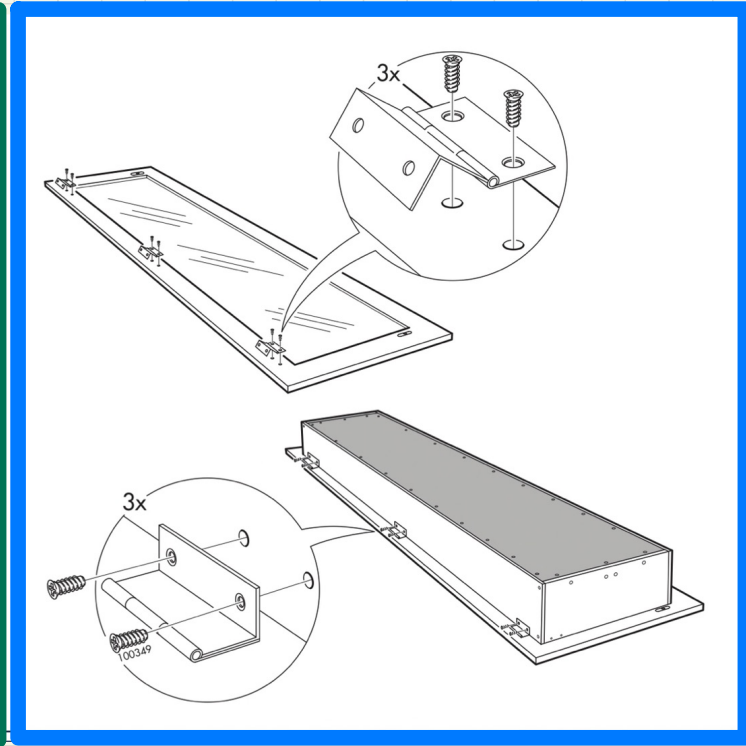
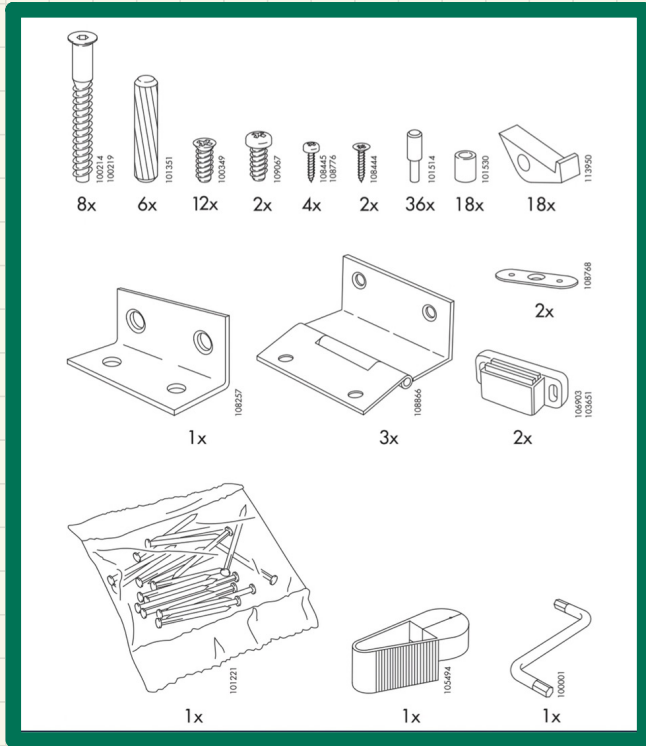
# Modularity: Childhood Activities



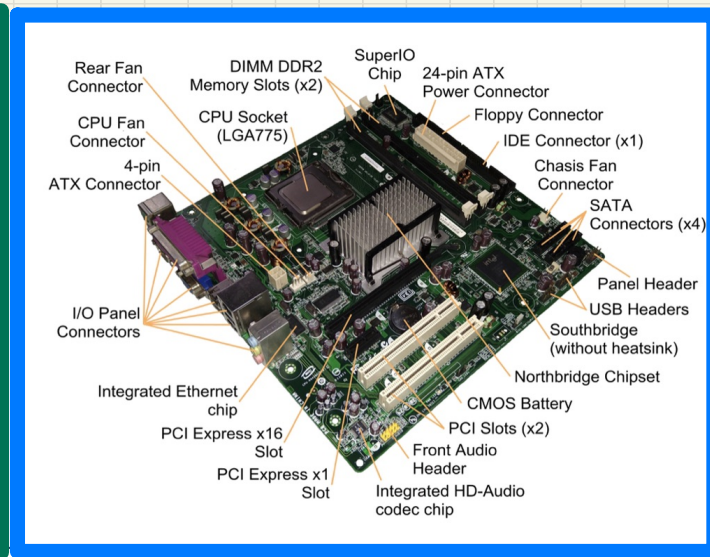
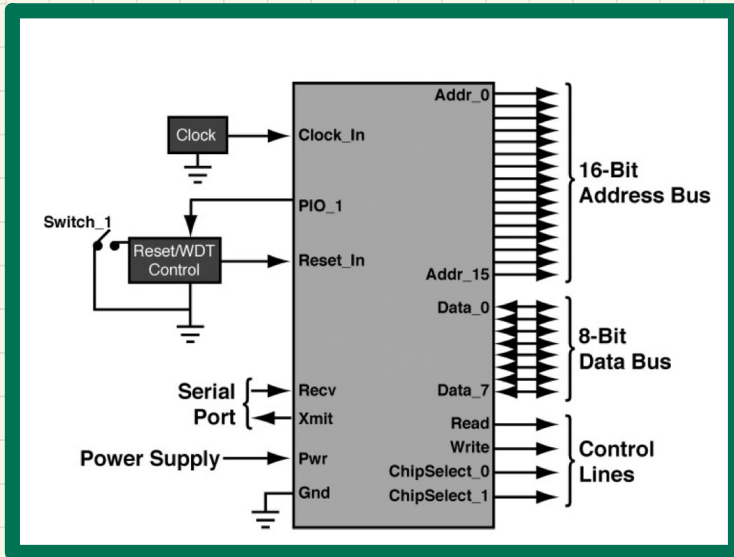
Interface  
specification  
(of a module)

Architecture  
(assembly)  
↳ of building blocks

# Modularity: Daily Constructions



# Modularity: Computer Architectures



# Modularity: System Developments

→ a bigger module

(\* DECLARATION \*)

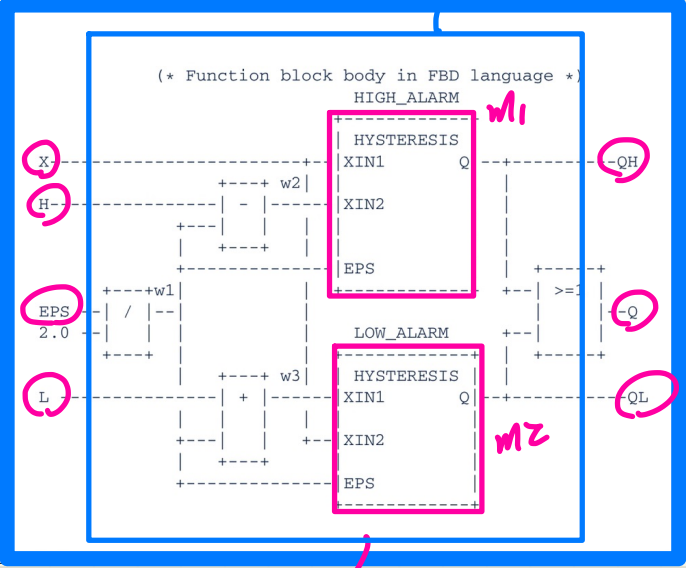
```

+-----+
| LIMITS_ |
| ALARM   |
+-----+
REAL--| H   QH |--BOOL
REAL--| X   Q  |--BOOL
REAL--| L   QL |--BOOL
REAL--| EPS |
+-----+
    
```

*spec. of module*

```

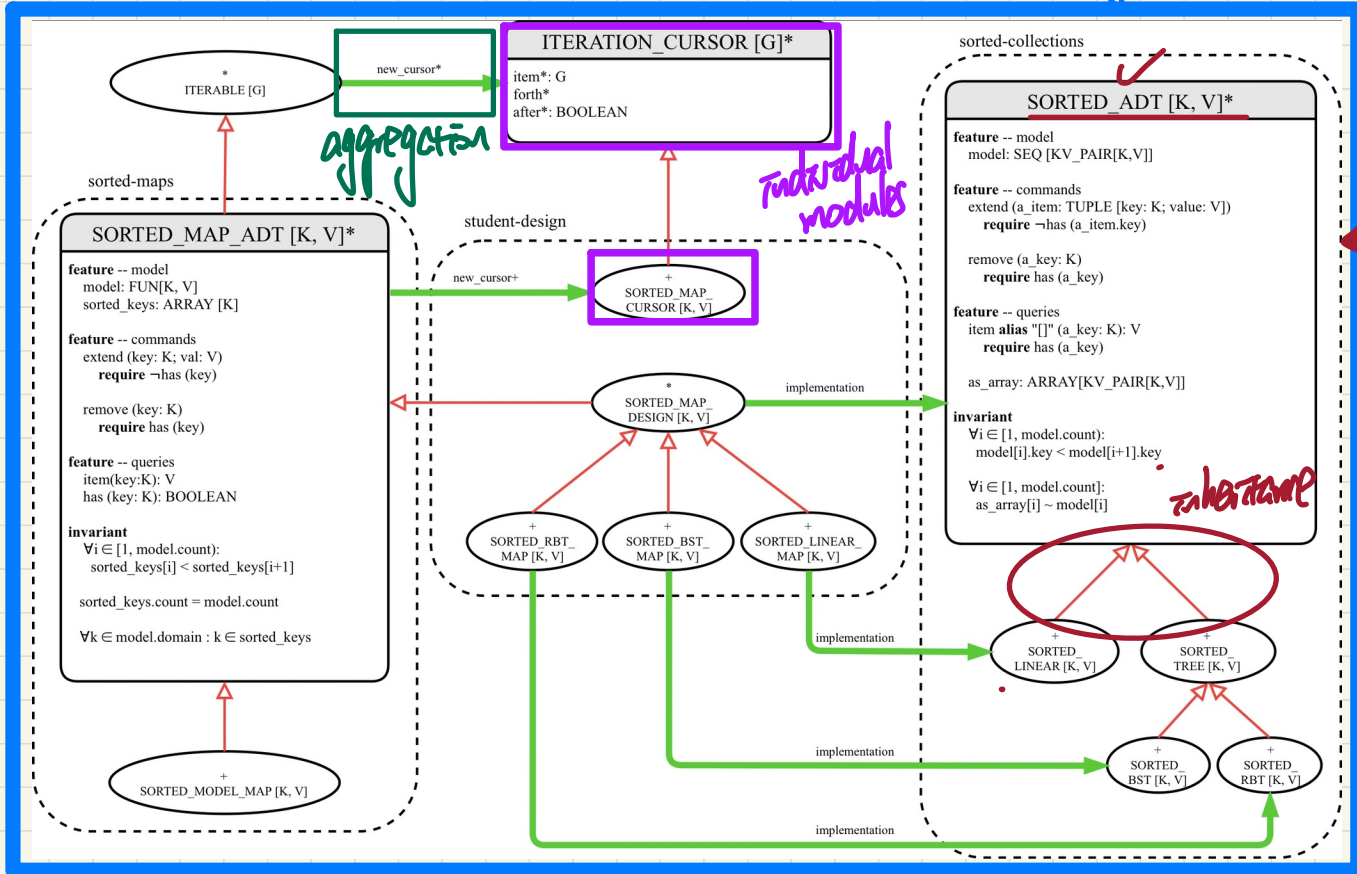
FUNCTION_BLOCK LIMITS_ALARM
VAR_INPUT
  H : REAL; (* High limit *)
  X : REAL; (* Variable value *)
  L : REAL; (* Lower limit *)
  EPS : REAL; (* Hysteresis *)
END_VAR
VAR_OUTPUT
  QH : BOOL; (* High flag *)
  Q  : BOOL; (* Alarm output *)
  QL : BOOL; (* Low flag *)
END_VAR
END_FUNCTION_BLOCK
    
```



assembly as a composition of well-specified modules

# Modularity: Software Design

In oop, assemble classes via:  
 1. aggregations  
 2. compositions  
 3. inheritance

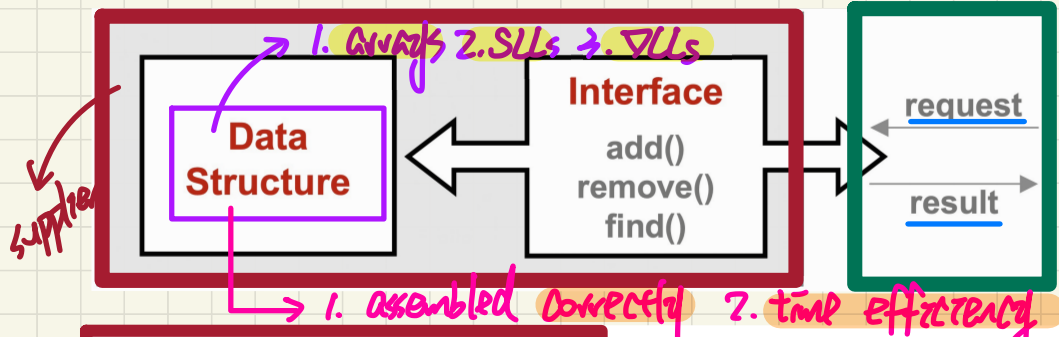


3. inheritance

New Module

Architectural diagram.

# Abstract Data Types (ADTs)



client creates on the public interface of ADT

1. input types  
2. output types  
3. what to be expected on IO related.

```
class Microwave {
    private boolean on;
    private boolean locked;
    void power() {on = true;}
    void lock() {locked = true;}
    void heat(Object stuff) {
        /* Assume: on && locked */
        /* stuff not explosive. */
    }
}
```

```
class MicrowaveUser {
    public static void main(...) {
        Microwave m = new Microwave();
        Object obj = ???;
        m.power(); m.lock();
        m.heat(obj);
    }
}
```

|          | benefits                     | obligations         |
|----------|------------------------------|---------------------|
| CLIENT   | obtain a service             | follow instructions |
| SUPPLIER | assume instructions followed | provide a service   |

# Java API $\approx$ Abstract Data Types

NT is Subject to Ambiguities & Contradictions

## Interface List<E>

### Type Parameters:

E - the type of elements in this list

### All Superinterfaces:

Collection<E>, Iterable<E>

### All Known Implementing Classes:

AbstractList, AbstractSequentialList, ArrayList, AttributeList, CopyOnWriteArrayList, LinkedList, RoleList, RoleUnresolvedList, Stack, Vector

```
public interface List<E>
    extends Collection<E>
```

An ordered collection (also known as a *sequence*). The user of this interface has precise control over where in the list each element is inserted. The user can access elements by their integer index (position in the list), and search for elements in the list.

```
E set(int index, E element)
    Replaces the element at the specified position in this list with the specified element (optional operation).
```

### set

```
E set(int index,
      E element)
```

Replaces the element at the specified position in this list with the specified element (optional operation).

### Parameters:

index - index of the element to replace  
element - element to be stored at the specified position

### Returns:

the element previously at the specified position

### Throws:

UnsupportedOperationException - if the set operation is not supported by this list  
ClassCastException - if the class of the specified element prevents it from being added to this list  
NullPointerException - if the specified element is null and this list does not permit null elements  
IllegalArgumentException - if some property of the specified element prevents it from being added to this list  
IndexOutOfBoundsException - if the index is out of range ( $\text{index} < 0 \ || \ \text{index} \geq \text{size}()$ )

# Lecture 3

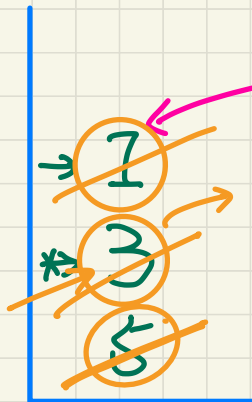
## Part B

***Stack ADT -  
Last In First Out (LIFO)  
Implementations in Java***



# Stack ADT: Illustration

|                              | isEmpty | size | top      |
|------------------------------|---------|------|----------|
| <u>new stack</u>             | T       | 0    | n.g.     |
| <u>push(5)</u>               | F       | 1    | <u>5</u> |
| <u>push(3)</u>               | F       | 2    | <u>3</u> |
| <u>push(1)</u>               | F       | 3    | <u>1</u> |
| <u>pop</u> <sup>ret.</sup> 1 | F       | 2    | <u>3</u> |
| <u>pop</u> <sup>ret.</sup> 3 | F       | 1    | <u>5</u> |
| <u>pop</u> <sup>ret.</sup> 5 | T       | 0    | n.g.     |



last pushed element

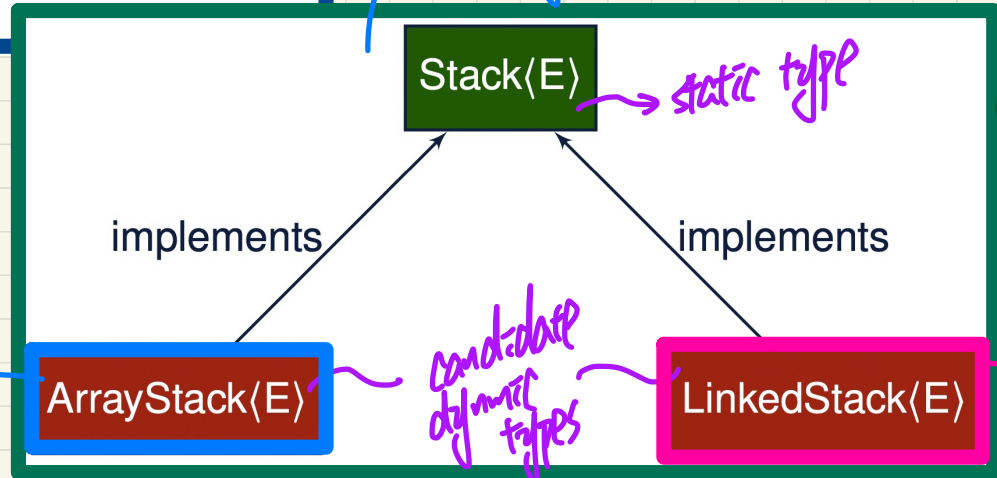
2nd last pushed element

The order in which items are popped off the stack is the reverse of how these items were pushed. (LIFO)

# Implementing the Stack ADT in Java: Architecture

```
public interface Stack<E> {  
    public int size();  
    public boolean isEmpty();  
    public E top();  
    public void push(E e);  
    public E pop();  
}
```

1. Polymorphism  
2. dynamic binding



① all operations O(1)  
② inflexible by a pre-set SIZE

# Implementing the Stack ADT using an Array

```
public class ArrayStack<E> implements Stack<E> {
    private final int MAX_CAPACITY = 1000;
    private E[] data;
    private int t; /* index of top */
    public ArrayStack() {
        data = (E[]) new Object[MAX_CAPACITY];
        t = -1;
    }

    public int size() { return (t + 1); }
    public boolean isEmpty() { return (t == -1); }

    public E top() {
        if (isEmpty()) { /* Precondition Violated */ }
        else { return data[t]; }
    }
    public void push(E e) {
        if (size() == MAX_CAPACITY) { /* Precondition Violated */ }
        else { t++; data[t] = e; }
    }
    public E pop() {
        E result;
        if (isEmpty()) { /* Precondition Violated */ }
        else { result = data[t]; data[t] = null; t--; }
        return result;
    }
}
```

O(1)  
O(1)  
O(1)  
O(1)  
O(1)

→ limitation: fixed size

ArrayStack<String>

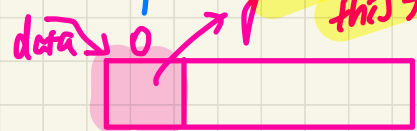
↳ instantiates E for Stack:

Stack<String>

(E[]) Object[\_\_\_\_\_]

↳ what you have to write in Java.

→ element of stack  
temp.



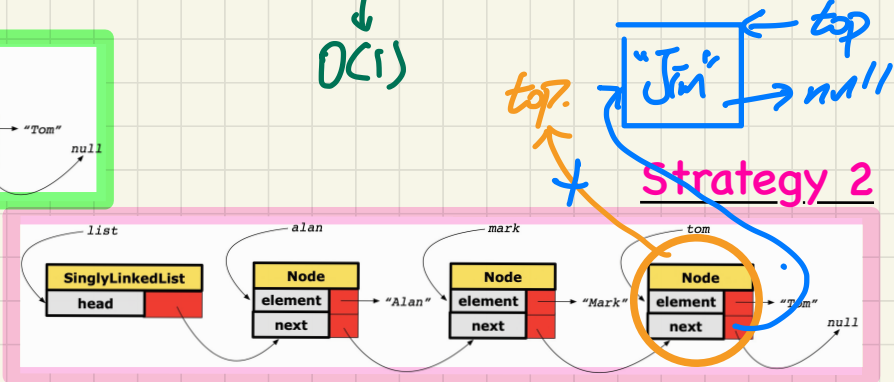
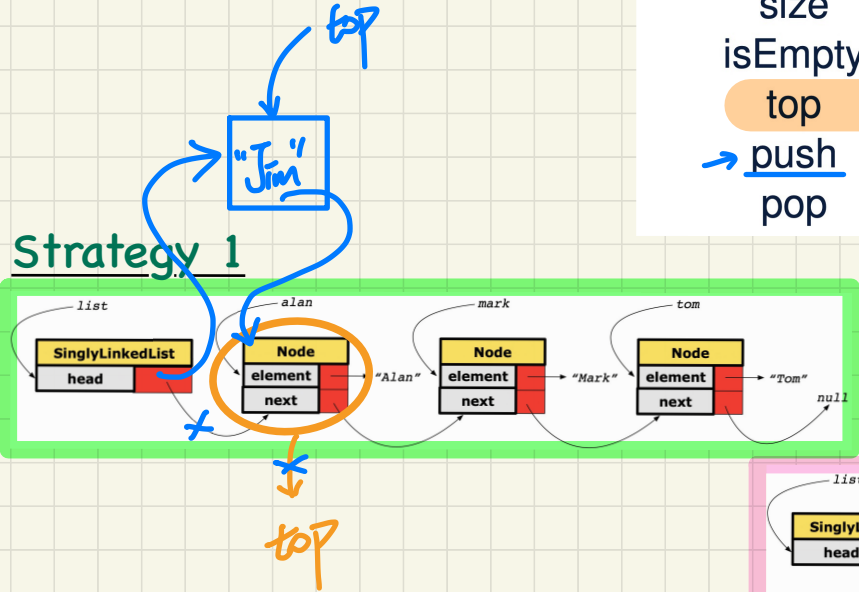
goal: treat this first item as the top.

# Implementing the Stack ADT using a SLL

Improved to  $O(1)$  if a DLL is used.  
 $O(1)$

```
public class LinkedStack<E> implements Stack<E> {
    private SinglyLinkedList<E> list;
    ...
}
```

| Stack Method | Singly-Linked List Method |                 |
|--------------|---------------------------|-----------------|
|              | Strategy 1                | Strategy 2      |
| size         | list.size                 |                 |
| isEmpty      | list.isEmpty              |                 |
| top          | list.first ✓              | list.last       |
| → push       | list.addFirst             | list.addLast    |
| pop          | list.removeFirst          | list.removeLast |

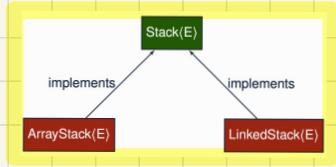


$O(1)$

# Stack ADT: Testing Alternative Implementations

Stack<S> s = new Stack<>();

\*L → interface can't be a DT.



```

public class ArrayStack<E> implements Stack<E> {
    private final int MAX_CAPACITY = 1000;
    private E[] data;
    private t; /* index of top */
    public ArrayStack() {
        data = (E[]) new Object [MAX_CAPACITY];
        t = -1;
    }

    public int size() { return t + 1; }
    public boolean isEmpty() { return t == -1; }

    public E top() {
        if (isEmpty()) { /* Precondition Violated */ }
        else { return data[t]; }
    }

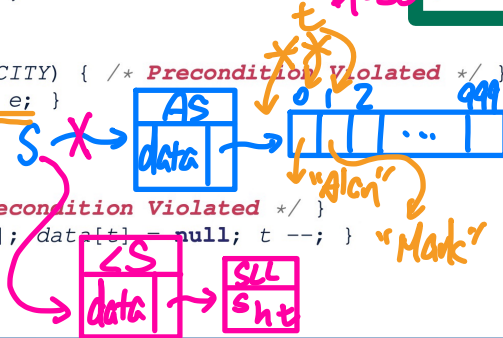
    public void push(E e) {
        if (size() == MAX_CAPACITY) { /* Precondition Violated */ }
        else { t++; data[t] = e; }
    }

    public E pop() {
        E result;
        if (isEmpty()) { /* Precondition Violated */ }
        else { result = data[t]; data[t] = null; t--; }
        return result;
    }
}
  
```

static type

DT: AS

DT: LS



```

@Test
public void testPolymorphicStacks() {
    Stack<String> s = new ArrayStack<>();
    s.push("Alan"); /* dynamic binding */
    s.push("Mark"); /* dynamic binding */
    s.push("Tom"); /* dynamic binding */
    assertTrue(s.size() == 3 && !s.isEmpty());
    assertEquals("Tom", s.top());

    s = new LinkedStack<>();
    s.push("Alan"); /* dynamic binding */
    s.push("Mark"); /* dynamic binding */
    s.push("Tom"); /* dynamic binding */
    assertTrue(s.size() == 3 && !s.isEmpty());
    assertEquals("Tom", s.top());
}
  
```

dynamic type

is the DT of S a descendant? \*

|                |             | * | ** |
|----------------|-------------|---|----|
| S instantiated | Stack       | T | T  |
| S instantiated | ArrayStack  | T | F  |
| S instantiated | LinkedStack | F | T  |

## Lecture 3

### Part C

#### ***Stack ADT - Algorithms using the Stack ADT***

# Algorithm using Stack: Reversing an Array

```

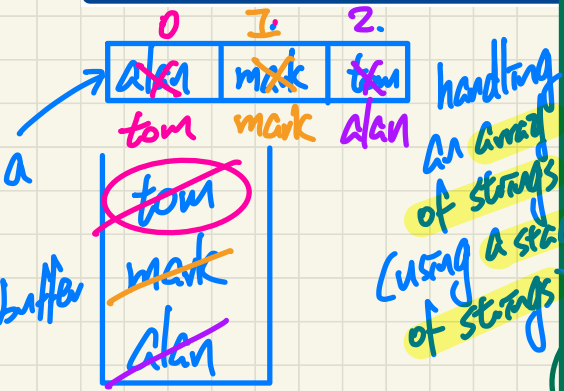
public static <E> void reverse(E[] a) {
    Stack<E> buffer = new ArrayStack<E>();
    for (int i = 0; i < a.length; i++) {
        buffer.push(a[i]);
    }
    for (int i = 0; i < a.length; i++) {
        a[i] = buffer.pop();
    }
}
    
```

generic parameter at the method level

reverse ({"alan", "mark"})

String[]

reverse ({ 23, 46 })



```

@Test
public void testReverseViaStack() {
    String[] names = {"Alan", "Mark", "Tom"};
    String[] expectedReverseOfNames = {"Tom", "Mark", "Alan"};
    StackUtilities.reverse(names);
    assertEquals(expectedReverseOfNames, names);

    Integer[] numbers = {46, 23, 68};
    Integer[] expectedReverseOfNumbers = {68, 23, 46};
    StackUtilities.reverse(numbers);
    assertEquals(expectedReverseOfNumbers, numbers);
}
    
```

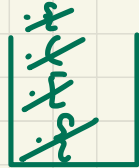
handling an array of ints (using a stack of ints)

# Algorithm using Stack: Matching Delimiters

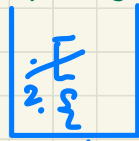
```

public static boolean isMatched(String expression) {
    final String opening = "([{";
    final String closing = ")]";
    Stack<Character> openings = new LinkedStack<Character>();
    int i = 0;
    boolean foundError = false;
    while (!foundError && i < expression.length()) {
        char c = expression.charAt(i);
        if (opening.indexOf(c) != -1) { openings.push(c); }
        else if (closing.indexOf(c) != -1) {
            if (openings.isEmpty()) { foundError = true; }
            else {
                if (opening.indexOf(openings.top()) == closing.indexOf(c)) {
                    openings.pop();
                } else { foundError = true; }
            }
        }
        i++;
    }
    return !foundError && openings.isEmpty();
}
    
```

*opening: ( [ {*  
*closing: ) ] }*  
*0 1 2*  
*exit: foundError || i >= exp.length*  
*c is opening*  
*more closing than opening*  
*2 == 0*  
*c is closing*  
*closing not matching opening*  
*!false true*  
*more opening than closing*



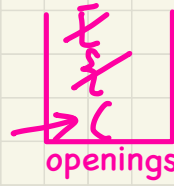
openings



openings



openings



openings

```

@Test
public void testMatchingDelimiters() {
    assertTrue(StackUtilities.isMatched(""));
    assertTrue(StackUtilities.isMatched("[ ] ( )"));
    assertFalse(StackUtilities.isMatched("[ ] ( )"));
    assertFalse(StackUtilities.isMatched("[ ] 0"));
    assertFalse(StackUtilities.isMatched("{ [ ] }"));
}
    
```

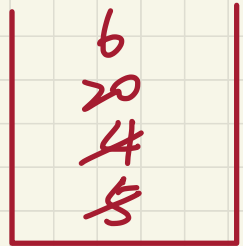


# Algorithm using Stack: Calculating Postfix Expressions

## Sketch of Algorithm

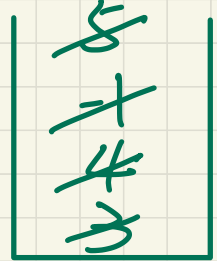
- When input is an **operand** (i.e., a number), **push** it to the stack.
- When input is an **operator**, obtain its two **operands** by **popping** off the stack **twice**, evaluate, then **push** the result back to stack.
- When finishing reading the input, there should be **only one** number left in the stack.

$$5 + 4 = 20$$



(insufficient operator)  $\ominus$

$\ominus$  -17



$$3 - 4 = -1$$

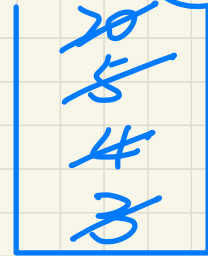
$$-1 * 5 = \ominus 5$$

Input 1:  $3 \ 4 \ 5 \ *$   $\equiv 3 - (4 * 5)$

Input 2:  $3 \ 4 \ - \ 5 \ *$   $\equiv (3 - 4) * 5$

Input 3:  $5 \ 2 \ 3 \ + \ *$   $\equiv + 5 * (2 + 3)$

Input 4:  $5 \ 4 \ + \ 6 \ !$   $\equiv 5 + 4 \ 6$



$$4 * 5 = 20$$

$$3 - 20 = \ominus 17$$



$$2 + 3 = 5$$

$$5 * 5 = 25$$

$$\text{?} + 25$$

(insufficient operands)

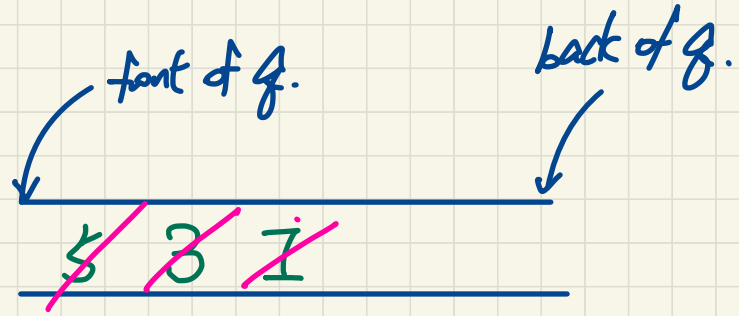
## Lecture 3

### Part D

***Queue ADT -  
First In First Out (FIFO)  
Implementations in Java***

# Queue ADT: Illustration

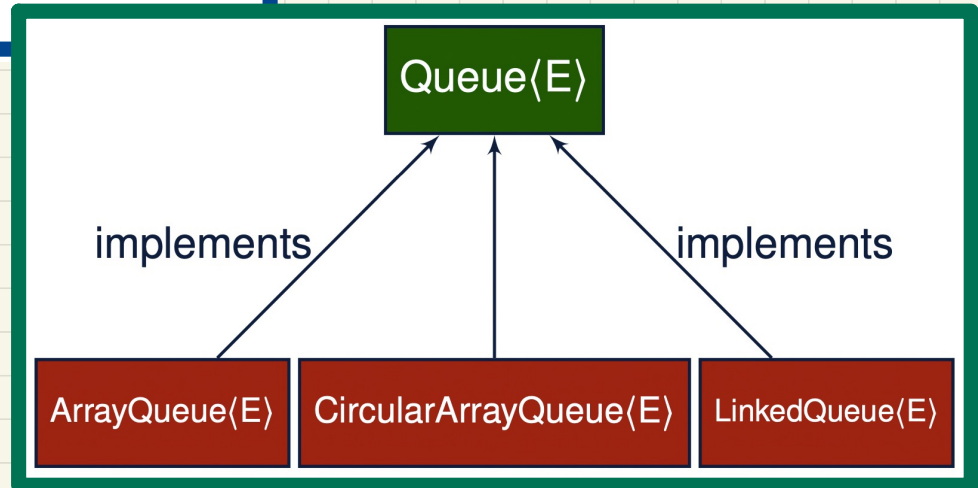
|                                     | isEmpty | size | first |
|-------------------------------------|---------|------|-------|
| <u>new queue</u>                    | T       | 0    | n.a.  |
| enqueue( <u>5</u> )                 | F       | 1    | 5     |
| enqueue( <u>3</u> )                 | F       | 2    | 5     |
| enqueue( <u>1</u> )                 | F       | 3    | 5     |
| <u>dequeue</u> <small>rm. 5</small> | F       | 2    | 3     |
| <u>dequeue</u> <small>rm. 3</small> | F       | 1    | 1     |
| <u>dequeue</u> <small>rm. 1</small> | T       | 0    | n.a.  |



→ First-In First-Out (FIFO)

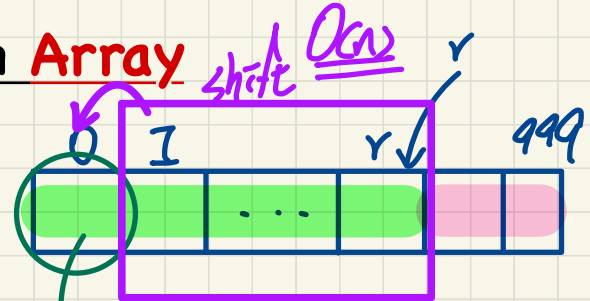
# Implementing the **Queue** ADT in Java: **Architecture**

```
public interface Queue< E > {  
    public int size();  
    public boolean isEmpty();  
    public E first();  
    public void enqueue( E e);  
    public E dequeue();  
}
```



# Implementing the Queue ADT using an Array

```
public class ArrayQueue<E> implements Queue<E> {
    private final int MAX_CAPACITY = 1000;
    private E[] data;
    private int r; /* rear index */
    public ArrayQueue() {
        - data = (E[]) new Object[MAX_CAPACITY];
        - r = -1;
    }
    • public int size() { return (r + 1); } O(1)
    • public boolean isEmpty() { return (r == -1); } O(1)
    • public E first() {
        if (isEmpty()) { /* Precondition Violated */ } O(1)
        else { return data[0]; }
    }
    public void enqueue(E e) {
        if (size() == MAX_CAPACITY) { /* Precondition Violated */ }
        else { r++; data[r] = e; } O(1)
    }
    public E dequeue() {
        • if (isEmpty()) { /* Precondition Violated */ }
        else {
            E result = data[0];
            for (int i = 0; i < r; i++) { data[i] = data[i + 1]; } O(n)
            data[r] = null; r--;
            return result;
        }
    }
}
```



front of queue

Limitation: no resizing.

to improve this, we need to be flexible about where the front index is ⇒ Circular array.

shifting "2nd item" and onwards to the left by one position

# Implementing the Queue ADT using a SLL

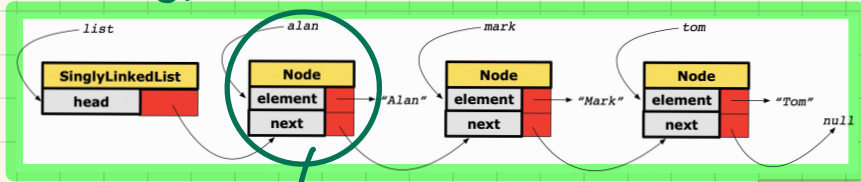
```
public class LinkedList<E> implements Queue<E> {
    private SinglyLinkedList<E> list;
    ...
}
```

$O(n)$

- ① use SL instead
- ② use DLL instead

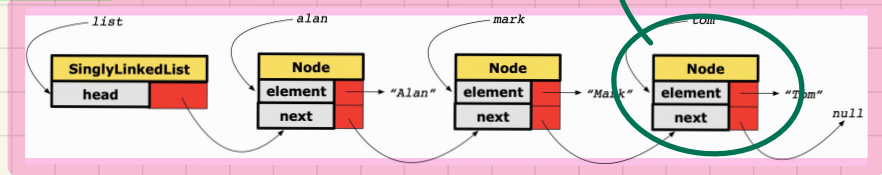
| Queue Method | Singly-Linked List Method |                 |
|--------------|---------------------------|-----------------|
|              | Strategy 1                | Strategy 2      |
| size         | list.size                 |                 |
| isEmpty      | list.isEmpty              |                 |
| first        | list.first                | list.last       |
| enqueue      | list.addLast              | list.addFirst   |
| dequeue      | list.removeFirst          | list.removeLast |

## Strategy 1

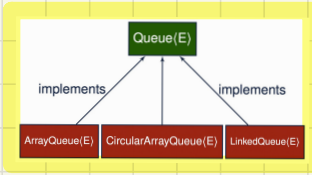


first of queue

first of queue.  
Strategy 2



# Stack ADT: Testing Alternative Implementations



```
public class ArrayQueue<E> implements Queue<E> {
    private final int MAX_CAPACITY = 1000;
    private E[] data;
    private int r = -1; /* rear index */
    public ArrayQueue() {
        data = (E[]) new Object[MAX_CAPACITY];
        r = -1;
    }
    public int size() { return r + 1; }
    public boolean isEmpty() { return r == -1; }
    public E first() {
        if (isEmpty()) { /* Precondition Violated */ }
        else { return data[0]; }
    }
    public void enqueue(E e) {
        if (size() == MAX_CAPACITY) { /* Precondition Violated */ }
        else { r++; data[r] = e; }
    }
    public E dequeue() {
        if (isEmpty()) { /* Precondition Violated */ }
        else {
            E result = data[0];
            for (int i = 0; i < r; i++) { data[i] = data[i + 1]; }
            data[r] = null; r--;
            return result;
        }
    }
}
```

different  
binding.

```
@Test
public void testPolymorphicQueues() {
    Queue<String> q = new ArrayQueue<>();
    q.enqueue("Alan"); /* dynamic binding */
    q.enqueue("Mark"); /* dynamic binding */
    q.enqueue("Tom"); /* dynamic binding */
    assertTrue(q.size() == 3 && !q.isEmpty());
    assertEquals("Alan", q.first());

    q = new LinkedQueue<>();
    q.enqueue("Alan"); /* dynamic binding */
    q.enqueue("Mark"); /* dynamic binding */
    q.enqueue("Tom"); /* dynamic binding */
    assertTrue(q.size() == 3 && !q.isEmpty());
    assertEquals("Alan", q.first());
}
```

Polymorphism

# Lecture 3

## Part D

***Queue ADT -  
First In First Out (FIFO)  
Implementations in Java  
(continued)***



SIZE of QUEUE vs. SIZE of array % modulo

# Implementing the Queue ADT using a Circular Array

Assume: A circular array of length 4.

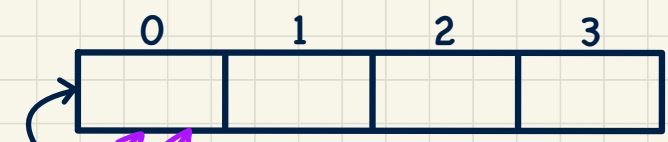
1. fix-sized (no resizing)

Circular Array

2. flexible for performing "dequeue"

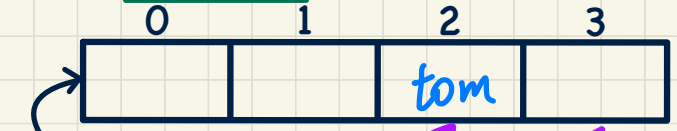
```
data[f] = null; f++;
```

Phase 0: Empty Queue q



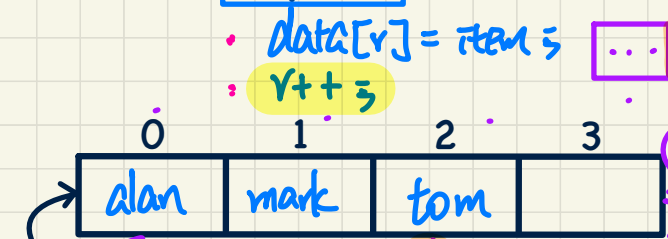
$f=0;$   
 $r=0;$

Phase 2: dequeue 2 times



size:  $3-2=1$

Phase 1: enqueue 3 elements

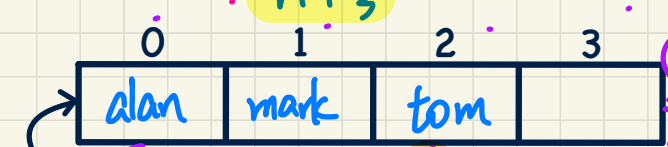


```
data[r] = item;
r++;
```

$[f, r-1] = (r-1) - f + 1 = r - f$

SIZE of array: 4 (stored)  
SIZE of q: 3

Phase 3: enqueue 2 elements



```
data[r] = item;
r = (r+1) % N
```

$(3+1) \% 4 = 0$

Queue Full?  $(r+1) \% N = f$

when r points to 3, is the only empty slot.

size:  $r > f$

size:  $r < f$

$r + (N - f)$

data  $[0, r-1]$

$(r-1) - 0 + 1 = r$

$[f, N-1]$

$(N-1) - f + 1 = N - f$

## Lecture 3

### Part E

***Implementing Stack and Queue -  
Dynamic Arrays:  
Const. Increments vs. Doubling***

total RT / # ops.

# Amortized Analysis: Dynamic Array with Const. Increments

Work. resp.:  $O(n)$

```

1 public class ArrayStack<E> implements Stack<E> {
2   private int I;
3   private int C;
4   private int capacity;
5   private E[] data;
6   public ArrayStack() {
7     I = 1000; /* arbitrary initial size */
8     C = 500; /* arbitrary fixed increment */
9     capacity = I;
10    data = (E[]) new Object[capacity];
11    t = -1;
12  }
13  public void push(E e) {
14    if (size() == capacity) {
15      /* resizing by a fixed constant */
16      E[] temp = (E[]) new Object[capacity + C];
17      for(int i = 0; i < capacity; i++) {
18        temp[i] = data[i];
19      }
20      data = temp;
21      capacity = capacity + C;
22    }
23    t++;
24    data[t] = e;
25  }
26 }

```

Sum of Arith. Seq.  $a_1 + a_2 + \dots + a_k$

$$= \frac{(a_1 + a_k) \cdot k}{2}$$

this only occurs once in a while

$O(n)$

$O(1)$

$$* I + (k-1) \cdot C = n$$

$$k = \frac{n-I}{C} + 1$$

# of resizing steps

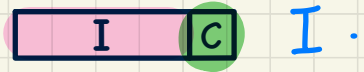
W.L.O.G, assume:  $n$  pushes

and the last push triggers the last resizing routine.

initial array:



1st resizing:



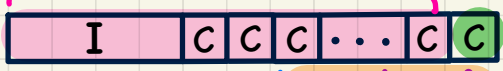
2nd resizing:



3rd resizing:



Last resizing:



$$I + 0 \cdot C \quad I + 1 \cdot C \quad \dots \quad I + (k-1) \cdot C$$

$$\underbrace{I}_{1st} + \underbrace{(I+C)}_{2nd} + \underbrace{(I+2 \cdot C)}_{3rd} + \dots + \underbrace{(I+(k-1) \cdot C)}_{kth}$$

$$= \frac{(I+n) \cdot (\frac{n-I}{C} + 1)}{2}$$

$$= \frac{n^2 + (2I-n) \cdot n + 2I \cdot n - I^2}{2C}$$

$O(n^2)$   
total RT

Amortized/  
Average RT:  
 $O(\frac{n^2}{n}) = O(n)$

# Deriving the Sum of a Geometric Sequence

Initial Term: I

Common Factor: r

Number of Terms: k

$$S_k = \overset{I \cdot r^0}{\textcircled{I}} + \frac{I \cdot r}{\text{2nd}} + \frac{I \cdot r^2}{\text{3rd}} + \frac{I \cdot r^3}{\text{4th}} + \dots + \frac{I \cdot r^{k-1}}{\text{kth}}$$

$$\underline{r \cdot S_k} = I \cdot r + I \cdot r^2 + I \cdot r^3 + \dots + I \cdot r^{k-1} + I \cdot r^k$$

$$(r-1) \cdot S_k = I \cdot r^k - I = I \cdot (r^k - 1) \Rightarrow \underline{S_k = \frac{I \cdot (r^k - 1)}{r - 1}}$$

Avg: total RT / # op.

$2^x = y \Rightarrow x = \log_2 y$

$2^3 = 8 \Rightarrow 3 = \log_2 8$

# Amortized Analysis: Dynamic Array with Doubling

```

1 public class ArrayStack<E> implements Stack<E> {
2     private int I;
3     private int capacity;
4     private E[] data;
5     public ArrayStack() {
6         I = 1000; /* arbitrary initial size */
7         capacity = I;
8         data = (E[]) new Object[capacity];
9         t = -1;
10    }
11    public void push(E e) {
12        if (size() == capacity) {
13            /* resizing by doubling */
14            E[] temp = (E[]) new Object[capacity * 2];
15            for(int i = 0; i < capacity; i++) {
16                temp[i] = data[i];
17            }
18            data = temp;
19            capacity = capacity * 2
20        }
21        t++;
22        data[t] = e;
23    }
24 }

```

Sum of Geo. Seq.  $\rightarrow$  # of terms  
 $SK = \frac{I \cdot (2^k - 1)}{2 - 1}$

$2^{\log_2 x} = x$

$2^{\log_2 8} = 2^3 = 8$

$2^{k-1} \cdot I = n$   
 $2^{k-1} = \frac{n}{I}$   
 $k-1 = \log_2 \frac{n}{I}$   
 $k = \log_2 \frac{n}{I} + 1$

initial array: **I**

$2^{x+z} = 2^x \cdot 2^z$

1st resizing: **I I I**

2nd resizing: **I I I I** 2·I

⋮

Last resizing: **I I ... I I I I ... I I**

Total RT =  $\underbrace{I}_{1^{st}} + \underbrace{2 \cdot I}_{2^{nd}} + \underbrace{2^2 \cdot I}_{3^{rd}} + \dots + \underbrace{2^{k-1} \cdot I}_{k^{th}}$

$= \frac{I \cdot (2^{\log_2 \frac{n}{I} + 1} - 1)}{2 - 1}$

$= I \cdot (\frac{n}{I} \cdot 2 - 1) = 2 \cdot n - I$

Amortized/  
Average RT:  
 $O(\frac{n}{n}) = O(1)$

W.L.O.G, assume: **n** pushes

and the last push triggers the last resizing routine.

$O(n)$

yes:  $O(n)$

# push/enqueue

Exercise

Array List

↳ implemented by?

|                     | const. increments | doubling |
|---------------------|-------------------|----------|
| Worst-case RT       | $O(n)$            | $O(n)$   |
| Amortised / avg. RT | $O(1)$            | $O(1)$   |

$O(1)$

due to that

doubling the size

each time makes it substantially

less frequent to resize

# Lecture 4

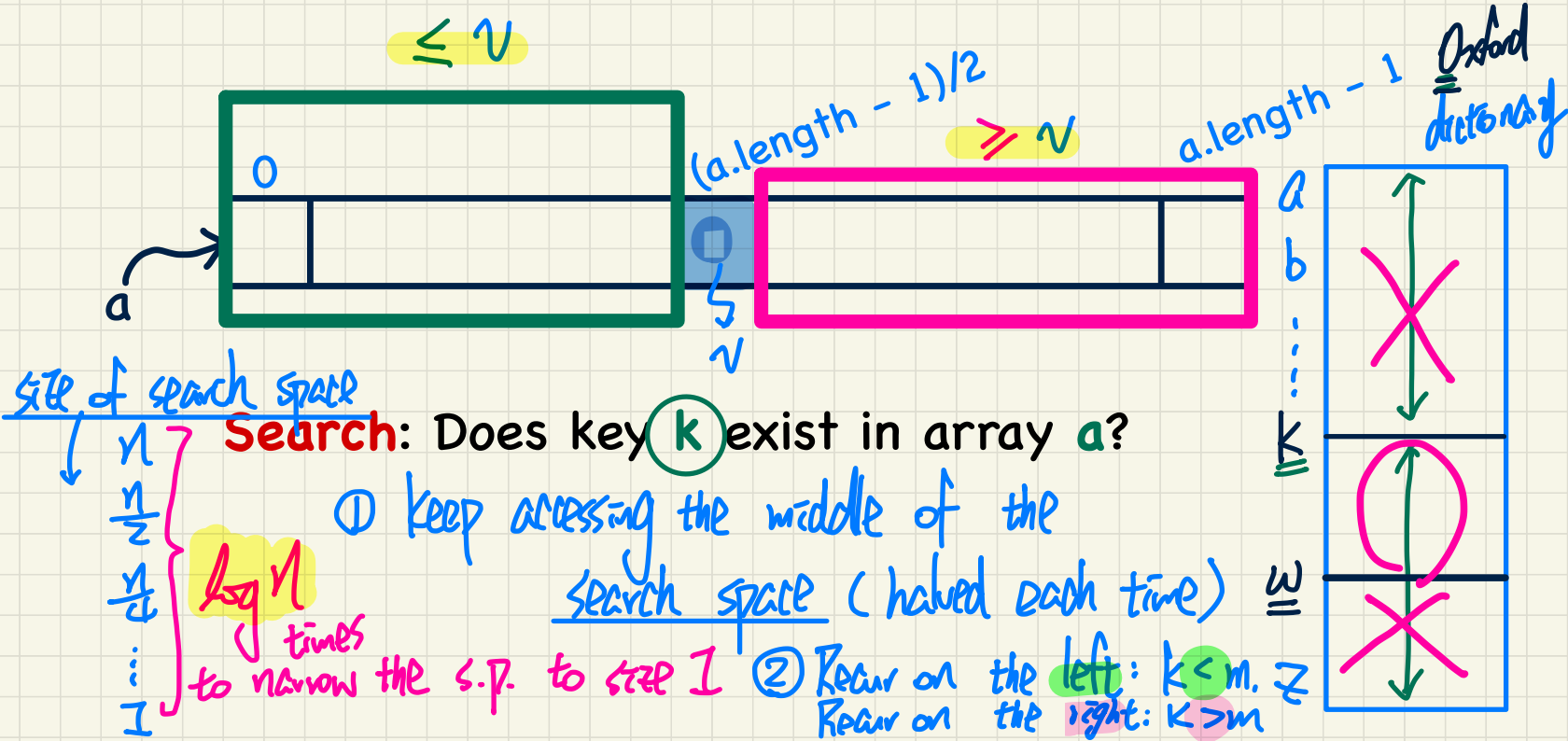
## Part B

***Examples on Recursion  
Binary Search***

# Binary Search: Ideas



Precondition: Array sorted in non-descending order





# Binary Search in Java

```
boolean binarySearch(int[] sorted, int key) {
    return binarySearchH(sorted, 0, sorted.length - 1, key);
}
boolean binarySearchH(int[] sorted, int from, int to, int key) {
    if (from > to) { /* base case 1: empty range */
        return false; }
    else if (from == to) { /* base case 2: range of one element */
        return sorted[from] == key; }
    else {
        int middle = (from + to) / 2;
        int middleValue = sorted[middle];
        if (key < middleValue) {
            return binarySearchH(sorted, from, middle - 1, key);
        }
        else if (key > middleValue) {
            return binarySearchH(sorted, middle + 1, to, key);
        }
        else { return true; }
    }
}
```

input array sorted

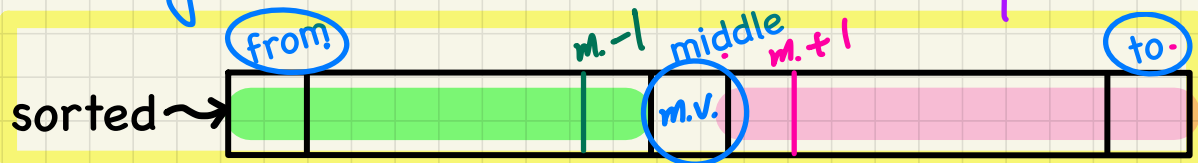
↳ call by value

define the range of indices of the search space.

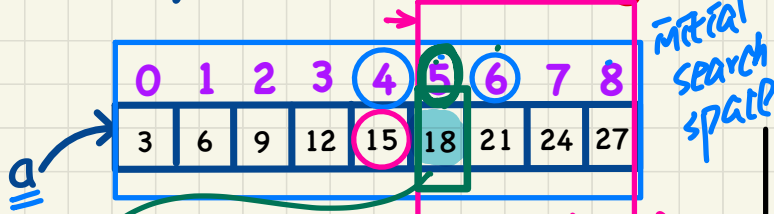
recursive case

narrowed search spaces represent a strictly smaller problem to solve.

↳ key == middle value



# Binary Search: Tracing



search(a, 18)

binarySearchH(a, 0, 8, 18)

binarySearchH(a, 5, 8, 18)

binarySearchH(a, 5, 5, 18)

↳ true

search space of 1st recursion  
 $m. = \frac{(0+8)}{2} = 4$   
 $m.v. = a[4] = 15$

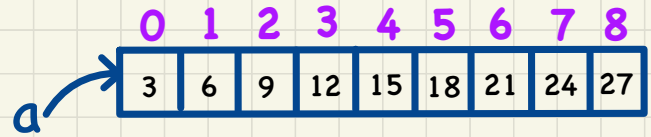
$m.+1$  to  $to.$   
 $m. = \frac{(5+8)}{2} = 6$   
 $m.v. = a[6] = 21$

from  $m.-1$

search space of 2nd recursion



EXERCISE



search(a, 7)

binarySearchH(a, 0, 8, 7)

binarySearchH(a, 0, 3, 7)

binarySearchH(a, 2, 3, 7)

binarySearchH(a, 2, 1, 7)

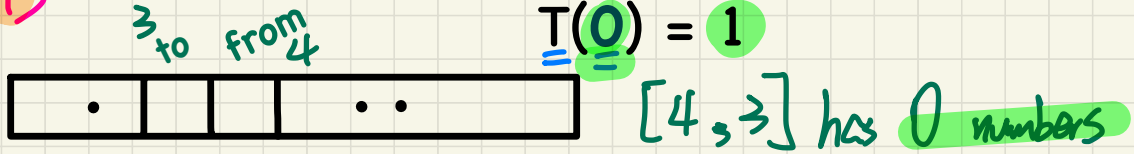
# Running Time: Ideas

# Recurrence Relation

```
1 boolean allPositive(int[] a) { return allPosH(a, 0, a.length - 1);  
2 boolean allPosH(int[] a, int from, int to) {  
3   if (from > to) { return true; }  $O(1)$   
4   else if (from == to) { return a[from] > 0; }  $O(1)$   
5   else { return a[from] > 0 && allPosH(a, from + 1, to); } }  $n-1$ 
```

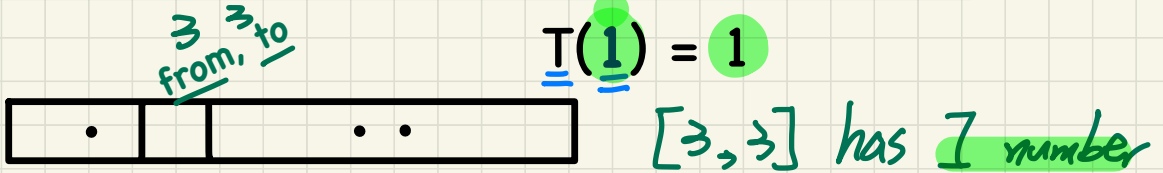
## Base Case:

### Empty Array



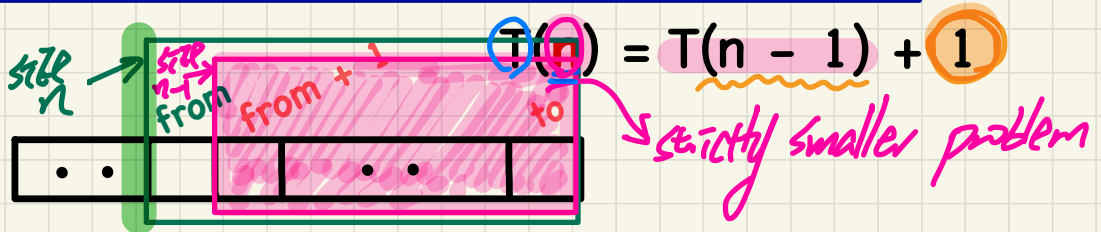
## Base Case:

### Array of Size 1



## Recursive Case:

### Array of size > 1



# Running Time: Unfolding Recurrence Relation

$$T(0) = 1$$

$$T(1) = 1$$

$$T(n) = T(n-1) + 1$$

→ recurrence relation derived from Java imp. of recursive algorithm.

$$T(n) = T(n-1) + 1 = T(n-1)$$

$$= T(n-1) + 1 + 1 = T(n-2) + 1 + 1 + 1$$

$$= T(n-2) + 1 + 1 + 1 + 1 = T(n-3) + 1 + 1 + 1 + 1 + 1$$

$$= \dots + T(1) + 1 + 1 + \dots + 1 \quad (n-1)$$

How many?

$$\therefore T(n) = (n-1) + 1 = n$$

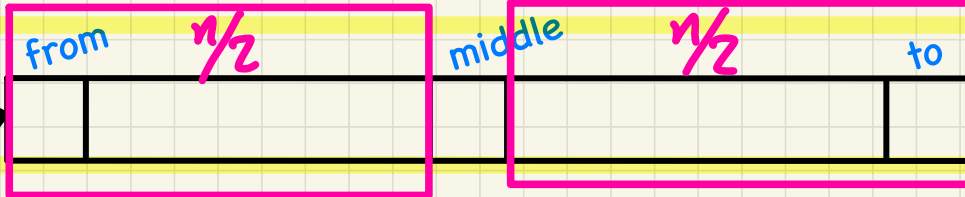
$$O(n)$$



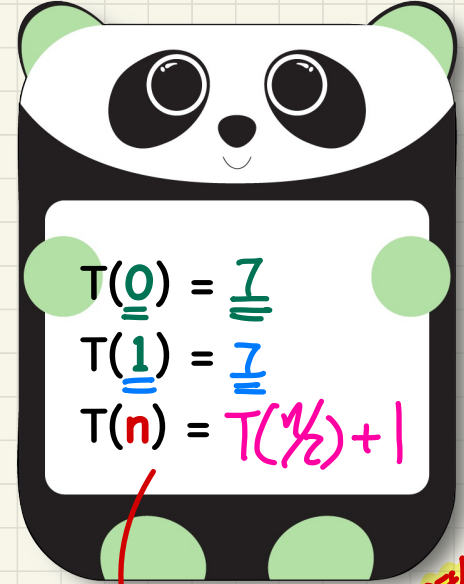
# Binary Search: Running Time

```
boolean binarySearch(int[] sorted, int key) {
    return binarySearchH(sorted, 0, sorted.length - 1, key);
}
boolean binarySearchH(int[] sorted, int from, int to, int key) {
    if (from > to) { /* base case 1: empty range */
        return false; } O(1)
    else if (from == to) { /* base case 2: range of one element */
        return sorted[from] == key; } O(1)
    else {
        int middle = (from + to) / 2;
        int middleValue = sorted[middle];
        if (key < middleValue) {
            return binarySearchH(sorted, from, middle - 1, key);
        }
        else if (key > middleValue) {
            return binarySearchH(sorted, middle + 1, to, key);
        }
        else { return true; }
    }
}
```

sorted ~>



## Running Time as a Recurrence Relation



Wrong:  $T(n) = T(n/2) + T(n/2)$   
X  
either L or R but not both

# Running Time: Unfolding Recurrence Relation

$$T(0) = 1$$

once reaching here, no more unfoldings

$$T(1) = 1$$

$$T(n) = T(n/2) + 1$$

$$T(n) = T\left(\frac{n}{2}\right) + 1$$

$$= T\left(\frac{n}{4}\right) + 1 + 1$$

$$= T\left(\frac{n}{8}\right) + 1 + 1 + 1$$

$$= T\left(\frac{n}{16}\right) + 1 + 1 + 1 + 1$$

$$\vdots$$

$$= T(1) + 1 + \dots + 1$$

Assume:  $n = 2^x$  for  $x \geq 0$

without loss of generality.

$$2^{\log 8} = 2^3 = 8$$

$$2^{\log n} = n$$

$O(\log n)$

How many?  $\log n$



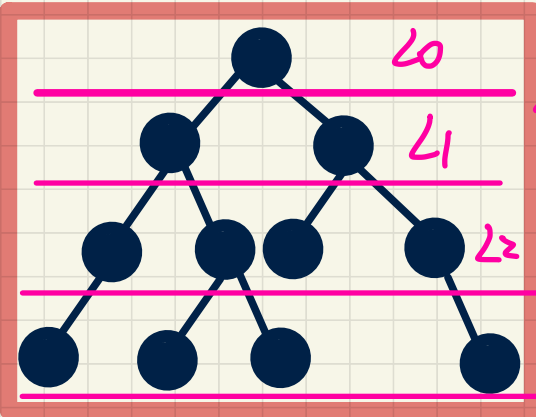
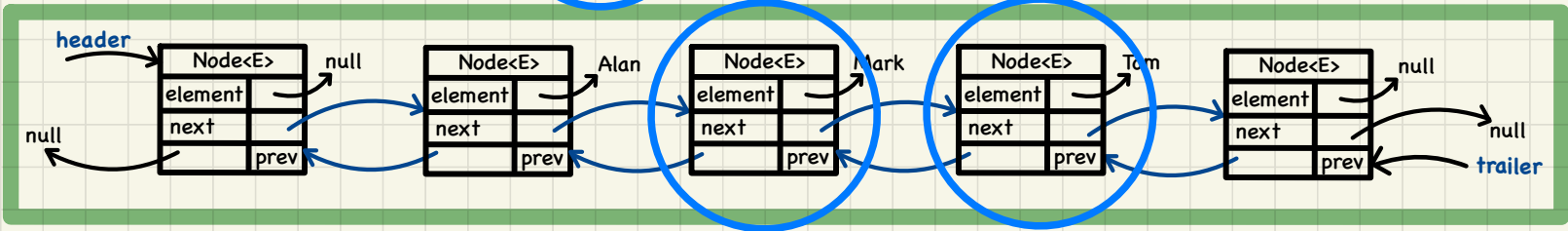
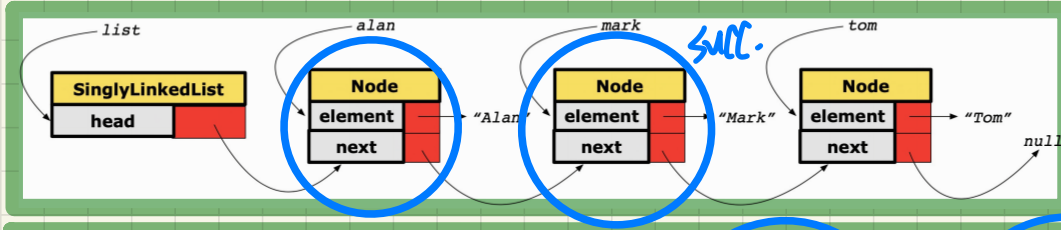
# Lecture 5a

## Part A

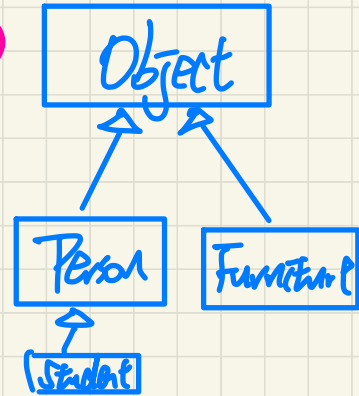
### ***General Trees*** ***Terminology, Applications***

# Linear vs. Non-Linear Structures

Linear DS  
(can't branch out when traversing)

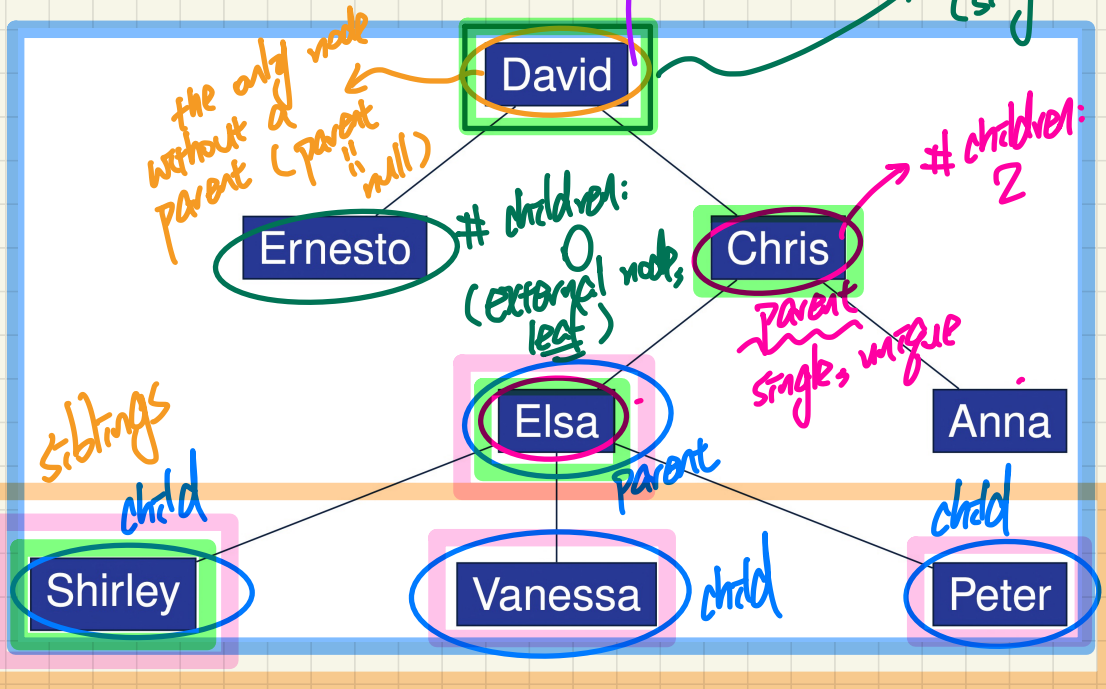


non-linear DS  
(levels, branching out structure)  
↳ hierarchical  
(e.g. inheritance)





# General Trees: Terminology (1)



- root
- parent
- children
- ancestors
- descendants
- siblings

descendants of root covers the entire tree.  
 root (single, unique)

the only node without a parent (parent is null)

# children: 0 (external node, leaf)

# children: 2  
 parent single, unique

siblings  
 child

parent

child

ancestors of shirley:  
 shirley, elsa, chris  
 david

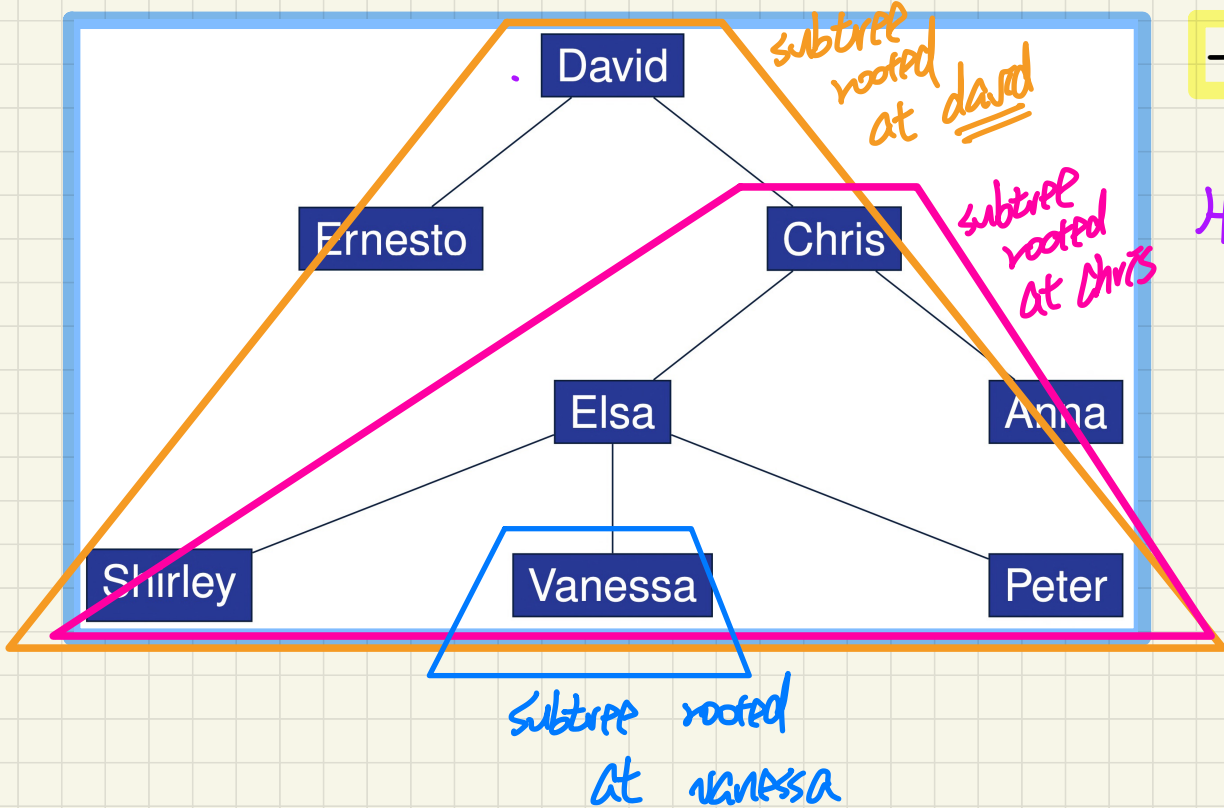
descendants of elsa:  
 elsa, shirley, vanessa, peter

Elsa is parent of Vanessa  
 Chris is parent of Elsa ] => Chris is parent of X  
 Vanessa

# General Trees: Terminology (2)

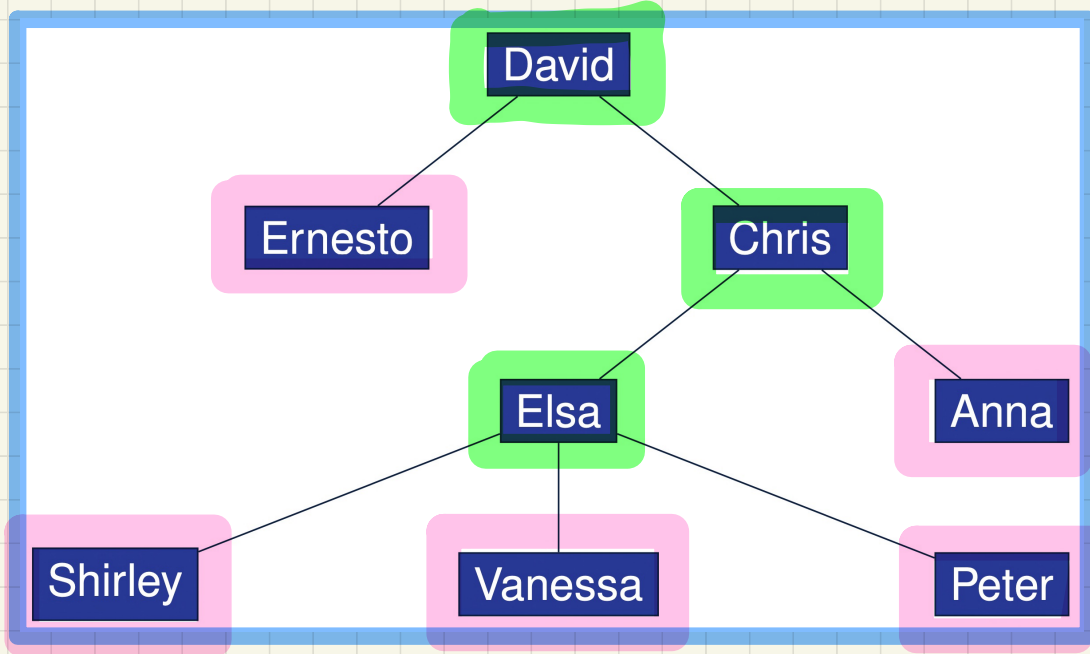
subtrees  
⇒ sub-arrays.

- subtree



How many subtrees?  
↳ count # node  
8

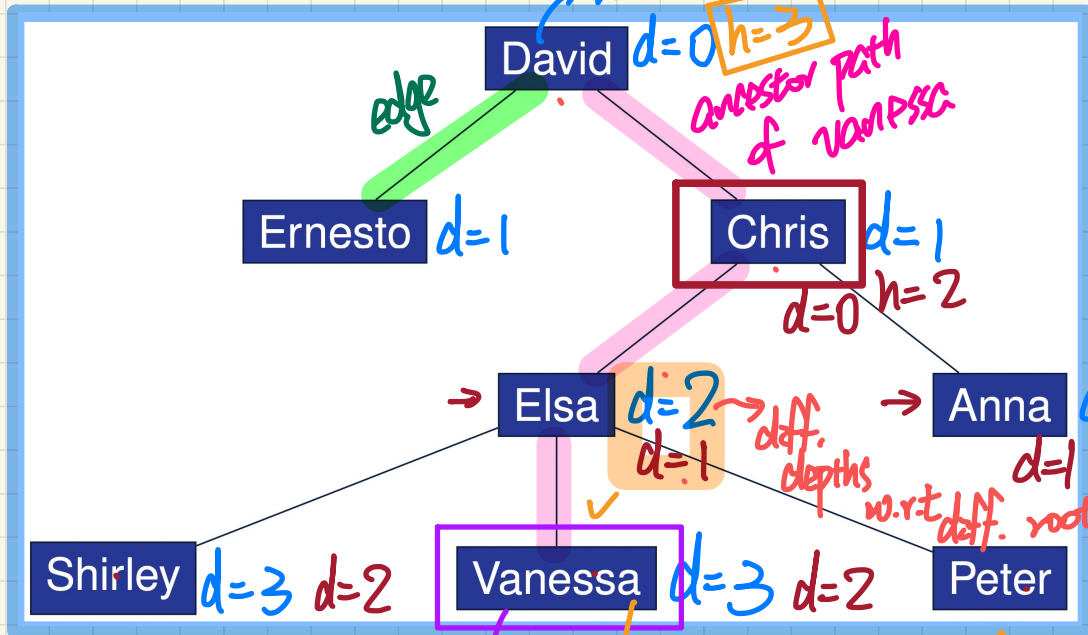
## General Trees: Terminology (3)



- external nodes (↵)
- internal nodes (⇒)

↵ not necessarily  
at the bottom level.

# General Trees: Terminology (4)



- edge
- path
- depth
- height

# edges from root

max depth among all nodes

height of subtree rooted at David.

ancestor path of VANESSA

$d=0$ ,  $h=2$

different depths w.r.t. different roots

$d=0$ ,  $h=0$  → height of subtree rooted at external node VANESSA relative to the subtree root (VANESSA)

\* heights of subtrees rooted at external nodes are 0.

# General Trees: Recursive Definition



- root
- size

Case 2

root  $\rightarrow$  'alai'

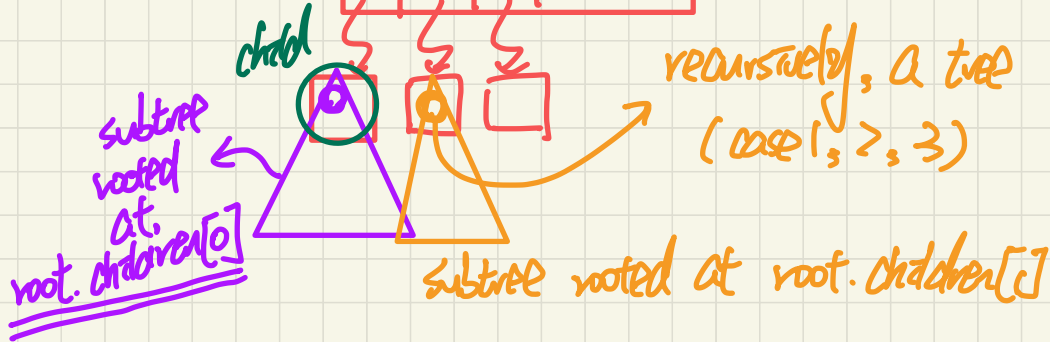
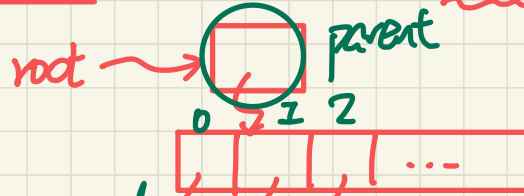
size = 1

Case 1: Empty Tree

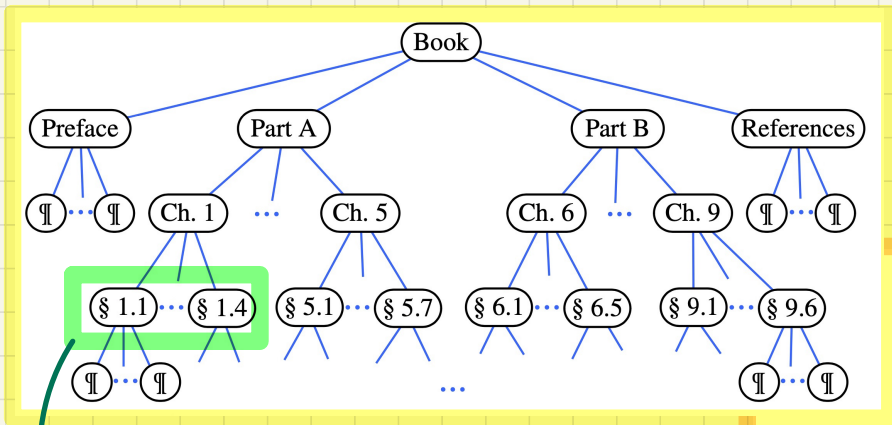
$\emptyset$  root  $\rightarrow$  null

size = 0

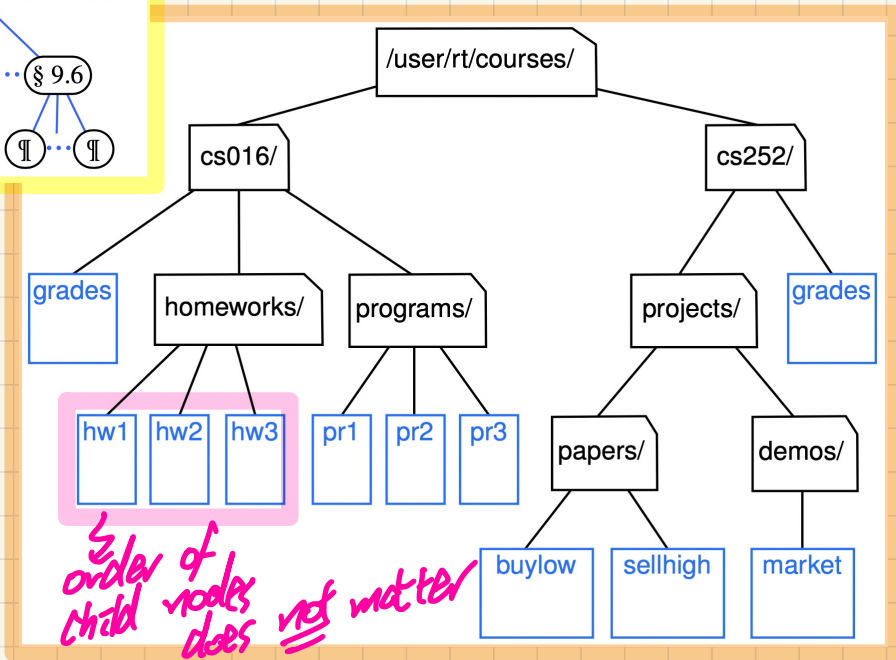
Case 3 (Recursive Case) size > 1



# General Trees: **Ordered** vs. **Unordered** Trees



*order of child nodes matters*



*order of child nodes does not matter*

# Lecture 5a

## Part B

***General Trees***

***Implementing a Generic Tree in Java***

# Generic, General Tree Nodes

```

public class TreeNode<E> {
    private E element; /* data object */
    private TreeNode<E> parent; /* unique parent node */
    private TreeNode<E>[] children; /* list of child nodes */

    private final int MAX_NUM_CHILDREN = 10; /* fixed max */
    private int noc; /* number of child nodes */

    public TreeNode(E element) {
        this.element = element;
        this.parent = null;
        this.children = (TreeNode<E>[])
            Array.newInstance(this.getClass(), MAX_NUM_CHILDREN);
        this.noc = 0;
    }

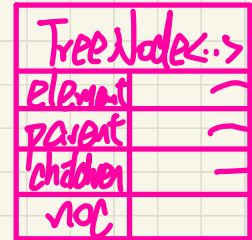
    public E getElement() { ... }
    public TreeNode<E> getParent() { ... }
    public TreeNode<E>[] getChildren() { ... }

    public void setElement(E element) { ... }
    public void setParent(TreeNode<E> parent) { ... }
    public void addChild(TreeNode<E> child) { ... }
    public void removeChildAt(int i) { ... }
}
    
```

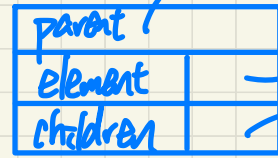
Obs last Exception

this.children = (**TreeNode**<E>[])  
new Object [MAX\_SIZ]

↓ **TreeNode**<E>



**TreeNode** :->



**Compare:**  
+ prev ref.  
+ next ref.  
in a DLN.



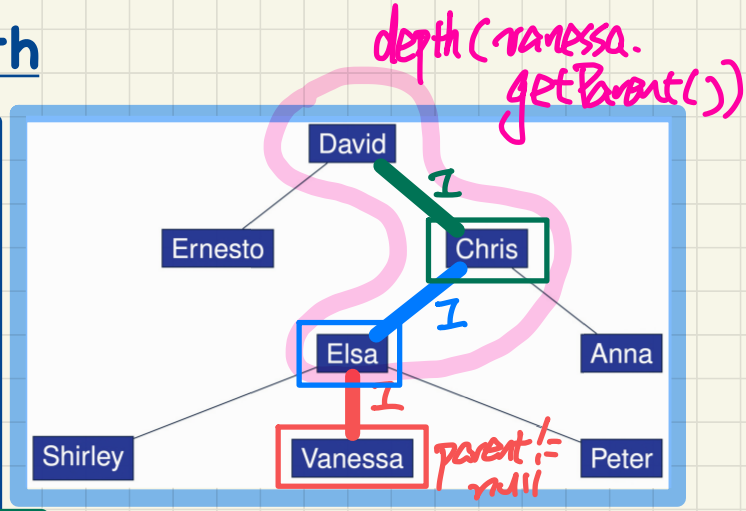




# Tracing: Computing a Node's Depth

```
public int depth(TreeNode<E> n) {
    if (n.getParent() == null) {
        return 0;
    }
    else {
        return 1 + depth(n.getParent());
    }
}
```

*Handwritten notes:*  
 -  $n$  is the root  
 - edge from  $n$  to its parent  
 - strictly smaller subproblem



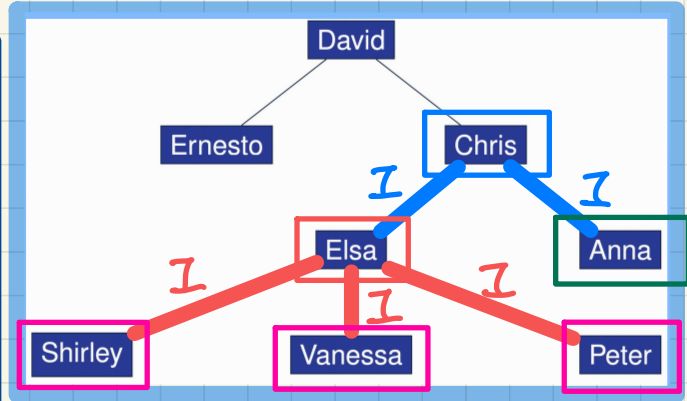
```
@Test
public void test_general_trees_depths() {
    ... /* constructing a tree as shown above */
    TreeUtilities<String> u = new TreeUtilities<>();
    assertEquals(0, u.depth(david));
    assertEquals(1, u.depth(ernesto));
    assertEquals(1, u.depth(chris));
    assertEquals(2, u.depth(elsa));
    assertEquals(2, u.depth(anna));
    assertEquals(3, u.depth(shirley));
    assertEquals(3, u.depth(vanessa));
    assertEquals(3, u.depth(peter));
}
```

*Handwritten note:*  
 - Trace:  $depth(anna)$

depth(vanessa)

$$\begin{aligned}
 &= 1 + \text{depth}(elsa) \\
 &= 1 + 1 + \text{depth}(chris) \\
 &= \underline{1} + \underline{1} + \underline{1} + \text{depth}(david) \\
 &= \textcircled{3} + \underline{0}
 \end{aligned}$$

# Tracing: Computing a Tree's Height



```

public int height(TreeNode<E> n) {
    TreeNode<E>[] children = n.getChildren();
    if (children.length == 0) { return 0; }
    else {
        int max = 0;
        for(int i = 0; i < children.length; i++) {
            int h = 1 + height(children[i]);
            max = h > max ? h : max;
        }
        return max;
    }
}
  
```

*n is external (leaf)*

*↳ strictly small problem: height of a child node.*

```

@Test
public void test_general_trees_heights() {
    ... /* constructing a tree as shown above */
    TreeUtilities<String> u = new TreeUtilities<>();
    /* internal nodes */
    assertEquals(3, u.height(david));
    assertEquals(2, u.height(chris));
    assertEquals(1, u.height(elsa));
    /* external nodes */
    assertEquals(0, u.height(ernesto));
    assertEquals(0, u.height(anna));
    assertEquals(0, u.height(shirley));
    assertEquals(0, u.height(vanessa));
    assertEquals(0, u.height(peter));
}
  
```

*Exercise!*

height(chris)

$$\begin{aligned}
 &= I + \text{MAX} \left( \begin{array}{l} \text{height(elsa)} \\ \text{height(anna)} \end{array} \right) \\
 &= I + \frac{\text{MAX}}{I} \left( \begin{array}{l} I + \text{MAX} \left( \begin{array}{l} h(s) \\ h(v) \\ h(p) \end{array} \right) \\ 0 \end{array} \right) \\
 &= \textcircled{2}
 \end{aligned}$$

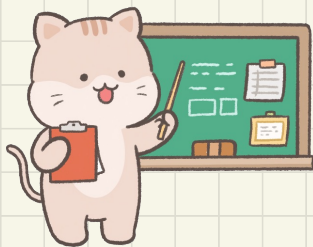
# Lecture 5a

## Part C

### ***Binary Trees***

### ***Definition, Terminology, Properties***

# Binary Trees: Recursive Definition



- root
- size

Case 2: one-node BT

$$\text{size} = 1$$



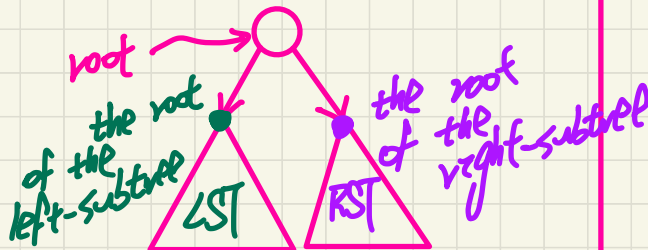
Case 1: Empty BT

$$\text{size} = 0$$

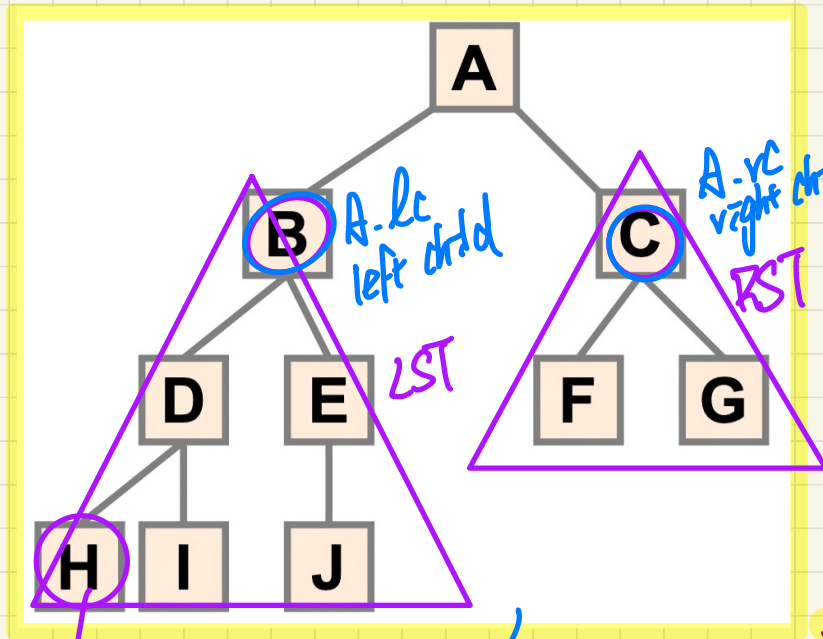


algorithm on a BT should be recursive  
given that a BT's structure is recursive.

Case 3: size of BT > 1



# BT Terminology: LST vs. RST



## Strategy of Recursion on BT:

- + Do something on **root**
- + **Recur** on **LST**
- + **Recur** on **RST**

e.g.,

- + counting size
- + searching item

$$\text{size}(A) = 1 + \text{size}(A.lc)$$

$$\text{size}(H) = 1 + \text{size}(A.rc)$$

ext. node  
(no further  
recursion  
necessary).

BT without  
satisfying  
the  
"search  
property"

$$\text{search}(A, \text{item}) = A.\text{equals}(\text{item}) \parallel$$

$$\text{search}(H, \text{item}) = \text{search}(A.lc, \text{item}) \parallel$$

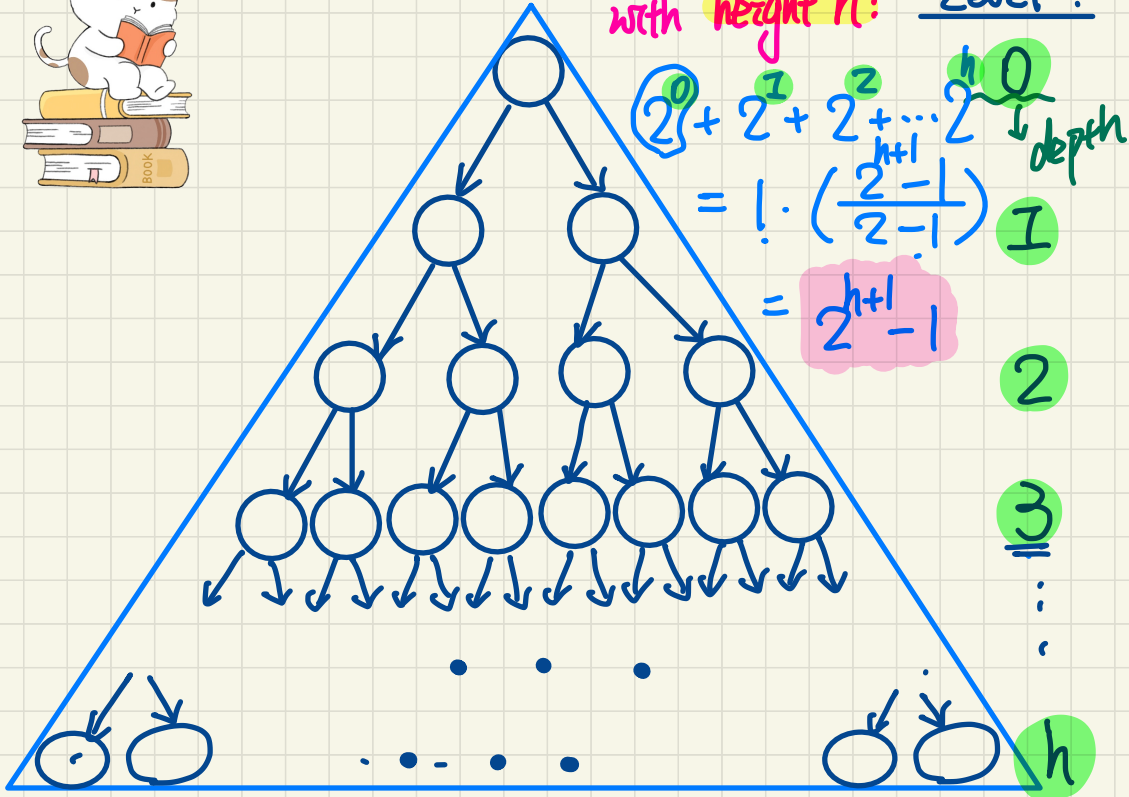
$$\text{search}(A.rc, \text{item})$$

# BT Terminology: Depths, Levels, Max # of Nodes



Max # of nodes in a tree with height  $h$ :

Level?  $\stackrel{d}{=}$



Max # nodes at Level?

$1 = 2^0$

$1 * 2 = 2 = 2^1$

$2 * 2 = 4 = 2^2$

$4 * 2 = 8 = 2^3$

$2^h$





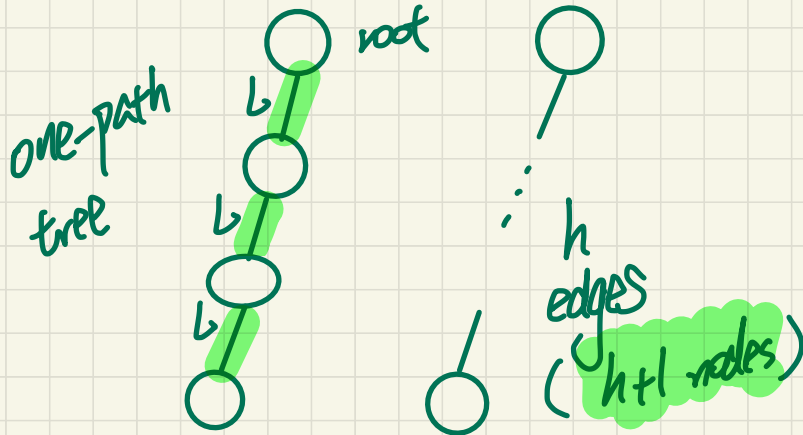
# BT Properties: Bounding # of Nodes

Given a **binary tree** with **height**  $h$  <sup>$\geq 0$</sup> , the **number of nodes**  $n$  is bounded as:

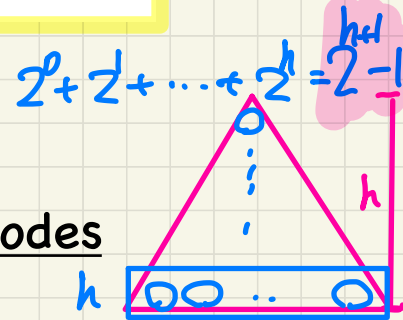
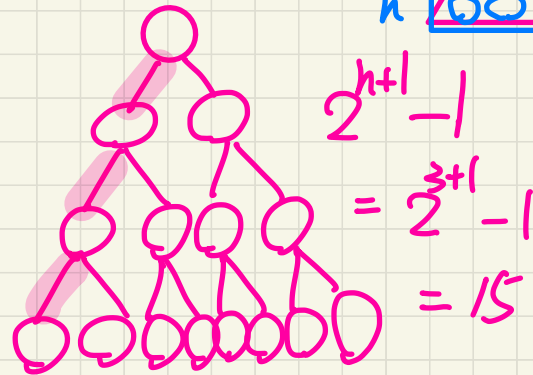
$$h + 1 \leq n \leq 2^{h+1} - 1$$

For example, say  $h = 3$

Minimum # of nodes



Maximum # of nodes



# BT Properties: Bounding Height of Tree

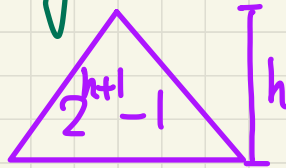
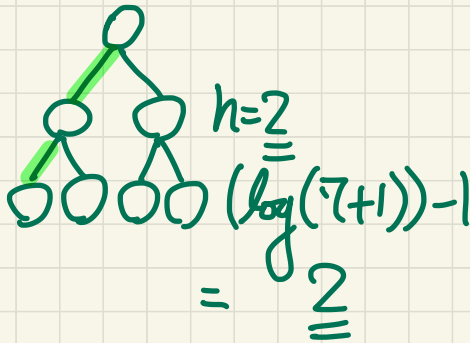
Given a **binary tree** with  $n$  nodes, the **height**  $h$  is bounded as:

$$\log(n+1) - 1 \leq h \leq n - 1$$

For example, say  $n = 7$ .

## Minimum height

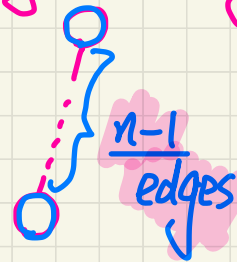
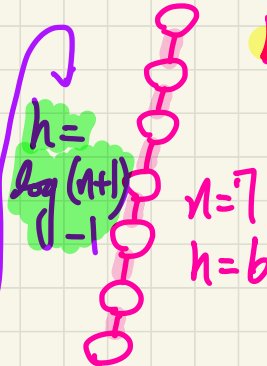
(branch out two ways whenever possible)



$$\begin{aligned} n &= 2^{h+1} - 1 \\ n+1 &= 2^{h+1} \\ \log(n+1) &= h+1 \end{aligned}$$

## Maximum height

(don't waste any nodes branching two ways)



# BT Properties: Bounding # of External Nodes

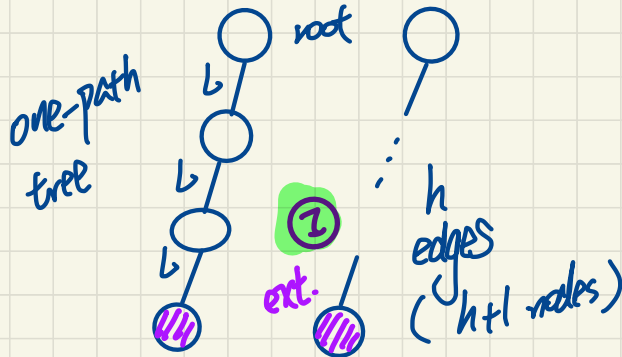
Given a **binary tree** with  <sup>$\geq 0$</sup>  height  $h$  the *number of external nodes*  $n_E$  is bounded as:

$$1 \leq n_E \leq 2^h$$

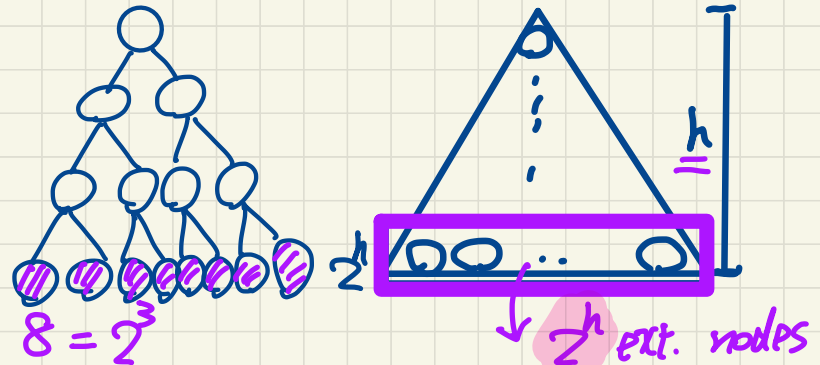
$n_E$

For example, say  $h = \sqrt{3}$ .

## Minimum # of External Nodes



## Maximum # of External Nodes



# BT Properties: Bounding # of Internal Nodes

Given a **binary tree** with <sup>≥ 0</sup> height  $h$ , the **number of internal nodes**  $n_I$  is bounded as:

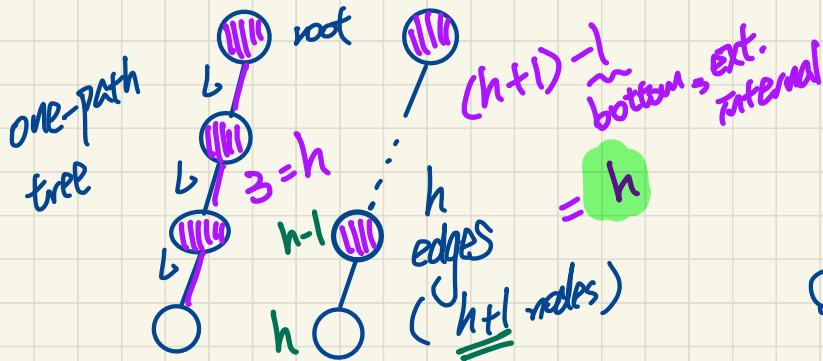
$$h \leq n_I \leq 2^h - 1$$

$n_I$

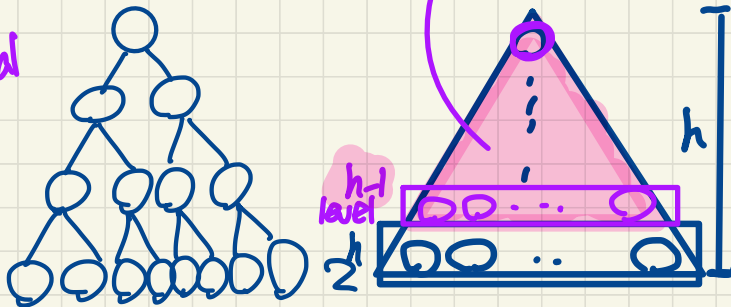
For example, say  $h = 3$

$$2^0 + 2^1 + 2^2 + \dots + 2^{h-1} = 2^h - 1$$

Minimum # of Internal Nodes



Maximum # of Internal Nodes



# Lecture 5a

## Part C

### ***Binary Trees Definition, Terminology, Properties (continued)***

# BT Properties: Relating #s of **Ext.** and **Int.** Nodes

Given a **binary tree** that is:

- **nonempty** and **proper**
- with  $n_I$  **internal nodes** and  $n_E$  **external nodes**

We can then expect that:  $n_E = n_I + 1$

## Induction on Size of Proper BT

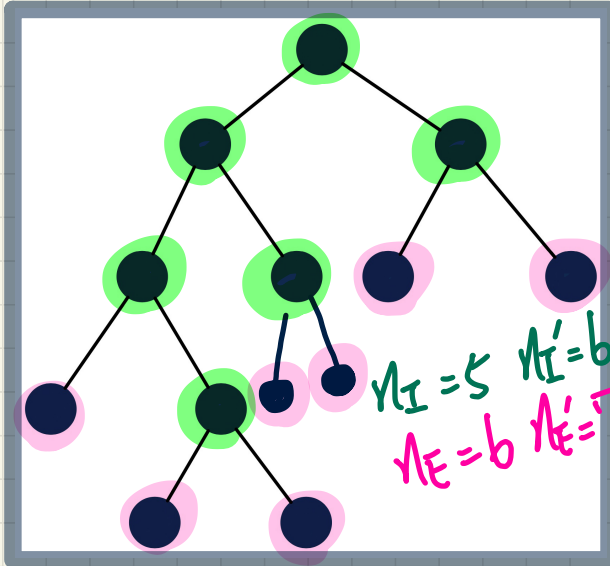
$$\begin{aligned}
 * \quad n_E' &= n_E + 1 \\
 &= \{\text{ind. hypth.}\} \\
 &= (n_I + 1) + 1 \\
 &= n_I' + 1
 \end{aligned}$$

REVIEW!



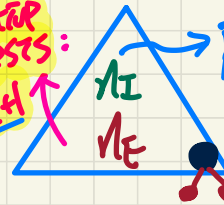
Base Case: A proper BT with size 1

- no internal node  
 $\Rightarrow$  "proper" property is satisfied  
 (without violation witness)



## Inductive - Recursive Case

Inductive Hypothesis:  
 $n_E = n_I + 1$



Proper BT with size  $> 1$

$$n_E' = n_E - 1 + 2 = n_E + 1$$

$$n_I' = n_I + 1$$

# Lecture 5a

## Part D

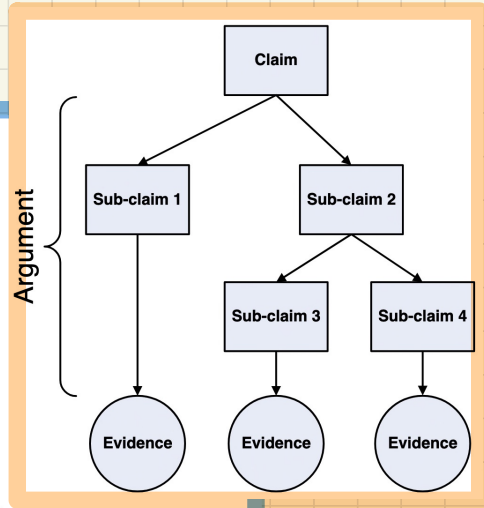
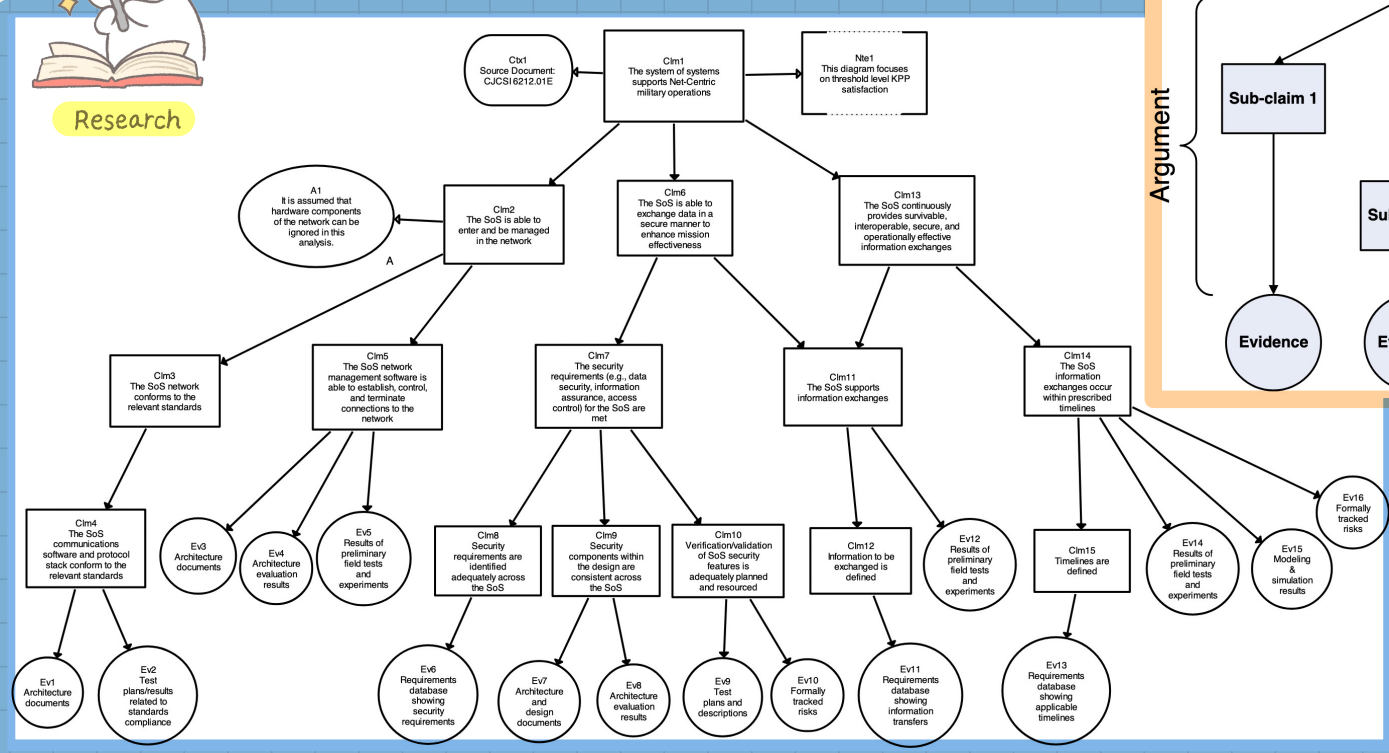
### *Binary Trees Applications*

# Applications of General Trees: Assurance Cases



Research

Research on "Assurance Cases" if interested!

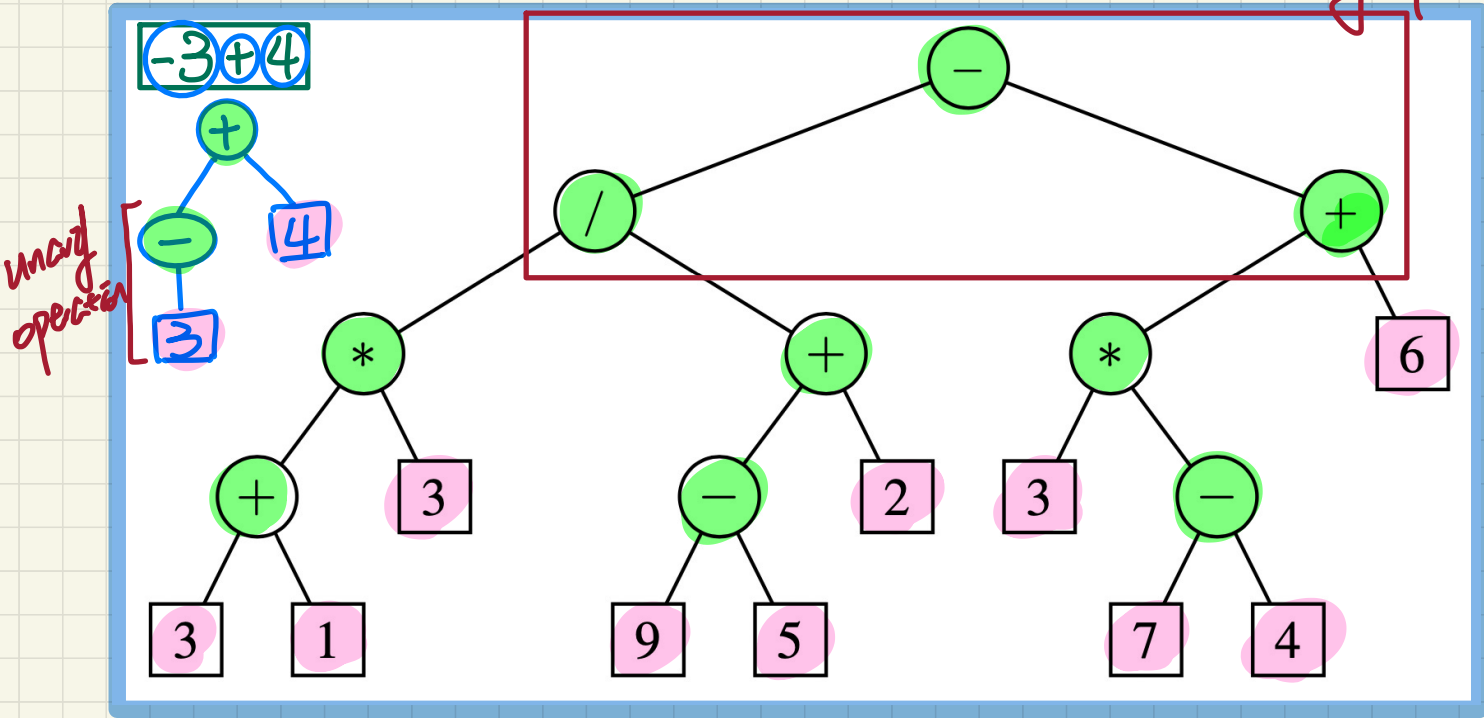


Source: [https://resources.sei.cmu.edu/asset\\_files/whitepaper/2009\\_019\\_001\\_29066.pdf](https://resources.sei.cmu.edu/asset_files/whitepaper/2009_019_001_29066.pdf)



# Applications of Binary Trees: Infix Notation

binary op: ... - ...



Q. Is the binary tree necessarily proper?

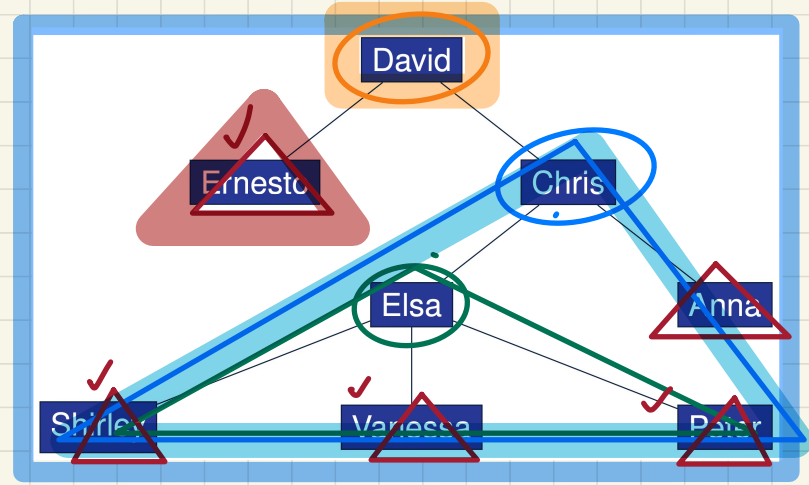
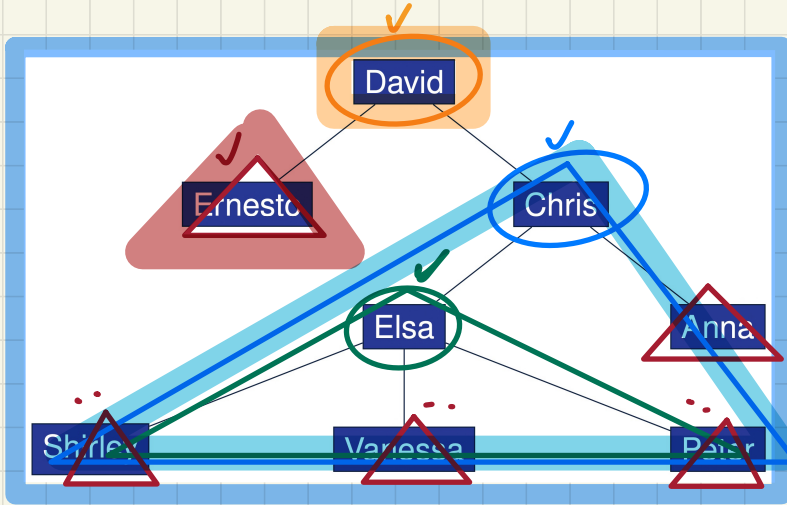
# Lecture 5a

## Part E

### ***Tree Traversals***

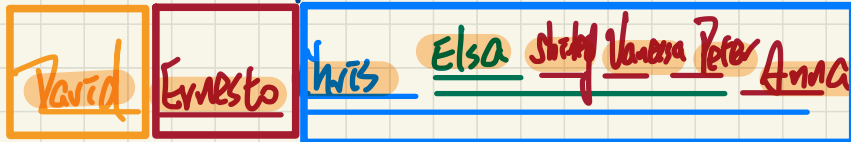
### ***Pre-Order, In-Order, Post-Order***

# General Tree Traversals: Pre-Order vs. Post-Order



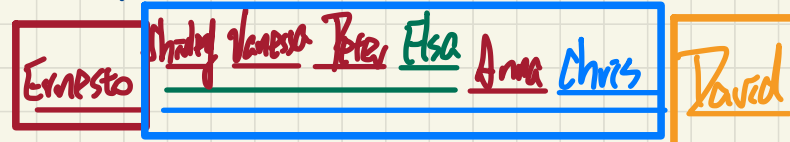
Pre-Order Traversal  
from the Root

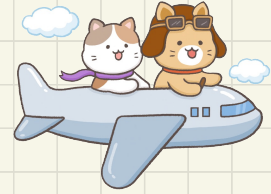
Parent, pre-order (child nodes)



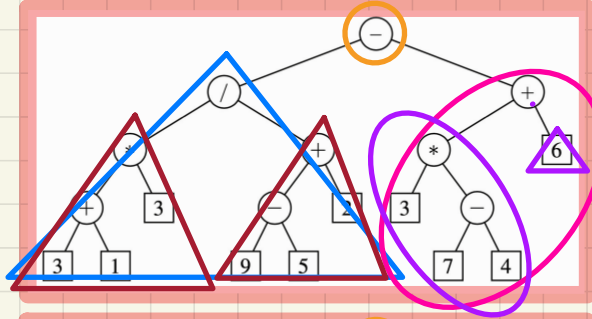
Post-Order Traversal  
from the Root

post-order (child nodes), Parent



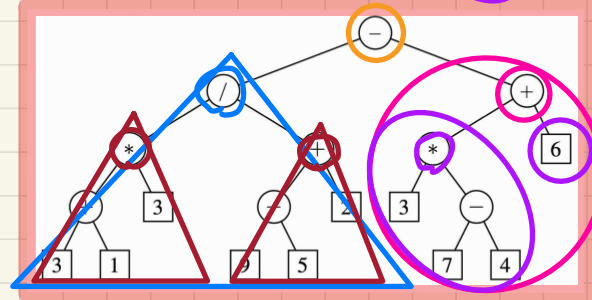


# Binary Tree Traversals



## Pre-Order Traversal

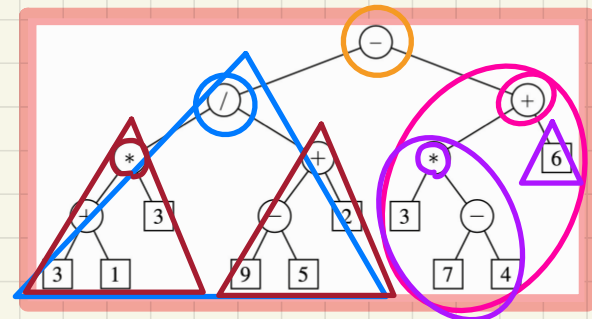
$- / * + 3 1 3 + - 9 5 2 + * 3 - 7 4 6$



## In-Order Traversal

In-Order(LST) Parent In-Order(RST)

$3 + 1 * 3 / 9 - 5 + 2 - 3 * 7 - 4 + 6$



## Post-Order Traversal

$3 1 + 3 * 9 5 - 2 + / 3 7 4 - * 6 + -$

# Lecture 5b

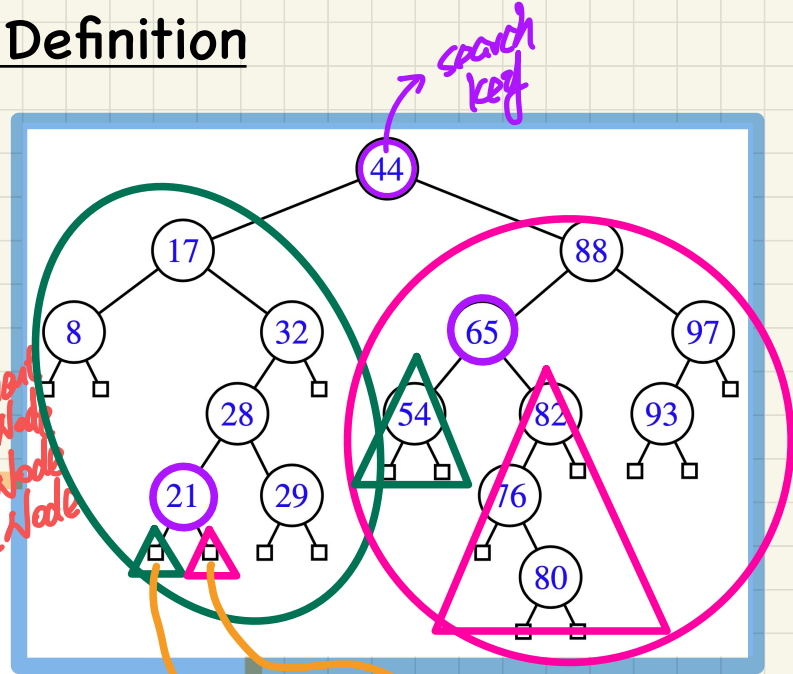
## Part A

### ***Binary Search Tree - Definition and Property***

# Binary Search Trees: Recursive Definition

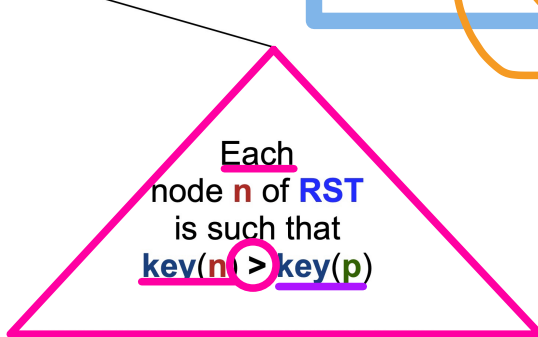
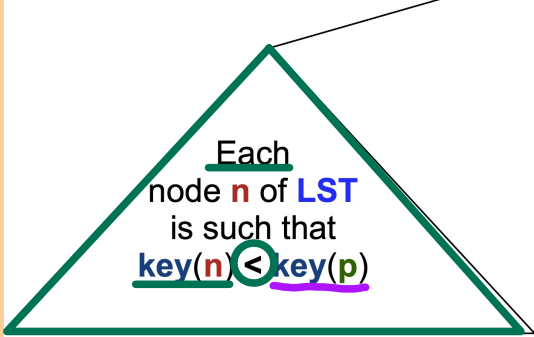


- external node
- internal node
- + LST
- + RST



$$\forall x. x \in \emptyset \Rightarrow P(x)$$

Node  $p$  stores  $(\text{key}(p), \text{value}(p))$



can't find a violation of search prop.  
 External node satisfies search property  $\because$  its LST or RST contains no nodes

# Binary Search Trees: Sorting Property



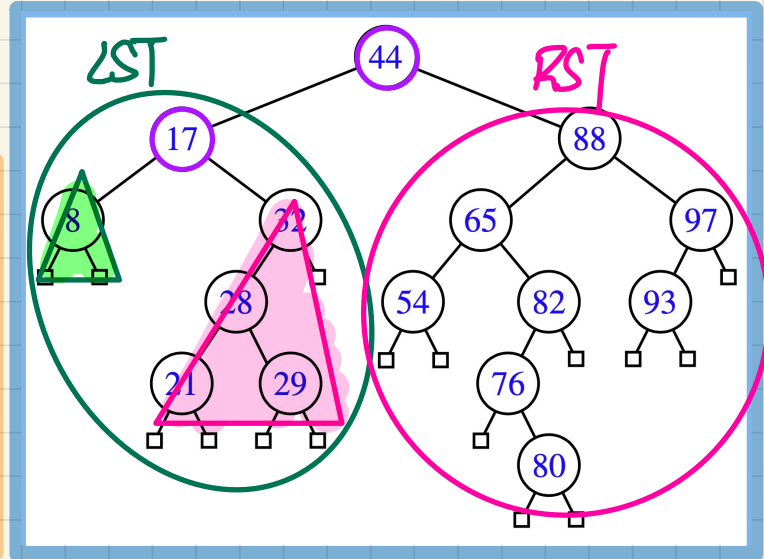
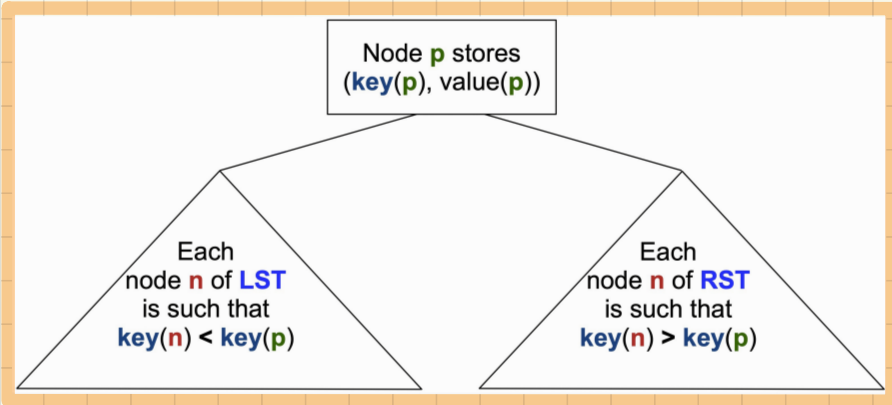
- BST: Non-Linear Structure
- In-Order Traversal

8 17 21 28 29 32

in-order on LST

44

in-order of RST  
54 65 76 80 82 88 93 97



## Lecture 5b

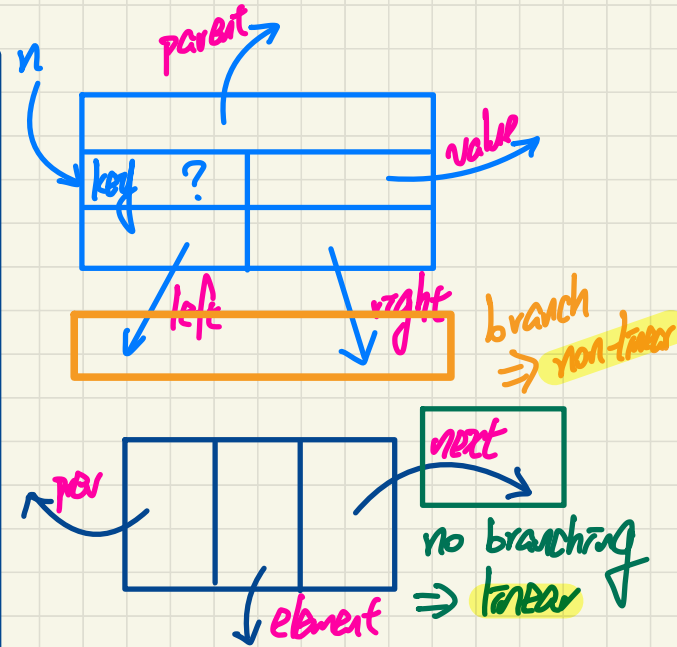
### Part B

***Binary Search Trees -  
Implementing a Generic BST in Java  
Tree Construction and Traversal***



# Generic, Binary Tree Nodes

```
public class BSTNode<E> {  
    private int key; /* key */  
    private E value; /* value */  
    private BSTNode<E> parent; /* unique parent node */  
    private BSTNode<E> left; /* left child node */  
    private BSTNode<E> right; /* right child node */  
  
    public BSTNode() { ... }  
    public BSTNode(int key, E value) { ... }  
  
    public boolean isExternal() {  
        return this.getLeft() == null && this.getRight() == null;  
    }  
    public boolean isInternal() {  
        return !this.isExternal();  
    }  
    public int getKey() { ... }  
    public void setKey(int key) { ... }  
    public E getValue() { ... }  
    public void setValue(E value) { ... }  
    public BSTNode<E> getParent() { ... }  
    public void setParent(BSTNode<E> parent) { ... }  
    public BSTNode<E> getLeft() { ... }  
    public void setLeft(BSTNode<E> left) { ... }  
    public BSTNode<E> getRight() { ... }  
    public void setRight(BSTNode<E> right) { ... }  
}
```



Compare:

+ prev ref.  
+ next ref.  
in a DLN.



# Generic, Binary Tree Nodes - Traversal

```
import java.util.ArrayList;
public class BSTUtilities<E> {
    public ArrayList<BSTNode<E>> inOrderTraversal(BSTNode<E> root) {
        ArrayList<BSTNode<E>> result = null;
        if (root.isInternal()) {
            result = new ArrayList<>();
            if (root.getLeft().isInternal) {
                result.addAll(inOrderTraversal(root.getLeft()));
            }
            result.add(root);
            if (root.getRight().isInternal) {
                result.addAll(inOrderTraversal(root.getRight()));
            }
        }
        return result;
    }
}
```

otherwise, root.isExternal  
⇒ return null

assumed to be the root of some BST

accumulate the returned result from LST

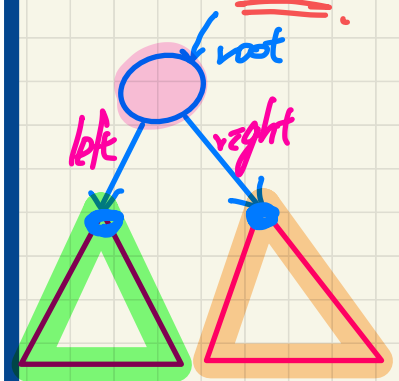
accumulate the returned result from RST



external node



↳ in-order tra.  
returns null.



Exercises: change to BSTNode<E>[]  
2. LinkedList<E>

- 3. pre-order
- 4. post-order

# Tracing: Constructing and Traversing a BST

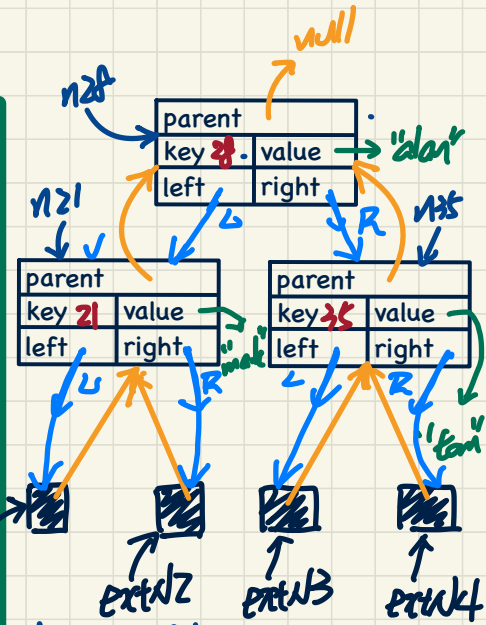
```

@Test
public void test_binary_search_trees_construction() {
    BSTNode<String> n28 = new BSTNode<>(28, "alan");
    BSTNode<String> n21 = new BSTNode<>(21, "mark");
    BSTNode<String> n35 = new BSTNode<>(35, "tom");
    BSTNode<String> extN1 = new BSTNode<>();
    BSTNode<String> extN2 = new BSTNode<>();
    BSTNode<String> extN3 = new BSTNode<>();
    BSTNode<String> extN4 = new BSTNode<>();
    n28.setLeft(n21); n21.setParent(n28);
    n28.setRight(n35); n35.setParent(n28);
    n21.setLeft(extN1); extN1.setParent(n21);
    n21.setRight(extN2); extN2.setParent(n21);
    n35.setLeft(extN3); extN3.setParent(n35);
    n35.setRight(extN4); extN4.setParent(n35);
    BSTUtilities<String> u = new BSTUtilities<>();
    ArrayList<BSTNode<String>> inOrderList = u.inOrderTraversal(n28);
    assertTrue(inOrderList.size() == 3);
    assertEquals(21, inOrderList.get(0).getKey());
    assertEquals("mark", inOrderList.get(0).getValue());
    assertEquals(28, inOrderList.get(1).getKey());
    assertEquals("alan", inOrderList.get(1).getValue());
    assertEquals(35, inOrderList.get(2).getKey());
    assertEquals("tom", inOrderList.get(2).getValue());
}
    
```

internal nodes

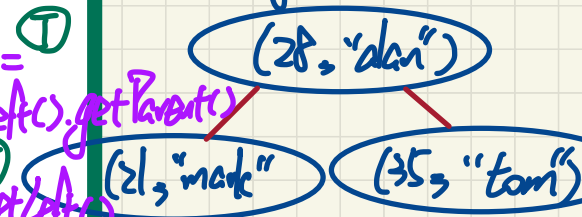


external nodes



① n28 == n28.getLeft().getLeft().getParent()  
 ② n28.getLeft() == n28.getLeft().getRight().getParent()

Sorting properties on keys.

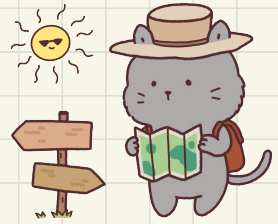


## Lecture 5b

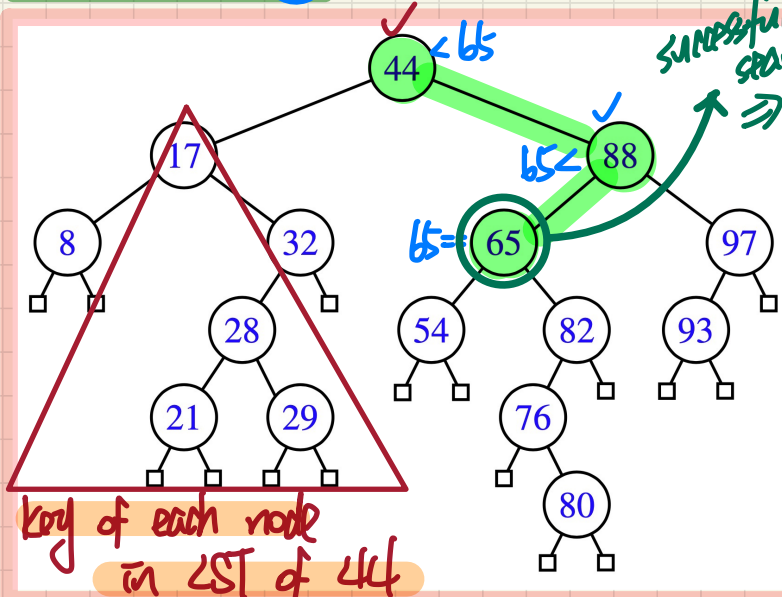
### Part C

# ***Binary Search Trees - Implementing a Generic BST in Java Searching***

# BST Operation: Searching a Key



Search key **65**

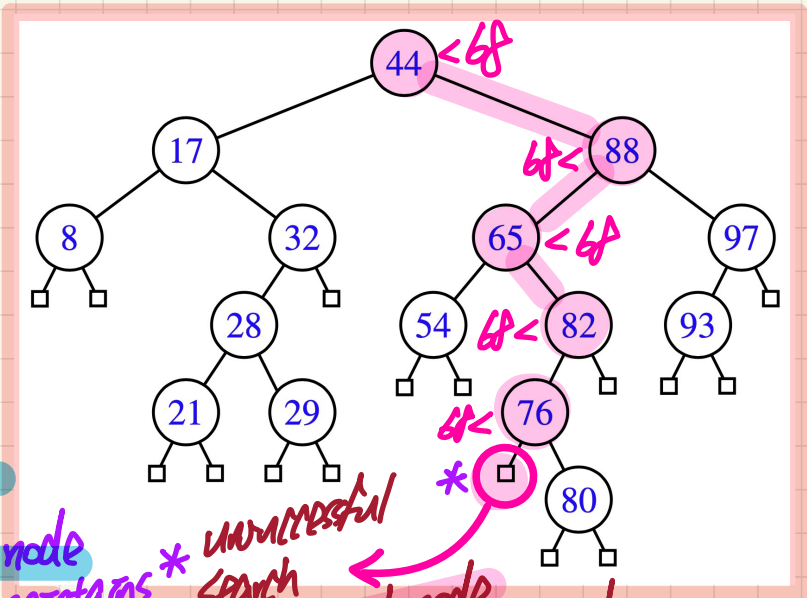


key of each node in BST of 44

must be  $< 44$  (assumed search property)

Assumption: BST  
 internal node storing 65 returned  $\Rightarrow$  search property

Search key **68**



\* Storing this returned ext. node with key 68 maintains the search property  $\Rightarrow$  unsuccessful search \* external node returned

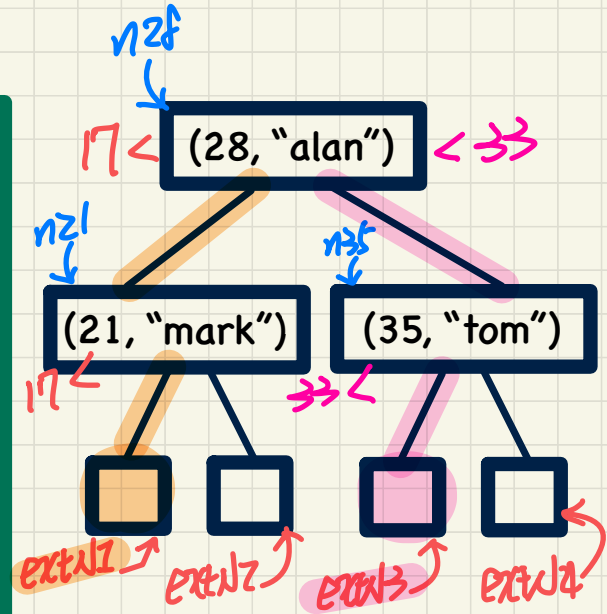
# Tracing: Searching through a BST

```
@Test
public void test_binary_search_trees_search() {
    BSTNode<String> n28 = new BSTNode<>(28, "alan");
    BSTNode<String> n21 = new BSTNode<>(21, "mark");
    BSTNode<String> n35 = new BSTNode<>(35, "tom");
    BSTNode<String> extN1 = new BSTNode<>();
    BSTNode<String> extN2 = new BSTNode<>();
    BSTNode<String> extN3 = new BSTNode<>();
    BSTNode<String> extN4 = new BSTNode<>();
    n28.setLeft(n21); n21.setParent(n28);
    n28.setRight(n35); n35.setParent(n28);
    n21.setLeft(extN1); extN1.setParent(n21);
    n21.setRight(extN2); extN2.setParent(n21);
    n35.setLeft(extN3); extN3.setParent(n35);
    n35.setRight(extN4); extN4.setParent(n35);

    BSTUtilities<String> u = new BSTUtilities<>();
    /* search existing keys */
    assertTrue(n28 == u.search(n28, 28));
    assertTrue(n21 == u.search(n28, 21));
    assertTrue(n35 == u.search(n28, 35));
    /* search non-existing keys */
    assertTrue(extN1 == u.search(n28, 17)); /* *17* < 21 */
    assertTrue(extN2 == u.search(n28, 23)); /* 21 < *23* < 28 */
    assertTrue(extN3 == u.search(n28, 33)); /* 28 < *33* < 35 */
    assertTrue(extN4 == u.search(n28, 38)); /* 35 < *38* */
}
```

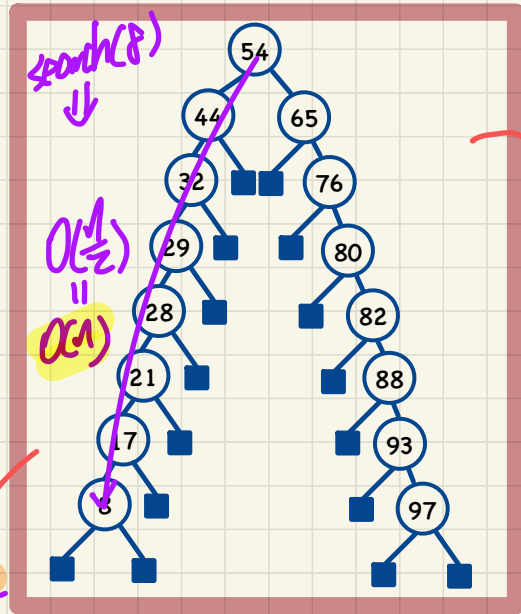
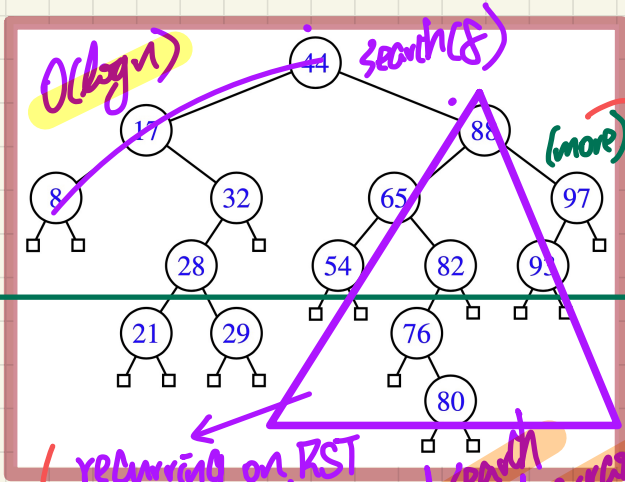
internal nodes  
successful search

external nodes  
unsuccessful search





# Binary Search: **Non-Linear** vs. **Linear** Structures



balanced  
 $h \approx \log n$   
 $\log 15 = 3 \dots$

→ ill-balanced

$O(\log n)$   
 half guarantees  
 the search space  
 is reduced by  
 half.

recurring on RST  
 reduces the search  
 BST space by  
 half.  
 A binary search  
 on a sorted array  
 is equivalent to as far as  
 RT is concerned  
 a search on  
 a balanced BST.

|   |    |    |    |    |    |    |    |    |    |    |    |    |    |    |
|---|----|----|----|----|----|----|----|----|----|----|----|----|----|----|
| 0 | 1  | 2  | 3  | 4  | 5  | 6  | 7  | 8  | 9  | 10 | 11 | 12 | 13 | 14 |
| 8 | 17 | 21 | 28 | 29 | 32 | 44 | 54 | 65 | 76 | 80 | 82 | 88 | 93 | 97 |

→ recurring on right

REVIEW!





## Lecture 5b

### Part D

# ***Binary Search Trees - Implementing a Generic BST in Java Insertion***

# Visualizing BST Operation: Insertion

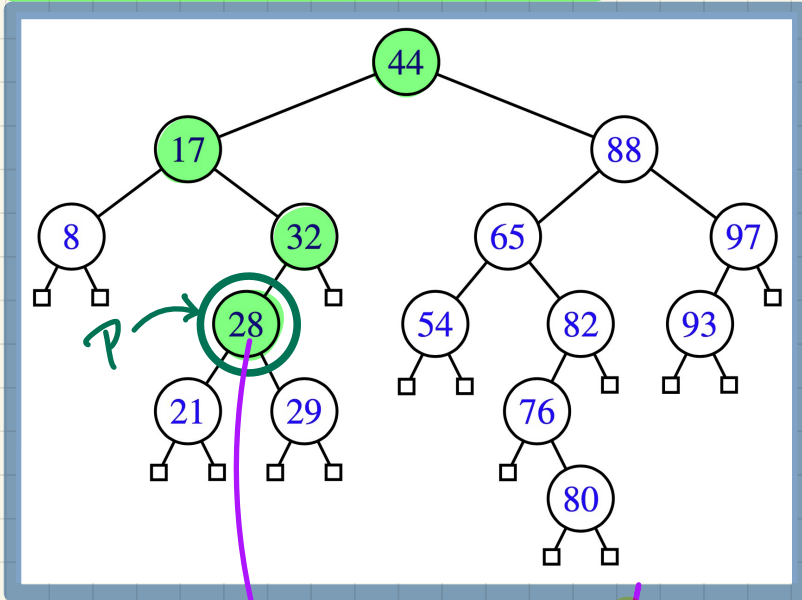


Insert Entry (28, "suyeon")

*search key*

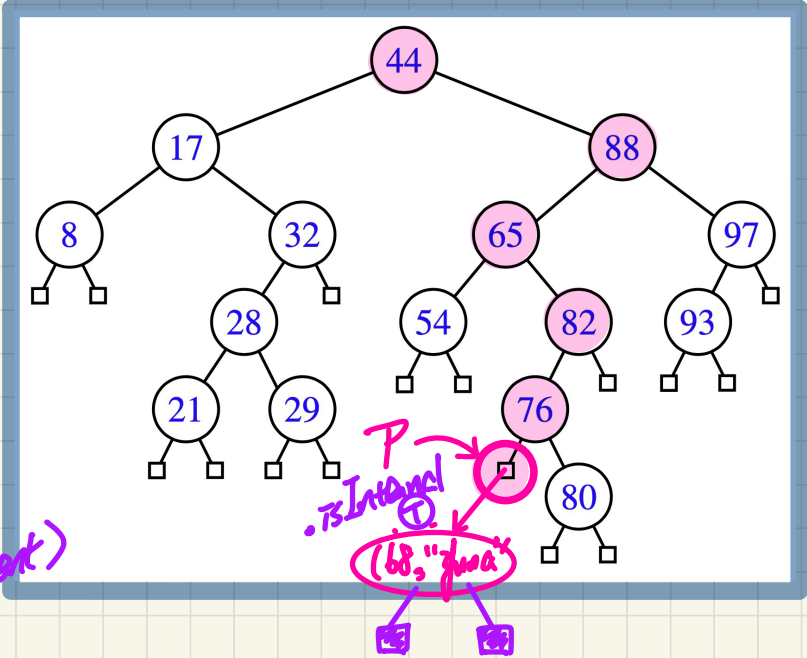
*data value (not for searching)*

$O(h)$   
*height of tree*



*Replace whatever value that's associated with key 28 by "suyeon" (e.g. setElement)*

Insert Entry (68, "yuna")



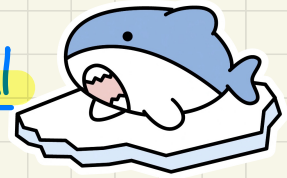
## Lecture 5b

### Part E

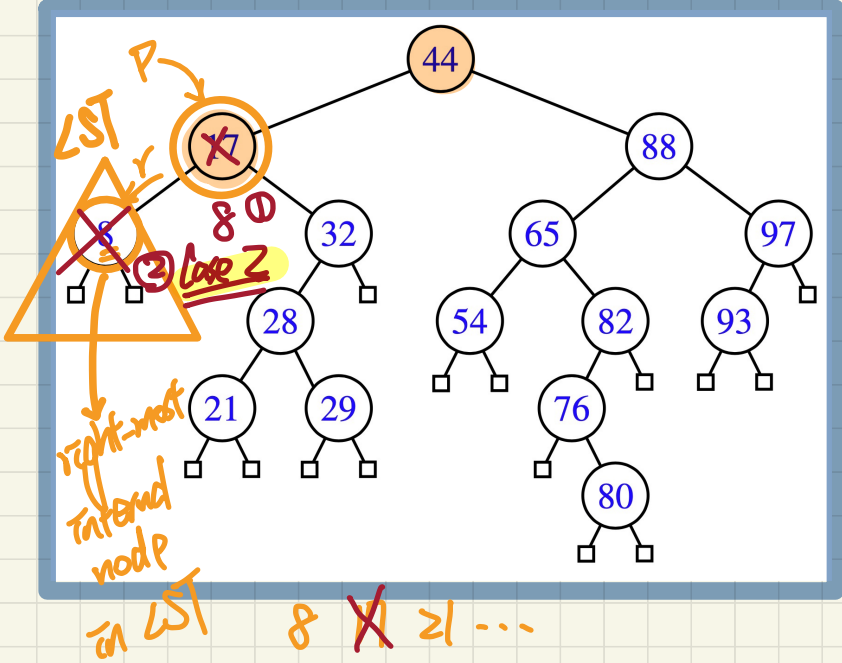
# ***Binary Search Trees - Implementing a Generic BST in Java Deletion***



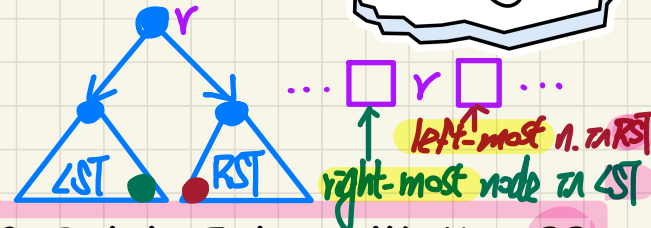
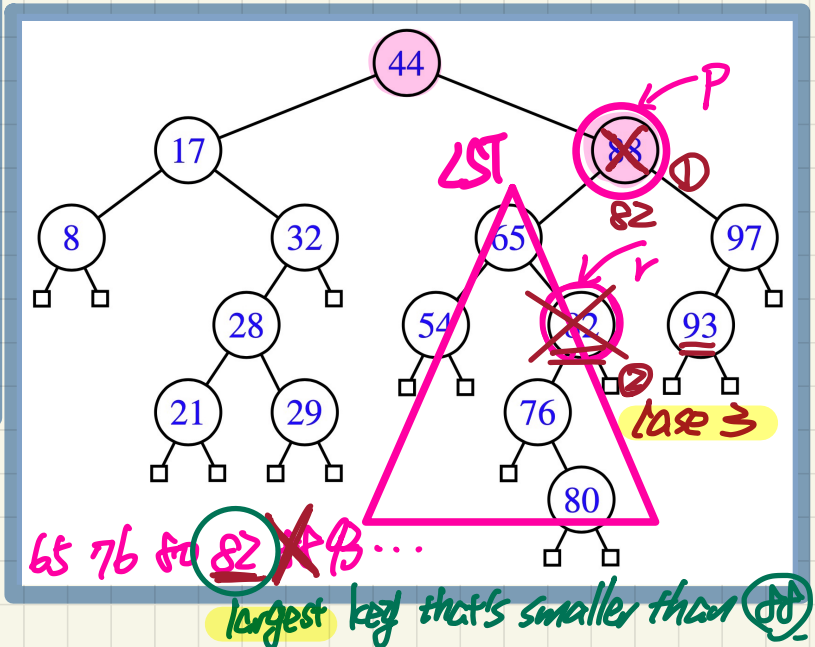
# Visualizing BST Operation: Deletion In-Order Traversal



Case 4.1: Delete Entry with Key 17



Case 4.2: Delete Entry with Key 88

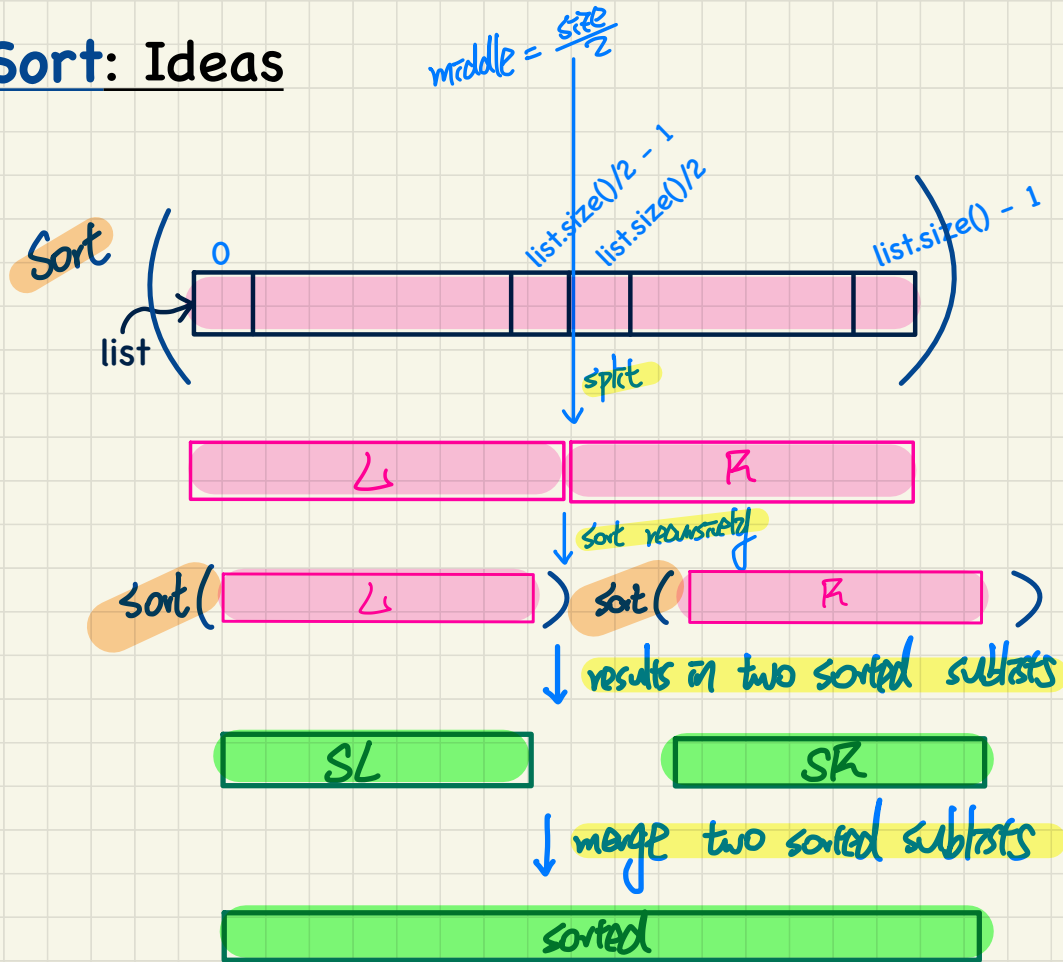


# Lecture 4

## Part C

***Examples on Recursion  
Merge Sort***

# Merge Sort: Ideas

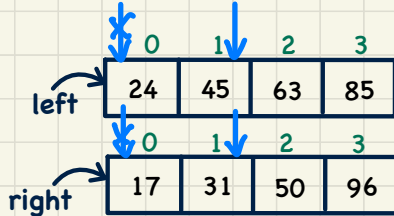


# Merge Sort in Java

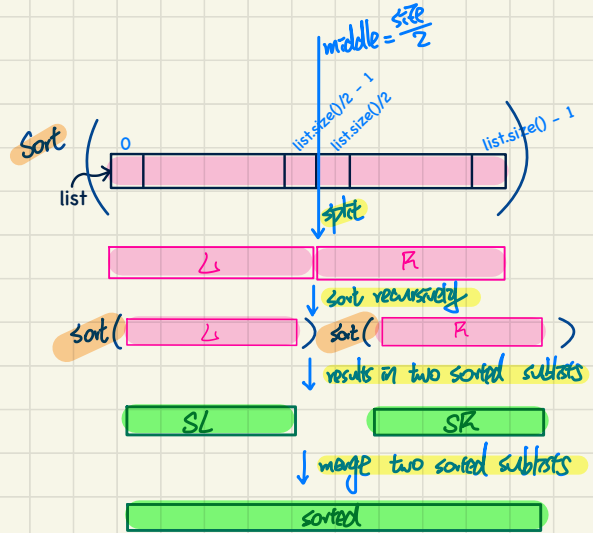
```

public List<Integer> sort(List<Integer> list) {
    List<Integer> sortedList;
    if(list.size() == 0) { sortedList = new ArrayList<>(); }
    else if(list.size() == 1) {
        sortedList = new ArrayList<>();
        sortedList.add(list.get(0));
    }
    else {
        int middle = list.size() / 2;
        List<Integer> left = list.subList(0, middle);
        List<Integer> right = list.subList(middle, list.size());
        List<Integer> sortedLeft = sort(left);
        List<Integer> sortedRight = sort(right);
        sortedList = merge(sortedLeft, sortedRight);
    }
    return sortedList;
}
    
```

*base cases*



Precondition  
L and R sorted



```

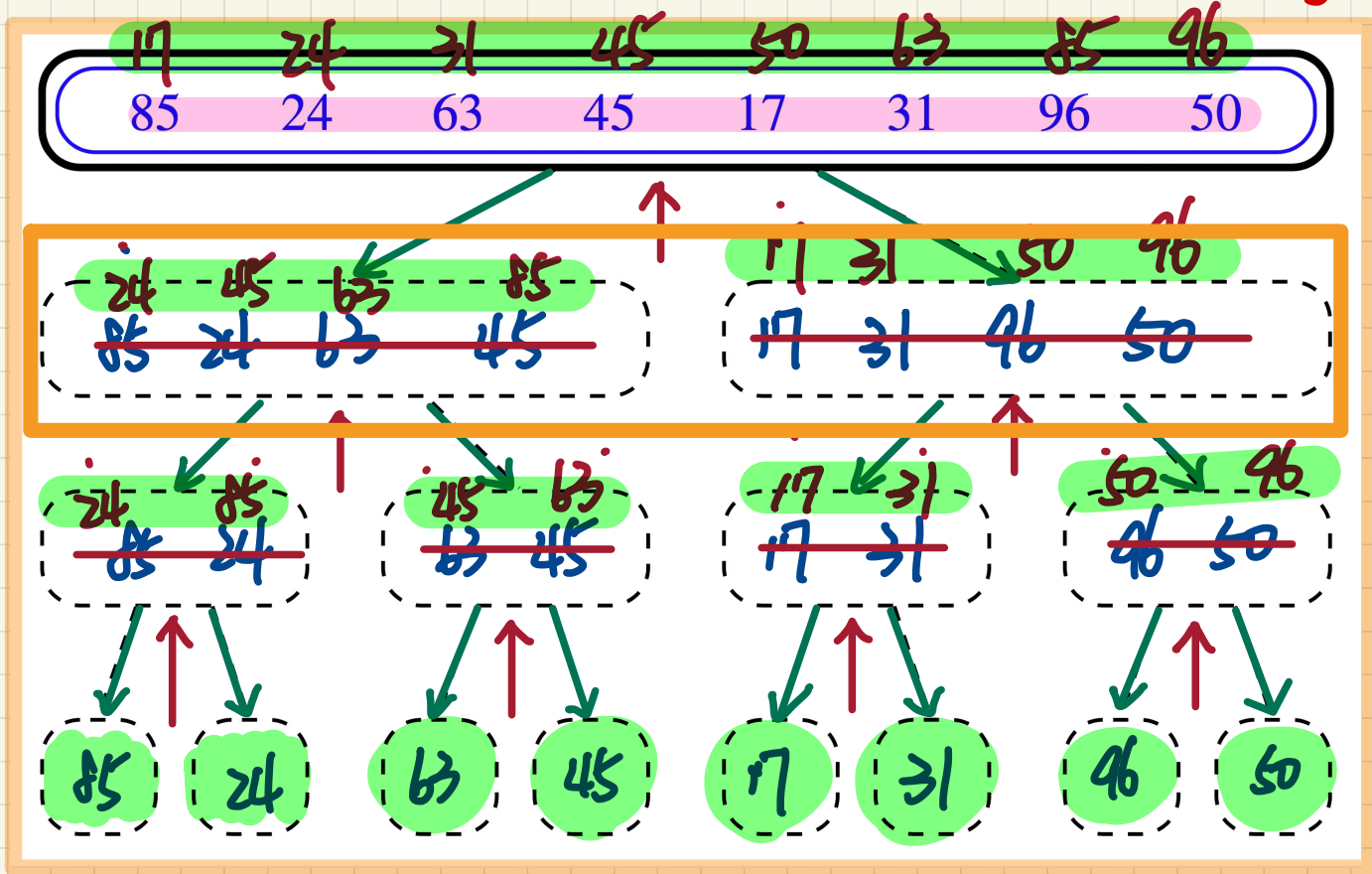
/* Assumption: L and R are both already sorted. */
private List<Integer> merge(List<Integer> L, List<Integer> R) {
    List<Integer> merge = new ArrayList<>();
    if(L.isEmpty() || R.isEmpty()) { merge.addAll(L); merge.addAll(R); }
    else {
        int i = 0;
        int j = 0;
        while(i < L.size() && j < R.size()) {
            if(L.get(i) <= R.get(j)) { merge.add(L.get(i)); i++; }
            else { merge.add(R.get(j)); j++; }
        }
        /* If i >= L.size(), then this for loop is skipped. */
        for(int k = i; k < L.size(); k++) { merge.add(L.get(k)); }
        /* If j >= R.size(), then this for loop is skipped. */
        for(int k = j; k < R.size(); k++) { merge.add(R.get(k)); }
    }
    return merge;
}
    
```



# Merge Sort: Tracing

→ split

→ merge



## Lecture 5c

### Part A

# ***Balanced Binary Search Tree - Motivation and Property***

# Worst-Case RT: BST with Linear Height



Example 1: Inserted Entries with Decreasing Keys

$\langle 100, 75, 68, 60, 50, 1 \rangle$

key

Example 2: Inserted Entries with Increasing Keys

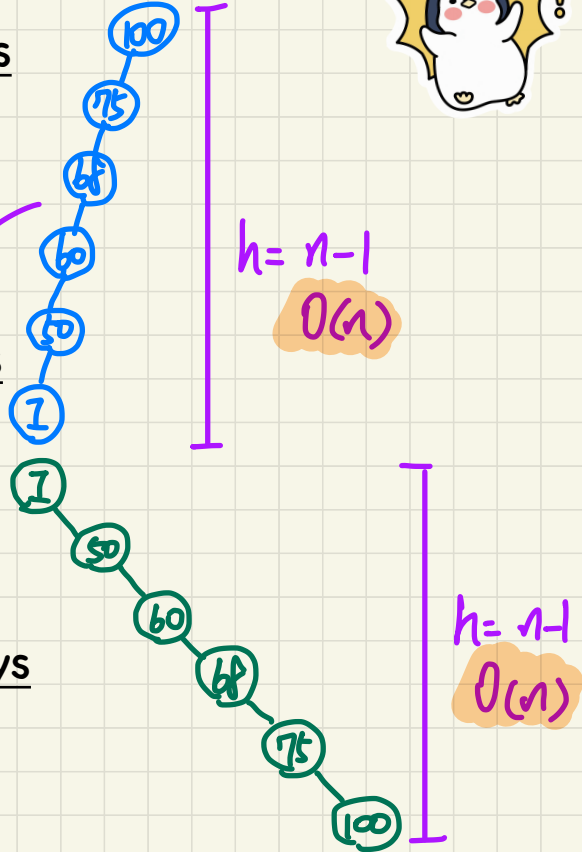
$\langle 1, 50, 60, 68, 75, 100 \rangle$

Example 3: Inserted Entries with In-Between Keys

$\langle 1, 100, 50, 75, 60, 68 \rangle$

Exercise

searching  
Worst-case  
RT:  $O(n)$



# Balanced BST: Definition

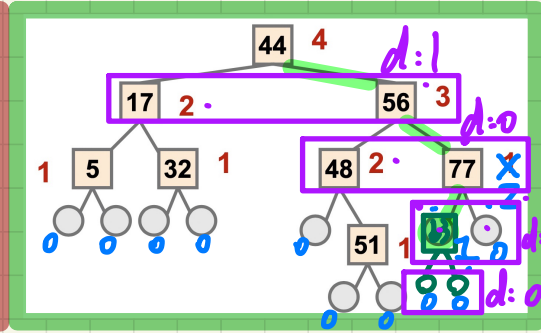
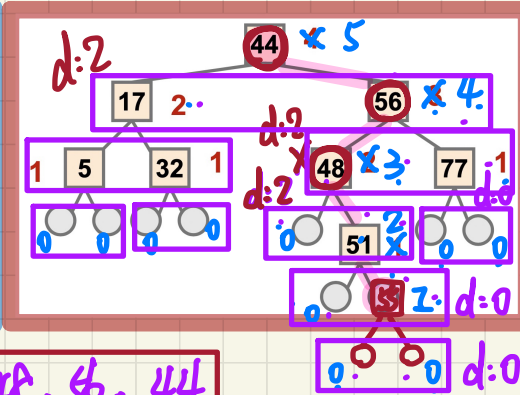
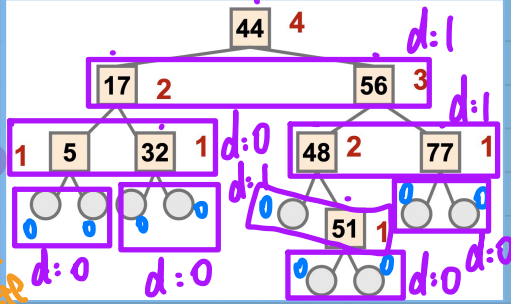


- internal node
- height
- height balance

Given a node  $p$ , the **height** of the subtree rooted at  $p$  is:

$$\text{height}(p) = \begin{cases} 0 & \text{if } p \text{ is external} \\ 1 + \text{MAX}(\{\text{height}(c) \mid \text{parent}(c) = p\}) & \text{if } p \text{ is internal} \end{cases}$$

when rotations may be needed to place



insertion path of 55: 55, 51, 48, 56, 44

unbalanced after insertion.

Q. Is the above tree a **balanced BST**? **YES**.

Q. Still a **balanced BST** after inserting 55? **NO**.

Q. Still a **balanced BST** after inserting 63? **YES**.




## Lecture 5c

### Part B

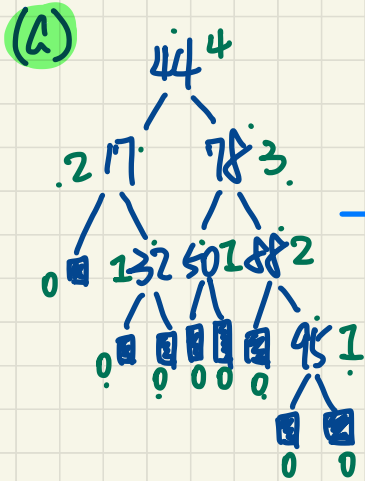
# ***Balanced Binary Search Tree - Trinode Restructuring after Insertion***

# Trinode Restructuring after Insertion: **Left Rotation**

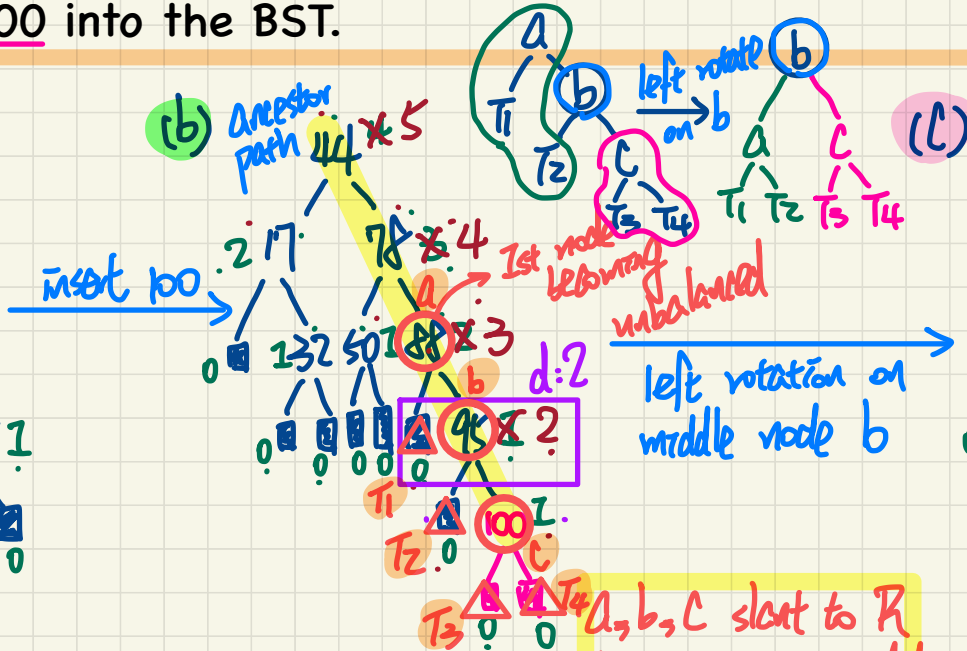
- Insert the following sequence of **keys** into an empty BST: 

$\langle 44, 17, 78, 32, 50, 88, 95 \rangle$

- Insert 100 into the BST.

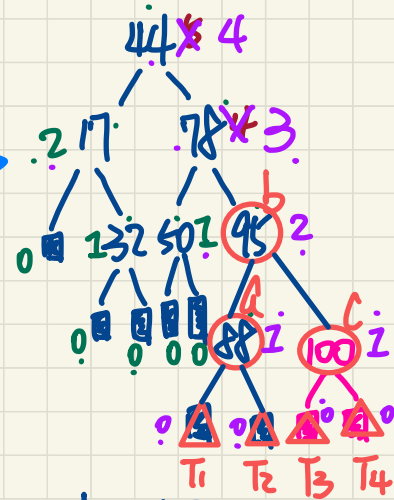


Balanced? ✓



Balanced? X

$A, b, C$  slant to R  
 $\Rightarrow$   $\angle$  rotation needed on b

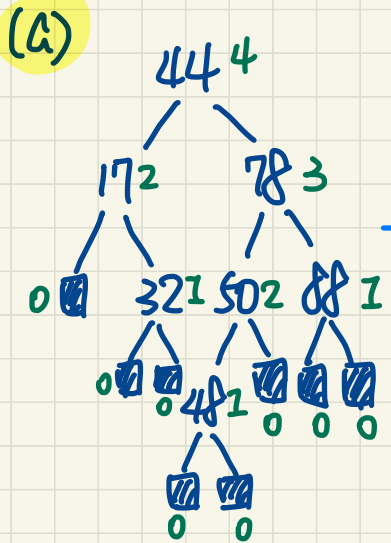


Balanced? ✓

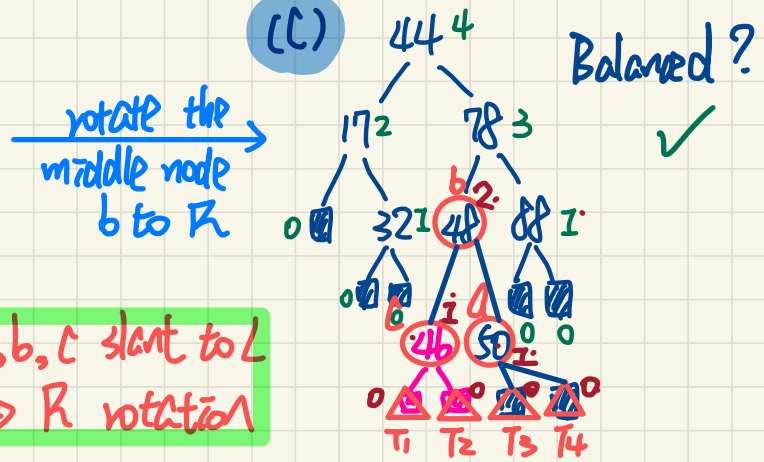
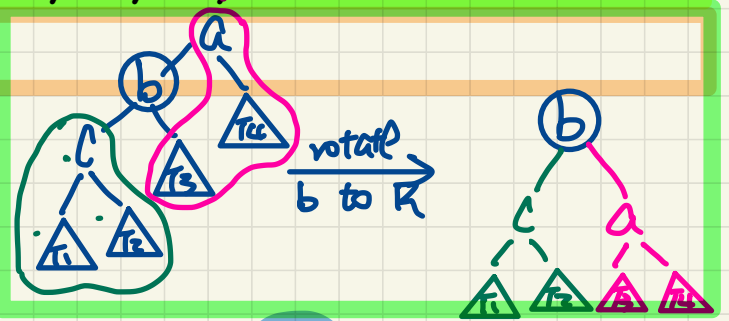
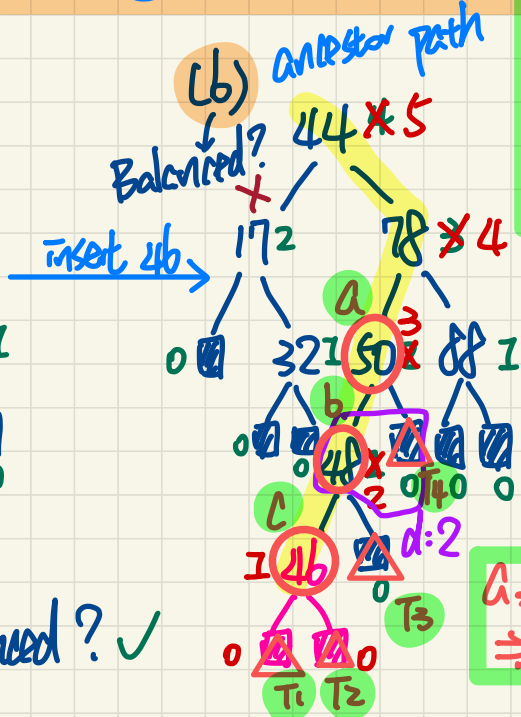
# Trinode Restructuring after Insertion: Right Rotation



- Insert the following sequence of **keys** into an empty BST:  
 $\langle 44, 17, 78, 32, 50, 88, 48 \rangle$
- Insert **46** into the BST.



Balanced? ✓



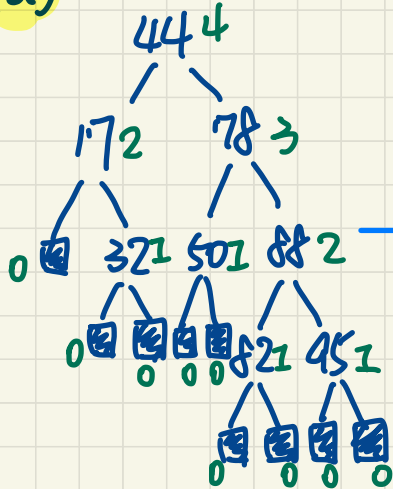


# Trinode Restructuring after Insertion: R-L Rotations



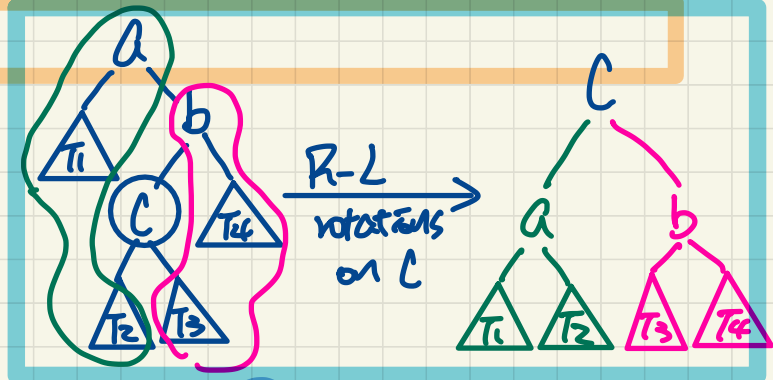
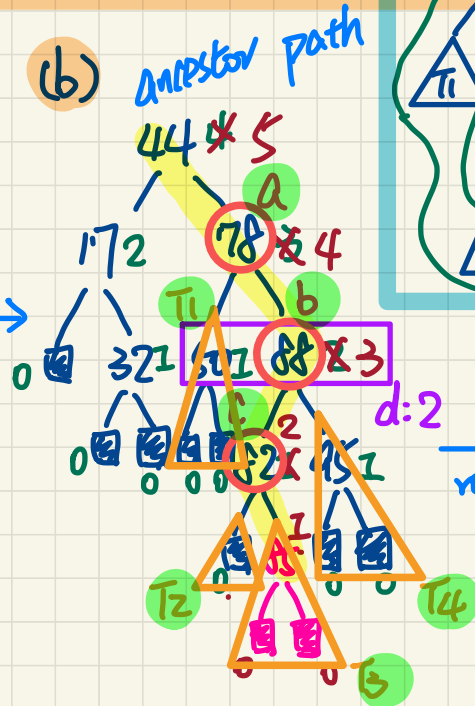
- Insert the following sequence of **keys** into an empty BST:  
 $\langle 44, 17, 78, 32, 50, 88, 82, 95 \rangle$
- Insert **85** into the BST.

(A)

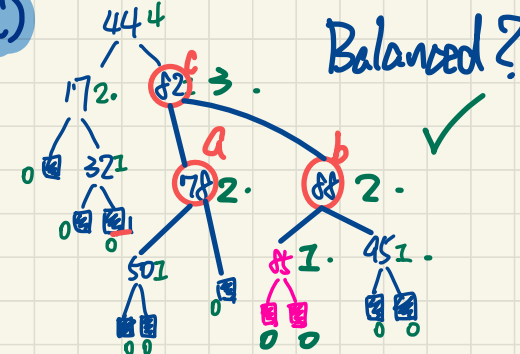


Balanced? ✓

(b)



(c)



Balanced? ✓

## Trinode Restructuring after Insertion: L-R Rotations



- Insert the following sequence of **keys** into an empty BST:  
<44, 17, 78, 32, 50, 88, 48, 62>
- Insert 54 into the BST.

Exercise

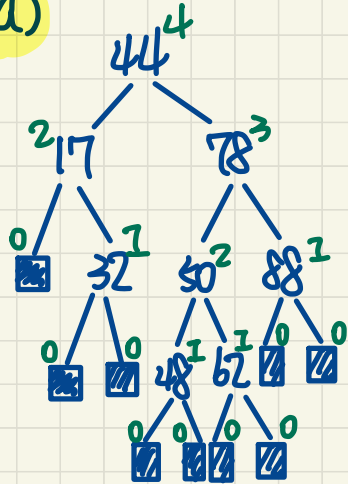
# Trinode Restructuring after Insertion: L-R Rotations

Solution



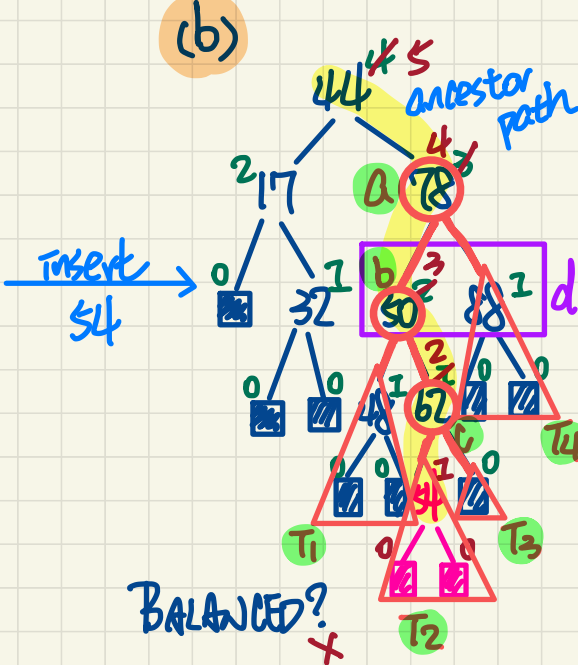
- Insert the following sequence of **keys** into an empty BST:  
 $\langle 44, 17, 78, 32, 50, 88, 48, 62 \rangle$
- Insert **54** into the BST.

(a)

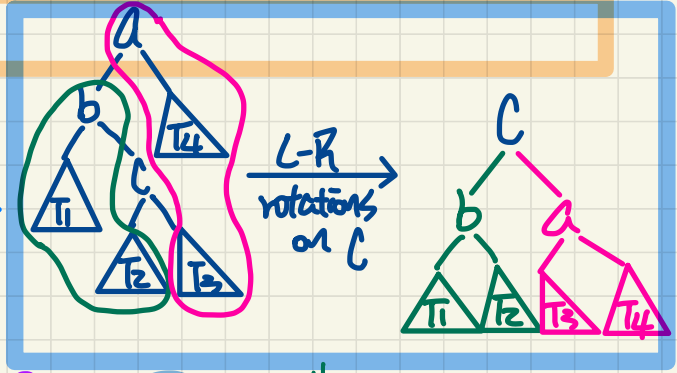


BALANCED? ✓

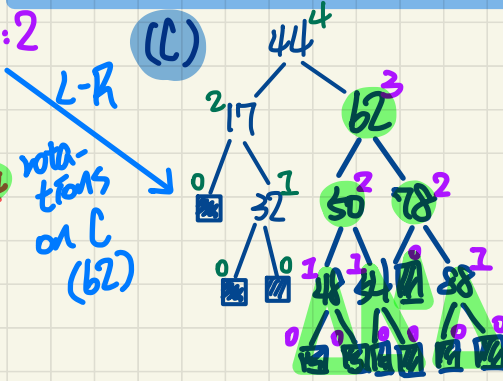
(b)



BALANCED? ✗



(c)



BALANCED? ✓

## Lecture 5c

### Part C

# ***Balanced Binary Search Tree - Trinode Restructuring after Deletion***

## Trinode Restructuring after Deletion: Single Rotation

- Insert the following sequence of **keys** into an empty BST:

<44, 17, 62, 32, 50, 78, 48, 54, 88>

- Delete 32 from the BST.

Exercise



# Trinode Restructuring after Deletion: Single Rotation

- Insert the following sequence of **keys** into an empty BST:

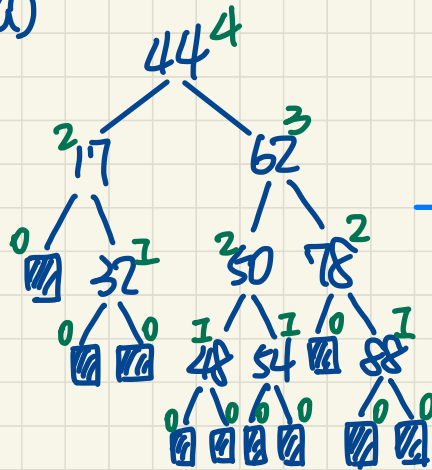
<44, 17, 62, 32, 50, 78, 48, 54, 88>

- Delete 32 from the BST.

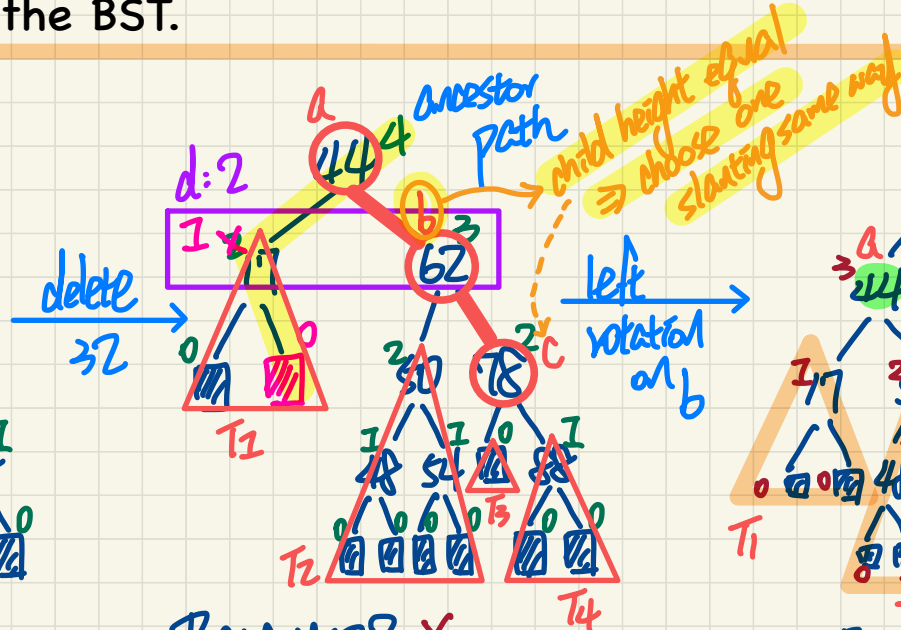


Solution

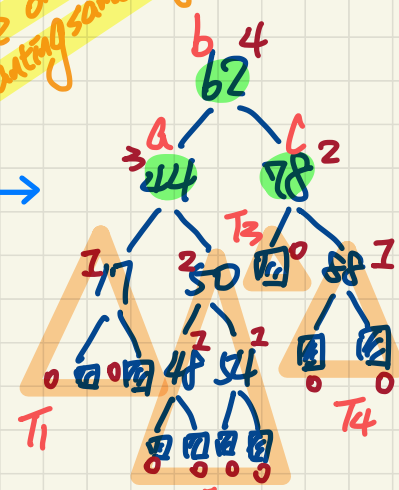
(a)



BALANCED? ✓



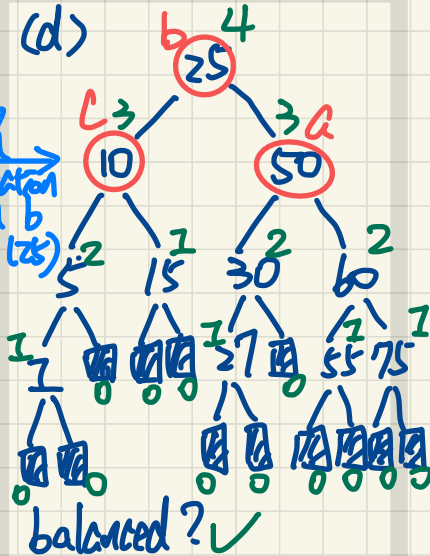
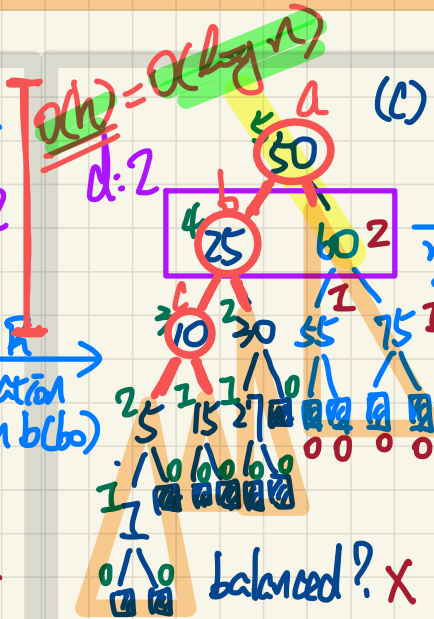
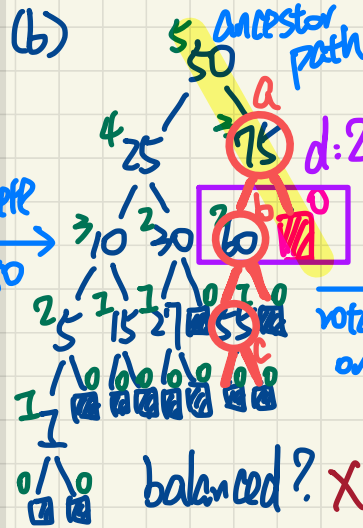
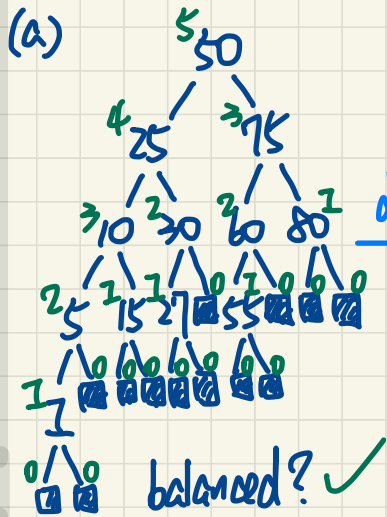
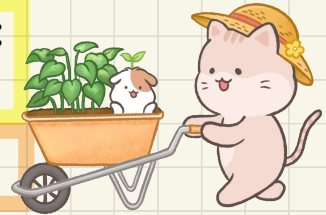
BALANCED? ✗



BALANCED? ✓

# Trinode Restructuring after Deletion: Multiple Rotations

- Insert the following sequence of **keys** into an empty BST:  
 $\langle 50, 25, 10, 30, 5, 15, 27, 1, 75, 60, 80, 55 \rangle$
- Delete **80** from the BST.



# Lecture 4

## Part C

***Examples on Recursion  
Merge Sort  
(continued)***

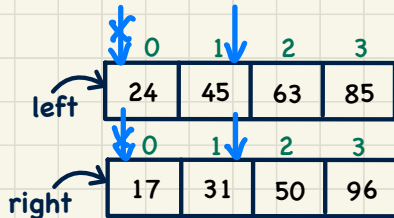
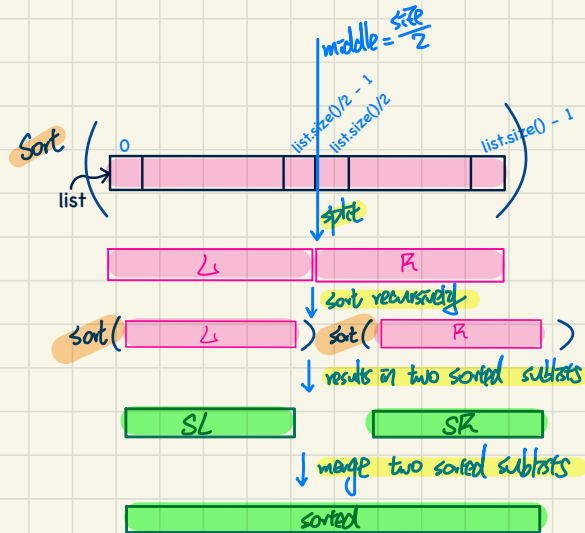


# Merge Sort in Java

```

public List<Integer> sort(List<Integer> list) {
    List<Integer> sortedList;
    if(list.size() == 0) { sortedList = new ArrayList<>(); }
    else if(list.size() == 1) {
        sortedList = new ArrayList<>();
        sortedList.add(list.get(0));
    }
    else {
        int middle = list.size() / 2;
        List<Integer> left = list.subList(0, middle);
        List<Integer> right = list.subList(middle, list.size());
        List<Integer> sortedLeft = sort(left);
        List<Integer> sortedRight = sort(right);
        sortedList = merge(sortedLeft, sortedRight);
    }
    return sortedList;
}
    
```

base cases



Precondition  
L and R sorted



```

/* Assumption: L and R are both already sorted. */
private List<Integer> merge(List<Integer> L, List<Integer> R) {
    List<Integer> merge = new ArrayList<>();
    if(L.isEmpty() || R.isEmpty()) { merge.addAll(L); merge.addAll(R); }
    else {
        int i = 0;
        int j = 0;
        while(i < L.size() && j < R.size()) {
            if(L.get(i) <= R.get(j)) { merge.add(L.get(i)); i++; }
            else { merge.add(R.get(j)); j++; }
        }
        /* If i >= L.size(), then this for loop is skipped. */
        for(int k = i; k < L.size(); k++) { merge.add(L.get(k)); }
        /* If j >= R.size(), then this for loop is skipped. */
        for(int k = j; k < R.size(); k++) { merge.add(R.get(k)); }
    }
    return merge;
}
    
```

(a) # iterations:  $\min(L.size(), R.size())$

```

while(i < L.size() && j < R.size()) {
    if(L.get(i) <= R.get(j)) { merge.add(L.get(i)); i++; }
    else { merge.add(R.get(j)); j++; }
}
    
```

```

for(int k = i; k < L.size(); k++) { merge.add(L.get(k)); }
for(int k = j; k < R.size(); k++) { merge.add(R.get(k)); }
    
```

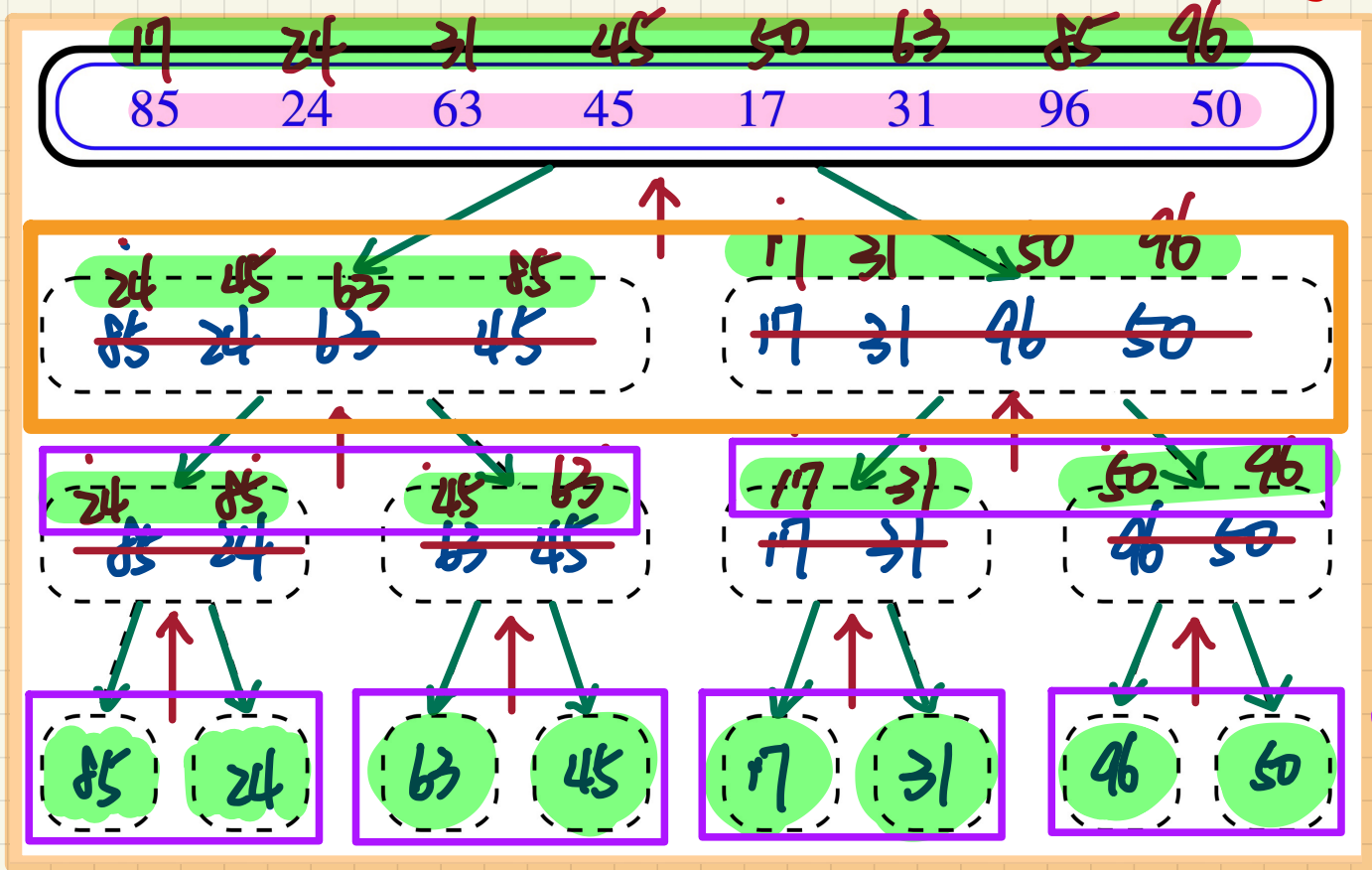
(b) # iterations: remaining # of items to loop over in the longer list.

$(a) + (b) = L.size() + R.size()$

# Merge Sort: Tracing

→ split

→ merge



$O(n)$

$O(n)$



# Merge Sort: Running Time

size =  $\frac{n}{2}$

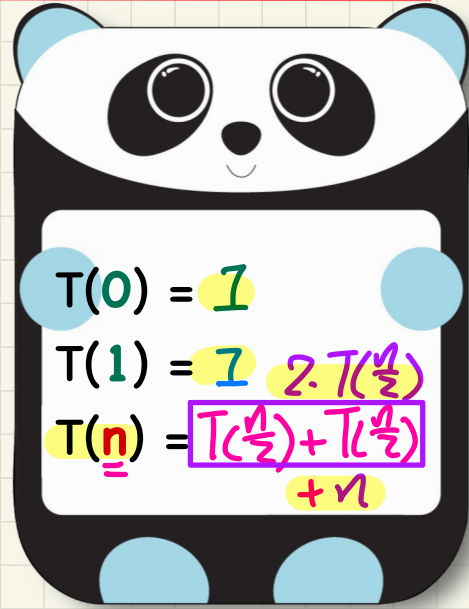
```

public List<Integer> sort(List<Integer> list) {
    List<Integer> sortedList;
    if(list.size() == 0) { sortedList = new ArrayList<>(); }
    else if(list.size() == 1) {
        sortedList = new ArrayList<>();
        sortedList.add(list.get(0));
    }
    else {
        int middle = list.size() / 2;
        List<Integer> left = list.subList(0, middle);
        List<Integer> right = list.subList(middle, list.size());
        List<Integer> sortedLeft = sort(left);
        List<Integer> sortedRight = sort(right);
        sortedList = merge(sortedLeft, sortedRight);
    }
    return sortedList;
}
    
```

sort(left)  
sort(right)

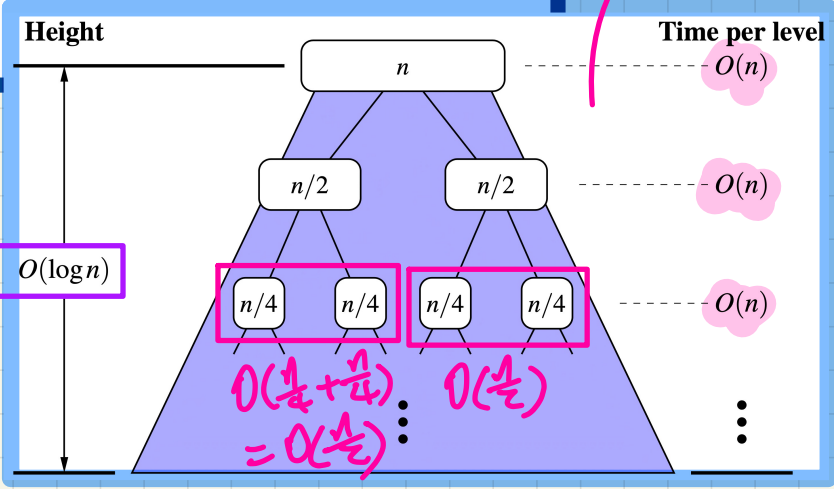
recursion tree is a full BT

## Running Time as a Recurrence Relation



$T(0) = 1$   
 $T(1) = 1 + 2 \cdot T(\frac{n}{2})$   
 $T(n) = T(\frac{n}{2}) + T(\frac{n}{2}) + n$

Total RT:  
 $O(\log n \times n)$   
 $= O(n \cdot \log n)$   
 height of balanced BST



## Running Time: Unfolding Recurrence Relation

$$T(0) = 1$$

$$T(1) = 1$$

$$T(n) = 2 \cdot T(n/2) + n$$

$$I = \frac{n}{n} = \frac{n}{2^{\log n}}$$

$$n=8 \\ 2^{\log 8} = 8$$

$$T(n) = 2 \cdot T\left(\frac{n}{2}\right) + n$$

$$= 2 \cdot \left(2 \cdot T\left(\frac{n}{4}\right) + \frac{n}{2}\right) + n \quad [4 \cdot T\left(\frac{n}{4}\right) + 2n]$$

$$= 2 \cdot \left(2 \cdot \left(2 \cdot T\left(\frac{n}{8}\right) + \frac{n}{4}\right) + \frac{n}{2}\right) + n \quad [8 \cdot T\left(\frac{n}{8}\right) + 3n]$$

⋮

$$= \frac{2^{\log n}}{n} \cdot T(1) + \log n \cdot n = n + n \cdot \log n \\ = O(n \cdot \log n)$$



# Lecture 4

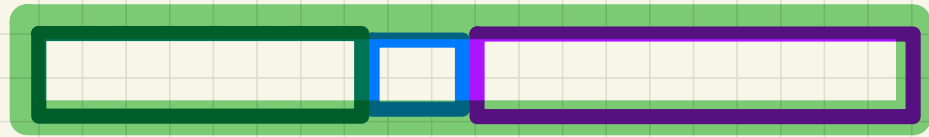
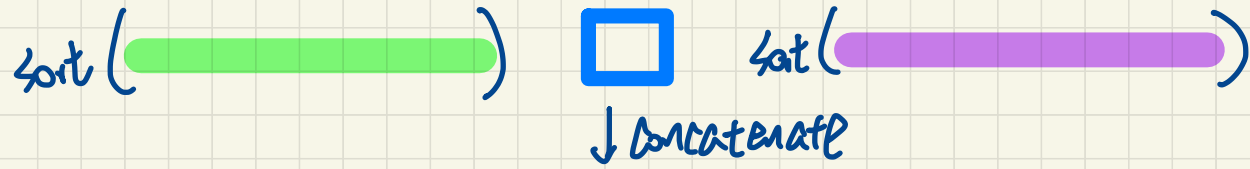
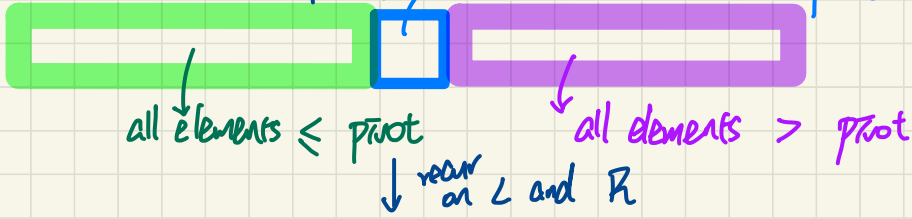
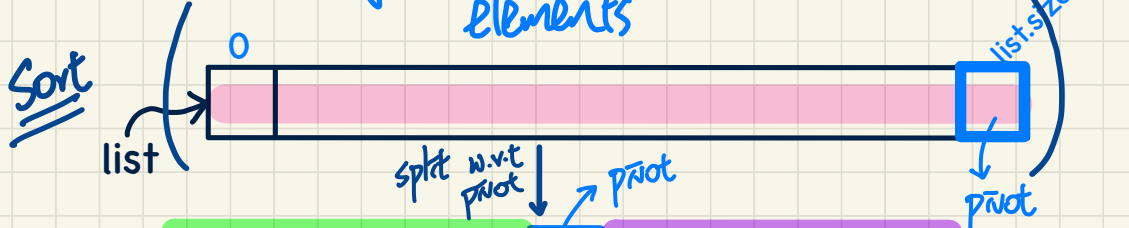
## Part D

***Examples on Recursion***  
***Quick Sort***

# Quick Sort: Ideas



pivot: ideally the median value of the list elements



sorted version of input list.

# Quick Sort in Java

```

public List<Integer> sort(List<Integer> list) {
    List<Integer> sortedList;
    if(list.size() == 0) { sortedList = new ArrayList<>(); }
    else if(list.size() == 1) {
        sortedList = new ArrayList<>(); sortedList.add(list.get(0));
    }
    else {
        int pivotIndex = list.size() - 1;
        int pivotValue = list.get(pivotIndex);
        List<Integer> left = allLessThanOrEqualTo(pivotIndex, list);
        List<Integer> right = allLargerThan(pivotIndex, list);
        List<Integer> sortedLeft = sort(left);
        List<Integer> sortedRight = sort(right);
        sortedList = new ArrayList<>();
        sortedList.addAll(sortedLeft);
        sortedList.add(pivotValue);
        sortedList.addAll(sortedRight);
    }
    return sortedList;
}
    
```

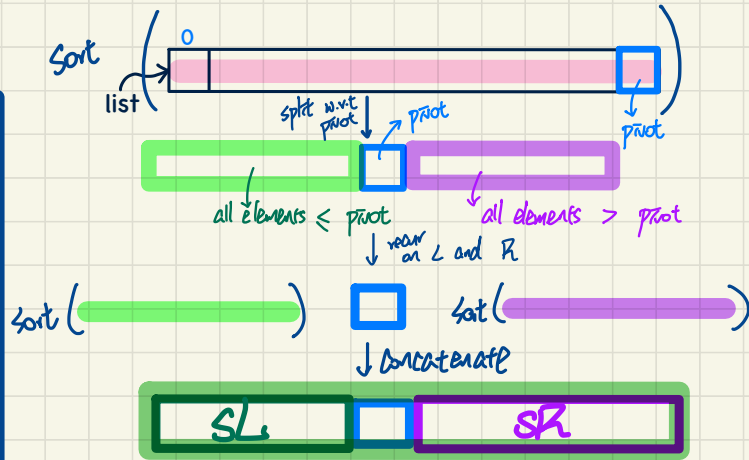
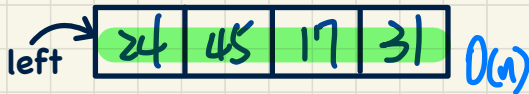
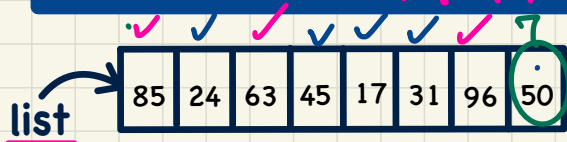
*base cases*

*0(1)*

*1. Best case: pivot is st.  $|L| \approx |R|$*

*2. Worst case:  $|L| \ll |R|$  or  $|R| \ll |L|$*

*OLN*



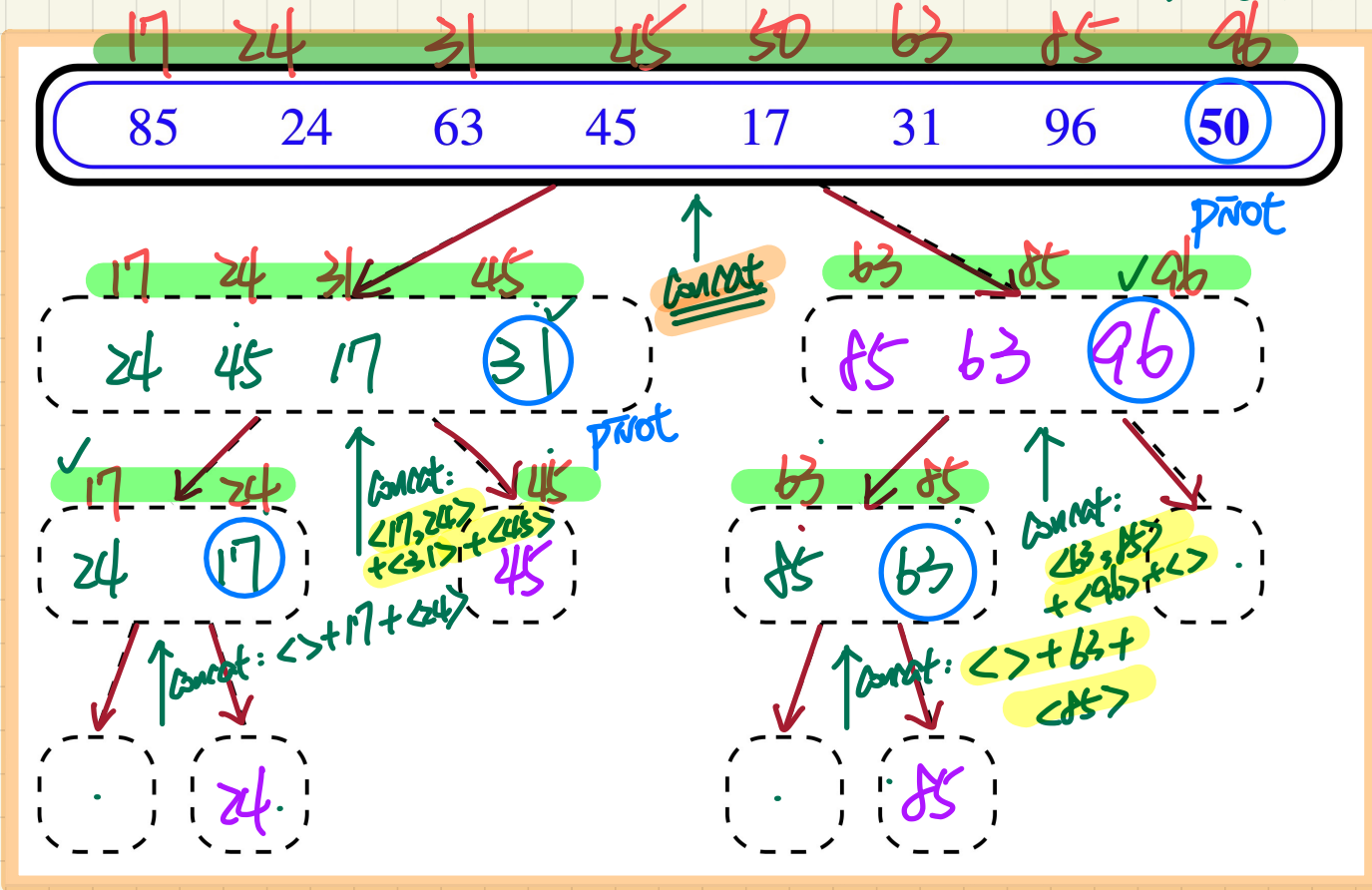
```

List<Integer> allLessThanOrEqualTo(int pivotIndex, List<Integer> list) {
    List<Integer> sublist = new ArrayList<>();
    int pivotValue = list.get(pivotIndex);
    for(int i = 0; i < list.size(); i++) {
        int v = list.get(i);
        if(i != pivotIndex && v <= pivotValue) { sublist.add(v); }
    }
    return sublist;
}

List<Integer> allLargerThan(int pivotIndex, List<Integer> list) {
    List<Integer> sublist = new ArrayList<>();
    int pivotValue = list.get(pivotIndex);
    for(int i = 0; i < list.size(); i++) {
        int v = list.get(i);
        if(i != pivotIndex && v > pivotValue) { sublist.add(v); }
    }
    return sublist;
}
    
```

# Quick Sort: Tracing

→ split  
→ concatenate





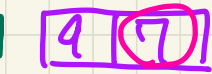
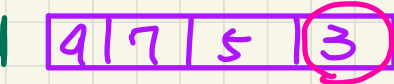
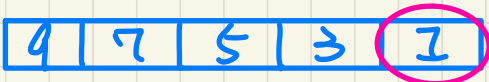
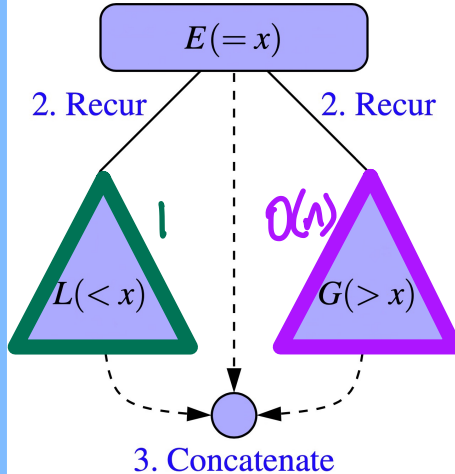
# Quick Sort: Worst-Case Running Time

```

public List<Integer> sort(List<Integer> list) {
    List<Integer> sortedList;
    • if(list.size() == 0) { sortedList = new ArrayList<>(); }
    • else if(list.size() == 1) {
        sortedList = new ArrayList<>(); sortedList.add(list.get(0)); }
    else {
        int pivotIndex = list.size() - 1;
        int pivotValue = list.get(pivotIndex);
        List<Integer> left = allLessThanOrEqualTo(pivotIndex, list);
        List<Integer> right = allLargerThan(pivotIndex, list);
        List<Integer> sortedLeft = sort(left);
        List<Integer> sortedRight = sort(right);
        sortedList = new ArrayList<>();
        sortedList.addAll(sortedLeft);
        sortedList.add(pivotValue);
        sortedList.addAll(sortedRight);
    }
    return sortedList;
}
    
```

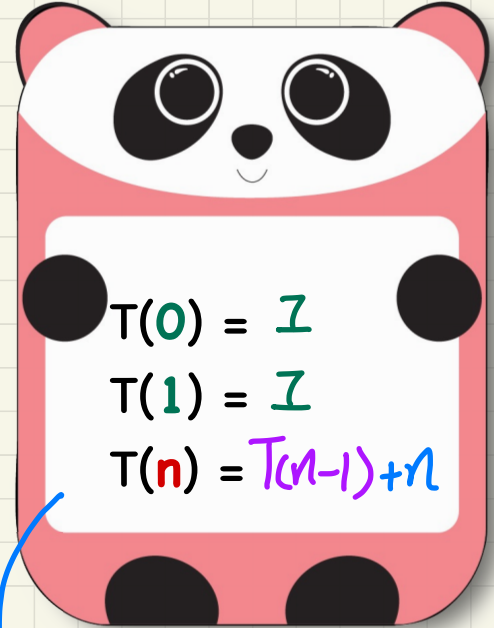
$O(n)$

1. Split using pivot  $x$



# splits:  
4  $O(n)$

## Running Time as a Recurrence Relation



$$T(0) = 1$$

$$T(1) = 1$$

$$T(n) = T(n-1) + n$$

Exercise: Solve by unrolling

# Quick Sort: Best-Case Running Time

log<sub>2</sub>n

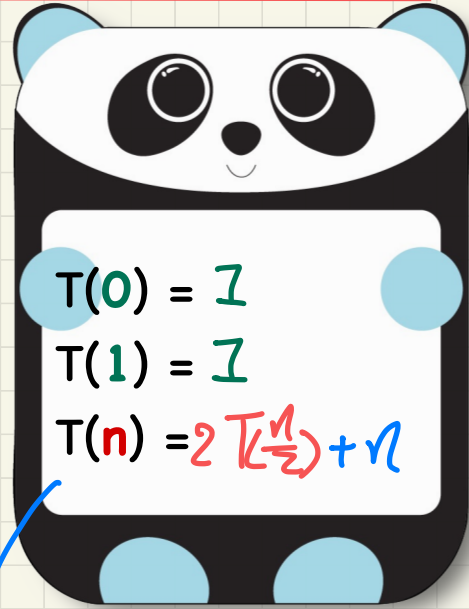
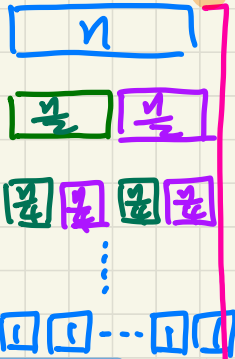
Running Time as a Recurrence Relation

```

public List<Integer> sort(List<Integer> list) {
    List<Integer> sortedList;
    if(list.size() == 0) { sortedList = new ArrayList<>(); }
    else if(list.size() == 1) {
        sortedList = new ArrayList<>(); sortedList.add(list.get(0));
    }
    else {
        int pivotIndex = list.size() - 1;
        int pivotValue = list.get(pivotIndex);
        List<Integer> left = allLessThanOrEqualTo(pivotIndex, list);
        List<Integer> right = allLargerThan(pivotIndex, list);
        List<Integer> sortedLeft = sort(left);
        List<Integer> sortedRight = sort(right);
        sortedList = new ArrayList<>();
        sortedList.addAll(sortedLeft);
        sortedList.add(pivotValue);
        sortedList.addAll(sortedRight);
    }
    return sortedList;
}
    
```

$O(1)$

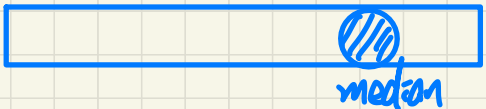
$O(n)$



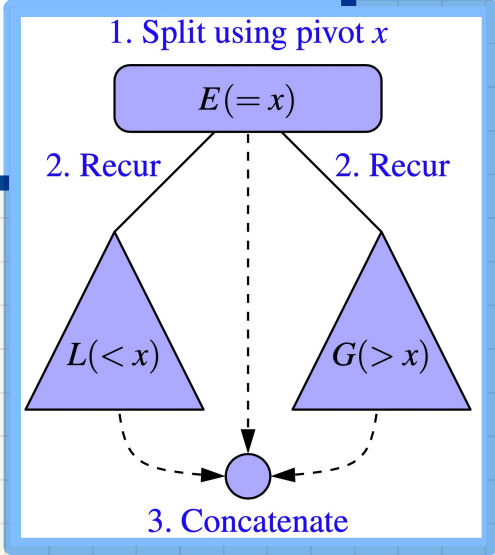
$$T(0) = 1$$

$$T(1) = 1$$

$$T(n) = 2T\left(\frac{n}{2}\right) + n$$



sizes equal



Ex. 2 Exercise: solve by Unfolding.

$$T(0) = 1$$

$$T(1) = 1$$

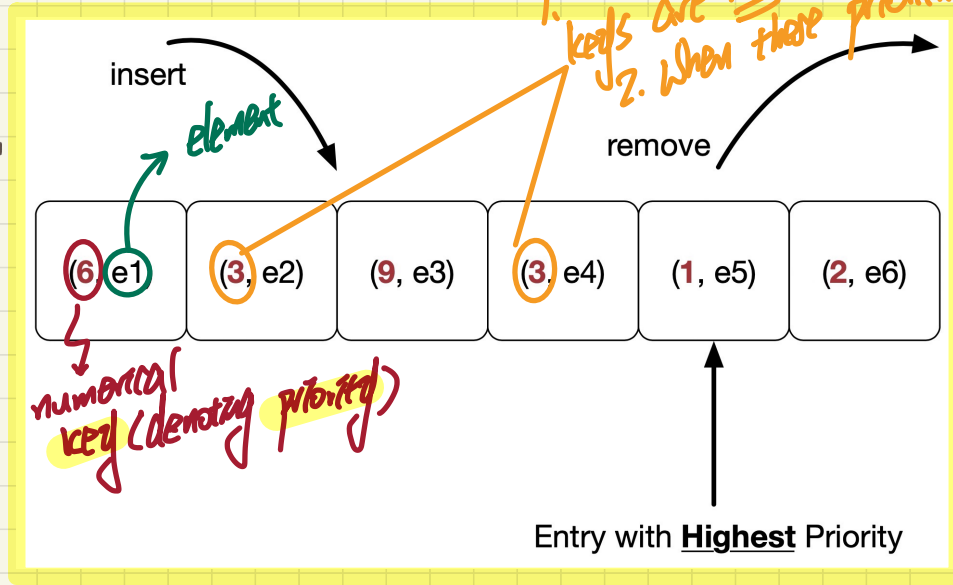
$$T(n) = T\left(\frac{n}{2}\right) + T\left(\frac{n}{2}\right) + n$$

# Lecture 5d

## Part A

### ***Priority Queue - Intro & List-Based Implementations***

# What is a Priority Queue (PQ)



1. In PQ, no notions of "front" or "end" of the q.
2. The lower the key value of an entry, the higher its priority is.  
↳ the entry with the minimum key value has the highest priority.

# List-Based Implementations of Priority Queue (PQ)

e.g. of app has more frequent calls to "min"  $\Rightarrow$  choose A1

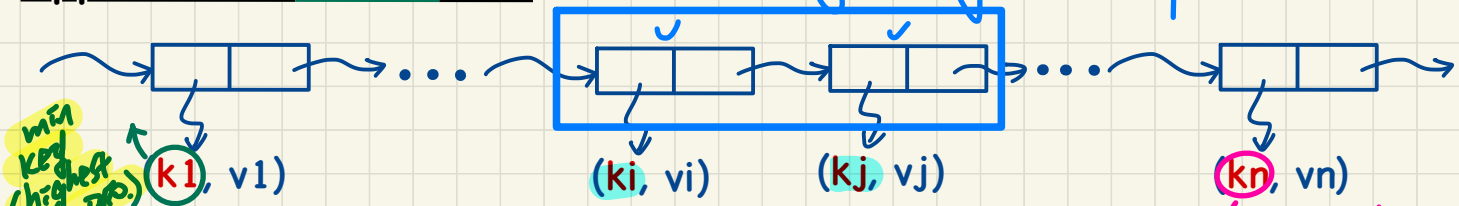
| PQ Method | List Method                   |                              |
|-----------|-------------------------------|------------------------------|
|           | A1                            | A2                           |
|           | <b>SORTED LIST</b>            | <b>UNSORTED LIST</b>         |
| size      | list.size $O(1)$              | list.size $O(1)$             |
| isEmpty   | list.isEmpty $O(1)$           | list.isEmpty $O(1)$          |
| min       | list.first $O(1)$             | search min $O(n)$            |
| insert    | insert to "right" spot $O(n)$ | insert to front $O(1)$       |
| removeMin | list.removeFirst $O(1)$       | search min and remove $O(n)$ |

## EXERCISE

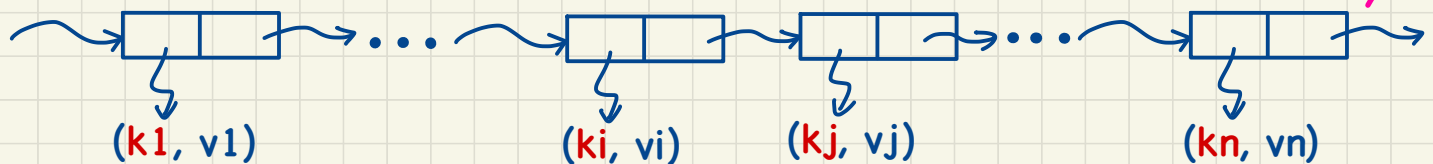
Use DLL for A1 & A2.  
Does it make a difference to RT?

### Approach 1: Sorted List

$k_i \leq k_j$  (entry  $i$  "more important" than entry  $j$ )



### Approach 2: Unsorted List



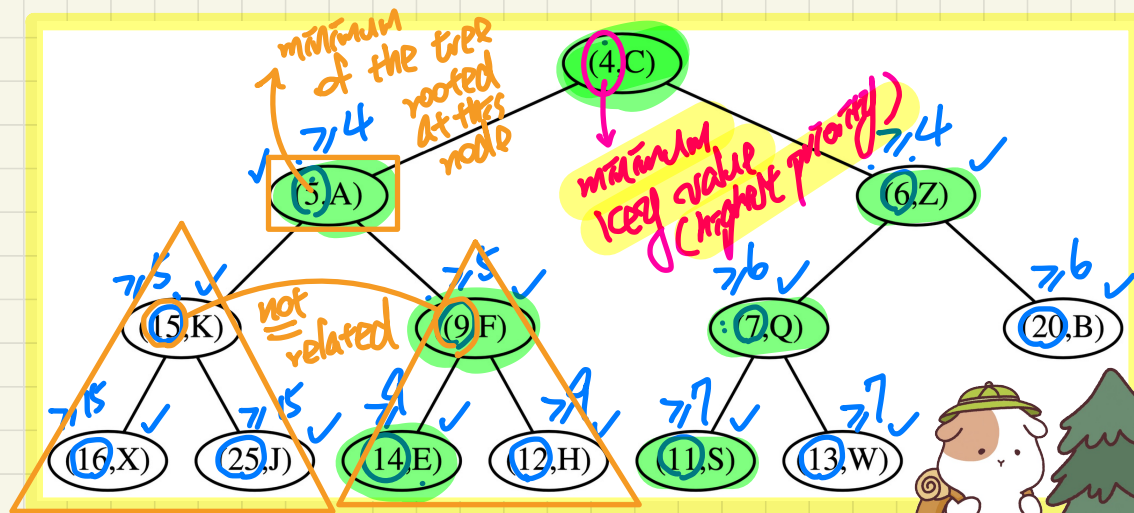
# Lecture 5d

## Part B

### *Heaps - Examples and Properties*

# Heaps: Relational Properties of Keys

**Property:** Each non-root node  $n$  is s.t.  $\text{key}(n) \geq \text{key}(\text{parent}(n))$



P1. Any leaf-to-root path has a sorted seq of keys.

P2. the minimum key exists in the root entry.

P3. key values between LST and RST are not related.

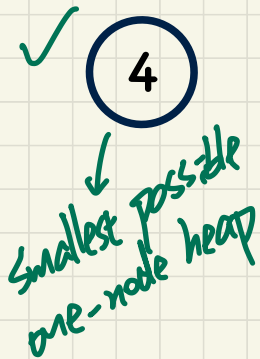




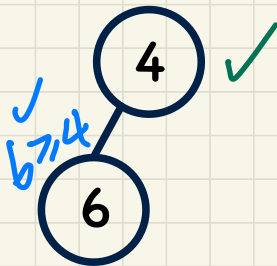


# Example Heaps < relational structural

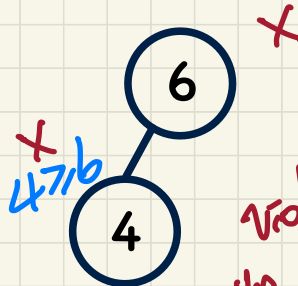
Example 1



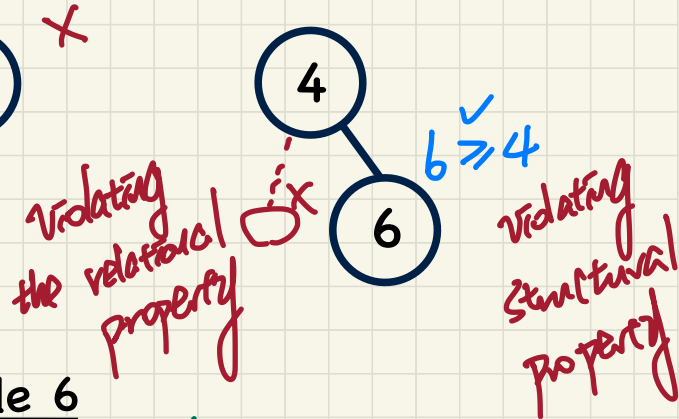
Example 2



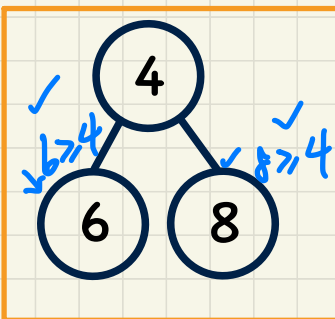
Example 3



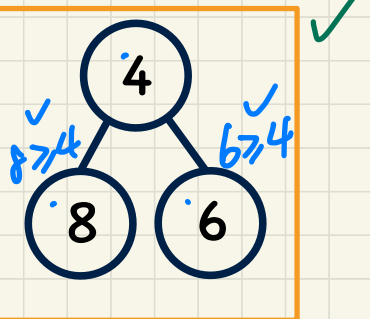
Example 4



Example 5



Example 6



full BTs  
⇒ complete BTs

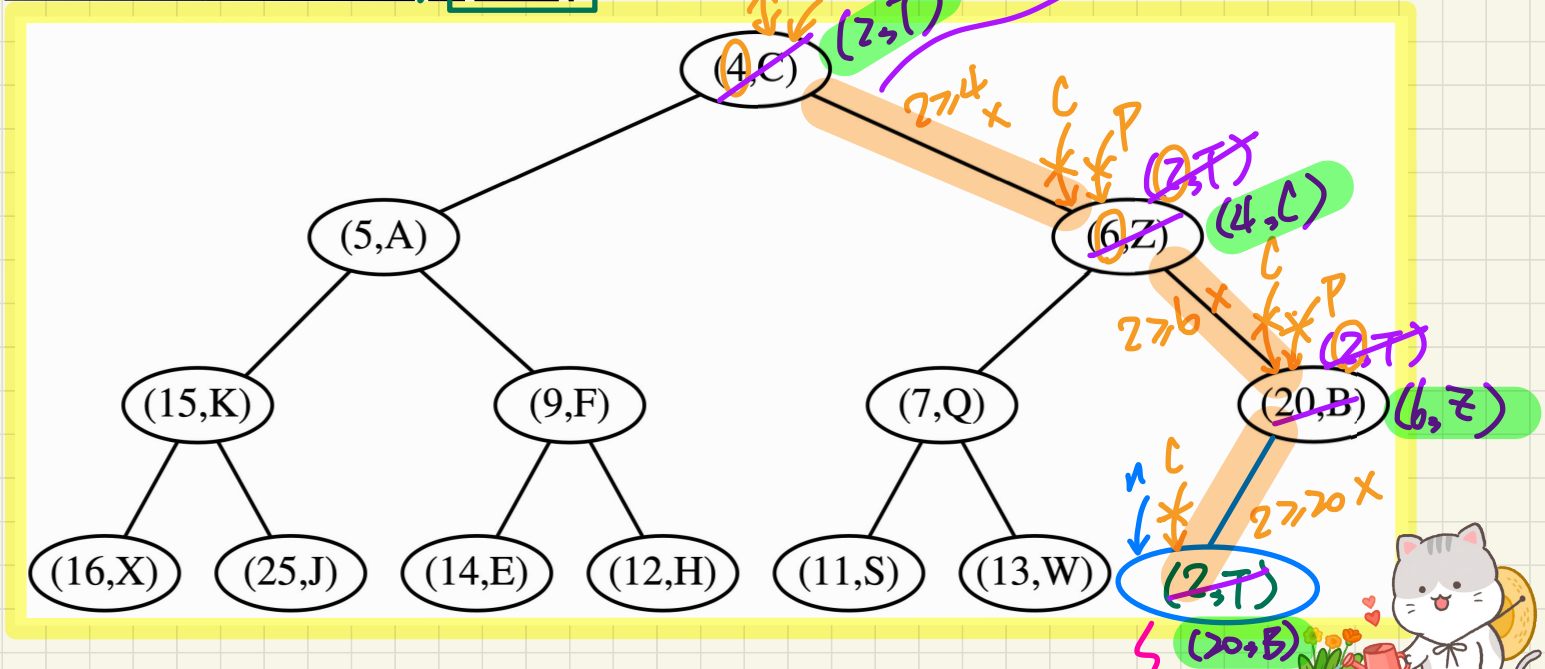
# Lecture 5d

## Part C

### *Heaps - Insertions*

# Heap Operations: Insertion

Insert a new entry (2, T) <sup>e</sup>



must be right-most at level  $h$  in order to preserve structural property



# Lecture 5d

## Part D

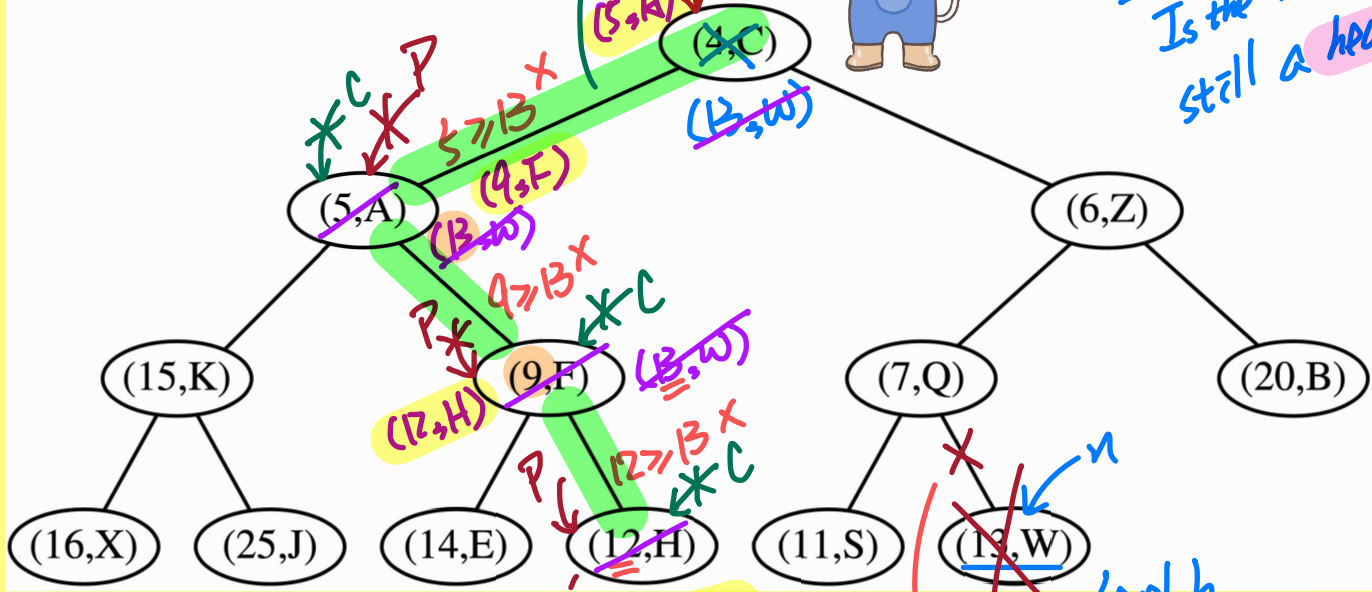
### *Heaps - Deletions*

# Heap Operations: Deletion

root-to-leaf path (down-heap bubbling)

Delete the root/minimum

Exercise  
Is the resulting tree still a heap?



external node

At Level h, nodes are still filled from L to R ⇒ complete BT

# Lecture 5d

## Part E

### *Heaps - Top-Down Heap Construction*

# Top-Down Heap Construction

**Problem:** Build a heap out of  $N$  entries, supplied one at a time.

- Initialize an *empty heap*  $h$ .
- As each new entry  $e = (k, v)$  is supplied, insert  $e$  into  $h$ .

RI: # nodes at level  $i$   
 $* \sum_{i=0}^{h-1} 2^i \leq \lg n$  # up-heap building steps  
 root  
 $+ 2^1 \cdot 2 \leq \lg n$   
 $+ \dots$   
 $+ 2^h \cdot h \lg n$

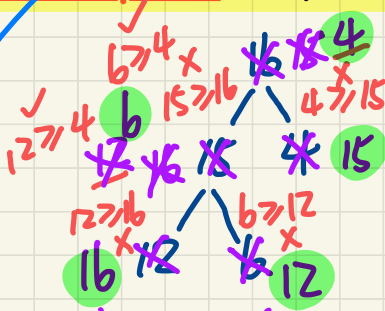
**Exercise:** Build a heap out of the following 15 keys:

<16, 15, 4, 12, 6, 7, 23, 20, 25, 9, 11, 17, 5, 8, 14>

**Assumption:** Key values supplied one at a time.



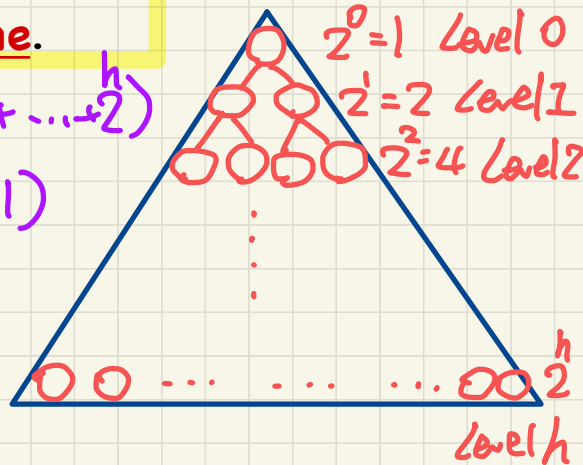
First inserted to level 1



$* \leq 1 + \lg_2 n \cdot (2^1 + 2^2 + \dots + 2^h)$   
 $= 1 + \lg_2 n (n - 1)$

$O(n \cdot \lg n)$

Exercise: Complete inserting the remaining keys to the heap.



# Lecture 5d

## Part F

### *Heaps - Bottom-Up Heap Construction*



# Bottom-Up Heap Construction

**Problem:** Build a heap out of  $N$  entries, supplied all at once.

- **Assume:** The resulting heap will be **completely filled** at all levels.

$N = 2^{h+1} - 1$  for some **height**  $h \geq 1$  [  $h = (\log(N + 1)) - 1$  ]

- Perform the following steps called **Bottom-Up Heap Construction**:

**Step 1** Treat the first  $\frac{N+1}{2}$  list entries as heap roots.  
 $\therefore \frac{N+1}{2}$  heaps with height 0 and size  $2^0 - 1$  constructed.

**Step 2** Treat the next  $\frac{N+1}{2}$  list entries as heap roots.  
 ◇ Each **root** sets two heaps from **Step 1** as its **LST** and **RST**.  
 ◇ Perform **down-heap bubbling** to restore **HOP** if necessary.  
 $\therefore \frac{N+1}{2}$  heaps, each with height 1 and size  $2^2 - 1$  constructed.

**Step  $h+1$ :** Treat next  $\frac{N+1}{2^{h+1}} = \frac{(2^{h+1}-1)+1}{2^{h+1}} = 1$  list entry as heap root.  
 ◇ Each **root** sets two heaps from **Step  $h$**  as its **LST** and **RST**.  
 ◇ Perform **down-heap bubbling** to restore **HOP** if necessary.  
 $\therefore \frac{N+1}{2^{h+1}} = 1$  heap, each with height  $h$  and size  $2^{h+1} - 1$  constructed.

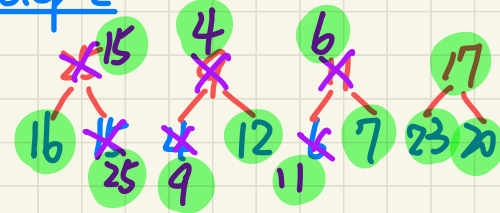
50% Step 1

8 heaps, size 1, height 0

16 15 4 12 6 7 23 20

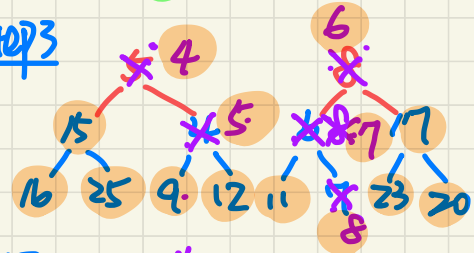
Step 2

25%

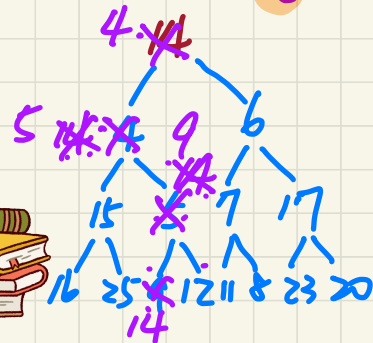


Step 3

12.5%



Step



Step 3: 8 heaps

NH: 2^3

Size of each heap: 2^3  
 height of each heap: 3

**Exercise:** Build a **heap** out of the following 15 keys:

<16, 15, 4, 12, 6, 7, 23, 20, 25, 9, 11, 17, 5, 8, 14>

**Assumption:** Key values supplied all at once.



# Lecture 5d

## Part G

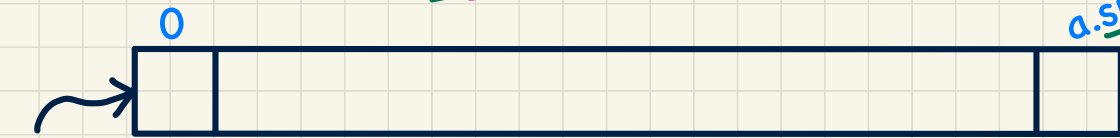
### *Heaps - Heap Sort Algorithm*

# Heap Sort: Ideas

$O(N \cdot \log N)$

$N$  entries

$a.size() - 1$



Construct a heap out of  $N$  entries

(A) Top-Down

(B) Bottom-Up

Selection Sort



select the min from unsorted portion & put it to the front/end of the list



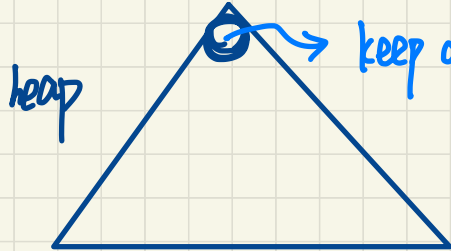
$O(N \cdot \log N)$



$O(N)$

$\approx$  Selection Sort

exploit the HOP (relational property): root stores entry with min key



keep deleting the root until the heap is empty.

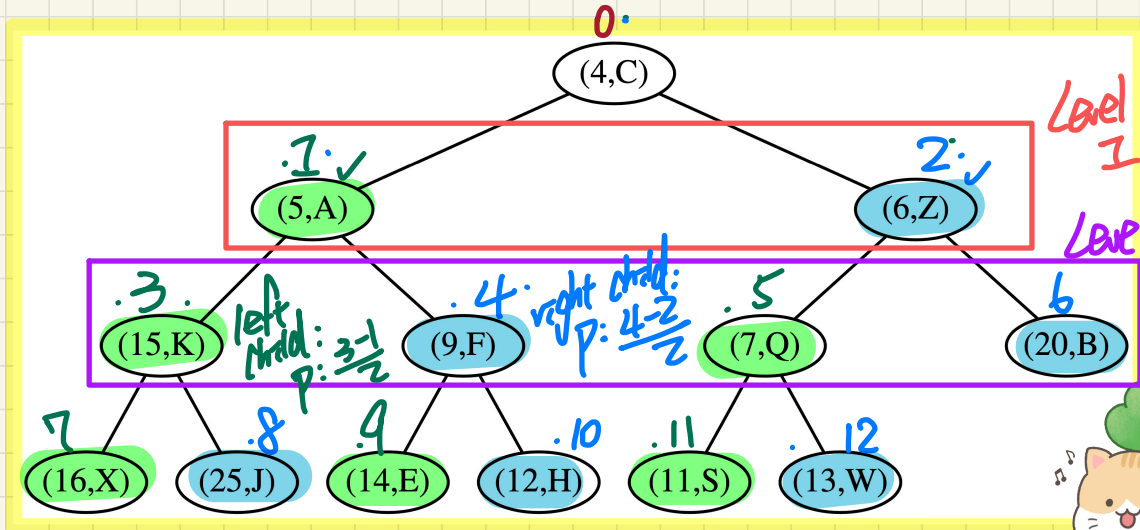
$N$  deletions, each  $O(\log N) \Rightarrow O(N \cdot \log N)$

# Lecture 5d

## Part H

### *Heaps - Array-Based Implementation*

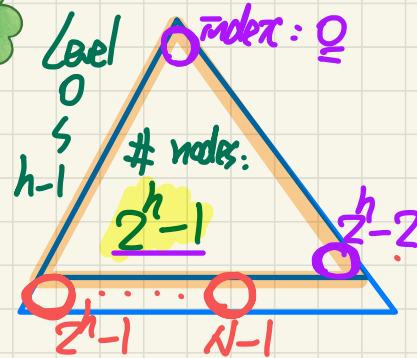
# Array-Based Representation of a Complete BT



Exercise

What if the BT is not complete? (bad for space util.)

$$index(x) = \begin{cases} 0 & \text{if } x \text{ is the root} \\ 2 \cdot index(\text{parent}(x)) + 1 & \text{if } x \text{ is a left child} \\ 2 \cdot index(\text{parent}(x)) + 2 & \text{if } x \text{ is a right child} \end{cases}$$



|        |        |        |         |        |        |         |         |         |         |         |         |         |
|--------|--------|--------|---------|--------|--------|---------|---------|---------|---------|---------|---------|---------|
| 0      | 1      | 2      | 3       | 4      | 5      | 6       | 7       | 8       | 9       | 10      | 11      | 12      |
| (4, C) | (5, A) | (6, Z) | (15, K) | (9, F) | (7, Q) | (20, B) | (16, X) | (25, J) | (14, E) | (12, H) | (11, S) | (13, W) |

I hope you enjoyed learning with me 



All the best to you! 