

EECS2101 Fundamentals of Data Structures

Lecture Notes

Winter 2025 (Section X)

Jackie Wang

Lecture 1 - January 7

Syllabus

Introduction to the Course

Solving Problems via Data Structures

Course Learning Outcomes (CLOs)

API. + precond. postcond. inv.

CLO1 Instantiate a range of standard abstract data types (ADT) as data structures.

CLO2 Implement these data structures and associated operations and check that they satisfy the properties of the ADT.

CLO3 Apply best practice software engineering principles in the design of new data structures.

CLO4 Demonstrate the ability to reason about data structures using contracts, assertions, and invariants.

CLO5 Analyse the asymptotic run times of standard operations for a broad range of common data structures.

CLO6 Select the most appropriate data structures for novel applications.

→ JUnit testing (regression)

→ make decisions among alternative DS.

→ ① correctness ② efficiency (running time)

Sorting

1. Insertion Sort
 2. Selection Sort
 3. Merge Sort
 4. Quick Sort
 5. Heap Sort
- } nested loops
- } recursively.
- ↪ balanced binary search tree

Written Test

~ section-specific

~ eClass (in-person)

~ multiple choice qs. (one or multiple correct ans.)

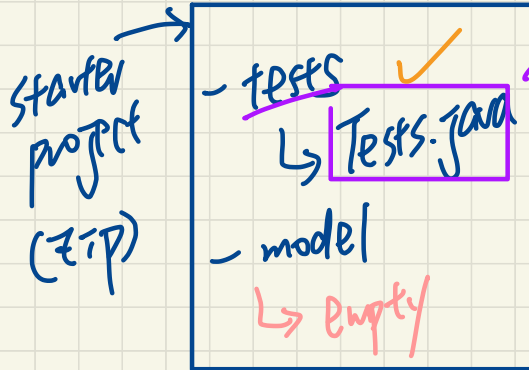
Exam

- in-person

- 3 hours

- mostly written questions.

Programming Tests



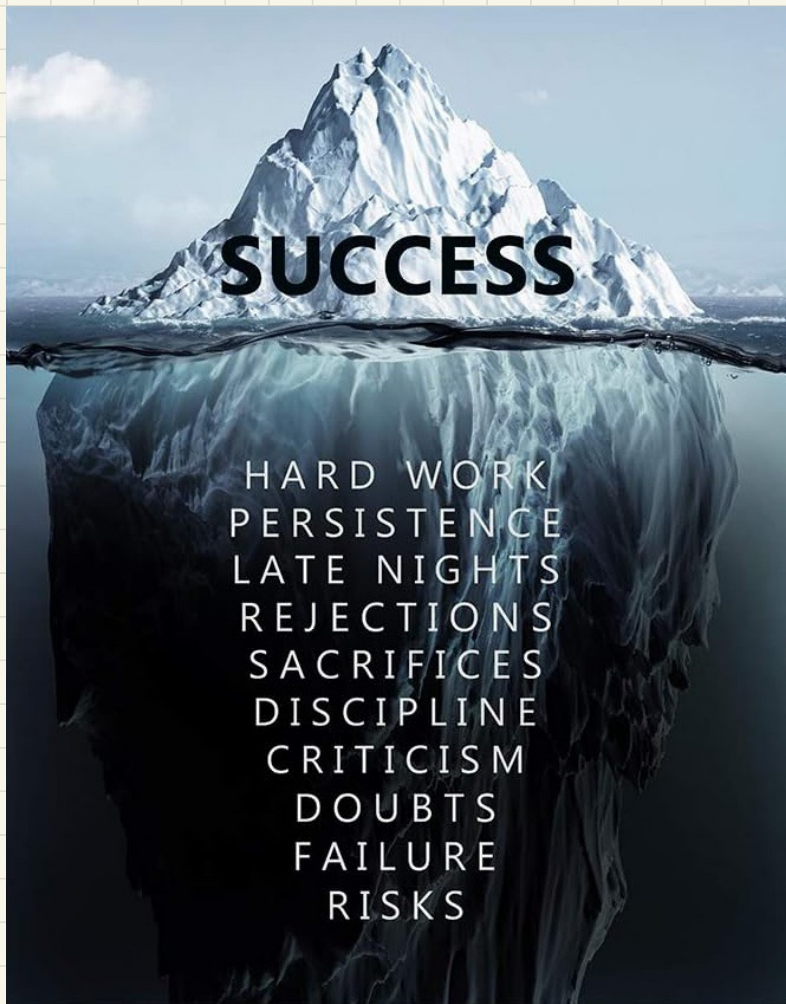
1. example usages of methods

2. meant to be incomplete

↳ you're expected:

(1) not to make your code work only for the starter

(2) write additional tests. tests.



General Tips about Success

Source: <https://a.co/d/aQ13fR1>

Lecture 2 - January 9

Introduction to the Course Recursion: Part 1

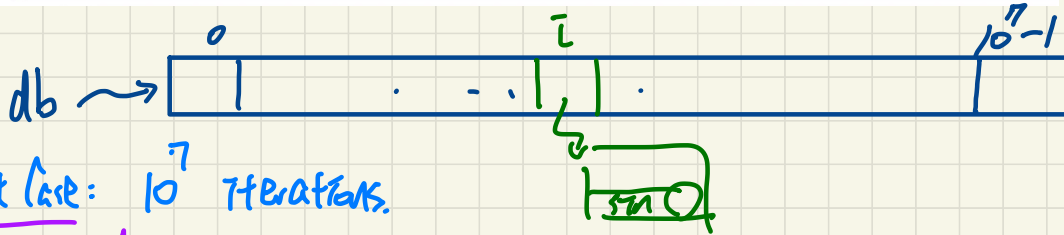
Solving Problems via Data Structures
References to Recursion Basics
More Advanced Recursion: splitArray

Announcements/Reminders

- **Assignment 1** released
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Trial attendance check via iClicker today!

A Searching Problem

```
ResidentRecord find(int sin) {  
    for(int i = 0; i < database.length; i++) {  
        if(database[i].sin == sin) {  
            → return database[i];  
        }  
    }  
}
```



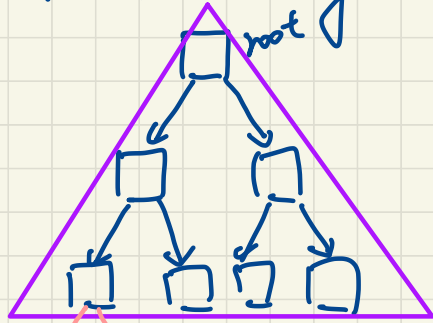
Worst case: 10^7 iterations.

Linear search

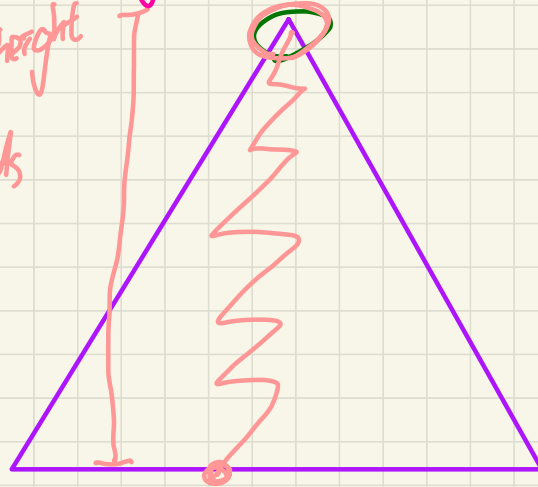
BBST : $\log_2 10^7 \approx 23.3$

Solution for Efficient Searching

✓
Balanced Binary Search Tree



height
N records



leaves.
(bottom level)

"log₂(N)" p.g 10⁷

Program Optimization Problem

```
b := ... ; c := ... ; a := ...  
across 1 |..| n is i  
  loop  
    read d  
    a := a * 2 * b * c * d  
  end
```

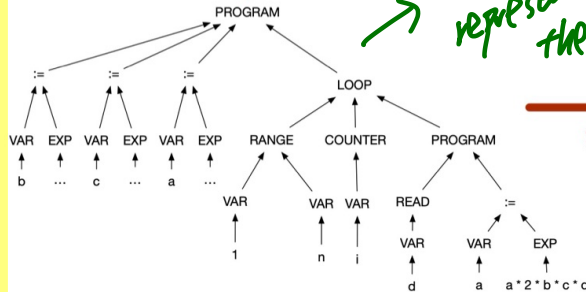
*stays invariant
between
iterations*

optimized

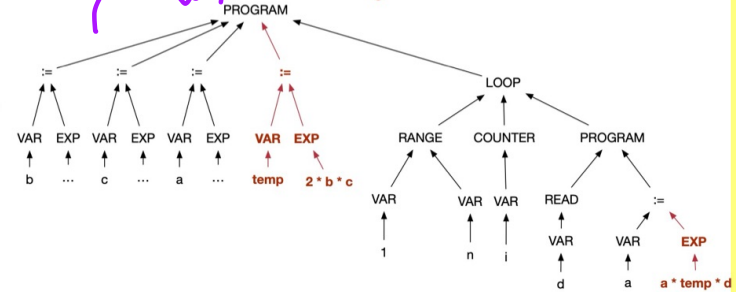
```
b := ... ; c := ... ; a := ...  
temp := 2 * b * c  
across 1 |..| n is i  
  loop  
    read d  
    a := a * temp * d  
  end
```

parsed

Compiler (AUTUR4)



transformed



Program Translation Problem

object-relational
bridge

```
class Account {  
  attributes  
    owner: Traveller . account  
    balance: int  
}
```

```
class Traveller {  
  attributes  
    name: string  
    reglist: set(Hotel . registered)[*]  
}
```

```
class Hotel {  
  attributes  
    name: string  
    registered: set(Traveller . reglist)[*]  
  methods  
    register {  
      t? : extent(Traveller)  
      & t? /: registered  
      ==>  
        registered := registered \ / {t?}  
      || t?.reglist := t?.reglist \ / {this}  
    }  
}
```

translated

```
CREATE TABLE 'Account'(  
  'oid' INTEGER AUTO_INCREMENT, 'balance' INTEGER,  
  PRIMARY KEY ('oid'));  
CREATE TABLE 'Traveller'(  
  'oid' INTEGER AUTO_INCREMENT, 'name' CHAR(30),  
  PRIMARY KEY ('oid'));  
CREATE TABLE 'Hotel'(  
  'oid' INTEGER AUTO_INCREMENT, 'name' CHAR(30),  
  PRIMARY KEY ('oid'));  
CREATE TABLE 'Account_owner_Traveller_account'(  
  'oid' INTEGER AUTO_INCREMENT, 'owner' INTEGER, 'account' INTEGER,  
  PRIMARY KEY ('oid'));  
CREATE TABLE 'Traveller_reglist_Hotel_registered'(  
  'oid' INTEGER AUTO_INCREMENT, 'reglist' INTEGER, 'registered' INTEGER,  
  PRIMARY KEY ('oid'));
```

parsed

Abstract Syntax Tree of
Source Object-Oriented Program

transformed

Abstract Syntax Tree of
Target Relational DB Queries

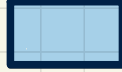
pretty-printed

Solving a Problem Recursively Math Induction (Strong) *show $P(k)$*

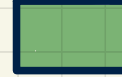
P $\frac{1}{2}$ $\frac{k-2}{2}$ $\frac{k-1}{2}$ $\frac{k}{2}$ $-$ $-$

$P(1)$ $P(2)$ *assume: $P(k-2)$ $P(k-1)$*

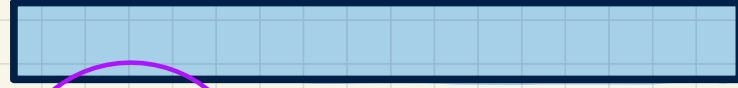
Given a **small** problem:



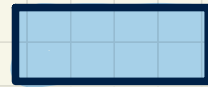
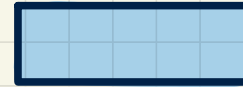
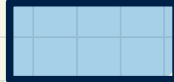
Solve it **directly**:



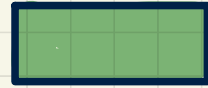
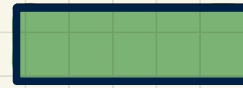
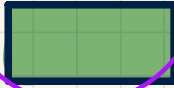
Given a **big** problem:



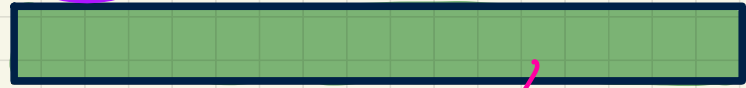
Divide it into **smaller** problems:



Assume solutions to **smaller** problems:



Combine solutions to **smaller** problems:



```
m(i) {
  if(i == ...) { /* base case: do something directly */ }
  else {
    m(j); /* recursive call with strictly smaller value */
  }
}
```

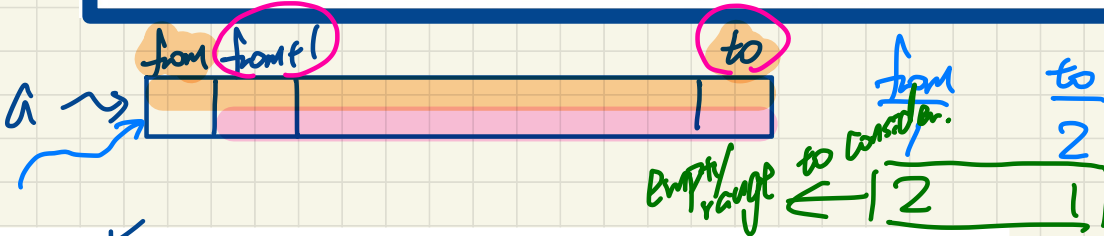
combination of sub-solutions

base case

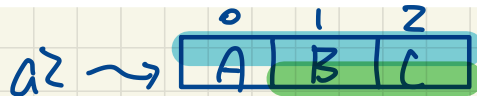
Assume a solution to this sub problem by making a recursive call

Recursion on an Array: Passing Same Array Reference

```
void m(int[] a, int from, int to) {  
    if (from > to) { /* base case */  
    else if (from == to) { /* base case */  
    else m(a, from + 1, to) } }
```



Say $a2 = \{A, B, C\}$, consider $m(a2, 0, a2.length - 1)$



$m(a2, 0, 2)$

$\downarrow$
 $\rightarrow m(a2, 1, 2)$

$\downarrow$
 $m(a2, 2, 2)$

specify the range of elements in 'a' to look at in a specific recursive call (without the need to create a new sub-array)

Problem on Recursion

<https://codingbat.com/prob/p185204>

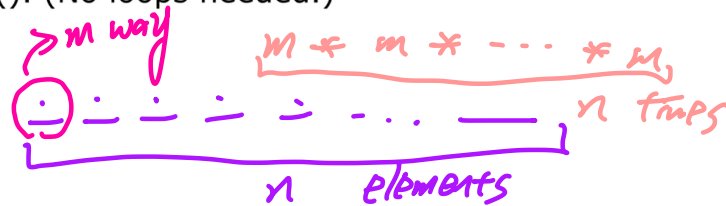
Given an array of ints, is it possible to divide the ints into two groups, so that the sums of the two groups are the same. Every int must be in one group or the other. Write a recursive helper method that takes whatever arguments you like, and make the initial call to your recursive helper from `splitArray()`. (No loops needed.)

`splitArray([2, 5, 3])` → true

`splitArray([2, 2])` → true

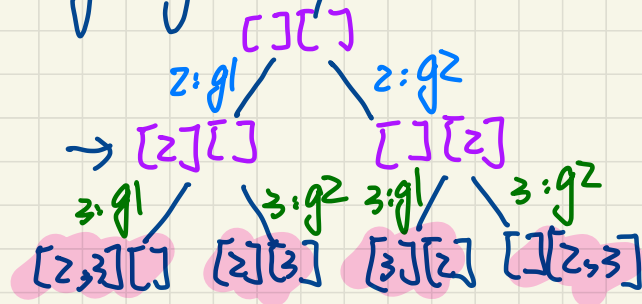
`splitArray([2, 3])` → false

`splitArray([5, 2, 3])` → true



Intuition

NR 2030 : How many ways to put n elements into m groups?



Lecture 3 - January 14

Recursion: Part 1

Asymptotic Analysis of Algorithms

splitArray: Implementation and Tracing

Announcements/Reminders

- **Assignment 1** released
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site

Problem on Recursion

<https://codingbat.com/prob/p185204>

Given an array of ints, is it possible to divide the ints into two groups, so that the sums of the two groups are the same. Every int must be in one group or the other. Write a recursive helper method that takes whatever arguments you like, and make the initial call to your recursive helper from `splitArray()`. (No loops needed.)

`splitArray([2, 5, 3])` → true

`splitArray([2, 2])` → true

`splitArray([2, 3])` → false

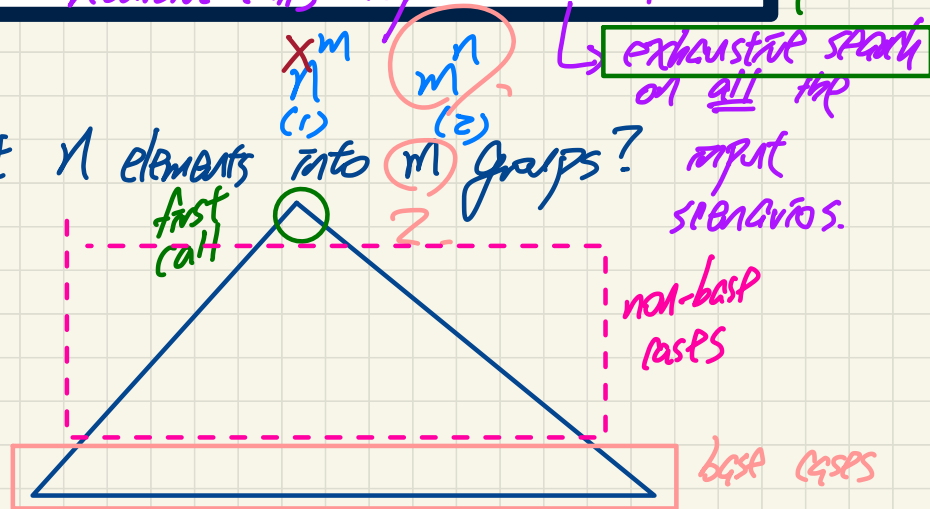
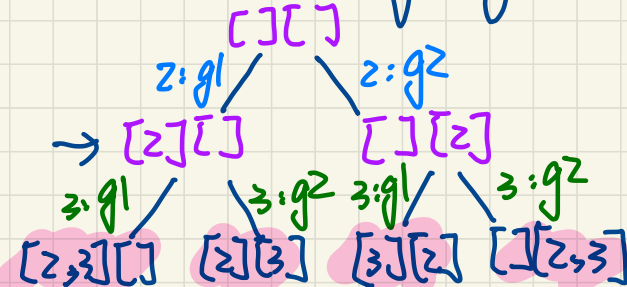
`splitArray([5, 2, 3])` → true

Insight: The recursive and base cases are defined s.t. the tree of recursive calls represents an

worst case

Intuition

NRTH 2030: How many ways to put n elements into m groups? input scenarios.

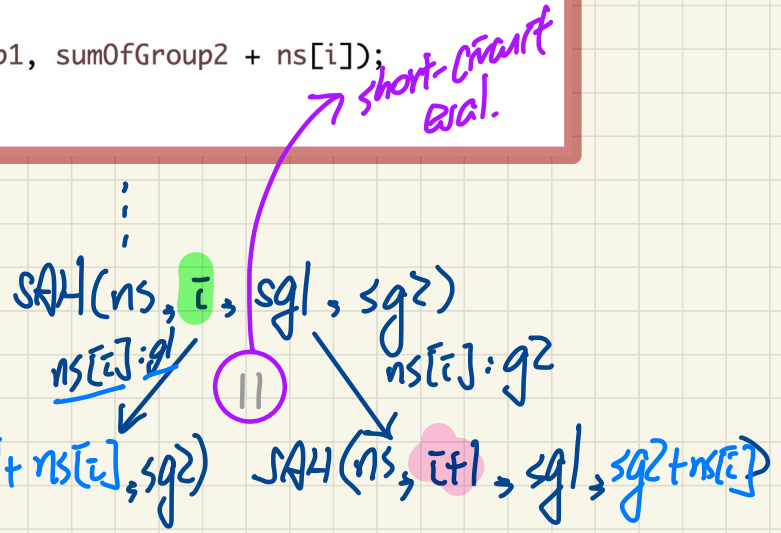
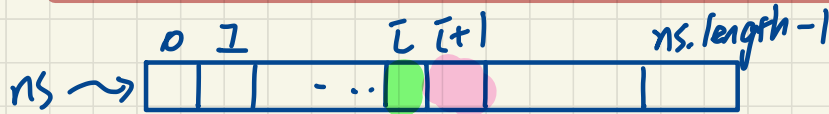


splitArray: Java Implementation *→ empty groups.*

```
public boolean splitArray(int[] ns) {  
    return splitArrayHelper(ns, 0, 0, 0);  
}
```

starting to group elements from index 0

```
private boolean splitArrayHelper(int[] ns, int i, int sumOfGroup1, int sumOfGroup2) {  
    if(i == ns.length) {  
        return sumOfGroup1 == sumOfGroup2;  
    }  
    else {  
        return  
            splitArrayHelper(ns, i + 1, sumOfGroup1 + ns[i], sumOfGroup2)  
            ||  
            splitArrayHelper(ns, i + 1, sumOfGroup1, sumOfGroup2 + ns[i]);  
    }  
}
```



Math

Commutativity:

$$\begin{aligned} P \wedge Q &\equiv Q \wedge P \\ P \vee Q &\equiv Q \vee P \end{aligned}$$

Java

Evaluation orders matter

$\&\&$ $\parallel$ do not commute

(2.1) $P \&\& Q \neq Q \&\& P$

(2.2) $P \parallel Q \neq Q \parallel P$

① Evaluation: left to right

(2.1) P eval. to $T \rightarrow$ still eval Q

P eval. to $F \rightarrow$ skip eval of $Q \rightarrow$ overall (F)

(2.2) P eval. to $F \rightarrow$ still eval Q
 P eval. to $T \rightarrow$ skip eval. of Q
 $\rightarrow$ overall (T)

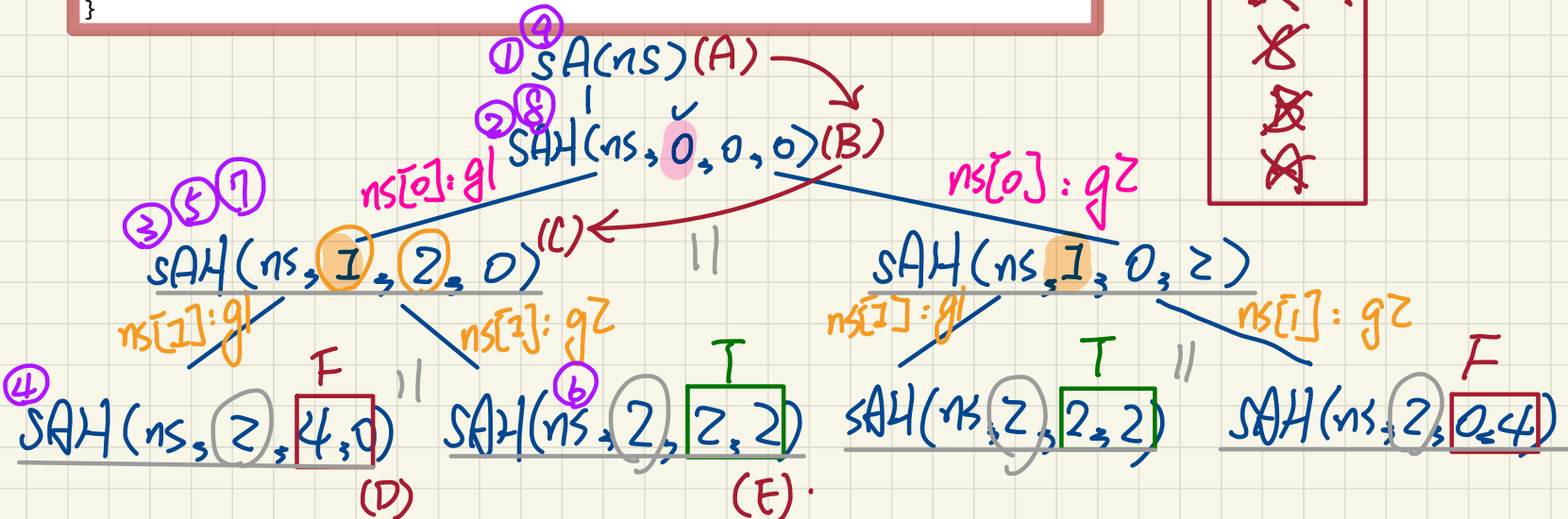
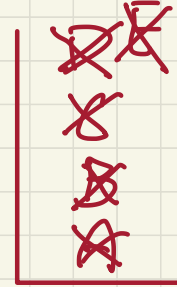
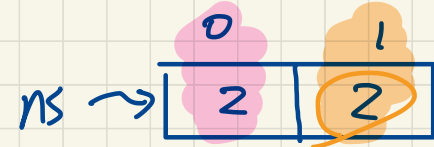
splitArray: Tracing (1)

```
public boolean splitArray(int[] ns) {  
    return splitArrayHelper(ns, 0, 0, 0);  
}
```

@Test

```
public void testSplitArray_01() {  
    RecursiveMethods rm = new RecursiveMethods();  
    int[] input = {2, 2};  
    assertEquals(true, rm.splitArray(input));  
}
```

```
private boolean splitArrayHelper(int[] ns, int i, int sumOfGroup1, int sumOfGroup2) {  
    if (i == ns.length) {  
        return sumOfGroup1 == sumOfGroup2;  
    }  
    else {  
        return  
            splitArrayHelper(ns, i + 1, sumOfGroup1 + ns[i], sumOfGroup2)  
            ||  
            splitArrayHelper(ns, i + 1, sumOfGroup1, sumOfGroup2 + ns[i]);  
    }  
}
```



splitArray: Tracing (2)

```
public boolean splitArray(int[] ns) {  
    return splitArrayHelper(ns, 0, 0, 0);  
}
```

```
private boolean splitArrayHelper(int[] ns, int i, int sumOfGroup1, int sumOfGroup2) {  
    if(i == ns.length) {  
        return sumOfGroup1 == sumOfGroup2;  
    }  
    else {  
        return  
            splitArrayHelper(ns, i + 1, sumOfGroup1 + ns[i], sumOfGroup2)  
            ||  
            splitArrayHelper(ns, i + 1, sumOfGroup1, sumOfGroup2 + ns[i]);  
    }  
}
```

@Test

```
public void testSplitArray_04() {  
    RecursiveMethods rm = new RecursiveMethods();  
    int[] input = {5, 2, 2};  
    assertEquals(false, rm.splitArray(input));  
}
```

Exercises

- (1) Trace (recursion tree)
- (2) Trace (debugger)

splitArray: Tracing (3)

```
public boolean splitArray(int[] ns) {  
    return splitArrayHelper(ns, 0, 0, 0);  
}
```

```
private boolean splitArrayHelper(int[] ns, int i, int sumOfGroup1, int sumOfGroup2) {  
    if(i == ns.length) {  
        return sumOfGroup1 == sumOfGroup2;  
    }  
    else {  
        boolean possibility1 = splitArrayHelper(ns, i + 1, sumOfGroup1 + ns[i], sumOfGroup2);  
        boolean possibility2 = splitArrayHelper(ns, i + 1, sumOfGroup1, sumOfGroup2 + ns[i]);  
        return possibility1 || possibility2;  
    }  
}
```

```
@Test  
public void testSplitArray_13() {  
    RecursiveMethods rm = new RecursiveMethods();  
    int[] input = {1, 2, 3, 10, 10, 1, 1};  
    assertEquals(true, rm.splitArray(input));  
}
```

splitArray: Tracing (3)

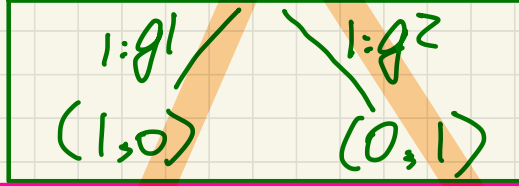
input

0	1	2	3	4	5	6
1	2	3	10	10	1	1

Level 0 (0,0)

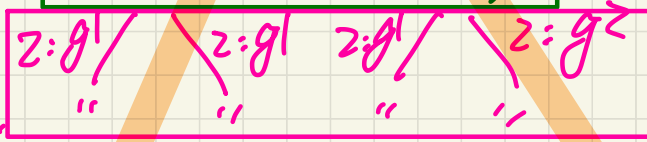
$$I = 2^0$$

Level 1
after insp.
1st elem.
at index 0



$$2 = 2^1$$

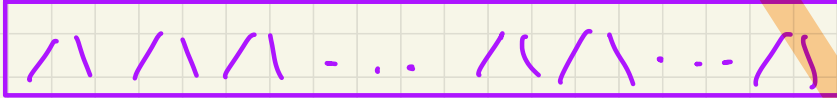
Level 2
after insp.
2nd elem.
at index 1



$$4 = 2^2$$

geometric seq.
sum.

Level 7
after insp.
7th elem.
at index 6



$$= 2^7 = 128$$

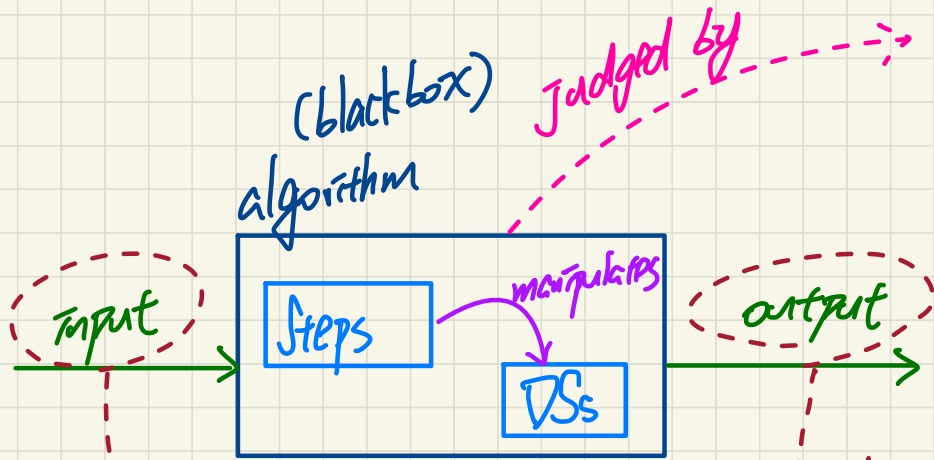
Lecture 4 - January 16

Asymptotic Analysis of Algorithms

Limitations of Experiments
Primitive Operations (POs)
Counting POs: findMax

Announcements/Reminders

- **Assignment 1** released
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site
- ***splitArrayHarder***: an extended version coming soon



1. Correctness

- ↳ testing (dynamic)
 - ↳ formal method (static)
- ↳ 1090
(3342, 4315)

2. Efficiency

- ↳ Time
 - ↳ Space
- * Experiments
- ↳ Math Func. (big-O).
- ↳ may impact RT

meant to solve

Computation problem

↳ (input, expected output)

* Limitations:

- (1) full, working implementation
- (2) EXEC. environment
- (3) input representativeness

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

Handwritten notes on the right side of the page:

- answer $\times$ (with an arrow pointing to the top green box)
- answer (with an arrow pointing to the bottom green box)
- Handwritten purple text: $\frac{1}{2}$, $\frac{1}{4}$, $\frac{1}{8}$, $\frac{1}{16}$ (with arrows pointing to the corresponding rows in the table)

Algorithm 2 using *StringBuilder* append's:

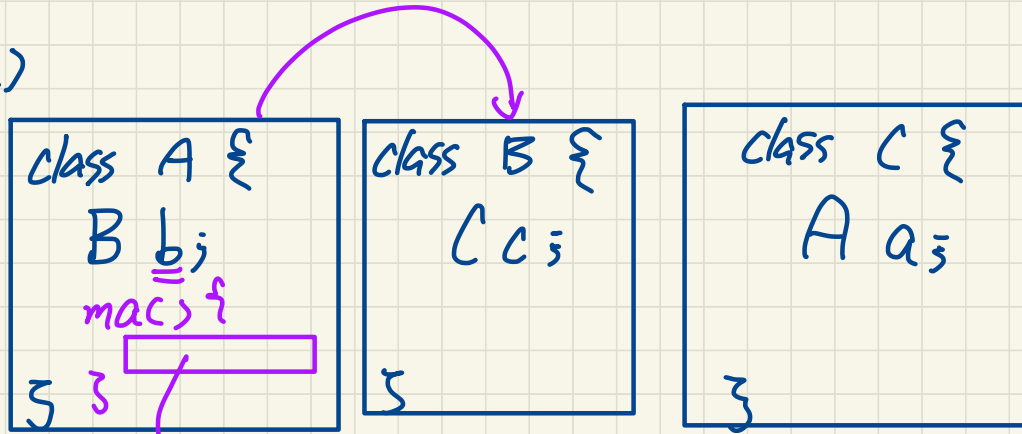
```
public static String repeat2(char c, int n) {
    StringBuilder sb = new StringBuilder();
    for (int i = 0; i < n; i++) { sb.append(c); }
    return sb.toString(); }

```

(doubling strategy)

Accessing an object's attribute

(aggregation)



arbitrarily
long
(as long as
it's valid)

b
b.C
b.C.a

Assumption

Length of dot notation expression
is always a small constant.

does not
depend on
input size
(n).

Method Call : may or may not be a PO

obj.m(...)

Case 2 is not Po

$$mcs \{$$

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

Case I - $\sin$ considered as Po

$$mC > \epsilon$$
 $a P_0$

can be:

- (1) a method call (that's considered a Po)

(2) a loop with a fixed # of iterations)

findMax(a, a.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     }  
7   }  
8   return currentMax;  
9 }
```

$\underline{i}$	$\underline{i < n}$
1	T
2	T
...	...
$n-1$	T
n	F

$i = i + 1$ ✓
Q. # of times $i < n$ in Line 3 is executed?

n times ($n-1$ times $i < n$ (T) ; 1 time $i < n$ (F))

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

$n-1$ times

$n-2$
STEP of input

Lecture 5 - January 21

Asymptotic Analysis of Algorithms

From Absolute RT to Relative RT

Approximating RT Functions

Asymptotic Upper Bound (Big-O): Def.

Announcements/Reminders

- **Assignment 1** released
- ***splitArrayHarder***: an extended version released
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site

Example 2: Counting Number of Primitive Operations

(Exercise)

```
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  }
```

Q. # of times **Line 3** is executed?

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

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

Comparing Algorithms: From Absolute RT to Relative RT

t
 exact/absolute
 time taken to
 execute a P.O.
 in some exper. environment

e.g. Mac M1 $t = 2$ (ms)

e.g. Mac'14 $t = 4$ (ms)

absolute
 RTs of
 two alg.
 (solving
 the same
 problem)

abs. RT	Mac M1	Mac'14
$7n - 2$	$(100 \cdot 7 - 2) \cdot 2$	$(100 \cdot 7 - 2) \cdot 4$
$10n + 3$	$(100 \cdot 10 + 3) \cdot 2$	

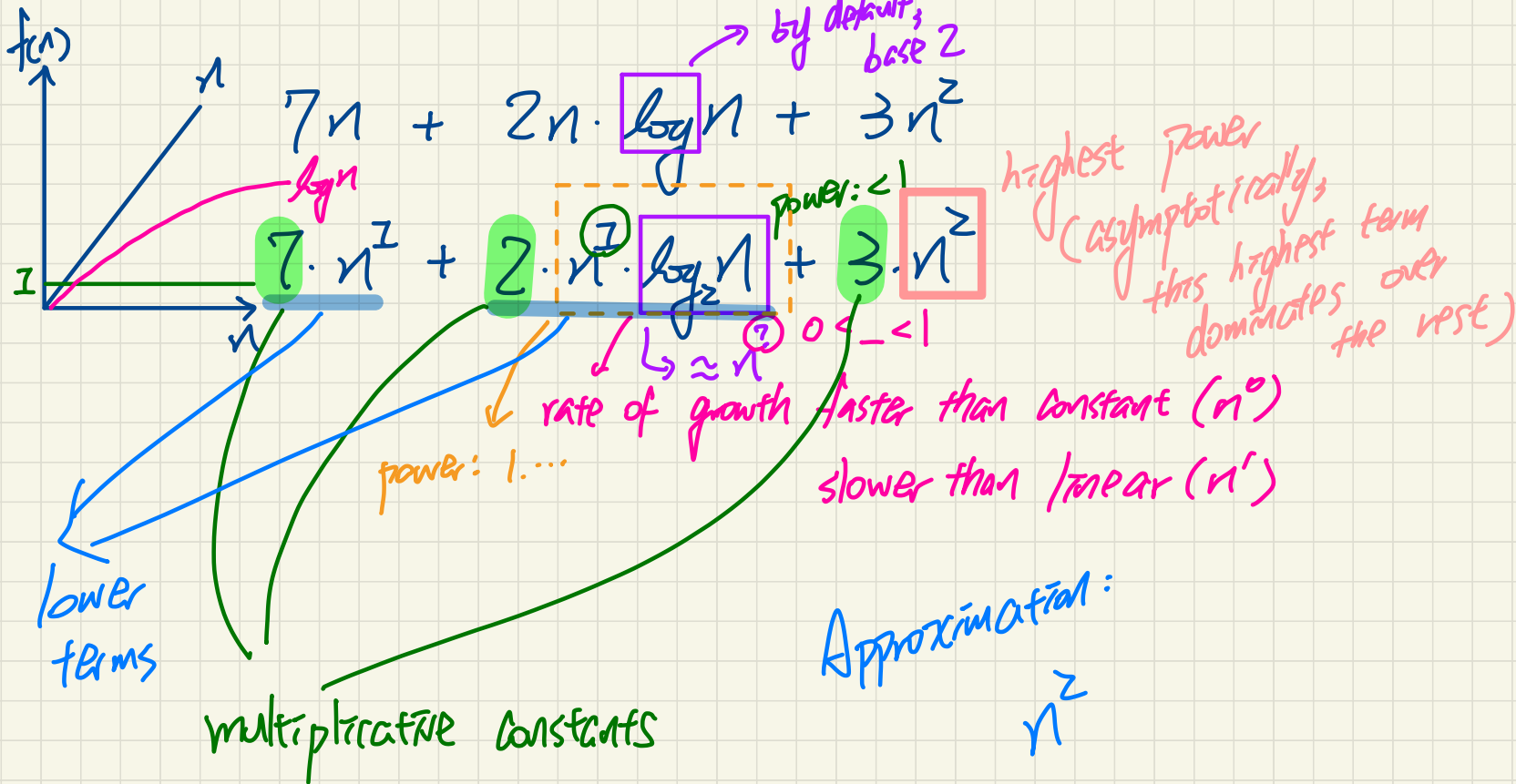
input
 size
 (assume $n=100$)

when comparing
 two diff. alg.,
 not necessary to consider
 the extra common difference
 factor. $\rightarrow t$ disre.

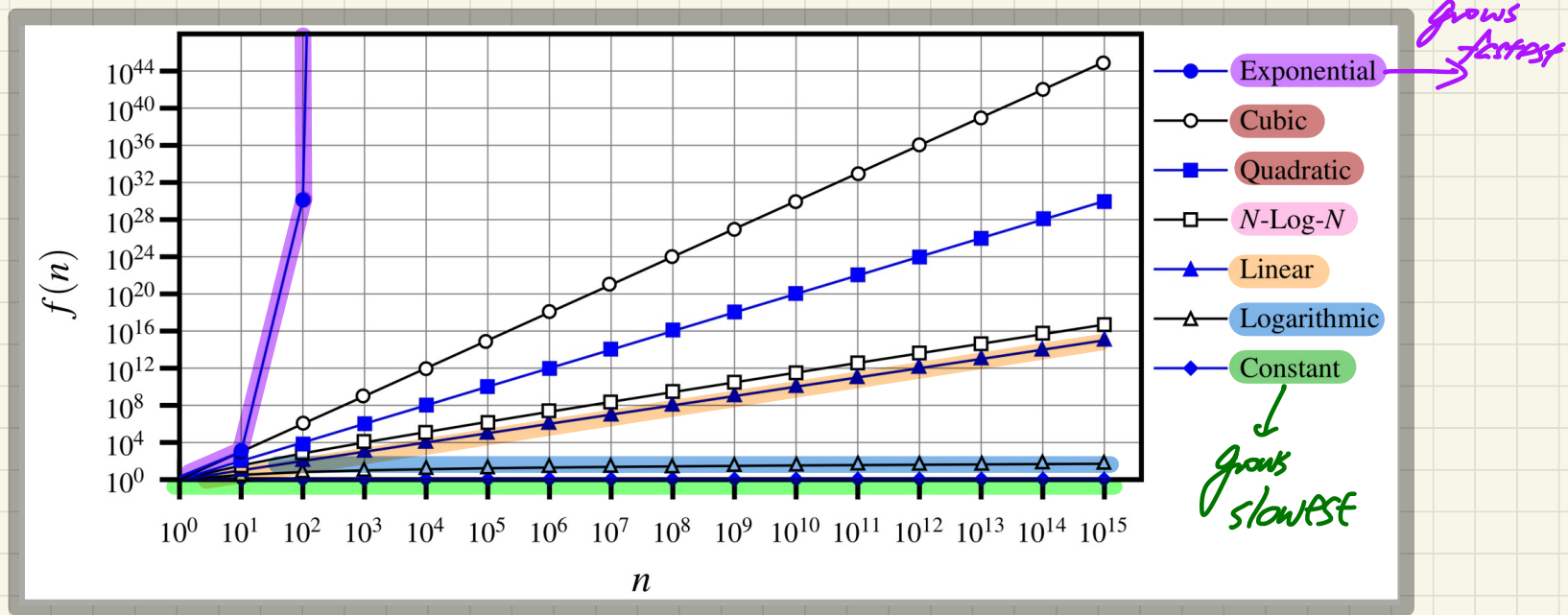
when consid.
 the same alg.,
 it's not
 necessary to
 know the
 precise RT

n^0 n^1 $\log n$

Exercise: Approximating $f(n) = 7n + 2n \cdot \log n + 3n^2$



RT Functions: Rates of Growth (w.r.t. Input Sizes)



RT

$$\begin{aligned} f(n) &= 1000 = 1000 \cdot n^0 & f(1000) &= 1000 \\ f(1) &= 1000 & f(1M) &= 1000 \end{aligned}$$

Comparing **Relative**, **Asymptotic** RTs of Algorithms

Q1. Compare:

$$\text{RT}_1(n) = \cancel{3}n^2 + \cancel{7}n + \cancel{18} \approx n^2$$

$$\text{RT}_2(n) = \cancel{100}n^2 + \cancel{3}n - \cancel{100} \approx n^2$$

↳ equally efficient, asymptotically.

Q2: Compare:

$$\text{RT}_1(n) = n^3 + \cancel{7}n + \cancel{18} \approx n^3$$

$$\text{RT}_2(n) = \cancel{100}n^2 + \cancel{100}n + \cancel{2000} \approx n^2$$

↳ RT_2 more efficient (taking less time), asymptotically.

$f(n)$: RT function

↳ input size $\leadsto$ relative RT

$f(n)$

$\rightarrow O(g(n))$ e.g. $f(n) = 7n - 2$

$g(n)$: reference function

(further manipulation on $g(n)$ expected)

$g(n) \leadsto c \cdot g(n)$

$f(n)$ being a member in the family means that it can be upper-bounded by $g(n)$

Goal: Prove $f(n)$ is $O(g(n))$

u.b.e. : upper-bound effect

Asymptotic Upper Bound: **Big-O**

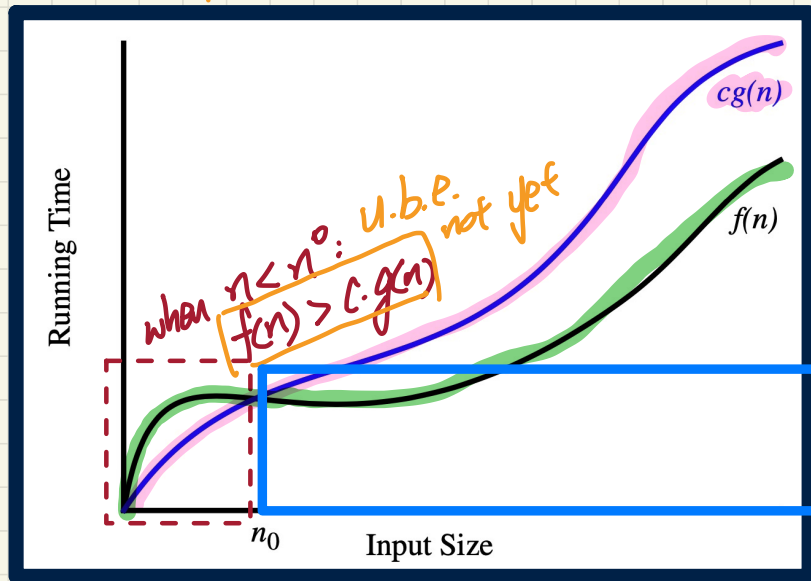
$f(n) \in O(g(n))$ if there are:

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

such that:

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

starting point of the u.b.e.
multiplicative constant applied to $g(n)$ to change its slope



Example:

$$f(n) = 8n + 5$$

$$g(n) = n$$

Can n_0 be 1?

$$f(1) \stackrel{?}{\leq} 9 \cdot 1$$

$$8 + 5 = 13$$

False

↳ u.b.e. not there.

Prove:

$$f(n) \text{ is } O(g(n))$$

Choose $c = 9$

What about n_0 ?

starting from $n = n_0$
 $f(n) \leq c \cdot g(n)$
u.b.e. is there!

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

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 $O(n^d)$. $\rightarrow g(n)$

We prove by choosing

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

$$\begin{aligned} (1) f(1) &\leq c \cdot 1^d \\ (2) f(n) &\leq c \cdot n^d \quad (n > 1) \end{aligned}$$

Upper-bound effect: $n_0 = 1$?

$$[f(1) \leq (|a_0| + |a_1| + \dots + |a_d|) \cdot 1^d]$$

Upper-bound effect holds?

$$[f(n) \leq (|a_0| + |a_1| + \dots + |a_d|) \cdot n^d]$$

Lecture 6 - January 23

Asymptotic Analysis of Algorithms

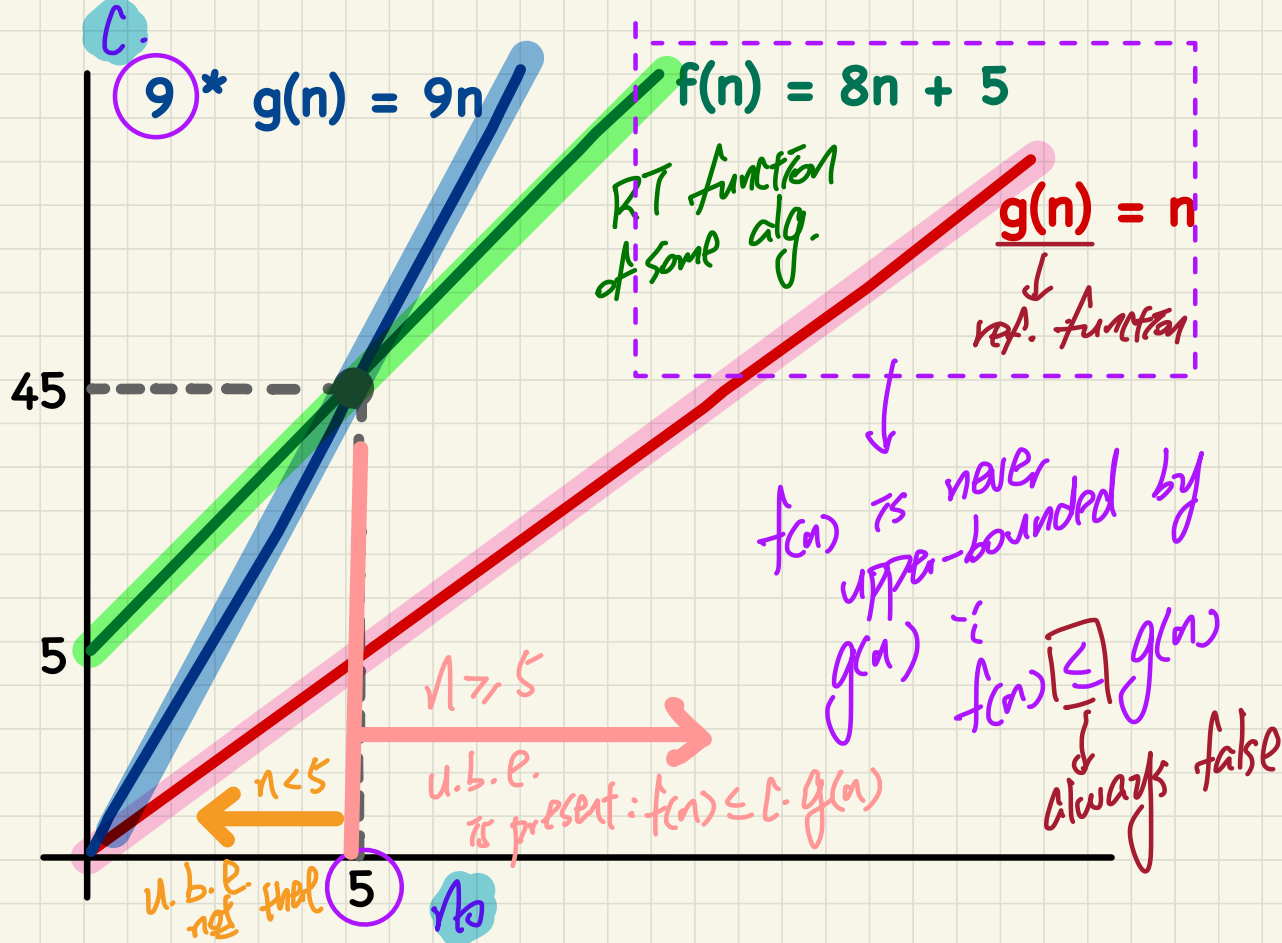
***Big-O: Pred. Def., Properties, Examples
Correct vs. Accurate Asymptotic U.B.
Deriving U.B. from Code: Basic Examples***

Announcements/Reminders

- **Assignment 1** due next Monday
- ***splitArrayHarder***: an extended version released
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site

Asymptotic Upper Bound: Example

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



Asymptotic Upper Bound (Big-O): Alternative Formulation

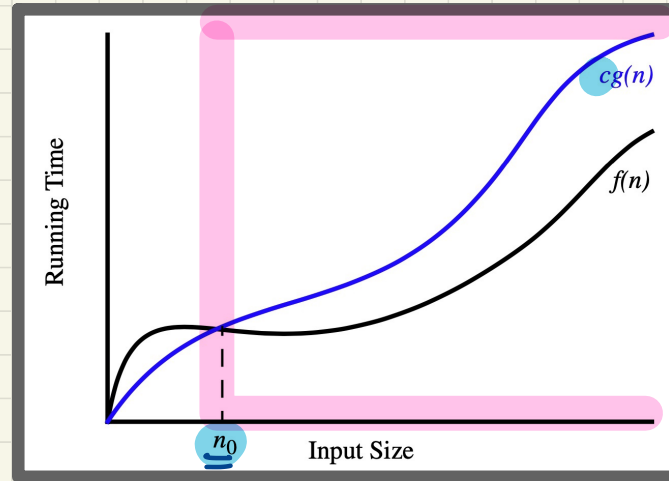
Known:

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

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

such that:

$$f(n) \leq c \cdot g(n) \quad \text{for } n \geq n_0$$



Q. Formulate the definition of " $f(n)$ is order of $O(g(n))$ " using logical operator(s): $\neg, \wedge, \vee, \Rightarrow, \forall, \exists$

$$f(n) \in O(g(n)) \iff \exists c, n_0 \cdot (c > 0 \wedge n_0 \geq 1 \wedge (\forall n \cdot n \geq n_0 \Rightarrow f(n) \leq c \cdot g(n)))$$

* $1^0 = 1^1 = \dots = 1^d = 1$

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

$f(n) \leq c \cdot g(n)$

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) $f(1) \leq c \cdot 1^d$
 (2) $f(n) \leq c \cdot n^d$ ($n > 1$)

Upper-bound effect: $n_0 = 1$?

$$f(1) \leq (|a_0| + |a_1| + \dots + |a_d|) \cdot 1^d$$

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

Upper-bound effect holds?

$$f(n) \leq (|a_0| + |a_1| + \dots + |a_d|) \cdot n^d \quad (n > 1)$$

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

 $a_0 \leq |a_0|$
 $a_1 \leq |a_1|$
 $\vdots$
 $a_d \leq |a_d|$
 $n^0 \leq n^d$
 $n^1 \leq n^d$
 $\vdots$
 $n^d \leq n^d$

Exercise: Prove $f(n) = 5n^4 - 3n^3 + 2n^2 - 4n + 1$ is $O(n^4)$

5. $\boxed{n^4} - \cancel{3n^3} + \cancel{2n^2} - \cancel{4n} + \cancel{1 \cdot n^0}$

(1) Guess: $O(n^4)$

(2) Prove $\downarrow g(n)$

choose $C = |5| + |(-3)| + |2| + |(-4)| + |1| = 15$

$n_0 = 1$

Verify:

$\boxed{f(1)} \leq 15 \cdot \cancel{n^4} - \cancel{g(n)}$

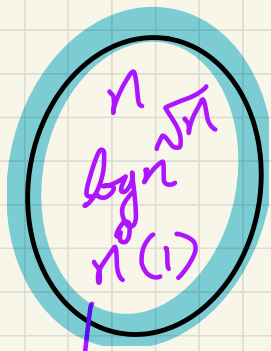
$5 - 3 + 2 - 4 + 1 \leq 15 \cdot 1$

Big-O Properties (1): Members in a Family

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

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

$O(n)$



Functions growing "no faster" than n should be included

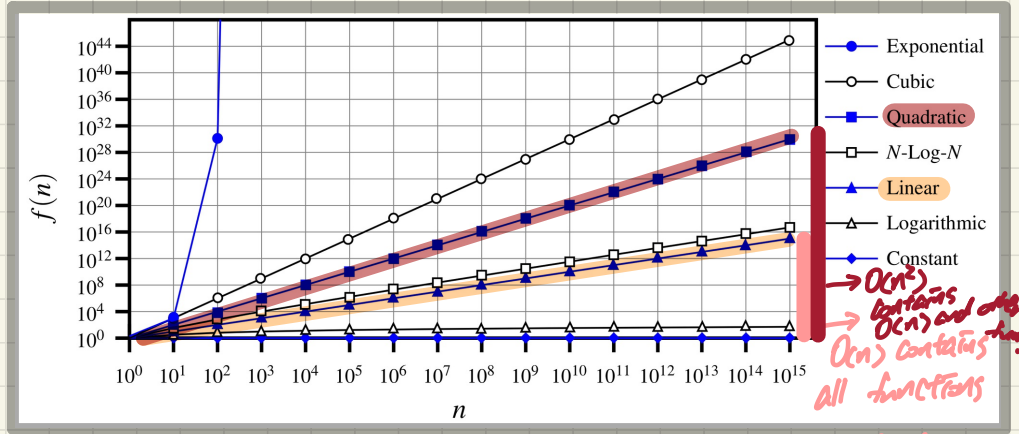
$O(n^2)$



$O(n)$ is "contained" within $O(n^2)$

$2^n \notin O(n^2)$

Functions: Rates of Growth

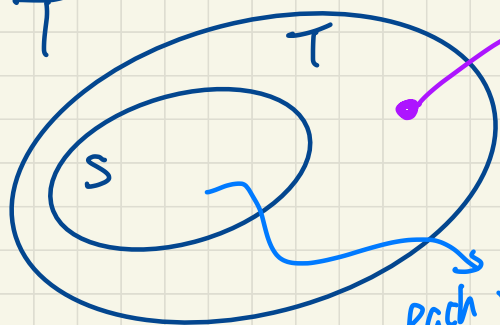


going no faster than n

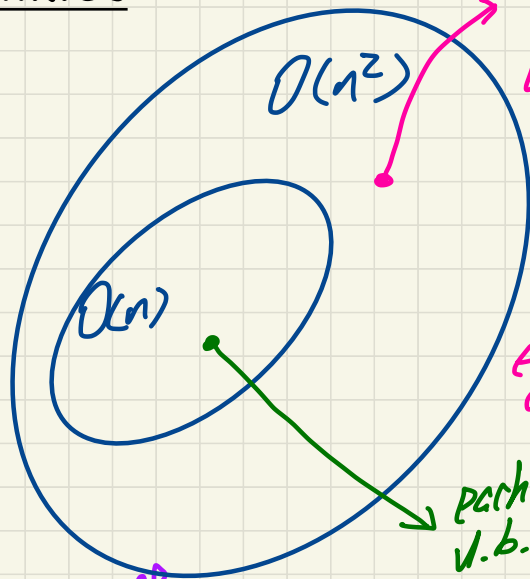
Big-O Properties (2): Relating Families

$O(n) \subset O(n^2)$
 Correct (1) $\boxed{\subset}$ $\rightarrow$ it's possible $O(n) = O(n^2)$
 (2) $\subset$ correct & accurate
 (3) $\supseteq$
 (4) $\supset$

$S \subset T$



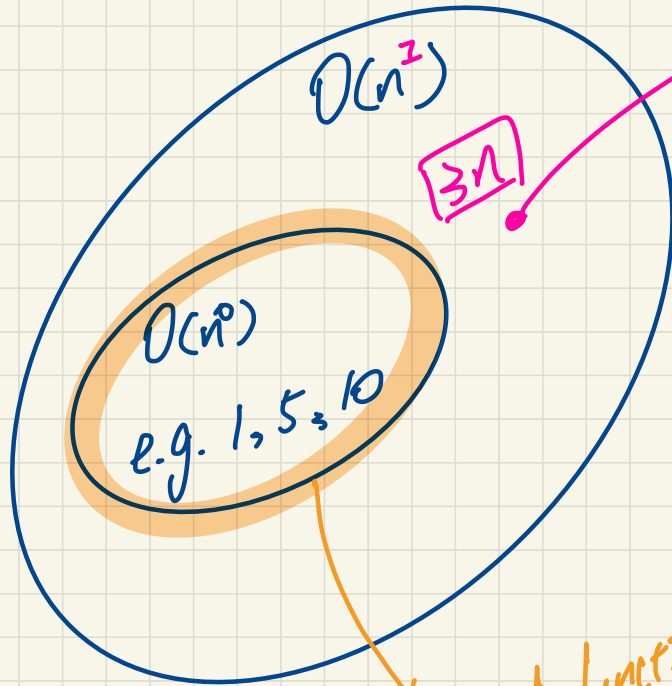
at least one member in T that's not a member in S.
 each member in S is also a member in T



at least one function u.b. by n^2 but not u.b. by n .
 e.g. n^2 is n by n

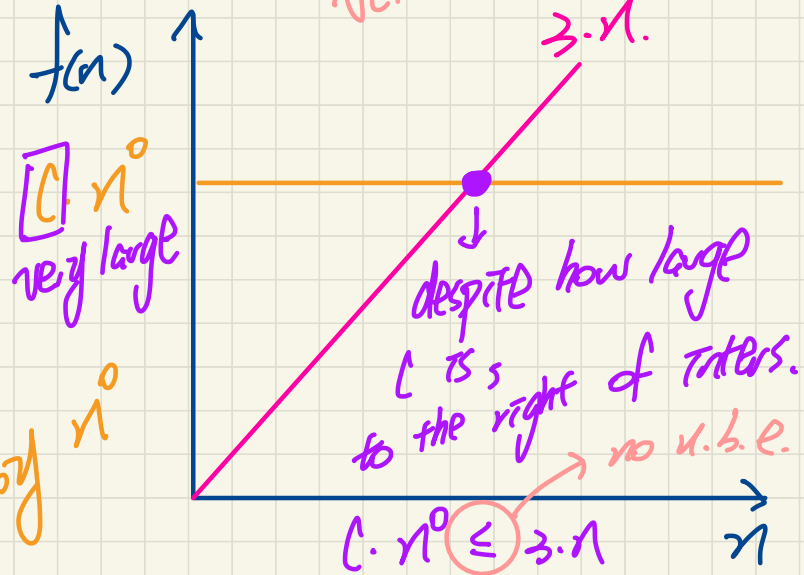
each function u.b. by n can also be u.b. by n^2

$$O(n^0) \subset O(n)$$

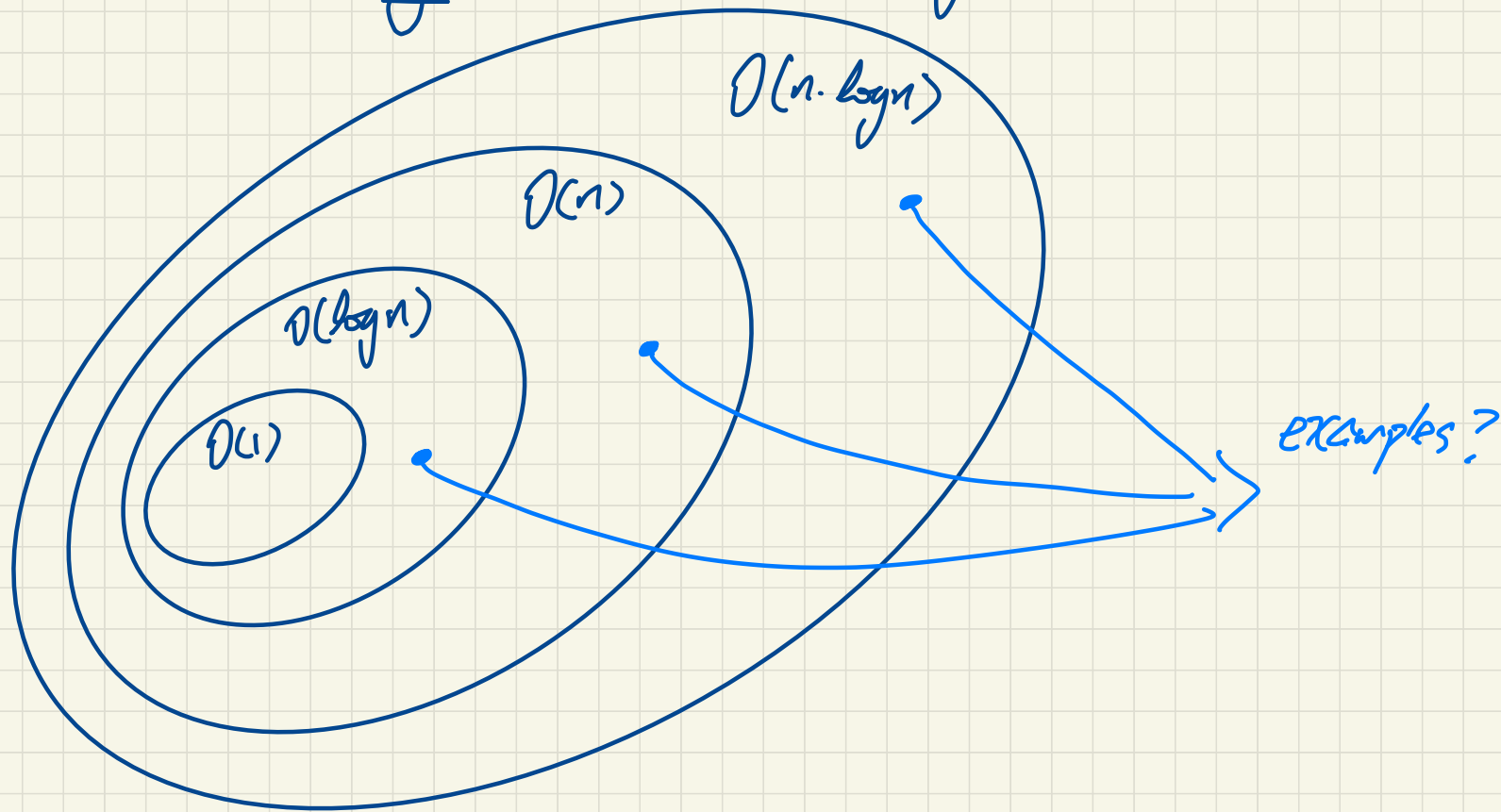


at least a function
u.b. by n^1 but
not u.b. by $\underbrace{n^0}$
even with a
VERY LARGE c chosen

set of functions
that can be
u.b. by n^0



$$O(\underline{n^0}) \subset O(\underline{\log n}) \subset O(\underline{n}) \subset O(n \cdot \log n) \subset \dots$$



Big-O Properties (3): Deciding **Correct** & **Accurate** Bound

e.g. $f_1(n) = 7n - 2$

$$f_2(n) = 4n^2 - 3n + 6$$

$7n - 2$ is order of (ϵ)

$O(n)$
 $O(n^2)$
 $O(n^3)$
 $O(2^n)$

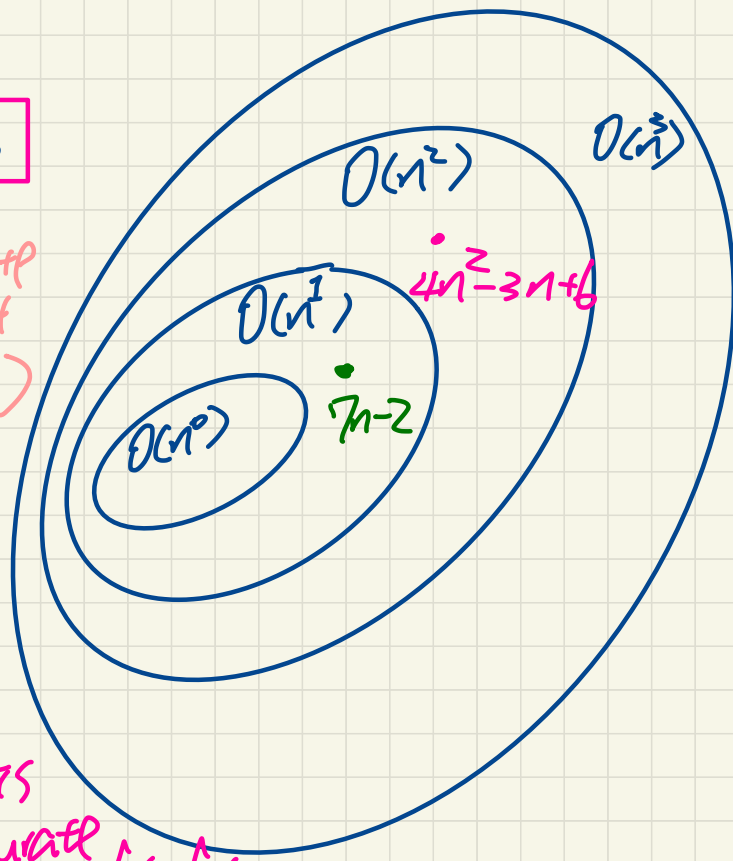
→ most accurate
(tightest u.b.)

all correct misleading.

$$\begin{array}{l} f_1(n) \text{ is } O(n^3) \\ f_2(n) \text{ is } O(n^2) \end{array}$$

→ $f_2(n)$ more efficient?

no! $\because$ the $O(n^3)$ is not accurate for $f_1(n)$



$O(7n^2 + 4n - 2)$ X not appropriate
as the final answer

$O(n^2)$ ✓

Asymptotic Upper Bounds: Example (1)

Given $f(n) = 5n^2 + 3n \cdot \log n + 2n + 5$:

(1) What is $f(n)$'s most accurate asymptotic upper bound.

(2) Prove your claim.

(1) $O(n^2)$
 $g(n)$

(2) Choose $c = |5| + |3| + |2| + |5| = 15$

$n_0 = 1$

→ verify

$$f(1) \leq 15 \cdot 1^2$$

$$5 \cdot 1^2 + 3 \cdot 1 \cdot \log 1 + 2 \cdot 1 + 5 \leq 15$$

true!

Asymptotic Upper Bounds: Example (2) (Exercise)

Given $f(n) = 20n^3 + 10n \cdot \log n + 5$:

- (1) What is $f(n)$'s most accurate asymptotic upper bound.
- (2) Prove your claim.

Asymptotic Upper Bounds: Example (3)

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

(1) What is $f(n)$'s most accurate asymptotic upper bound.

(2) Prove your claim.

(1) $O(\log n)$

(2) choose $C = |3| + |2| = 5$
 $n_0 = 1 \rightarrow$ verify:

$$\boxed{f(1)} \leq 5 \cdot \boxed{\log 1}$$

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

$\downarrow$
false

What if $n_0 = 2$

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

(Exercise)

u.b.e?

Asymptotic Upper Bounds: Example (4)

(Exercise)

Given $f(n) = 2^{n+2}$:

- (1) What is $f(n)$'s most accurate asymptotic upper bound.
- (2) Prove your claim.

Asymptotic Upper Bounds: Example (5)

(Exercise)

Given $f(n) = 2n + 100 \cdot \log n$:

- (1) What is $f(n)$'s most accurate asymptotic upper bound.
- (2) Prove your claim.

Lecture 7 - January 28

Asymptotic Analysis of Algorithms, Arrays and Linked Lists

*Deriving Upper Bounds from Code
Inserting into an Array
Sorting Orders*

Announcements/Reminders

- **Assignment 1** solution released
- ***splitArrayHarder***: an extended version released
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site

Determining the Asymptotic Upper Bound (1)

approx.

→ vs. Counting # P_3

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

$$O(\underbrace{1}_{L2} + \underbrace{1}_{L3} + \underbrace{1}_{L4} + \underbrace{1}_{L6}) = O(4 \cdot n^0)$$

$$= O(n^0)$$
$$O(1)$$

Determining the Asymptotic Upper Bound (2)

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

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

$\downarrow$ $\downarrow$ $\downarrow$ $\downarrow$

$\mathcal{L}_2$ $\mathcal{L}_3$ $\mathcal{L}_4 \sim \mathcal{L}_6$ $\mathcal{L}_7 = O(n)$

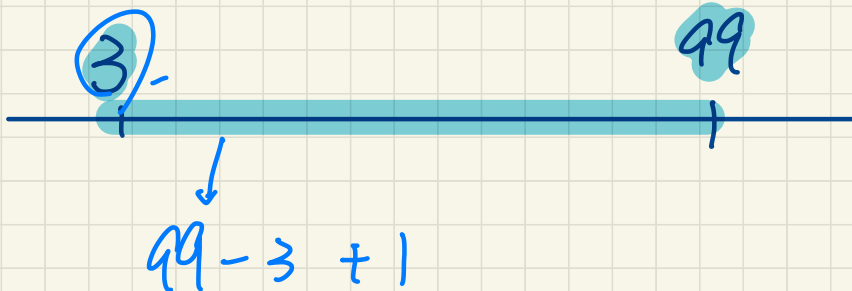
$$[\underline{a}, \underline{b}]$$

$$\hookrightarrow \underline{b - a + 1} \text{ integers in the closed interval}$$

$$[0, n-1] \rightarrow (n-1) - 0 + 1 = \textcircled{n}$$

$$[3, 99]$$

$$99 - 3$$



Determining the Asymptotic Upper Bound (3.1)

```

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

* P₁ gets executed for every combination of (i, j)

* P₂ gets exec. for every value of i

Patterns of Loop Counters

outer loop runs [0, n-1] n iterations

i	j					
0	0	1	2	...	n-1	n its.
1	0	1	2	...	n-1	n its
2	0	1	2	...	n-1	n its
⋮	⋮	⋮	⋮	⋮	⋮	⋮
n-1	0	1	2	...	n-1	n its

(2, 1) → P₁ exec once

i values: n
j values: n
rolls in the matrix

$$O(\underbrace{n^2}_{\# \text{ combinations of } (i, j)} \cdot \underbrace{1}_{\# \text{ it-its}} + \underbrace{n}_{\# \text{ i values}} \cdot \underbrace{1}_{\# \text{ j values}} + 1)$$

$$= O(n^2 + n + 1)$$

$$= O(n^2)$$

Determining the Asymptotic Upper Bound (3.2)

```
1 boolean containsDuplicate (int[] a, int n) {  
2   for (int i = 0; i < n; 10,000) {  
3     for (int j = 0; j < n; ) {  
4       if (i != j && a[i] == a[j]) {  
5         return true; }  
6       j++; }  
7     i++; }  
8   return false; }
```

$$O(10,000 \cdot n)$$

$$= O(n)$$

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

$$O(1M \cdot 1M)$$

$$= O(\cancel{n} \cdot n^0)$$

$$= O(1)$$

a.length

b.length

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

$$O(n \cdot m) = \cancel{O(n^2)}$$

Determining the Asymptotic Upper Bound (4)

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

$$O(1 + n + 1 + n^2 + 1)$$
$$= O(n^2 + n + 3) = O(n^2)$$

Determining the Asymptotic Upper Bound (5)

```

1  int triangularSum (int[] a, int n) {
2      int sum = 0;
3      for (int i = 0; i < n; i++) {
4          for (int j = i; j < n; j++) {
5              sum += a[j];
6          }
7      }
8      return sum;
9  }
```

① → exec for each (i, j)

Pattern of (i, j)

$$\# (i, j) = \underline{n} + (n-1) + (n-2) + \dots + \underline{1}$$

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

of (i, j) pairs

i	j	Range
0	0 1 2 ... n-1	$[0, n-1] \rightarrow n$
1	1 2 ... n-1	$[1, n-1] \rightarrow n-1$
2	2 ... n-1	$[2, n-1] \rightarrow n-2$
...	...	...
n-1	n-1	$[n-1, n-1] \rightarrow 1$

$$O\left(\underbrace{1}_{\sim \frac{1}{2}} + \underbrace{n^2}_{\#(i,j)} \cdot \underbrace{1}_{\sim \frac{1}{2}} + \underbrace{1}_{\sim \frac{1}{2}}\right)$$

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

Asymptotic Upper Bound: Arithmetic Sequence/Progression

$$\begin{array}{c} \bar{t} + 0 \cdot c \\ \downarrow \text{start term} \end{array} \quad \bar{t} + \underbrace{(\bar{t} + c)}_{\text{common difference}} + (\bar{t} + 2 \cdot c) + \dots + (\bar{t} + (n-1) \cdot c)$$

terms: n

$$\text{Sum: } \frac{[\bar{t} + (\bar{t} + (n-1) \cdot c)] \cdot n}{2} = \frac{c \cdot n^2 + (2\bar{t} - c) \cdot n}{2}$$

$\hookrightarrow O(n^2)$

object creation: $O(1)$

Inserting into an Array

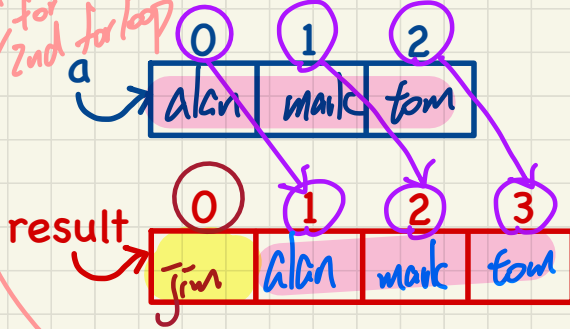
```
String[] insertAt(String[] a, int n, String e, int i)
1 String[] result = new String[n + 1];
  for(int j = 0; j <= i - 1; j++) { result[j] = a[j]; }
1 result[i] = e;
  for(int j = i + 1; j <= n; j++) { result[j] = a[j-1]; }
1 return result;
```

Handwritten notes:

- $a.length$ points to n .
- $insert "e" to index "i"$ points to i .
- $0 \leq i \leq n$ (first and last)
- $[0, i-1] \rightarrow i$ iterations
- $[i+1, n] \rightarrow n - (i+1) + 1 \rightarrow n - i$ iterations

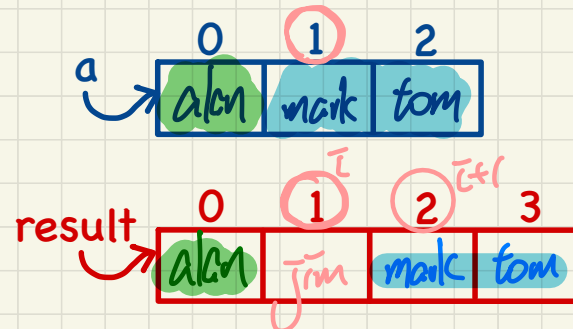
Example:

insertAt({alan, mark, tom}, 3, jim, 0)



Example: $O(1 + n \cdot 1 + 1 + (n-i) \cdot 1 + 1) = O(n)$

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



Exercise: insertAt({alan, mark, tom}, 3, jim, 3)

worst case for 1st for loop

Lecture 8 - January 30

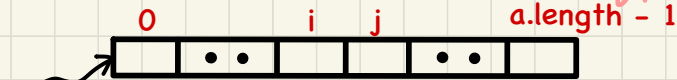
Arrays and Linked Lists

***Exercise: Relating Sorting Orders
Selection vs. Insertion Sorts***

Announcements/Reminders

- **Assignment 1** solution released
- ***splitArrayHarder***: an extended version released
- Lecture notes template available
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- Contact Information of TAs on common eClass site

Sorting Orders of Arrays



non-descending

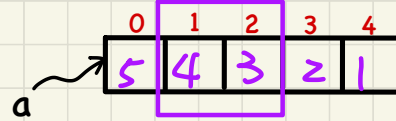
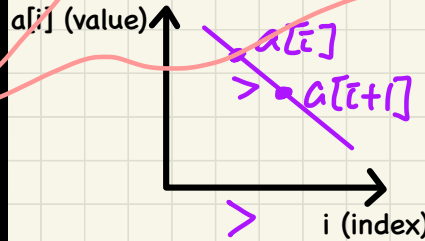
$\equiv \neg(\text{descending})$

$\equiv \neg(a[i] > a[i+1])$

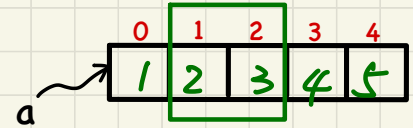
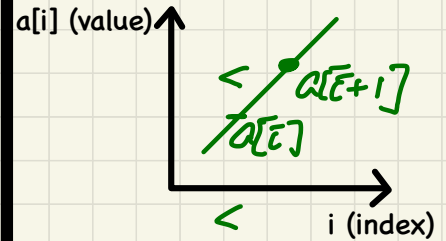
$\equiv a[i] \leq a[i+1]$

duplicates allowed

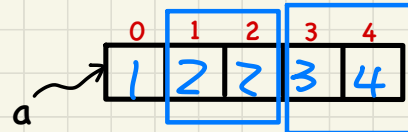
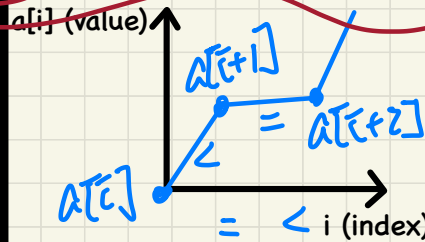
decreasing/descending



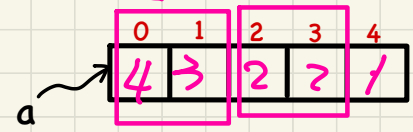
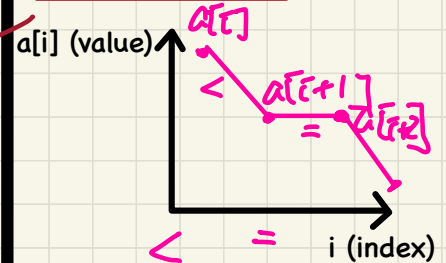
increasing/ascending



non-descending



non-ascending

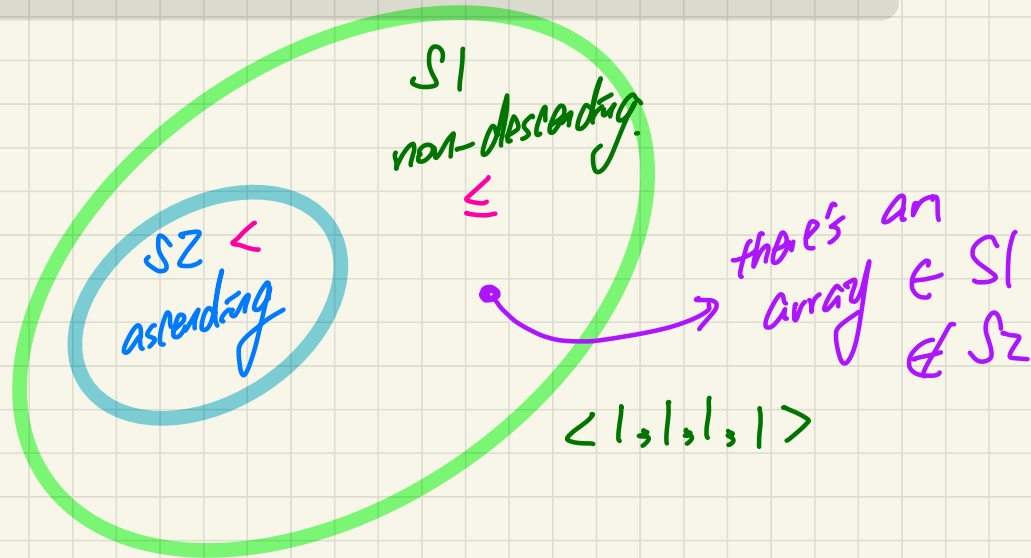


Exercise: Relating Sets of Sorted Arrays

Q. Consider the following two sets:

- S_1 : all arrays sorted in a non-descending order
- S_2 : all arrays sorted in an ascending order.

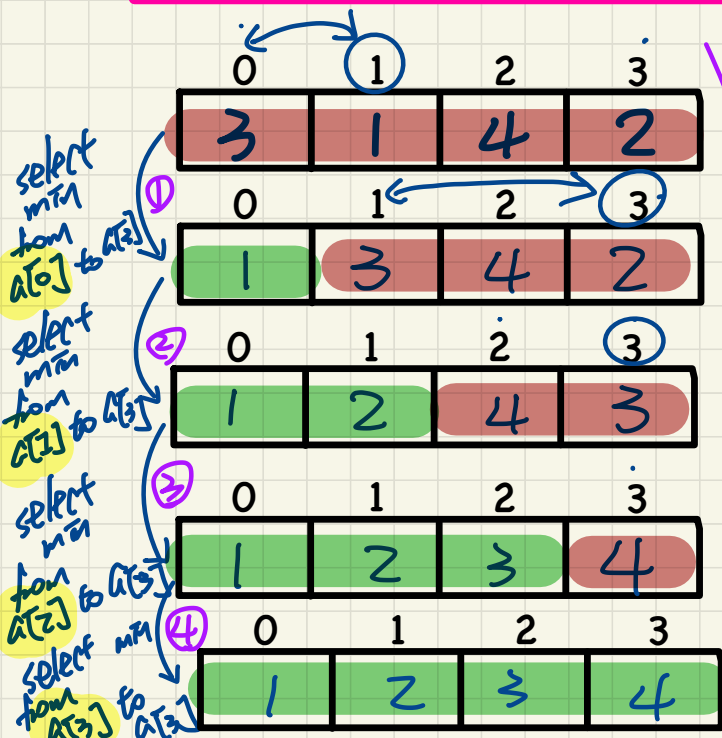
Formulate the relation between these two sets.



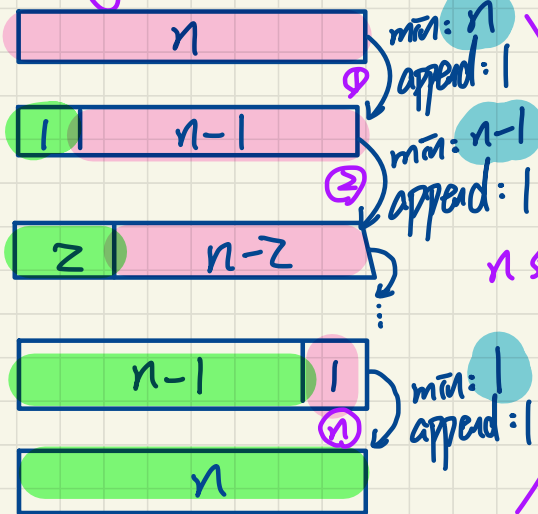
Selection Sort

$$O(\underbrace{n}_{\# \text{ steps swap}} \cdot \underbrace{1}_{\text{1st sel.}} + \underbrace{[n + (n-1) + \dots + 1]}_{\text{last sel.}}) = O(n + n^2) = O(n^2)$$

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



steps? size of the ultimate sorted portion n
Decreasing costs of select



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

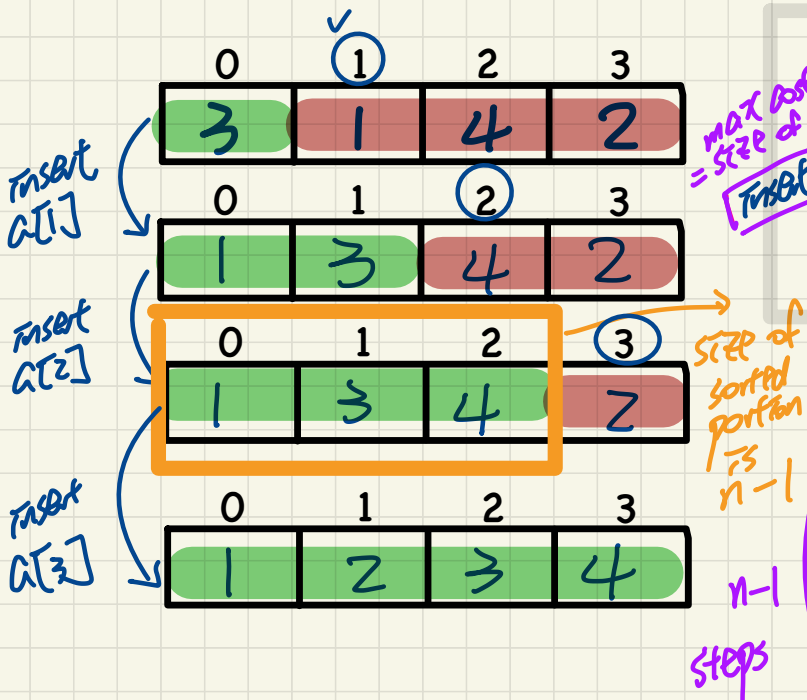
Insertion Sort

$O(1)$

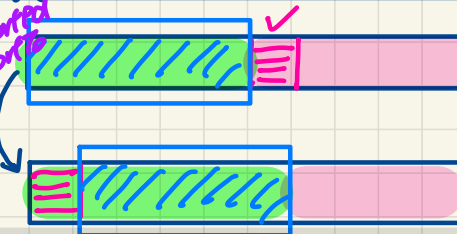
$$O\left(\underbrace{(n-1)}_{\text{steps}} \cdot \underbrace{1}_{\text{get left-most of unsorted}} + \underbrace{[1 + 2 + \dots + (n-1)]}_{\frac{(1+(n-1)) \cdot (n-1)}{2}}\right) =$$

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

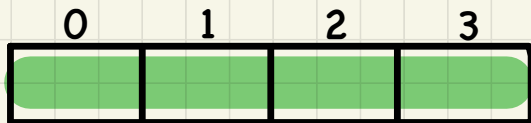
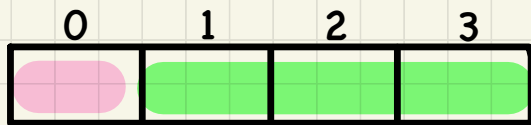
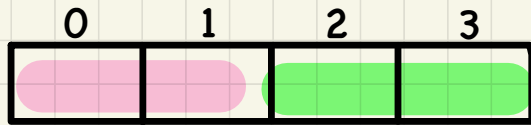
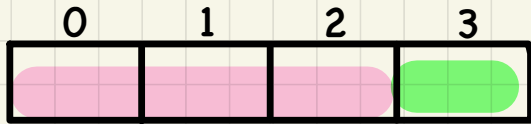
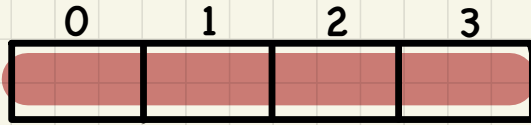
$$O(n-1 + \frac{n^2}{2}) = O(n^2)$$



Worst case for insert



step	get	size of sorted portion	max cost for insert
1	$a[1]$	1	1
2	$a[2]$	2	2
3	$a[3]$	3	3
		$\vdots$	
$n-1$	$a[n-1]$	$n-1$	$n-1$



(1) Sorted portion is maintained on the right

∴ order: non-ascending.

Selection Sort: Deriving Asymptotic Upper Bound

```

1 void selectionSort(int[] a, int (n) a.length)
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;
  
```

exec. according to values of i

exec. according to values of (i, j)

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

$O(n^2)$

$[0, n-2]$ i j

0	0	1	2	...	$n-1$	n
1		1	2	...	$n-1$	$n-1$
2			2	...	$n-1$	$n-2$
$\vdots$			$\vdots$		$\vdots$	$\vdots$
$n-2$					$n-2$	2

$n-1$ re.

$$O\left(\underbrace{(n-1)}_{\downarrow \# \text{ it. outer loop}} \cdot \underbrace{1}_{\downarrow L3, L6 \sim L8}\right) + \underbrace{\left[n + (n-1) + (n-2) + \dots + 2\right]}_{\downarrow L5} = O(n-1 + n^2) = O(n^2)$$

Insertion Sort: Deriving Asymptotic Upper Bound

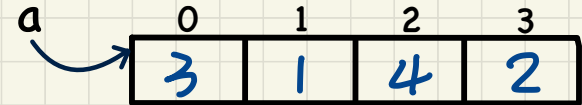
(Exercise)

```
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;
```

Selection Sort in Java

```
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;
```

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:

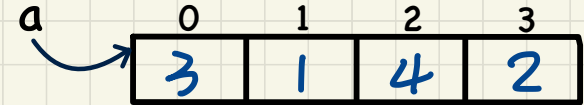
At the end of each iteration of the for-loop, a is sorted from $a[0]$ to $a[i]$.

i	inner loop: j from ? to ?	midIndex at L6	after L6 - L8, a becomes?

Insertion Sort in Java

```
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;
```

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



Outer Loop:

At the end of each iteration of the for-loop, a is sorted from `a[0]` to `a[i]`.

i	current after L3	j at L8	after L8, a becomes?

Lecture 9 - February 4

Arrays and Linked Lists

Q: Mixing Insertion & Selection Sorts

SLL: Visual Introduction & Operations

SLL in Java: Node vs. SinglyLinkedList

Announcements/Reminders

- **Assignment 2** (on **SLL**) to be released soon
- **Assignment 1** solution released
- ***splitArrayHarder***: an **extended** version released
- Lecture notes template available
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site

* Precondition: $\forall i, j \cdot 0 \leq i < \frac{n}{2} \wedge \frac{n}{2} \leq j < n \Rightarrow \text{input}[i] \leq \text{input}[j]$ Not working

Exercise: Mixing the "Best" from both **Sorts**?

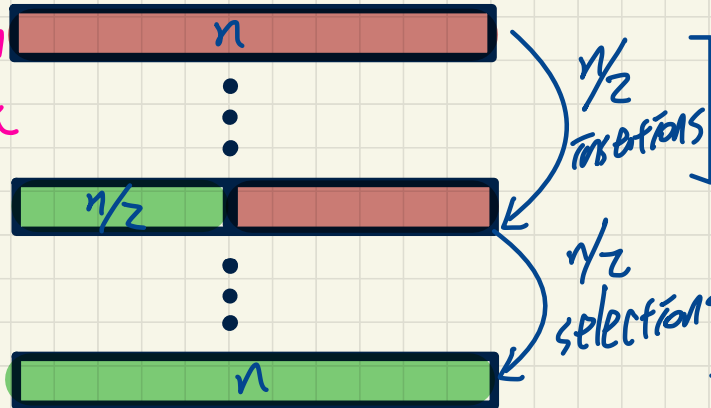
Recall:

- In insertion sort, costs of insertions are increasing.
- In selection sort, costs of selections are decreasing.

Idea:

- Perform insertion sort until half of the input is sorted.
- Perform selection sort to finish sorting the remaining half.

Q: Will this "new" algorithm perform better than $O(n^2)$?

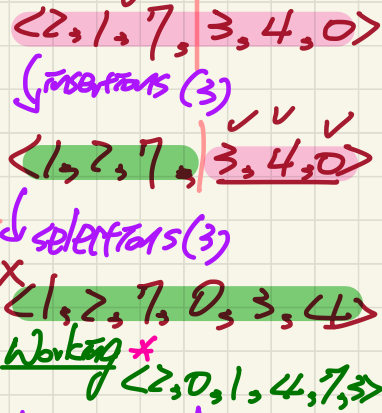


$$O\left(\underbrace{1 + 2 + \dots + \frac{n}{2}}_{\substack{\text{1st ins.} \\ \text{last ins.}}}\right) = O(n^2)$$

Handwritten notes: $(1 + \frac{n}{2}) \cdot \frac{n}{2}$ and $\frac{(\frac{n}{2} + 1) \cdot \frac{n}{2}}{2}$

$$O\left(\underbrace{\frac{n}{2}}_{\text{1st sel.}} + (\frac{n}{2} - 1) + \dots + \underbrace{1}_{\text{last sel.}}\right) = O(n^2)$$

Handwritten notes: $O(n^2 + n^2) =$



(b) justify
(c) assumption on input structure

Singly-Linked Lists (SLL): Visual Introduction

- A chain of connected nodes (via aliasing)
- Each node contains:
 - + reference to a data object
 - + reference to the next node
- Head vs. Tail
- Accessing a position in a linear collection:
 - + Array uses absolute indexing: $O(1)$
 - + SLL uses relative positioning: $O(n)$
- The chain may grow or shrink dynamically.

multiple expressions referring to same object

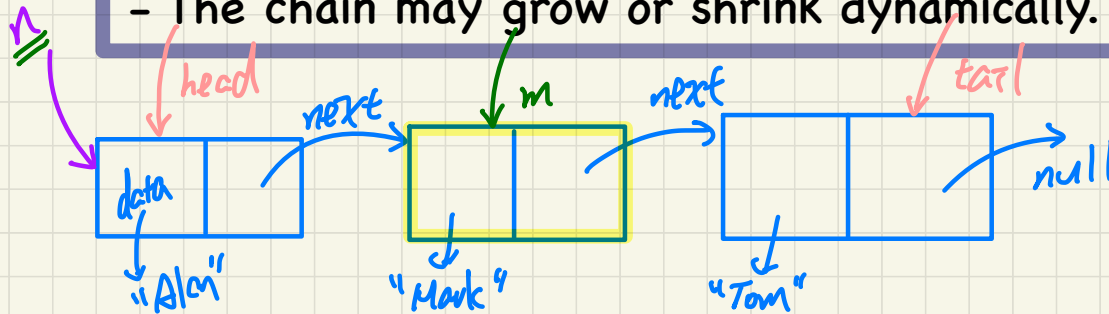
(e.g. $m == n.next$)

(n : 1st node
 $n.data == "Alan"$)

($n.next != null$
 $n.next.data == "Mark"$)

$n.next.next.next.data$
null

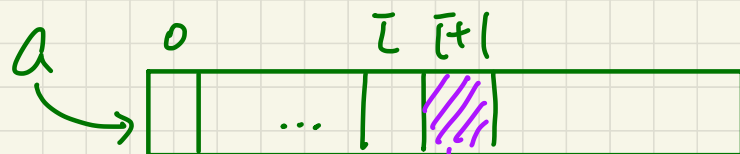
NullPointerException



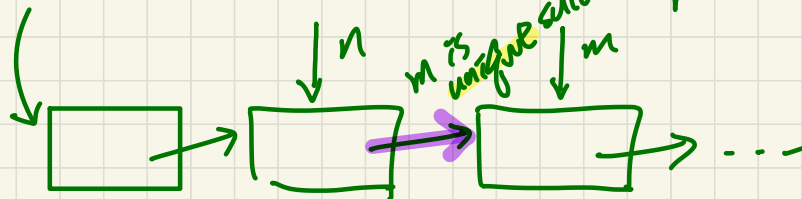
Linear vs. Non-Linear collections

each position in the collection has a **unique** successor.

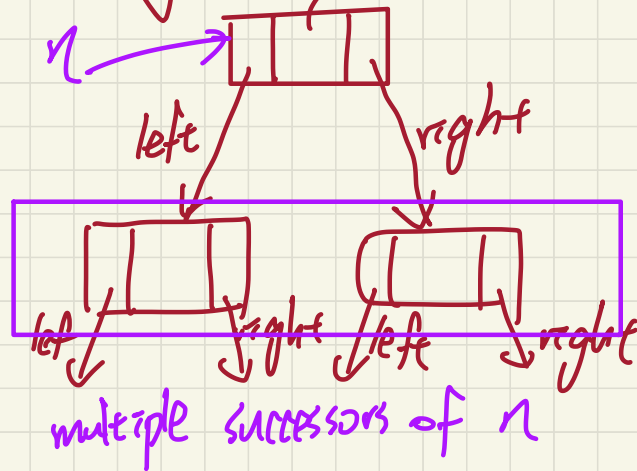
each position has **multiple** successors



unique successor of $a[i]$



Binary Tree



Absolute Indexing of Arrays

OG

$A[i]$

starting
address of
the array

int. exp:
calculating the address offset
from A

Relative Positioning of LL

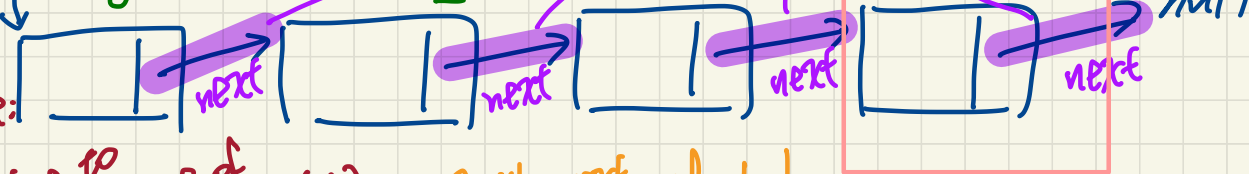
$O(n)$

$l.get(i)$

worst case:

i gets close to the size of chain (n) $\rightarrow \approx \#$ next ref. lookup

head

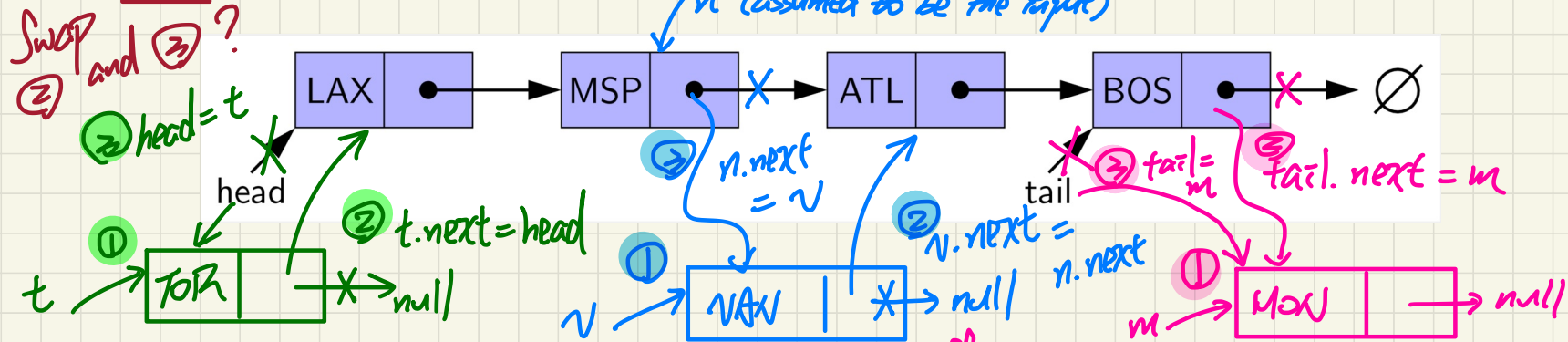


relative
positioning
(unique successor)

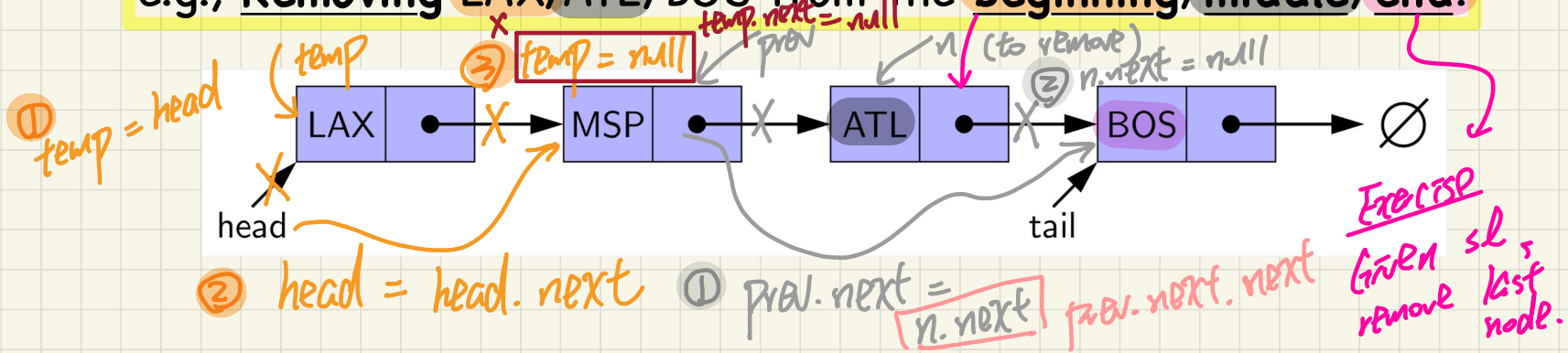
last node:
 $next == null$

A SLL Grows or Shrinks Dynamically

e.g., Inserting TOR/VAN/MON to the beginning/middle/end.



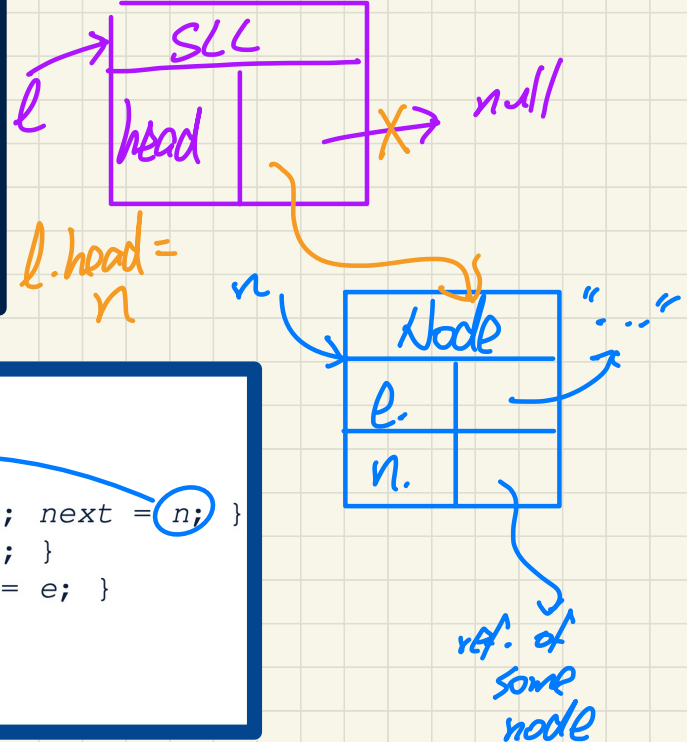
e.g., Removing LAX/ATL/BOS from the beginning/middle/end.



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() { ... }  
}
```

Runtime



```
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; }  
}
```

Lecture 10 - February 6

Arrays and Linked Lists

SLL: List Constructions

SLL: getSize and getTail

Trading Space for Time: tail and size

Announcements/Reminders

- **Assignment 2** (on **SLL**) released
 - + **Required** studies: Generics in Java (Slides 33 — 36)
 - + **Recommended** studies: extra SLL problems
- **Assignment 1** solution released
- ***splitArrayHarder***: an **extended** version released
- Lecture notes template available
- Office Hours: 3pm to 4pm, Mon/Tue/Wed/Thu
- Contact Information of TAs on common eClass site

SLL: Constructing a Chain of Nodes

Alan → Mark → Tom

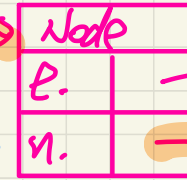
```
public class Node {  
    private String element;  
    private Node next;  
    public Node(String e, Node n) { element = e; next = n; }  
    public String getElement() { return element; }  
    public void setElement(String e) { element = e; }  
    public Node getNext() { return next; }  
  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

Approach 1

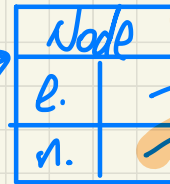
```
Node tom = new Node("Tom", null);  
Node mark = new Node("Mark", tom);  
Node alan = new Node("Alan", mark);
```

Aliasing

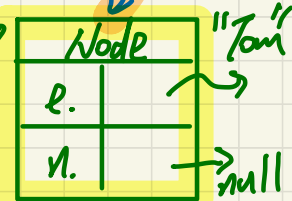
1. tom
2. mark.next → alan.next.next



"Alan"



"Mark"



"Tom"

→ null

Approach 1

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

Alan → Mark → Tom

unknown variable
(compilation
error!)

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

Node alan;

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 x) { next = x; }  
}
```

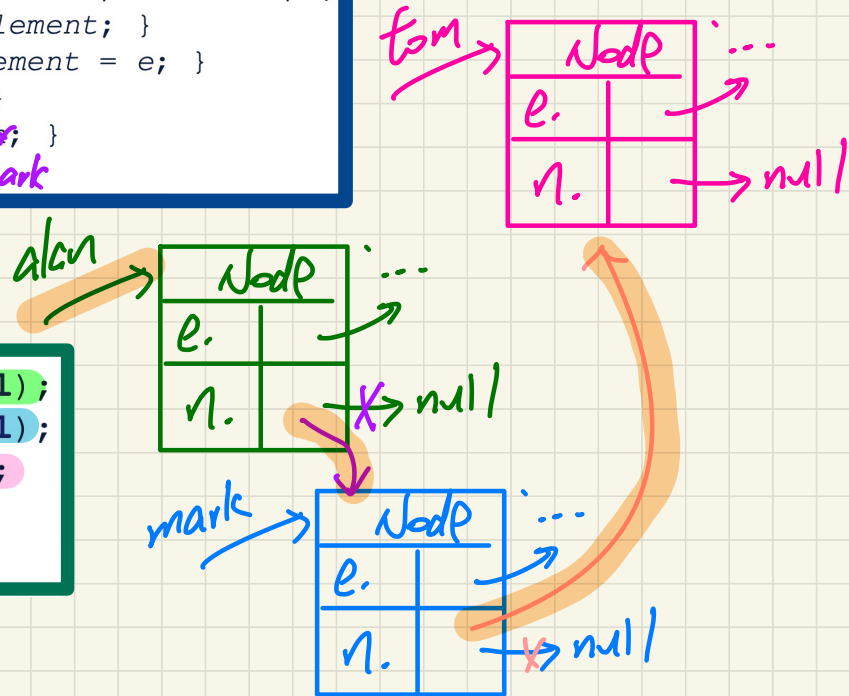
alan

mark

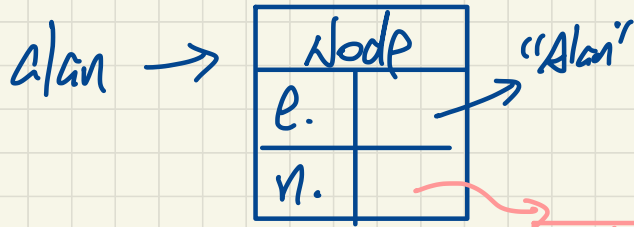
Approach 2

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

alan.next = mark =
mark.next = tom =

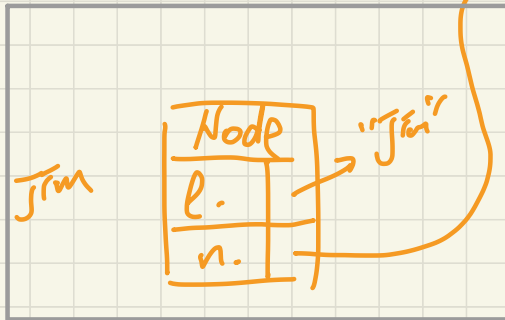


Node alan = new Node ("Alan", null);

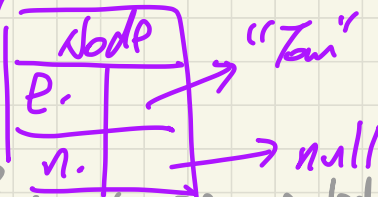


new Node ("Mark", null)

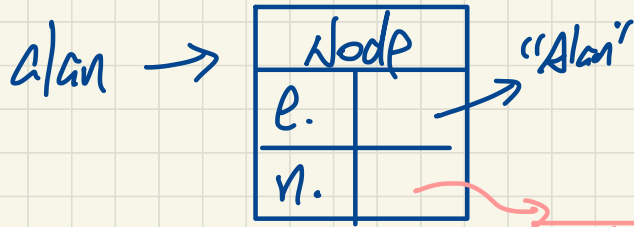
new Node ("Tom", null)



two nodes' next references aliased to the same obj: possible but not recommended!



Node alan = new Node ("Alan",) ;



new Node ("Mark",)

new Node ("Tom", null)

Node mark =
alan.next;



two nodes' next references
aliased to the same obj:
possible but not recommended!

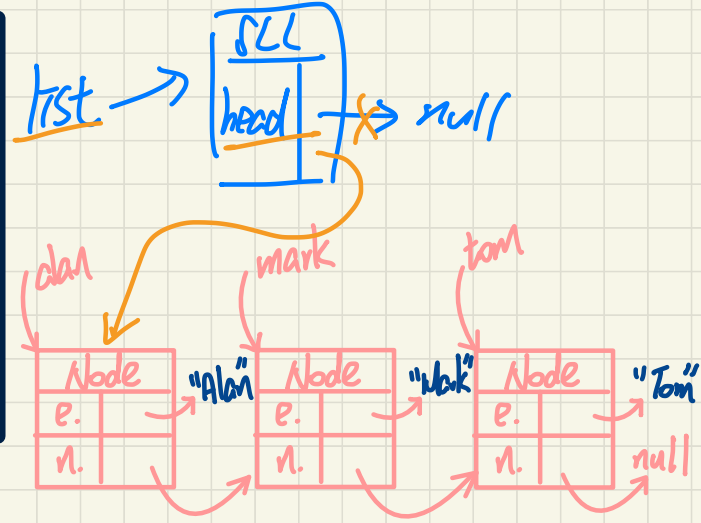
Node	
e.	
n.	

→ "Tom"

→ null

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

```
public class SinglyLinkedList {  
    private Node head = null; alan + this. / first  
    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)
```

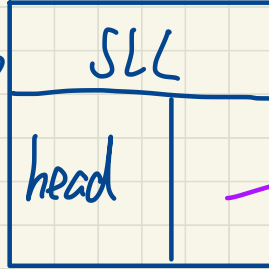
Empty SLL

default const.

SLL list = new SLL();

SLL list = null;

list
existing,
but empty.
(empty chain of
nodes)



null

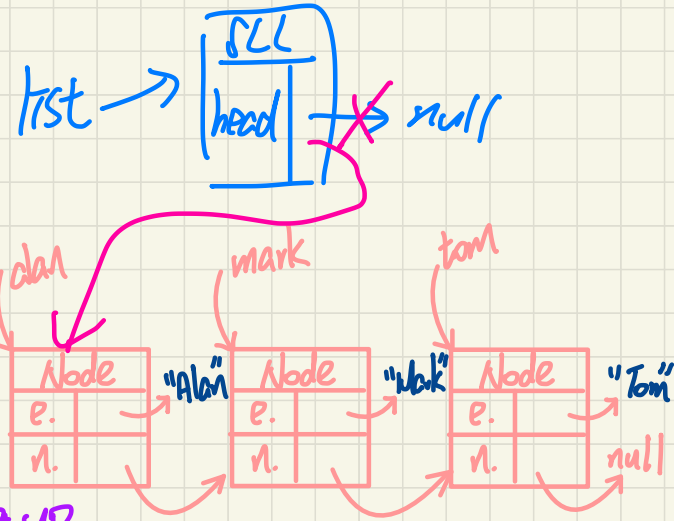
list

non-existing.

null

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() { ... }  
}
```

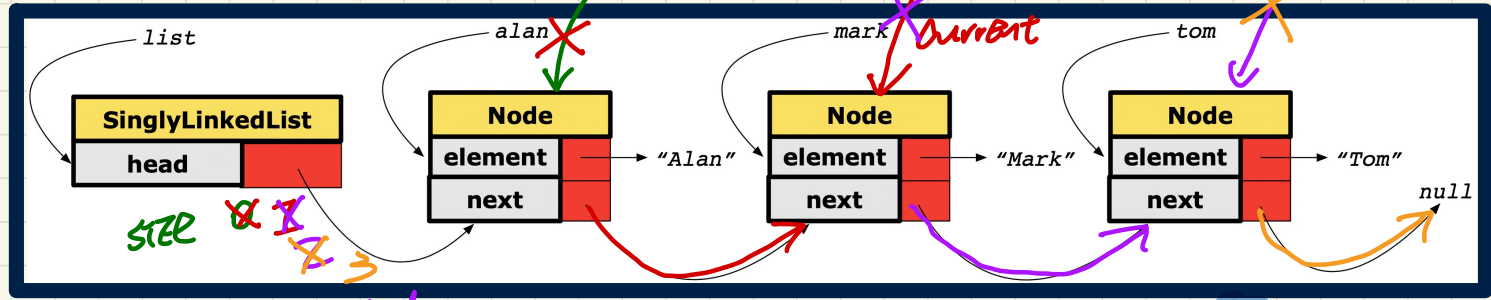


Approach 2 `list.setHead(null)` → clearing up the list

```
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);
```

`list.setHead(tom)`
↳ compiles and runs
but potentially
logical errors

SLL Operation: Counting the Number of Nodes



a SLL method

```

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 }
    
```

loop counter
exit when current == null

Trace: list.getSize()

$O(n)$ # iterations
 = # nodes

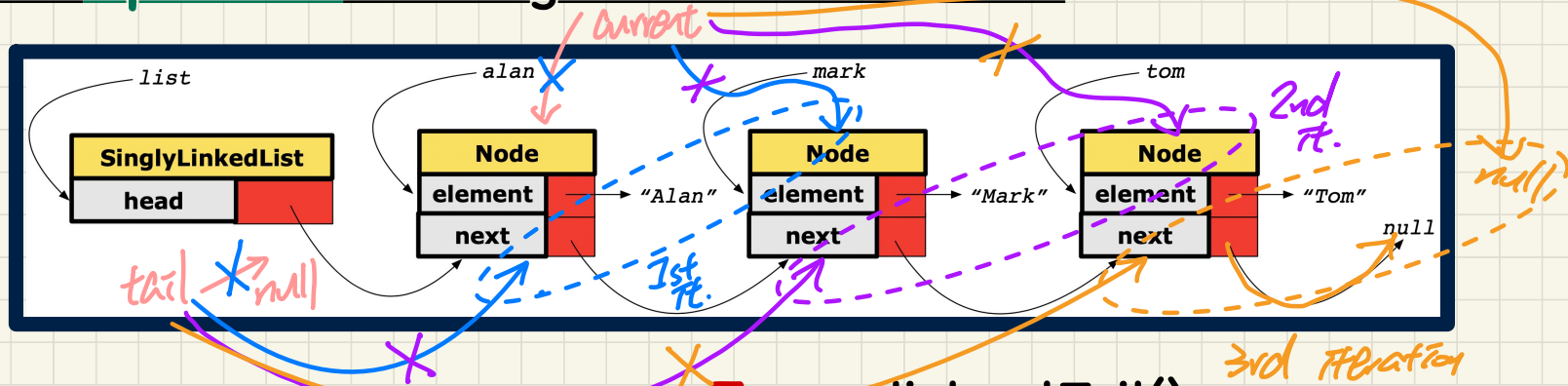
current	current != null	End of Iteration	size
alan	alan != null	Current == mark	1
mark	mark != null	Current == tom	2
tom	tom != null	Current == null	3
null	null != null		

$O(n \cdot 1) = O(n)$
 # it. $\rightarrow$ 15, 16

(F)

Exercise: Use "current" only to implement getTail. **current** is always one node ahead of **tail**.

SLL Operation: Finding the Tail of the List



Trace: list.getTail()

```

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 }

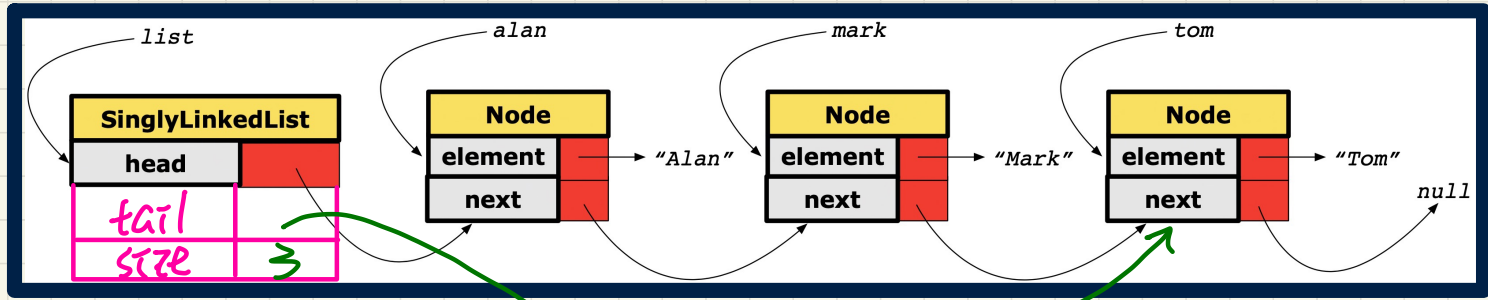
```

current	current != null	End of Iteration	tail

iterations = size of list $O(n)$
 $O(n \cdot 1) = O(n)$

SLL: Trading **Space** for **Time**

waste more memory space to make the subsequent computations cheaper



SLL class

Attributes
↓
more cost of space

- ↳ head
- ↳ tail
- ↳ size

SLL list = new SLLCS; might impact head, tail, or size of the SLL, bodies of imp. must update them properly.

Attributes access
↓
less cost for running time

(list.tail, list.size) $O(1)$
↓ turning loops to attr. access

Tutorial

Recursion Problem: splitArrayHarder

***Coding in Java
Tracing
Exercises***

Problem on Recursion

A useful extension to the original `splitArray` problem:

- + Return an **ArrayList** of size 2:
 - + If a split of equal sums (assumed to be unique) is possible:
 - * index 0 of the returned list stores **ArrayList** of integers representing group 1.
 - * index 1 of the returned list stores **ArrayList** of integers representing group 2.
 - + If a split is not possible, both indices store empty lists.
- e.g., **splitArrayHarder**({2, 2}) → <<2>, <2>>
- e.g., **splitArrayHarder**({2, 3}) → <<>, <>>
- e.g., **splitArrayHarder**({5, 2, 3}) → <<5>, <2, 3>>
- e.g., **splitArrayHarder**({5, 2, 2}) → <<>, <>>

splitArrayHarder: Java Implementation

call by value

only modified in base case

```
public ArrayList<ArrayList<Integer>> splitArrayHarder(int[] ns) {  
    ArrayList<ArrayList<Integer>> output = new ArrayList<>();  
    splitArrayHarderHelper(ns, 0, 0, 0, new ArrayList<Integer>(), new ArrayList<Integer>(), output);  
    if(output.isEmpty()) {  
        output.add(new ArrayList<Integer>());  
        output.add(new ArrayList<Integer>());  
    }  
    return output;  
}
```

g1 g2

either of them modified in every recursive call (non-base case)

```
private void splitArrayHarderHelper(int[] ns, int i, int sumOfGroup1, int sumOfGroup2,  
    ArrayList<Integer> group1, ArrayList<Integer> group2, ArrayList<ArrayList<Integer>> output) {  
    if(i == ns.length) {  
        if(sumOfGroup1 == sumOfGroup2) {  
            output.add(group1);  
            output.add(group2);  
        }  
    }  
    else {  
        ArrayList<Integer> group1Extended = new ArrayList<>(group1);  
        group1Extended.add(ns[i]);  
        splitArrayHarderHelper(ns, i + 1, sumOfGroup1 + ns[i], sumOfGroup2, group1Extended, group2, output);  
  
        if(output.isEmpty()) {  
            ArrayList<Integer> group2Extended = new ArrayList<>(group2);  
            group2Extended.add(ns[i]);  
            splitArrayHarderHelper(ns, i + 1, sumOfGroup1, sumOfGroup2 + ns[i], group1, group2Extended, output);  
        }  
    }  
}
```

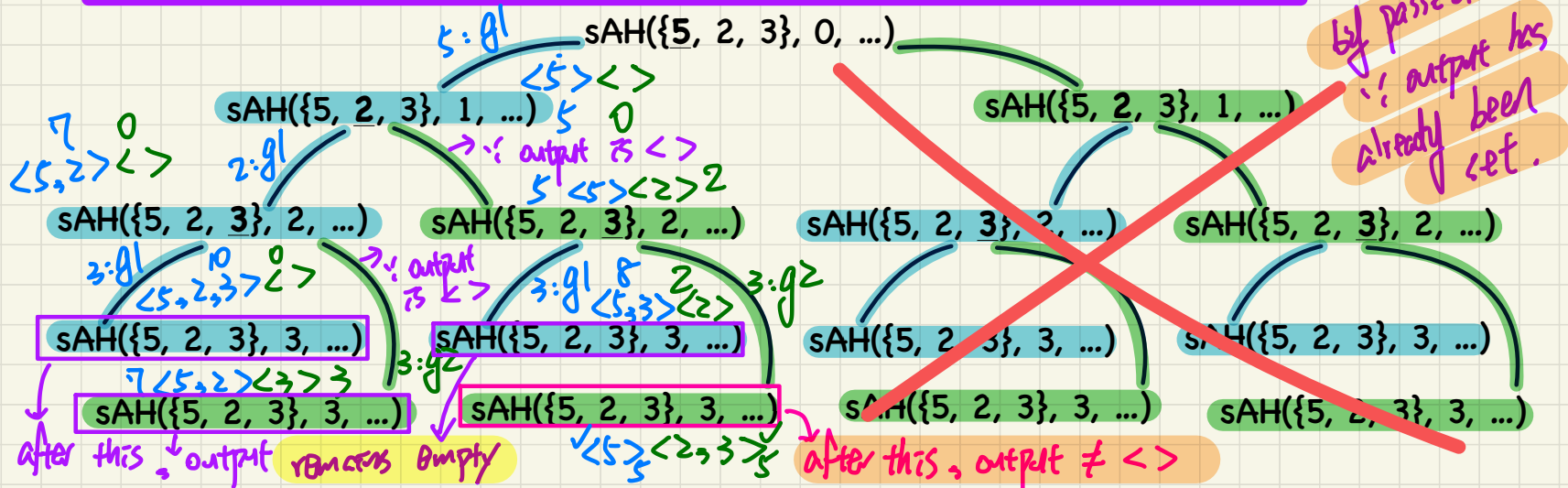
splitArrayHarder: Tracing

Exercise: Trace in Eclipse

@Test

```
public void testSplitArrayHarder_03() {  
    RecursiveMethods rm = new RecursiveMethods();  
    int[] input = {5, 2, 3};  
    ArrayList<ArrayList<Integer>> output = rm.splitArrayHarder(input);  
    ArrayList<Integer> expectedGroup1 = new ArrayList<>(Arrays.asList(5));  
    ArrayList<Integer> expectedGroup2 = new ArrayList<>(Arrays.asList(2, 3));  
    assertTrue(output.size() == 2);  
    assertEquals(expectedGroup1, output.get(0));  
    assertEquals(expectedGroup2, output.get(1));  
}
```

output: $\langle \langle 5 \rangle, \langle 2, 3 \rangle \rangle$



Lecture 11 - February 11

Arrays and Linked Lists

SLL: removeFirst, addLast

SLL: getNodeAt, insertAt

Announcements/Reminders

- **ProgTest1** guide & example questions to be released
- ***splitArrayHarder***: solution and tutorial video released
- **Assignment 2** (on **SLL**) released
 - + **Required** studies: Generics in Java (Slides 33 — 36)
 - + **Recommended** studies: extra SLL problems
- **Assignment 1** solution released
- Lecture notes template, Office Hours, TA Contact

SLL Operation: Inserting to the Front of the List

$O(1)$

@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);
```

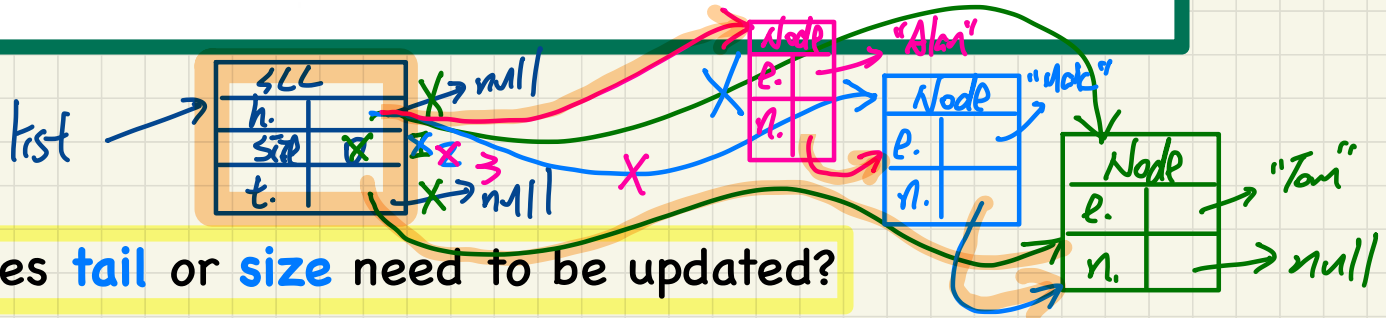
```
    assertEquals("Alan", list.getFirst().getElement());
```

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

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

```
}
```

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



Q. Does **tail** or **size** need to be updated?

SLL Operation (sketch): Removing the First Node

```
void removeFirst()
```

Boundary Cases?

↳ $size == 0 \rightarrow$ Exception

↳ $size == 1 \rightarrow$ result: empty list

SLL	
s.	0
h.	
t.	

→ null

General Cases?

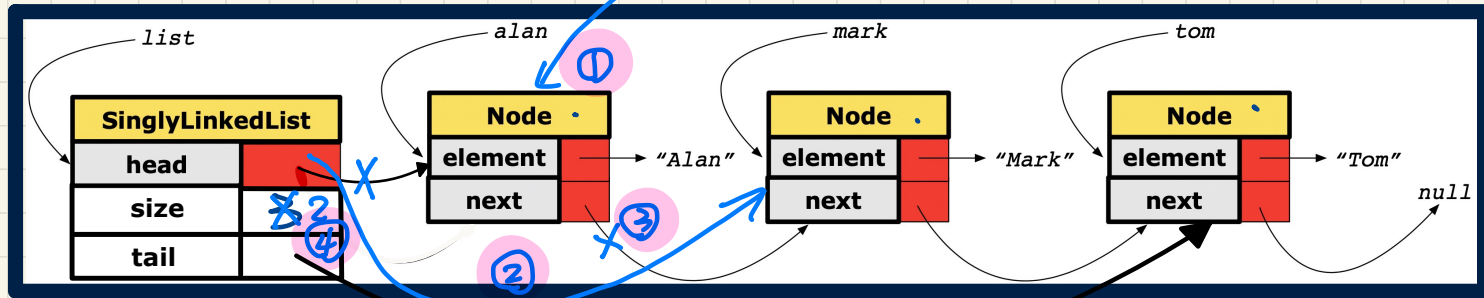
↳ $size \geq 2$

$O(1)$

∴ none of the operations depends on the # nodes in the chain

①, ②, ③, ④

temp



SLL Operation (sketch): Adding a Last Node

```
void addLast(String e)
```

General Cases?

$O(1)$

Boundary Cases?

$\hookrightarrow \text{SIZE} \geq 1$

$\hookrightarrow \text{SIZE} == 0$

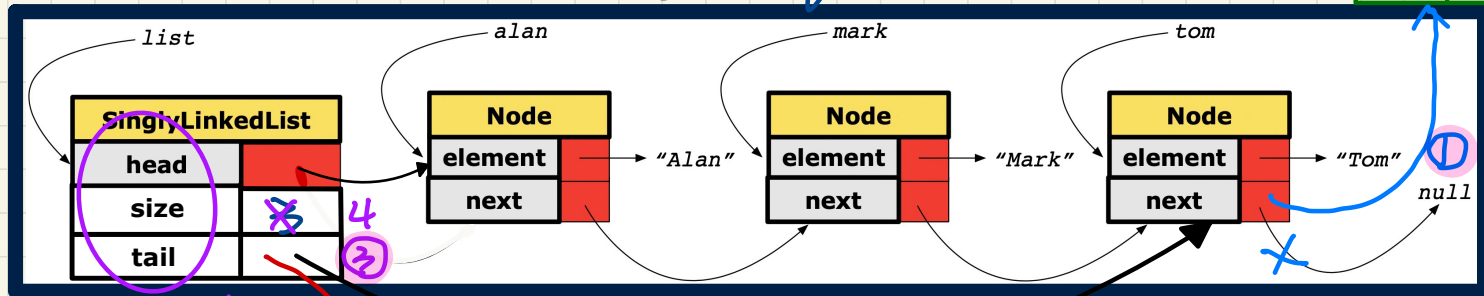
SLL	
h.	
t.	
s.	

~~h.~~ $\rightarrow$ null
~~t.~~ $\rightarrow$ null
~~s.~~ $\rightarrow$ 1

Node	
e.	"i"
n.	$\rightarrow$ null

①, ①, ②, ③
all are variable assignments

Node	
e.	"i"
n.	$\rightarrow$ null



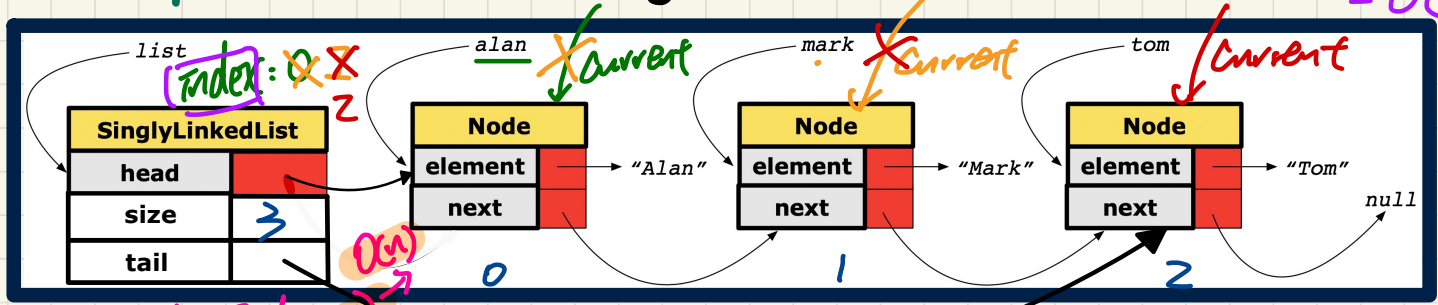
updated constantly

②

* current always references the node stored at index "index"

SLL Operation: Accessing the Middle of the List

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



iterations
 $\frac{n}{2}$

* to access the 2nd (12) last node: $getNodeAt$ $0 \leq i \leq list.size - 1$

Trace: `list.getNodeAt(2)`

```

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

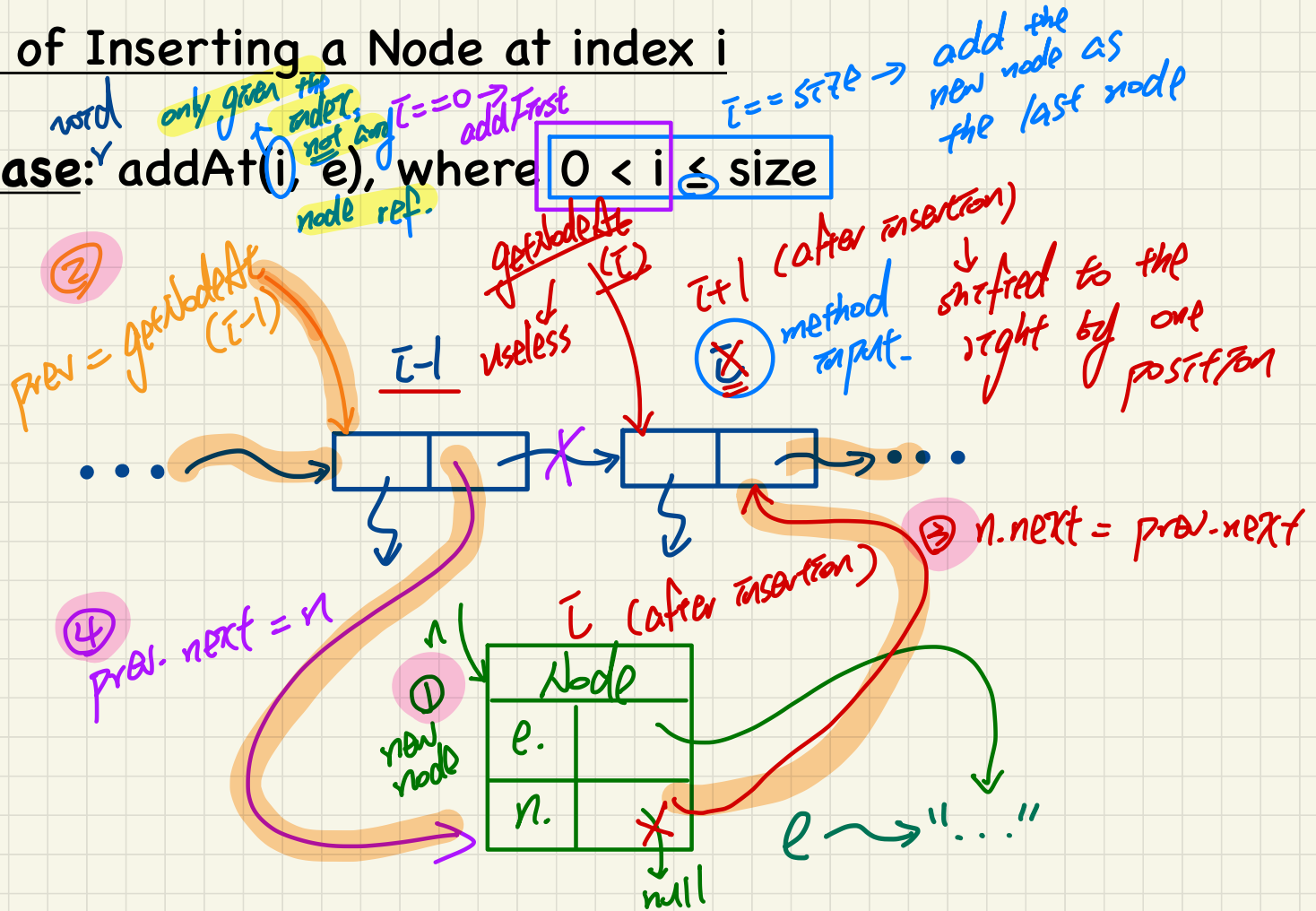
current	index	index < 2	Start of Iteration
alan	0	$0 < 2$	1st: index 0 → 1 current alan → mark
mark	1	$1 < 2$	2nd: index 1 → 2 current mark → tom
tom	2	$2 < 2$	---

F: exit

Q. Does tail or size need to be updated? No!

Idea of Inserting a Node at index i

Case: $\text{addAt}(i, e)$, where $0 < i \leq \text{size}$



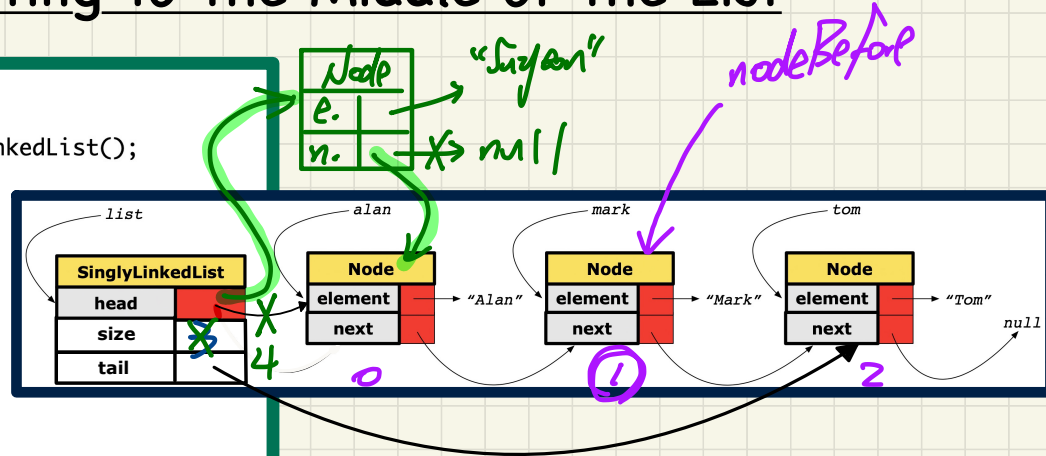
SLL Operation: Inserting to the Middle of the List

@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");
    assertTrue(list.getSize() == 5);
    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());
}
```



```
1 void addAt (int i, String e) {
2     if (i < 0 || i > size) {
3         throw new IllegalArgumentException("Invalid Index.");
4     }
5     else {
6         if (i == 0) {
7             addFirst(e);
8         }
9         else {
10            ① Node nodeBefore = getNodeAt(i - 1);
11                Node newNode = new Node(e, nodeBefore.getNext());
12                nodeBefore.setNext(newNode);
13                size++;
14            }
15        }
16    }
```

Q. Does **tail** or **size** need to be updated?

Lecture 12 - February 13

Arrays and Linked Lists

DLL: Introduction

DLL in Java: Node vs. Doubly-Linked Lists

DLL in Java: addBetween, remove

Announcements/Reminders

- **ProgTest1** guide & example questions released
- In-person Office Hours during RW to be announced
- ***splitArrayHarder***: solution and tutorial video released
- **Assignment 2** (on **SLL**) released
 - + Required studies: Generics in Java (Slides 33 — 36)
 - + Recommended studies: extra SLL problems
- **Assignment 1** solution released
- Lecture notes template, TA Contact

SLL Operation: Inserting to the Middle of the List

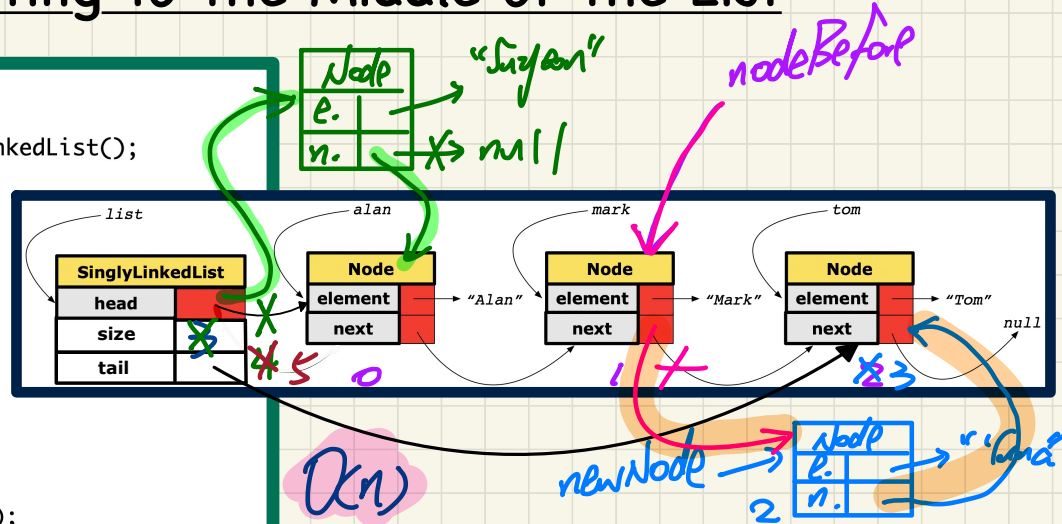
@Test

```
public void testSLL_addAt() {
    SinglyLinkedList list = new SinglyLi
    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");
assertTrue(list.getSize() == 5);
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());
```

}



```

1 void addAt (int i, String e) {
2     if (i < 0 || i > size) {
3         throw new IllegalArgumentException("Invalid Index.");
4     }
5     else {
6         if (i == 0) {
7             addFirst(e);
8         }
9         else {
10            Node nodeBefore = getNodeAt(i - 1);
11            Node newNode = new Node(e, nodeBefore.getNext());
12            nodeBefore.setNext(newNode);
13            size ++;
14        }
15    }
16 }

```

Q. Does **tail** or **size** need to be updated?

SLL Operation: Removing the End of the List

@Test

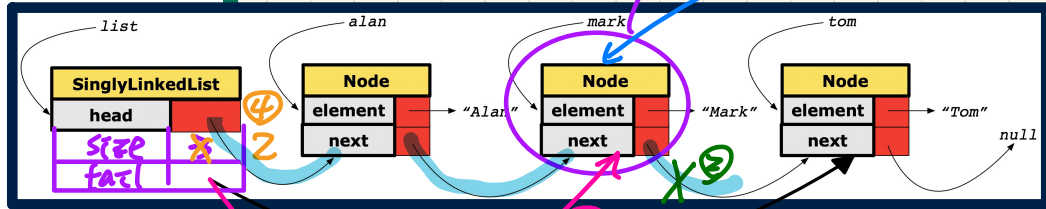
```
public void testSLL_removeLast() {
    SinglyLinkedList list = new SinglyLinkedList();
    assertTrue(list.getSize() == 0);
    assertTrue(list.getFirst() == null);

    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());
}
```



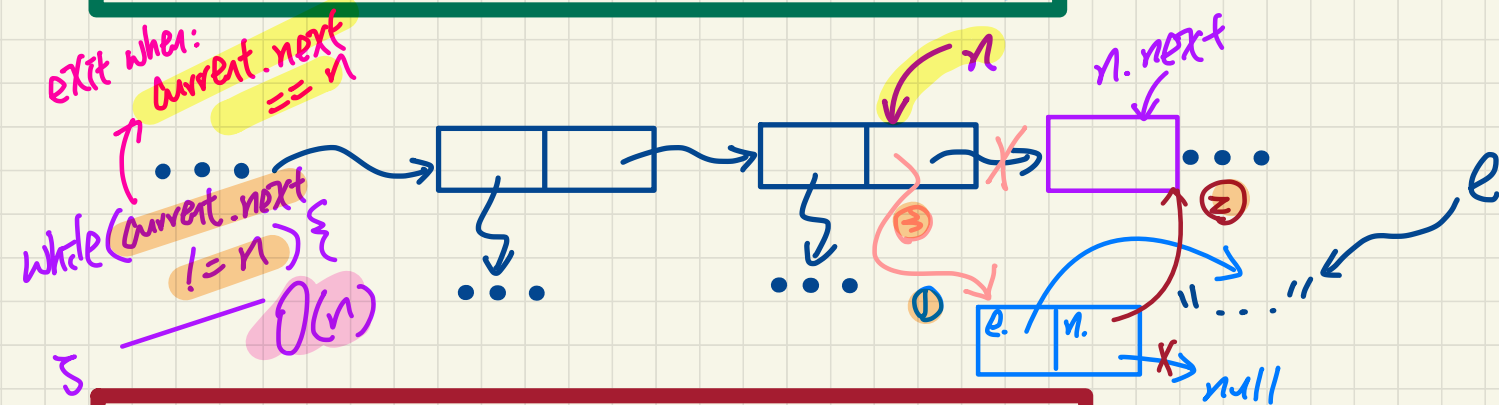
```
1 void removeLast () {
2   if (size == 0) {
3     throw new IllegalArgumentException("Empty List.");
4   }
5   else if (size == 1) {
6     removeFirst();
7   }
8   else {
9     Node secondLastNode = getNodeAt(size - 2);
10    secondLastNode.setNext(null);
11    tail = secondLastNode;
12    size --;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

Q. Does **tail** or **size** need to be updated?

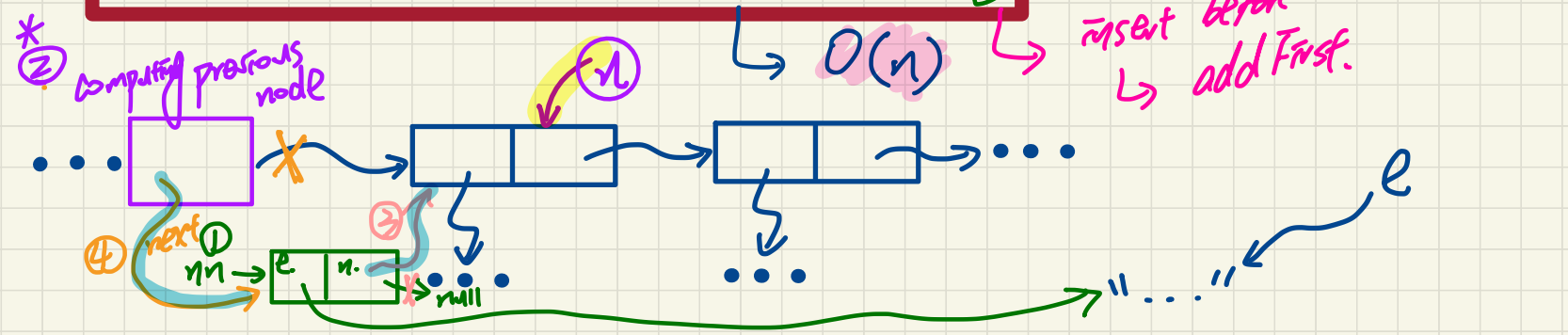
Exercises: **insertAfter** vs. **insertBefore**

Case: insertAfter(Node n, String e)

$O(1)$



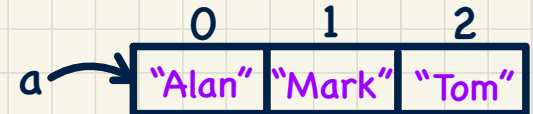
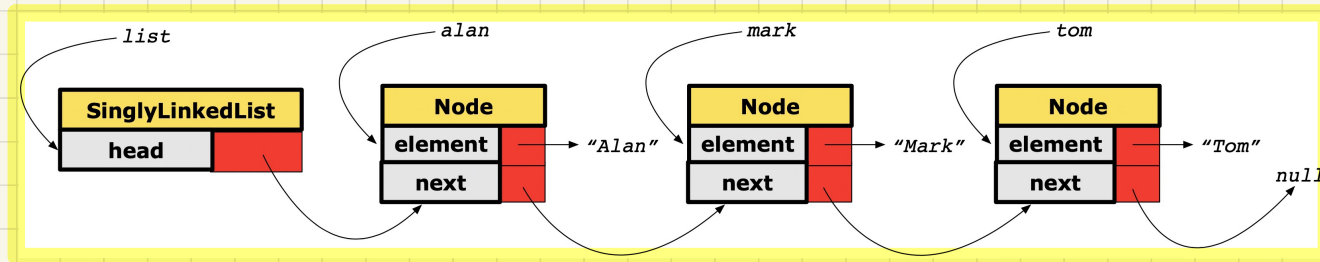
Case: insertBefore(Node n, String e)



Running Time: Arrays vs. Singly-Linked Lists

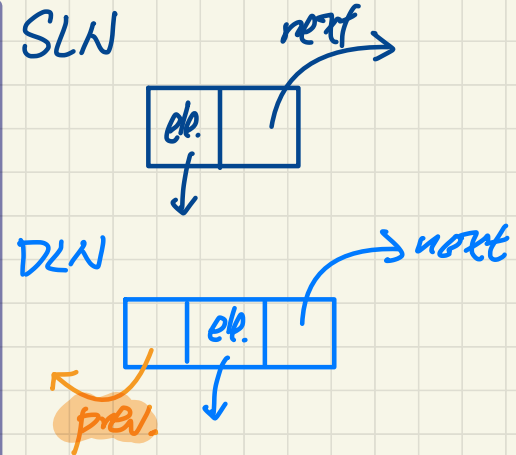
DATA STRUCTURE		ARRAY	SINGLY-LINKED LIST
OPERATION			
get size			$O(1)$
get first/last element			
get element at index i	<i>array: $a[a.length - 1] = \text{null}$</i>	$O(1)$	$O(n)$
remove last element		$O(1)$	$O(n)$
add/remove first element, add last element			
add/remove i^{th} element	given reference to $(i - 1)^{\text{th}}$ element	$O(1)$	$O(1)$
	not given	$O(n)$	$O(n)$

no need to compute node



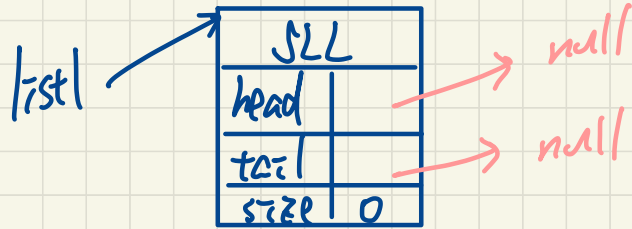
Doubly-Linked Lists (DLL): Visual Introduction

- 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:
 - + many methods implemented the same way
 - + some method implemented more efficiently
- Each DLL stores dedicated Header & Trailer Nodes (no head reference and no tail reference)
- The chain may grow or shrink dynamically.
- Accessing a node in a DLL (via next or prev):
 - + Relative positioning: $O(n)$

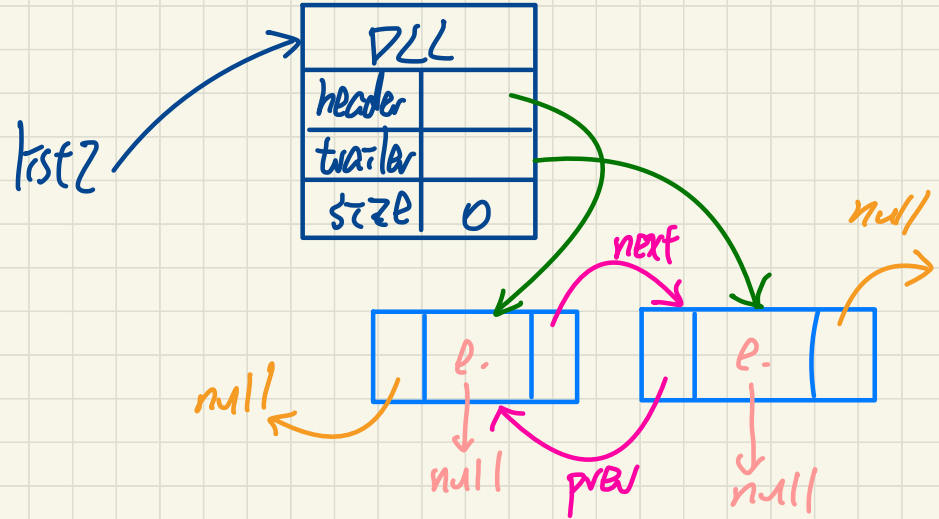


Empty Lists: SLLs vs. DLLs

Empty SLL

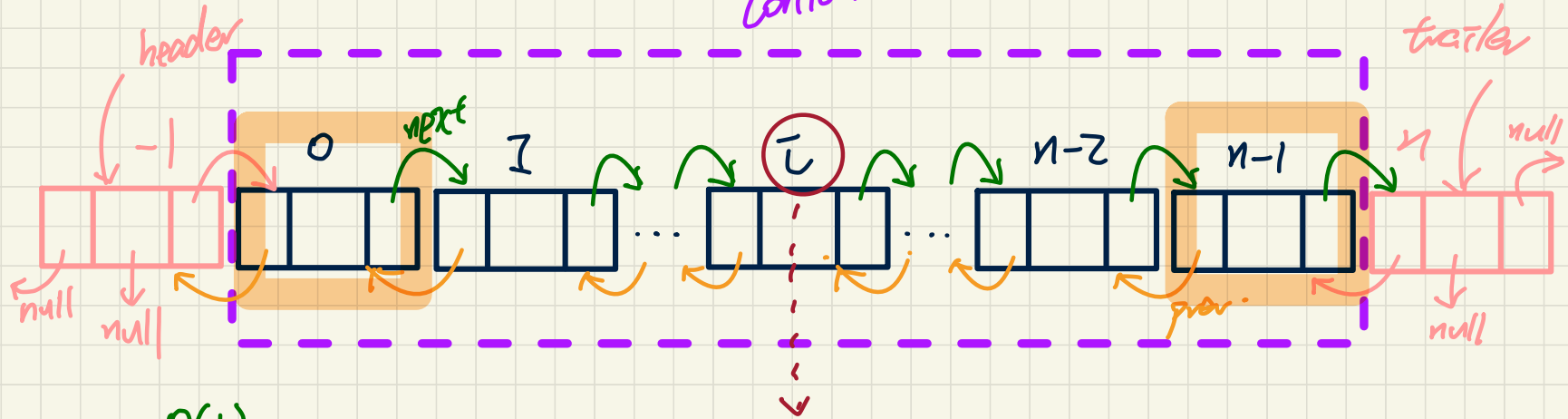


Empty DLL



DLLs: Relative Positioning

Contents of DLL



$O(1)$
header.next : first node

$O(1)$
trailer.prev : last node

worst case:
Around the middle
 $O(\frac{n}{2}) = O(n)$



Why DLL / DLN?

list →
node →

1. performance (e.g. removeLast)

↳ prev ref. for DLN

2. Code structure

don't need to handle edge cases explicitly.

↳ header, trailer for DLL

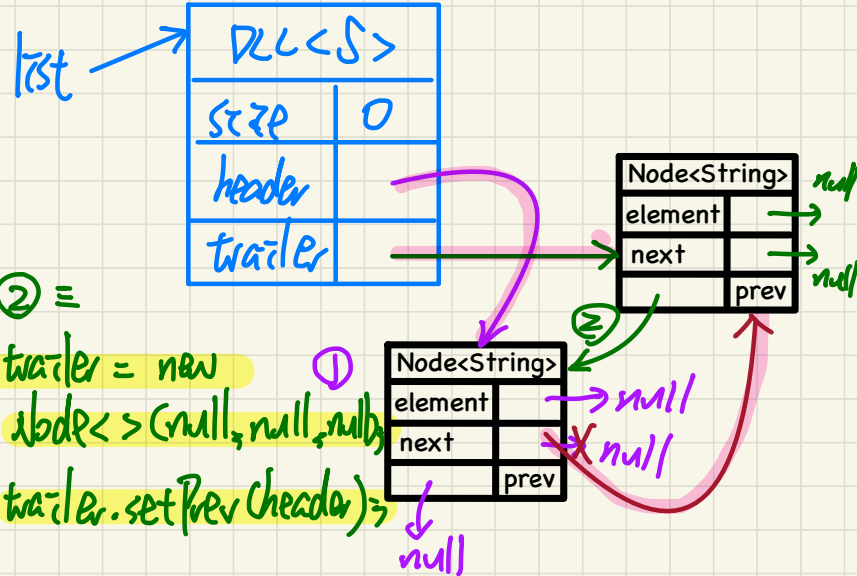
Generic DLL in Java: DoublyLinkedList vs. Node

Node<String>	
element	
next	
	prev

```
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() {
        ① header = new Node<>(null, null, null);
        ② trailer = new Node<>(null, header, null);
        ③ header.setNext(trailer);
    }
}
```

```
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;
    }
}
```

```
@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);
}
```



Generic DLL in Java: Inserting between Nodes

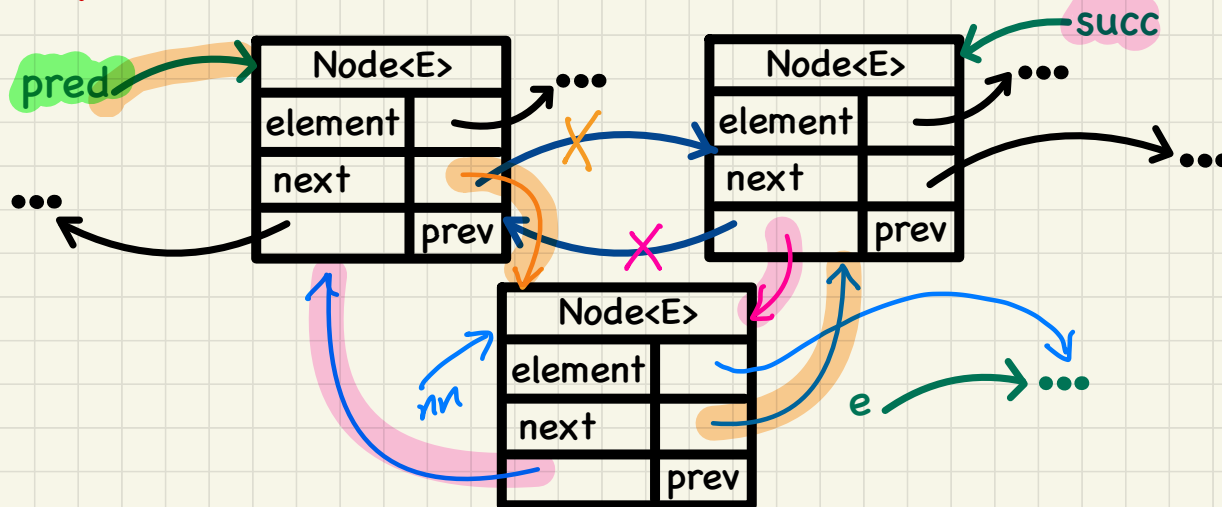
Assumptions: $\text{pred.next} == \text{succ}$ && $\text{succ.prev} == \text{pred}$

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 }
```

ele. prev. next

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());

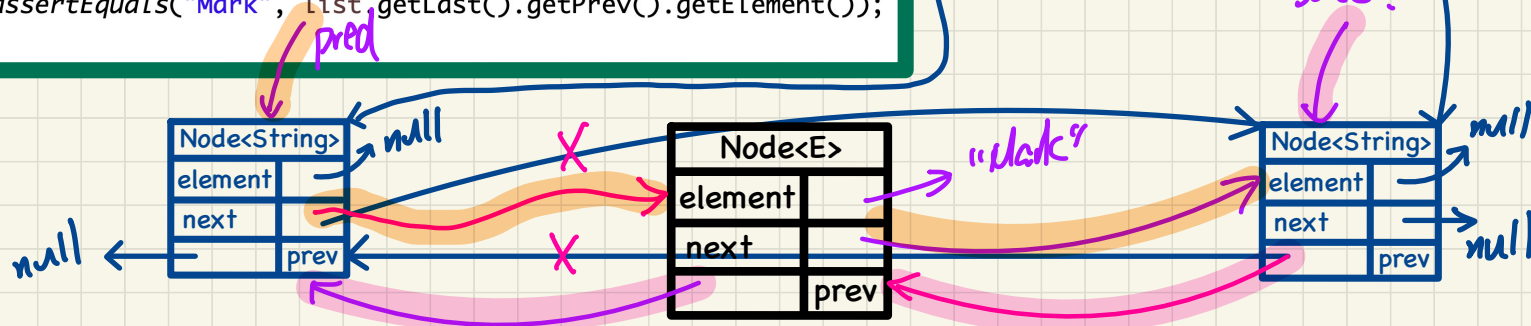
    list = new DoublyLinkedList<>();
    list.addLast("Mark");
    list.addLast("Alan");

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

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

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

DLL<String>	
size	0
	header
trailer	



Generic DLL in Java: Inserting to the Middle

Node<String>	
element	
next	
	prev

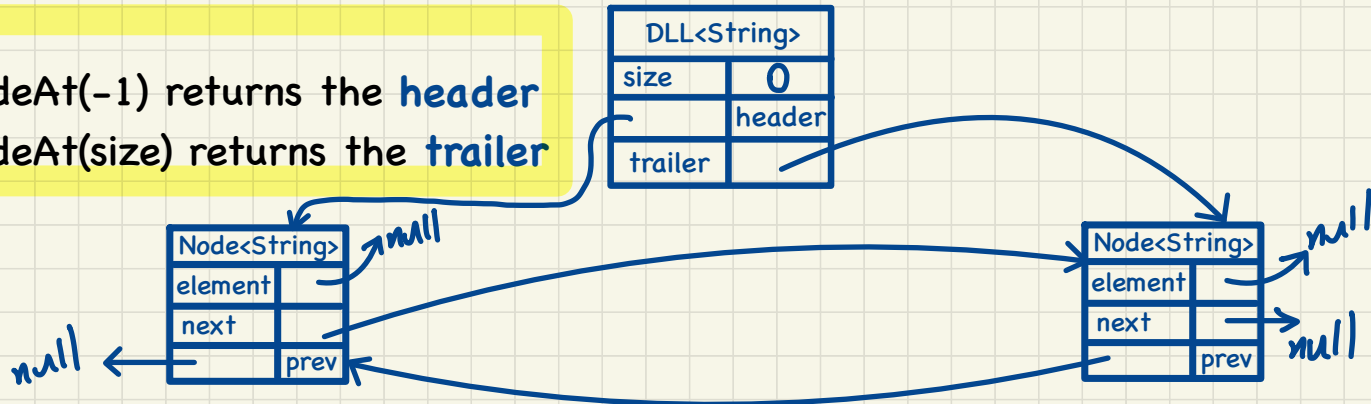
@Test

```
public void test_String_DLL_addAt() {  
    DoublyLinkedList<String> list = new DoublyLinkedList<>();  
    list.addAt(0, "Alan");  
    list.addAt(1, "Tom");  
    list.addAt(1, "Mark");  
    assertEquals.assertEquals(list.getSize() == 3);  
    assertEquals("Alan", list.getFirst().getElement());  
    assertEquals("Mark", list.getFirst().getNext().getElement());  
    assertEquals("Tom", list.getFirst().getNext().getNext().getElement());  
}
```

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

Notes.

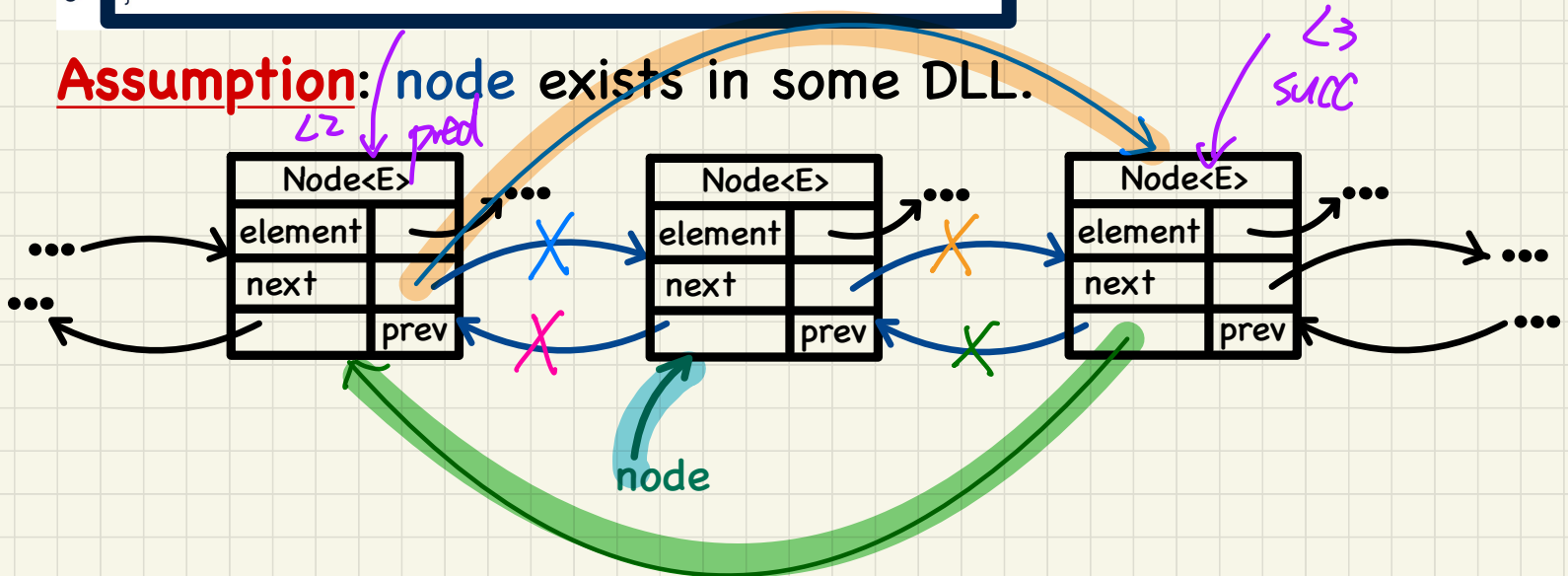
- + getNodeAt(-1) returns the **header**
- + getNodeAt(size) returns the **trailer**



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     pred.setNext(succ);  
5     succ.setPrev(pred);  
6     ✓ node.setNext(null);  
7     node.setPrev(null);  
8     size --;  
9 }
```

Assumption: node exists in some DLL.



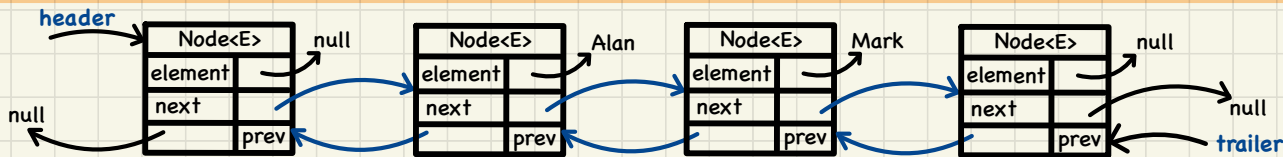
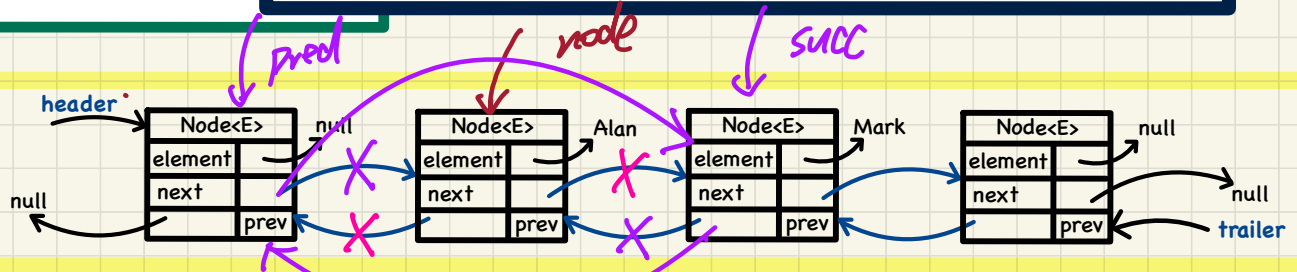
Generic DLL in Java: Removing from the Front/End

```
@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()); }
}
```

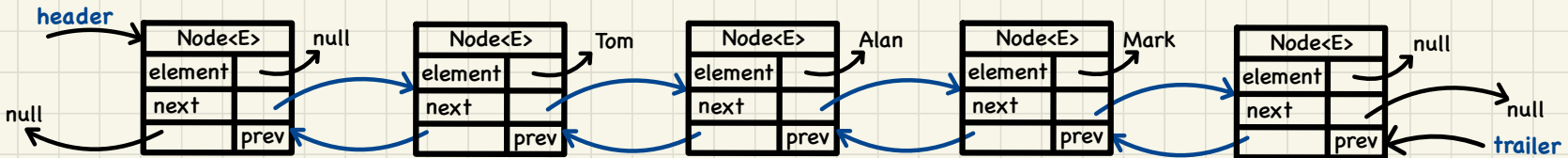
```
void removeLast() {
    if (size == 0) { throw new IllegalArgumentException("Empty"); }
    else { remove(trailer.getPrev()); }
}
```



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);
    }
}
```



Lecture 13 - February 25

General Trees

Linear vs. Non-Linear Structures

General Trees: Terminology

Generic TreeNode in Java

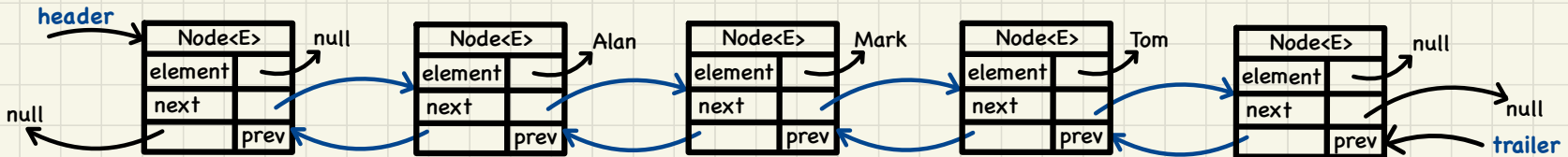
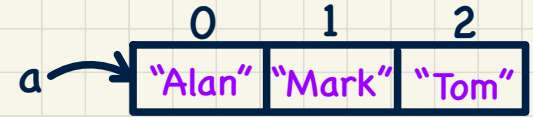
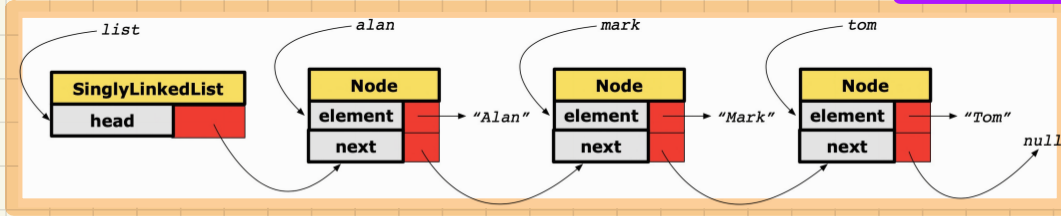
Announcements/Reminders

- Survey on **Makeup Lecture** for ProgTest1
- **Assignment 3** (on linked Trees) to be released
- **WrittenTest** guide to be released
- This week's office hour: 3pm, Wed

Running Time: Arrays vs. SLL vs. DLL

see earlier discussion

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



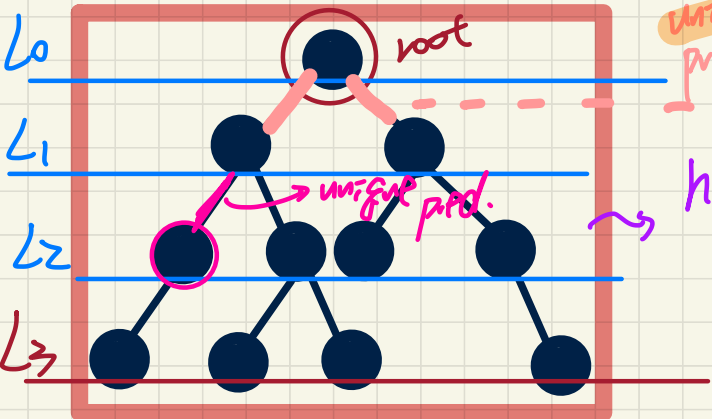
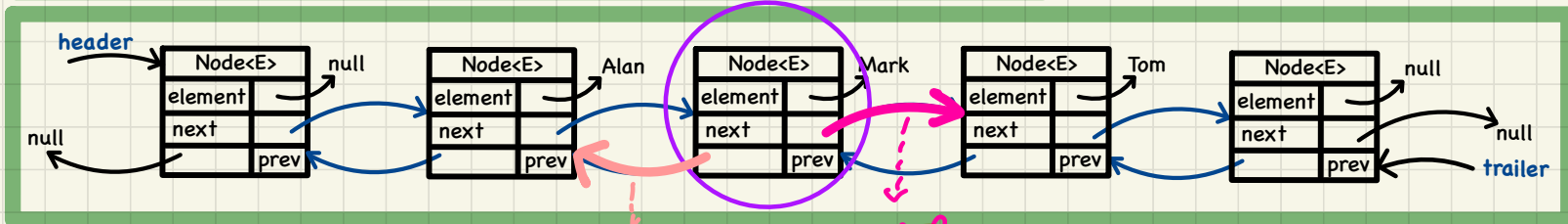
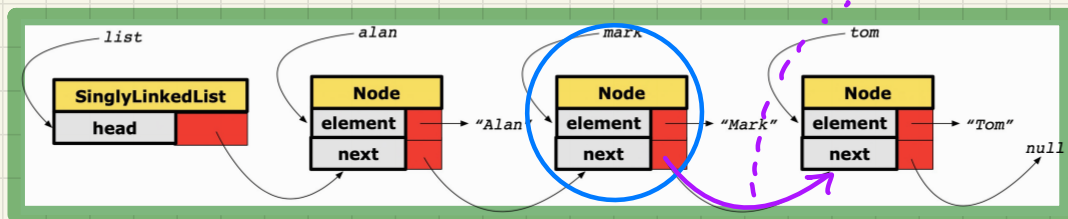
Trees

- a (1. General Trees
- 2. Binary Trees (BTs)
- b (3. Binary Search Trees (BSTs)
- 4. Balanced BSTs
- c (5. Priority Queues
- 6. Heap
- 7. Heap Sort

Linear vs. Non-Linear Structures

using next to access the unique successor

Index of unique pred. $i-1$
Index of unique succ. $i+1$

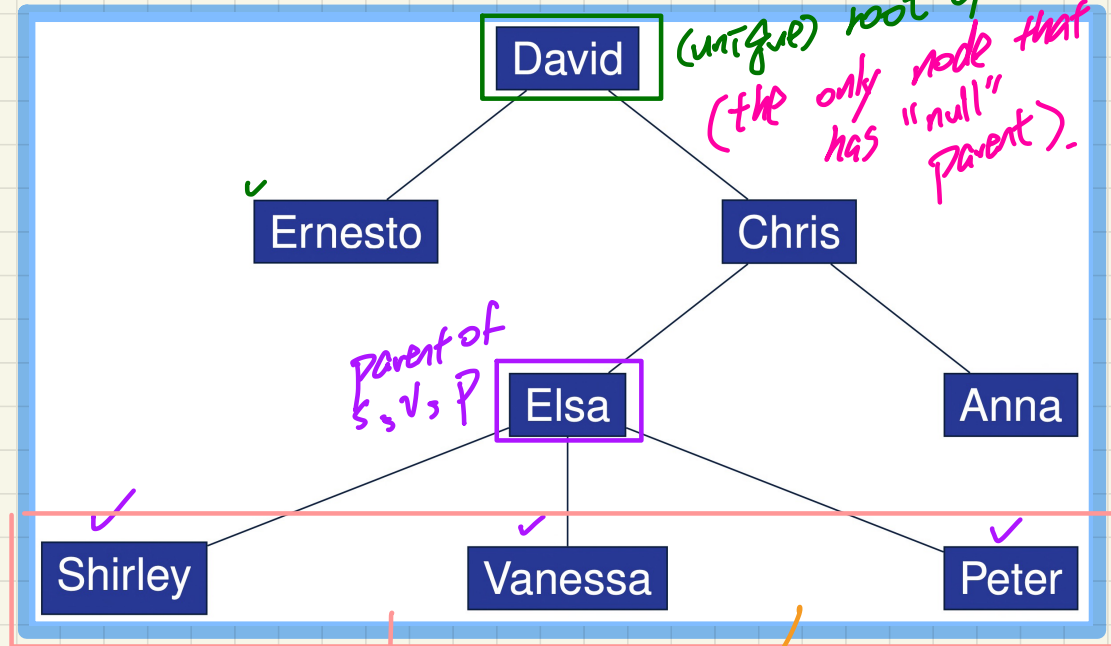


unique predecessor
unique successor
hierarchical structure (levels)

multiple "successors" of the root

↓
in programming they are stored in a linear DS (e.g. STL)

General Trees: Terminology (1)



(unique) root of the tree
(the only node that has "null" parent).

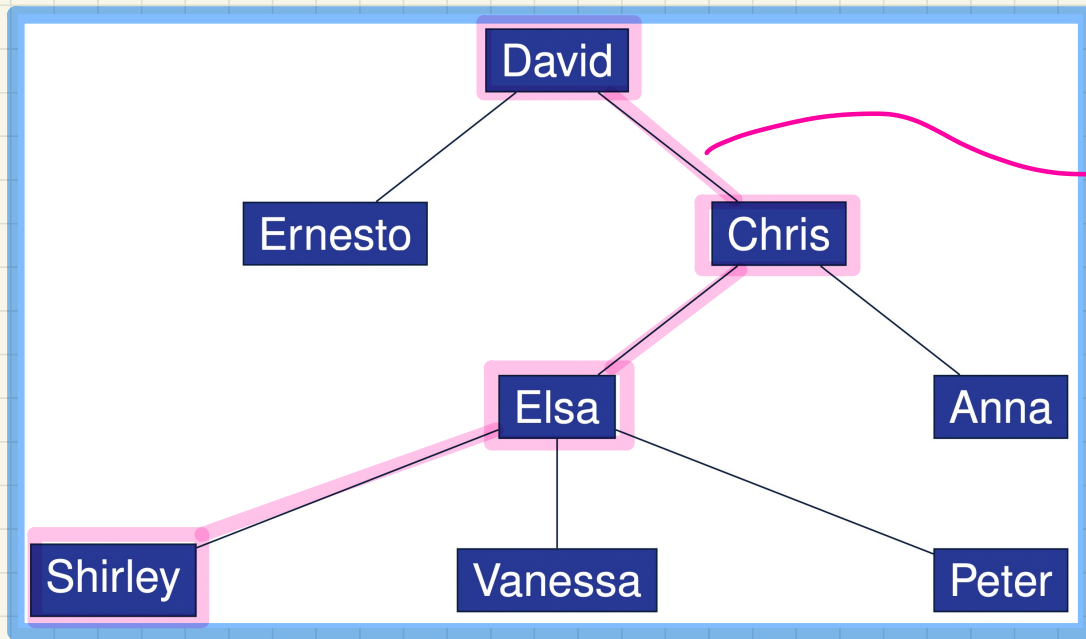
parent of
S, V, P

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

nodes without children

these 3 nodes are siblings.
(at the same level).

children of Elsa



unique ∴ parent is unique
↑

ANCESTOR path of shirley
(shirley), Elsa, Chris, (David)
n root

node	Descendants
Vanessa	Vanessa
Elsa	Elsa, S, V, P
David	all nodes in the tree.

A node is both its ancestor and descendant.

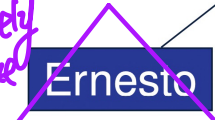
General Trees: Terminology (2)



Count(David) $\rightarrow 8$



Count(Ernesto)
 $\hookrightarrow$ recursively
count the size
of subtree
rooted at
1st child of
David



base case
 $\hookrightarrow 1$

Count(S)



$\hookrightarrow 1$



$\hookrightarrow 1$

Count(Chris)
 $4 + 1 + 1 = 6$
 $\hookrightarrow$ # of nodes
in subtree
rooted at
David's
2nd child



Count(Elsa)
 $\hookrightarrow 4$



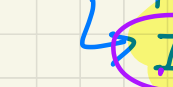
Count(Anna)
 $\hookrightarrow 1$



Count(v)
 $\hookrightarrow 1$



Count(p)
 $\hookrightarrow 1$



Problem:

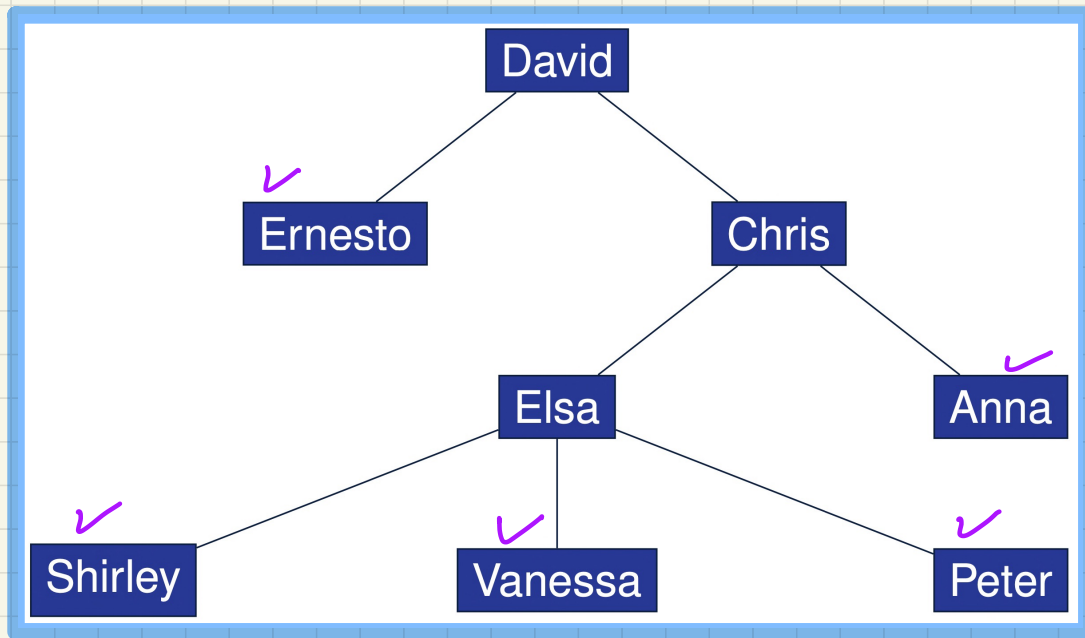
Given a node n ,
return the size of
subtree rooted at n .

Count(David) = 8

Count(Chris) = 6

Count(Shirley) = 1

- subtrees are the subproblems for you to make recursive
calls on.

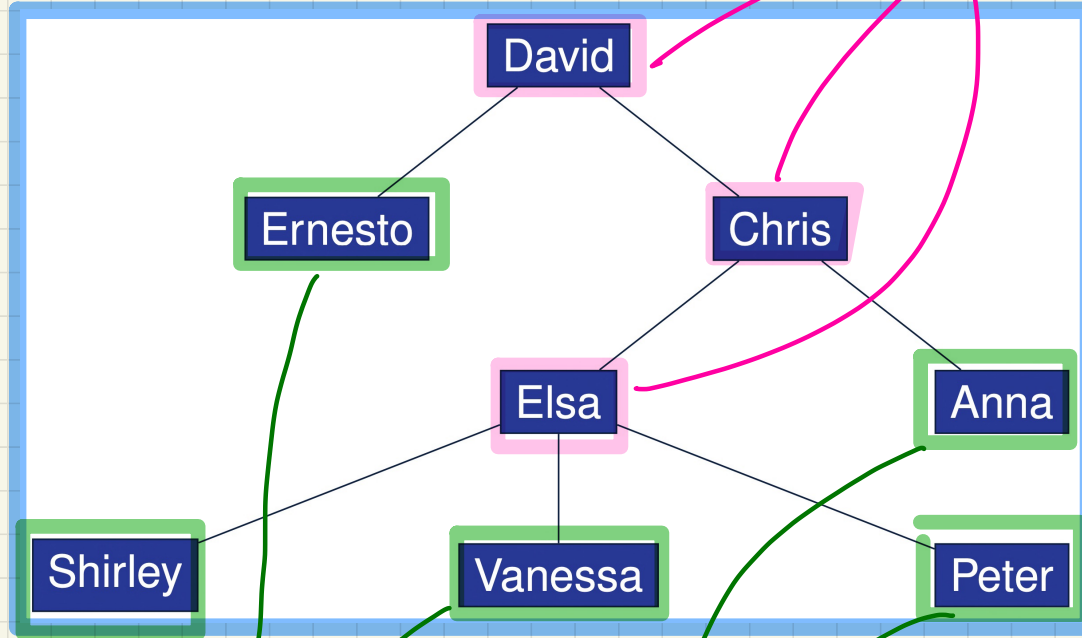


How many subtreps
in total?

δ = # nodes in
the tree.

size	# subtreps
1	5
...	
δ	$\boxed{1}$ rooted at David.

General Trees: Terminology (3)

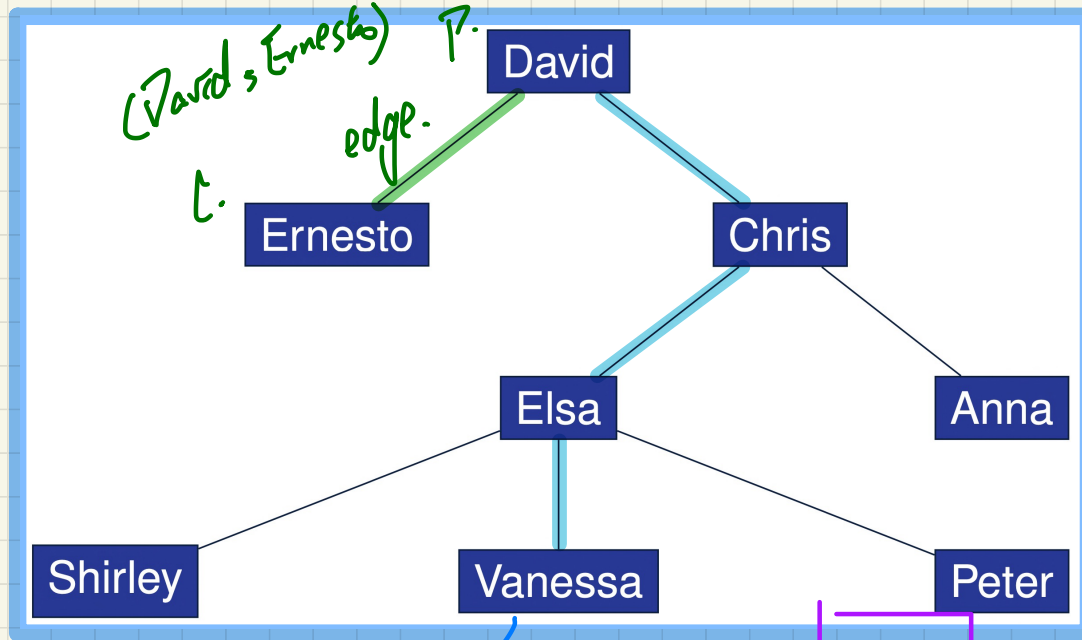


internal nodes → recursive cases.

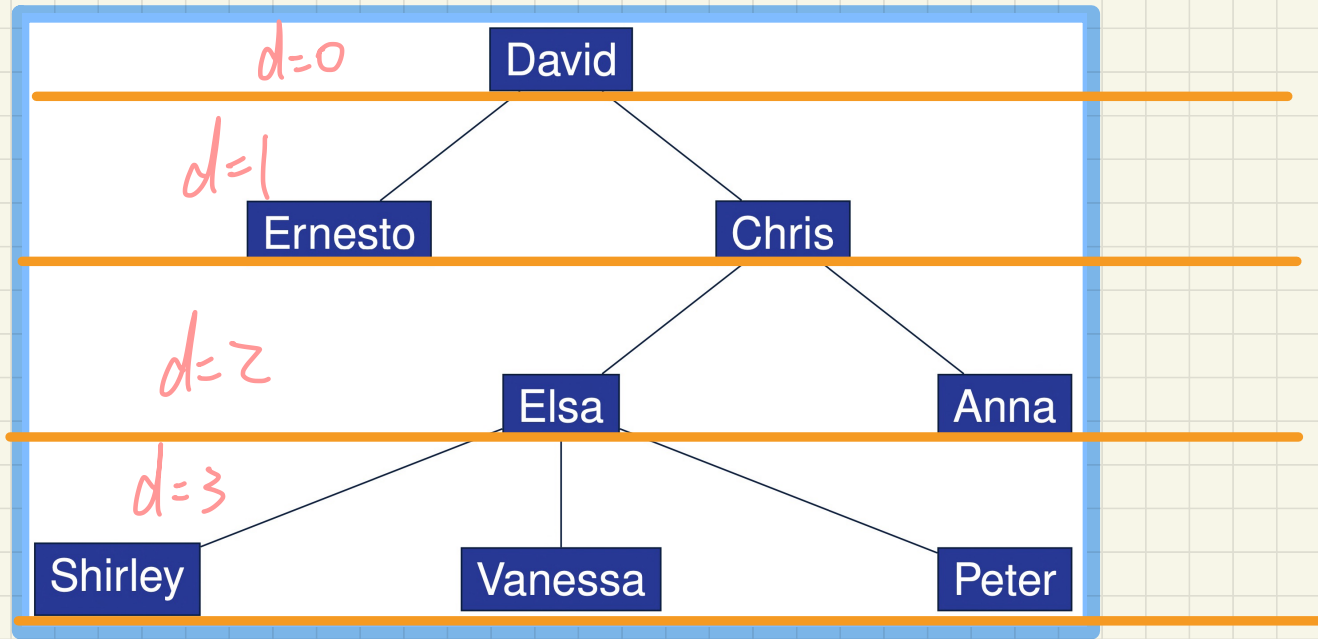
- external nodes
- internal nodes

external nodes (leaves) → base cases

General Trees: Terminology (4)

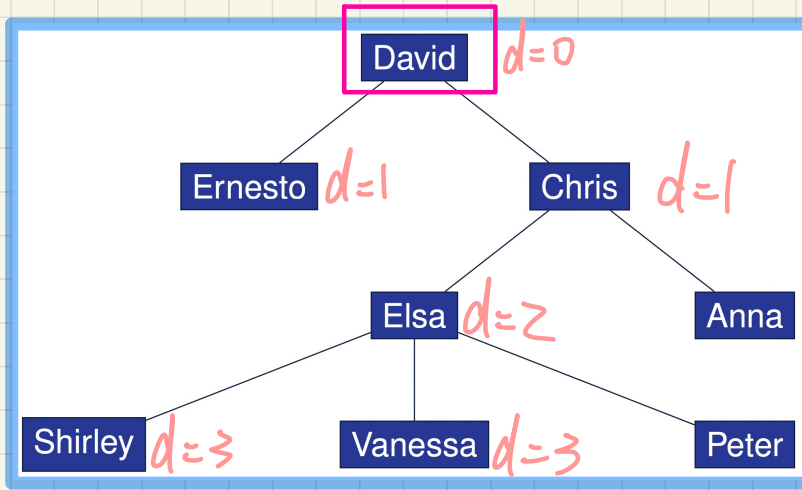


- edge
- path
- depth
- height



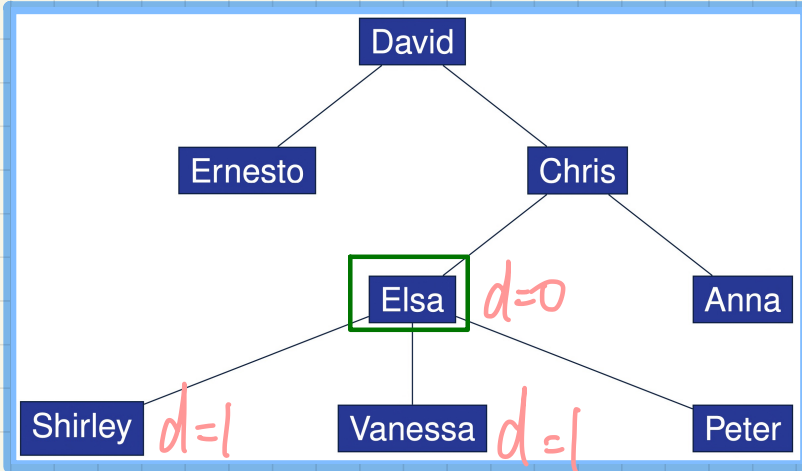
depth of a nodeⁿ: # edges (parent links) from n to root.

height of a tree: max depth of descendants of its root.



Height of tree rooted at David:

3



Height of tree rooted at Elsa:

1.

Lecture 14 - March 4

General Trees, Binary Trees

Initializing a Generic Array

Recursive Definitions of (Binary) Trees

Trees in Java: Construction, Depth

Announcements/Reminders

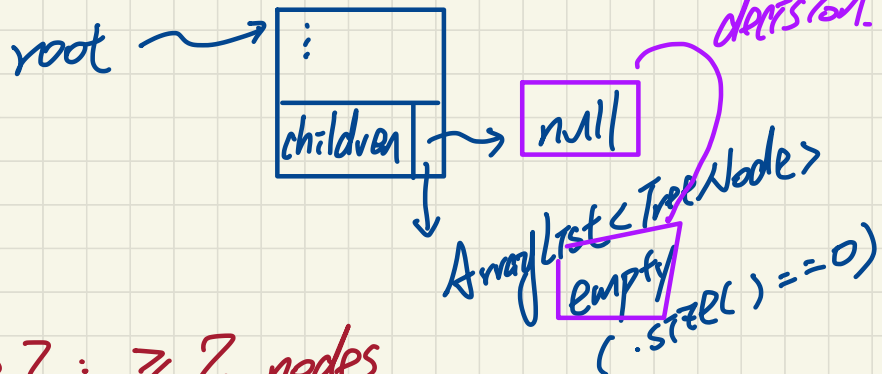
- **ProgTest1** results to be released by Friday, Mar 14
- **Makeup Lecture** (on **ADTs**, **Stacks**) posted
- **Assignment 3** (on linked **Trees**) released
- **WrittenTest** guide and example questions to be release
- Lecture notes template, Office Hours, TA Contact

General Trees: Recursive Definition



- root
- size

Case 1: A singleton tree

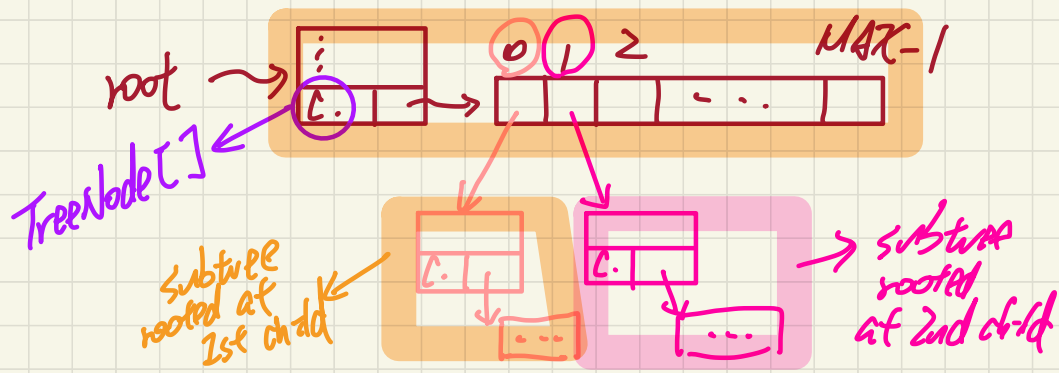


Case 0: Empty Tree

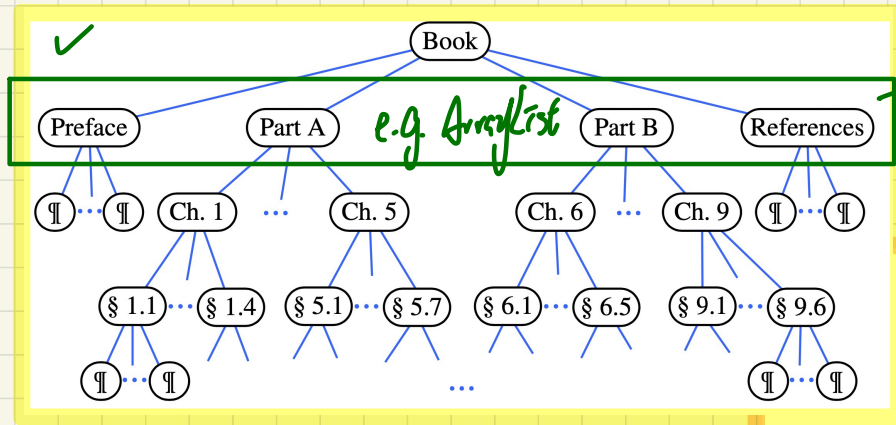
$\emptyset$

root $\rightarrow$ null
size == 0

Case 2: ≥ 2 nodes

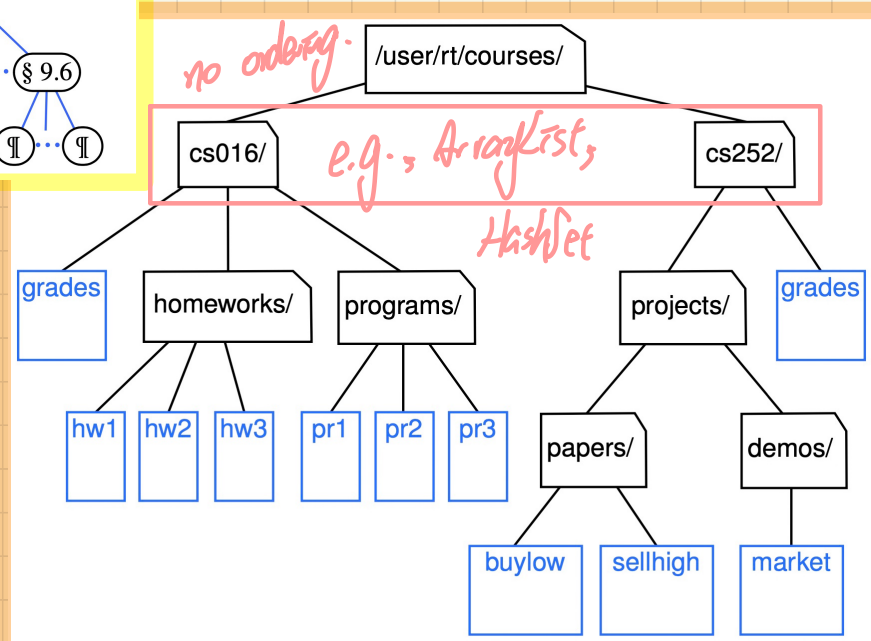


General Trees: **Ordered** vs. **Unordered** Trees



→ there's a linear, logical order between a nodes child nodes

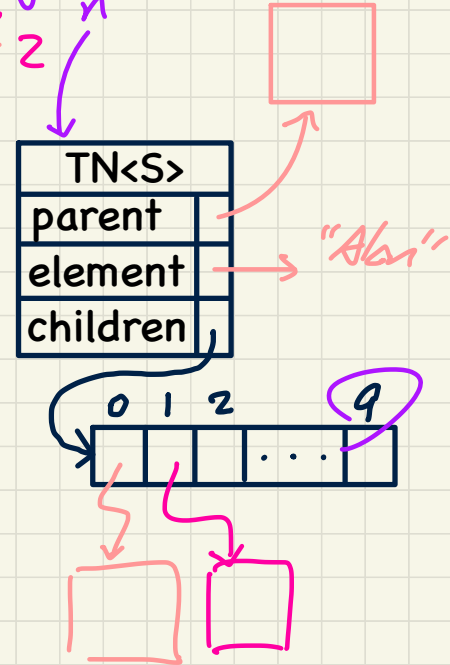
red
↳ tree



Generic, General Tree Nodes

$n.noc \leq n.children.length$
 $n.children.length = 10$
 $n.noc == 0$

```
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) { ... }  
}
```



Compare:

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



Instantiating **Generic** Structures in Java

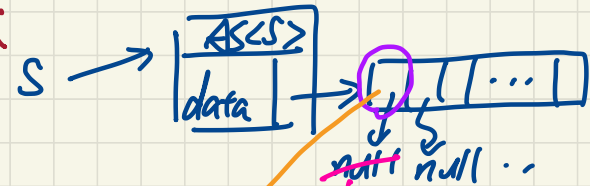
```
class ArrayStack<E> {  
    private E[] data;  
    ...  
    public ArrayStack<E>() {  
        ...  
    }  
}
```

~~data = new E[10];~~ X

data = (E[]) new Object[10]; ✓

AS<String> s = new AS<>();

s.push(23); X
s.push("alan");



```
class TreeNode<E> {  
    private TreeNode<E>[] children;  
    ...  
    public TreeNode<E>() {  
        ...  
    }  
}
```

E is wrapped within the TreeNode class

~~children = new E[10];~~ X
children = (T[]<E>) new Object[10];

ST: String
DT: String.

RT: Object[]

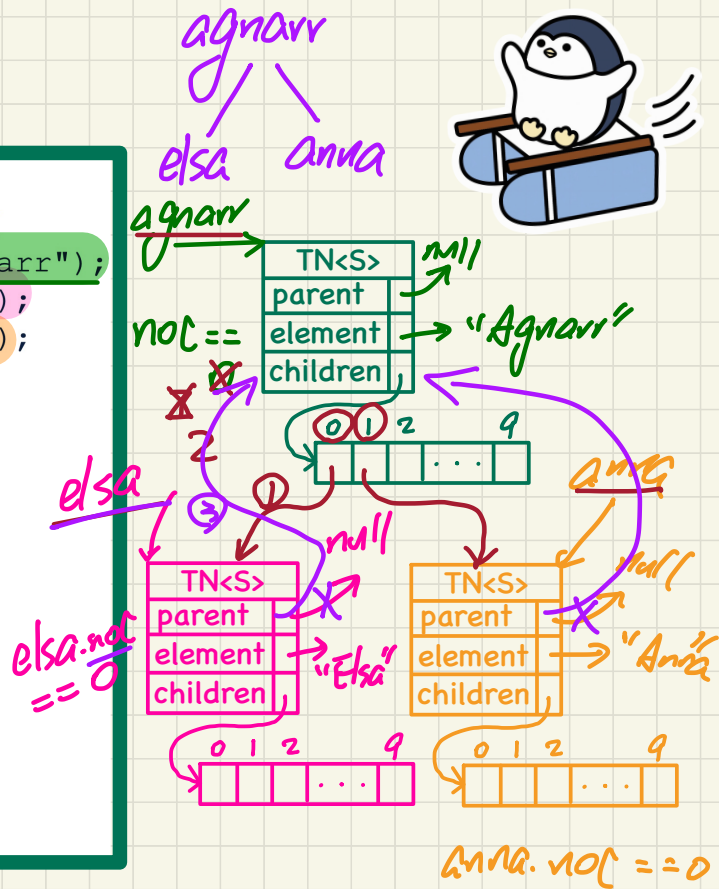
children = (T[]<E>) Array.newInstance(this.getClass(), 10);

Tracing: Constructing a Tree

```
@Test
public void test_general_trees_construction() {
    TreeNode<String> agnarr = new TreeNode<>("Agnarr");
    TreeNode<String> elsa = new TreeNode<>("Elsa");
    TreeNode<String> anna = new TreeNode<>("Anna");

    ① agnarr.addChild(elsa);
    ② agnarr.addChild(anna);
    ③ elsa.setParent(agnarr);
    ④ anna.setParent(agnarr);

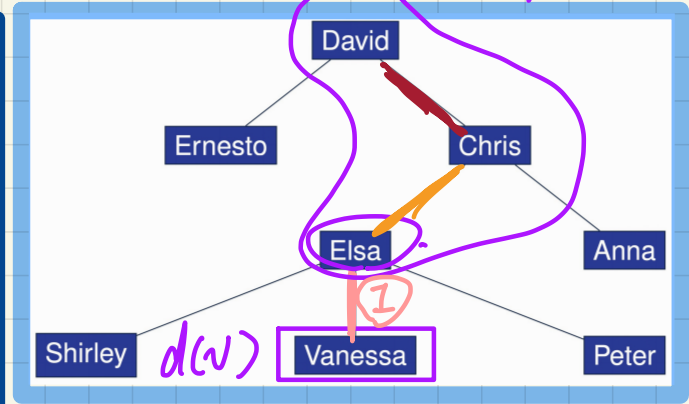
    assertNull(agnarr.getParent());
    assertTrue(agnarr == elsa.getParent());
    assertTrue(agnarr == anna.getParent());
    assertTrue(agnarr.getChildren().length == 2);
    assertTrue(agnarr.getChildren()[0] == elsa);
    assertTrue(agnarr.getChildren()[1] == anna);
}
```



Tracing: Computing a Node's Depth

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

depth of root is 0.



```
@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));  
}
```

depth(vanessa)

$$\begin{aligned} & \hookrightarrow .\text{getP} \neq \text{null} \\ & = 1 + \text{depth}(\text{Elsa}) \\ & \hookrightarrow .\text{getP} \neq \text{null} \\ & = 1 + 1 + \text{depth}(\text{Chris}) \\ & = 1 + 1 + 1 + \text{depth}(\text{David}) \\ & = 3 \end{aligned}$$

Binary Trees: Recursive Definition

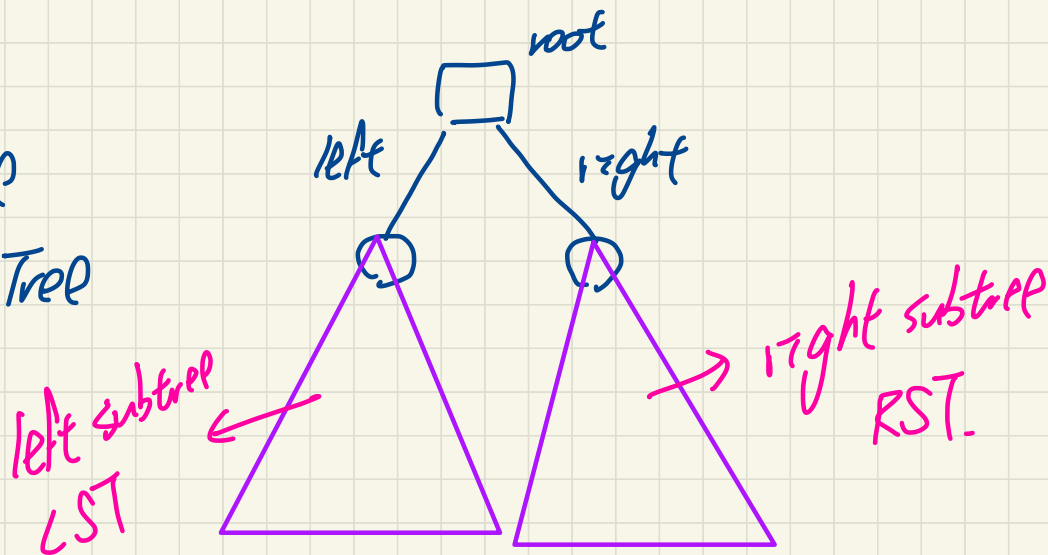


- root
- size

Case 2: ≥ 2 nodes

Case 0: Empty Tree

Case 1: Singleton Tree



Deriving the Sum of a Geometric Sequence

Initial Term: I

Common Factor: r

Number of Terms: k

$$1 + 2 + 4 + 8 + 16 + \dots + 1024$$

2^0 2^{10}

$\times 2$ $\times 2$ $k=11$

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

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

$$r \cdot S_k - S_k = (r-1) \cdot S_k = I \cdot r^k - I = I \cdot (r^k - 1)$$

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

For BT: $r=2$, $I=1$ last depth of "bottom" node

$$S_k = \frac{1 \cdot (2^k - 1)}{2 - 1} = 2^k - 1$$

Lecture 15 - March 6

Binary Trees

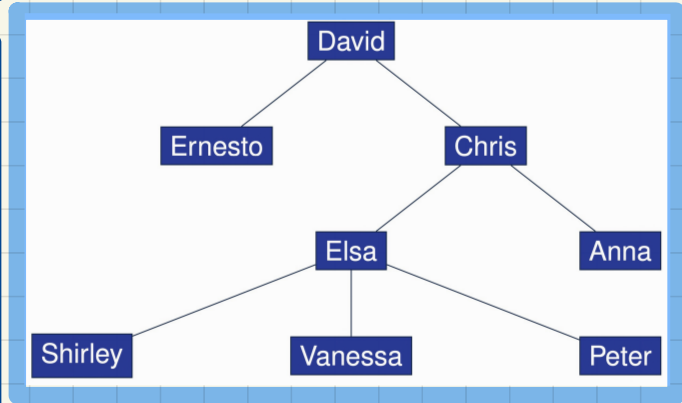
Binary Trees: Math Properties
Tree Traversals

Announcements/Reminders

- **Assignment 3** (on linked Trees) released
- **WrittenTest**
 - + guide released
 - + example questions to be release
- **Makeup Lecture** (on **ADTs**, **Stacks**) posted
- Lecture notes template, Office Hours, TA Contact

Tracing: Computing a Tree's Height

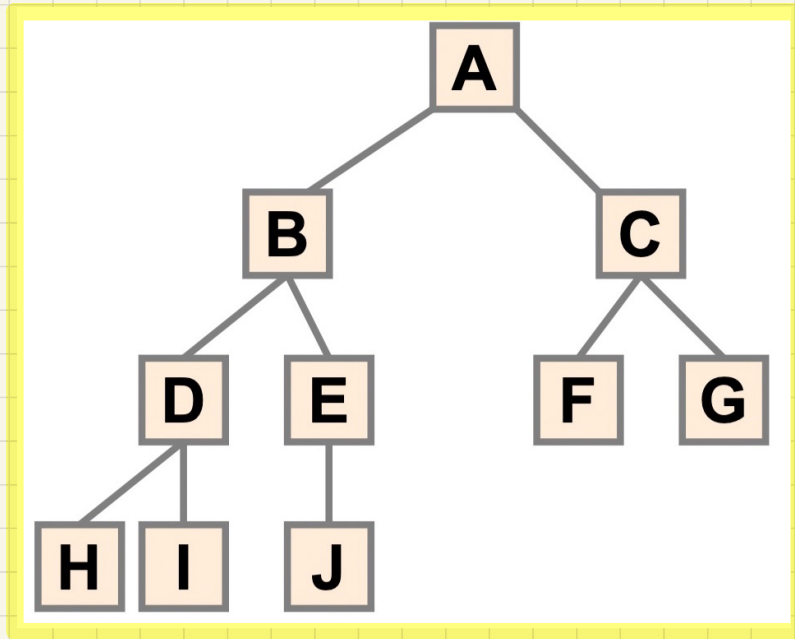
```
public int height(TreeNode<E> n) {  
    TreeNode<E>[] children = n.getChildren();  
    if (children.length == 0) { return 0; }  
    else { ↪ noc  
        int max = 0;  
        for (int i = 0; i < children.length; i++) {  
            int h = 1 + height(children[i]);  
            max = h > max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



height(chris)

```
@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));  
}
```

BT Terminology: LST vs. RST



Strategy of Recursion on BT:

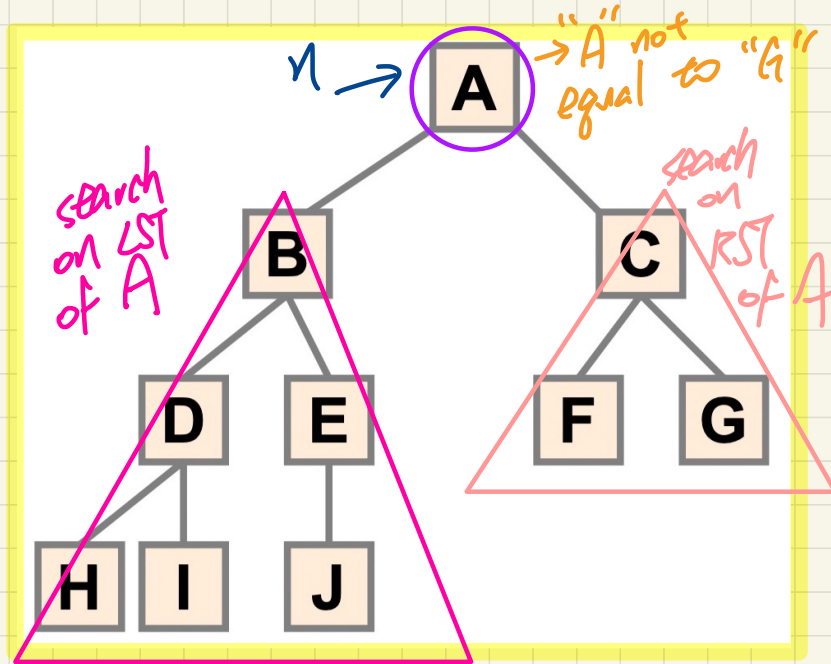
- + Do something on **root**
- + **Recur** on **LST**
- + **Recur** on **RST**

e.g.,

- + counting size

BT Terminology: **LST** vs. **RST**

search(A, "G") → T
 search(A, "F") → F



Strategy of Recursion on BT:

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

e.g.,

+ searching item

search(n, e) ← tree node ← data elp.

① if (n.element.equals(e)) {
 return true;
 }

② if (n.left != null) {
 return search(n.left, e);
 }

③ if (n.right != null) {
 return search(n.right, e);
 }

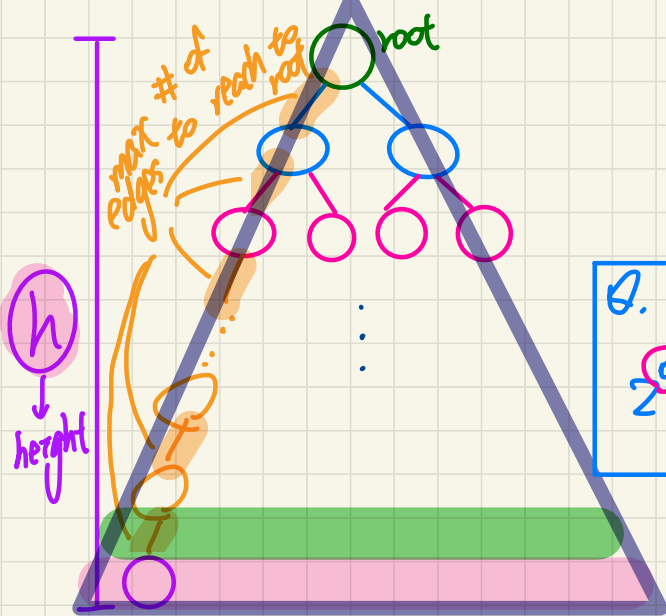
④ return false; // n is external, n.element ≠ e

BT Terminology: Depths, Levels, Max # of Nodes

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

$$BT: \frac{1 \cdot (2^k - 1)}{2 - 1} = 2^k - 1^*$$

BT structure



Level ??

Max # nodes at Level ??

0

1

2

Ex: Max # of nodes from level 0 to level h-1?

$$1 = 2^0$$

$$2 = 2^1$$

$$4 = 2^2$$

Q. Max # of nodes in a BT with height h?

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

h-1
h

$$2^{h-1} + 2^h$$

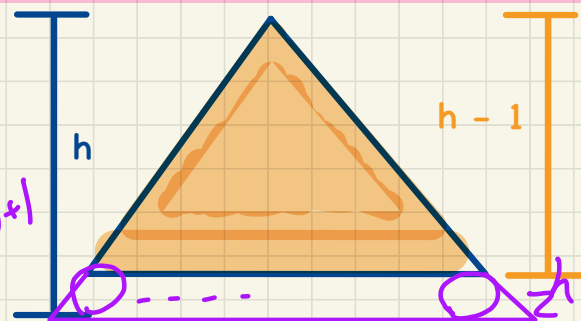
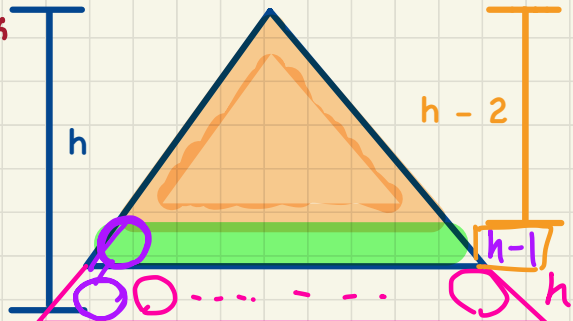
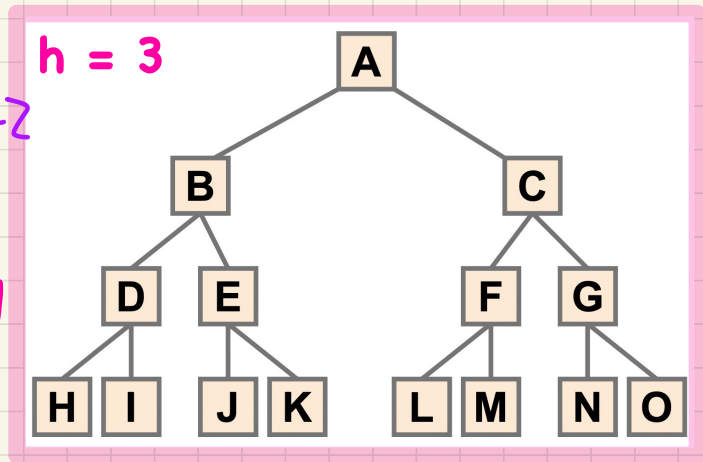
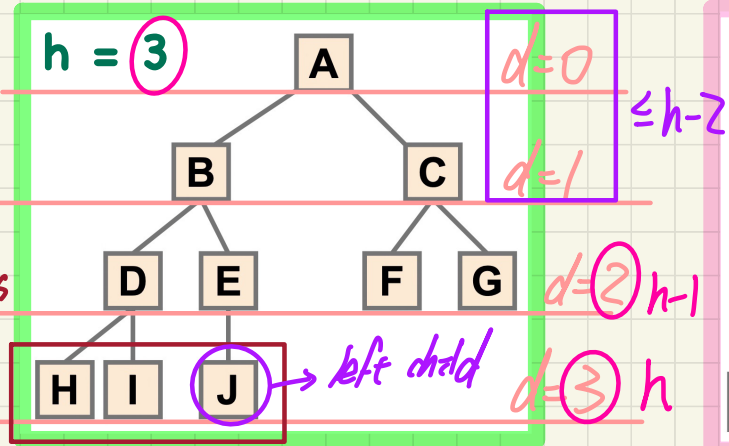


BT Terminology: Complete vs. Full BTs

$$S_k = 2^k - 1$$

nodes with $d=h$

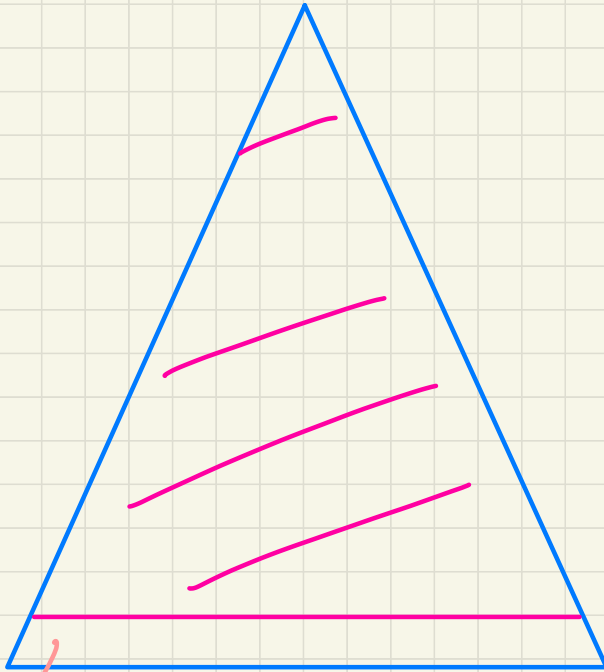
children of nodes at level $n-1$



Min # nodes? $(2^0 + 2^1 + \dots + 2^{h-1}) + 1$
 Max # nodes? $(2^0 + 2^1 + \dots + 2^{h-1}) + 2^h$

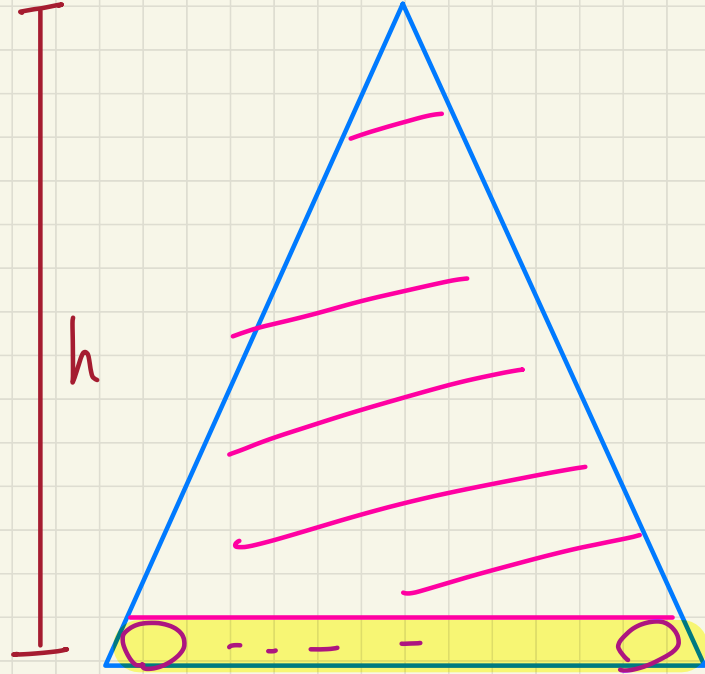
Min # nodes? $2^0 + 2^1 + \dots + 2^h$
 Max # nodes? $2^0 + 2^1 + \dots + 2^h$

Complete BT

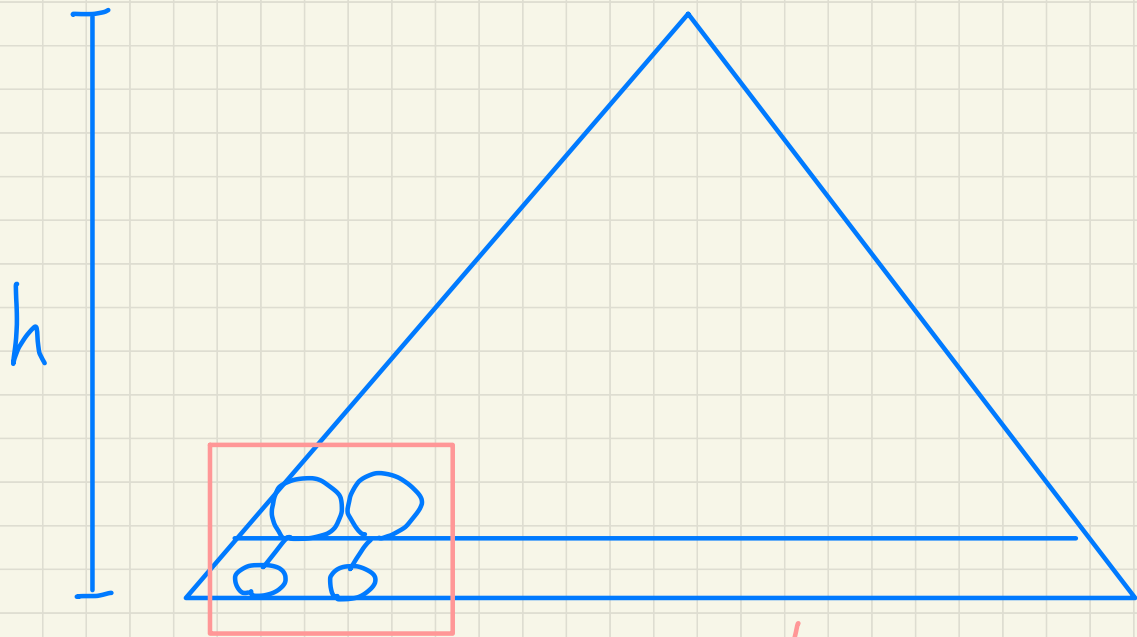


nodes at level h :
 $1 \sim 2^h$

vs. Full BT



2^h



not complete BT anymore!

BT Properties: Bounding # of Nodes

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

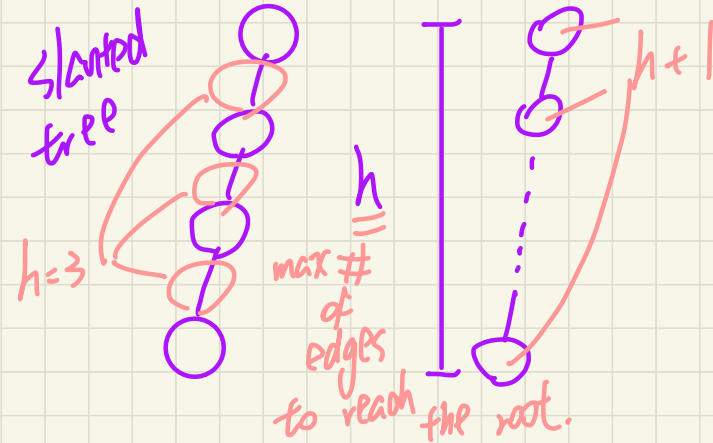
$$h + 1 \leq n \leq 2^{h+1} - 1$$

For example, say $h = 3$

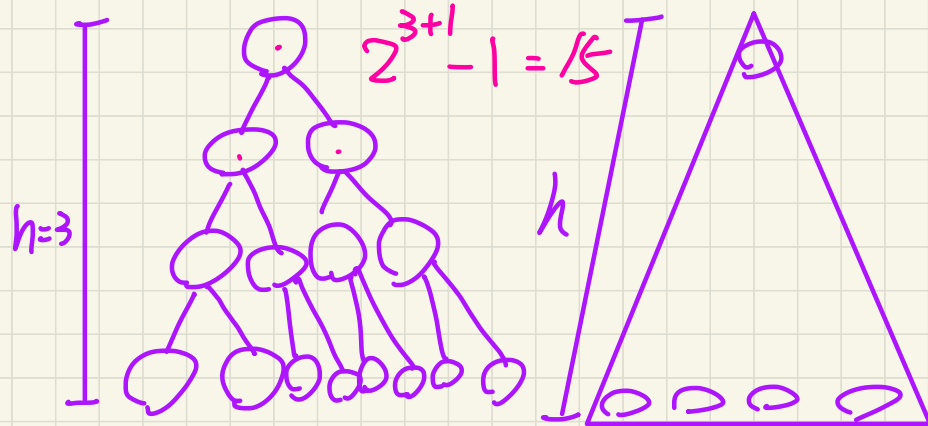
→ max depth is 3

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

Minimum # of nodes



Maximum # of nodes



BT Properties: Bounding Height of Tree

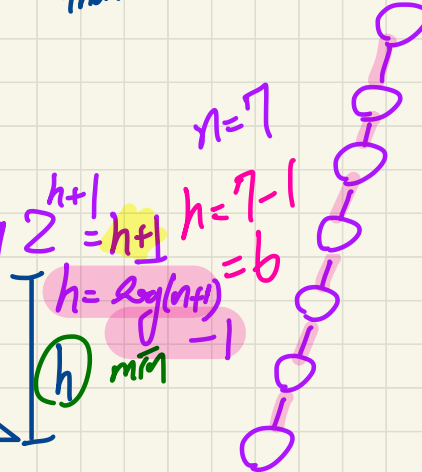
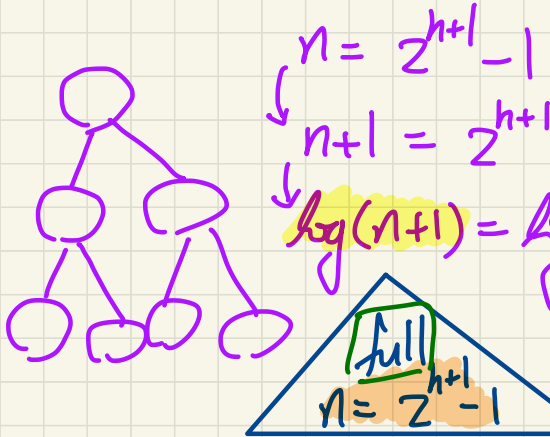
$$\log 2^x = x$$

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

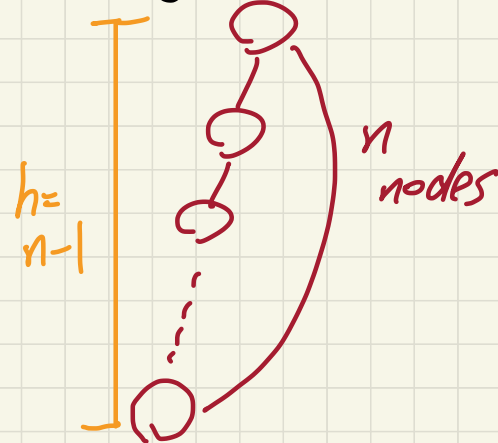
$$n=7 \\ \text{max: } \log(7+1) - 1 = \boxed{2} \quad \log(n+1) - 1 \leq h \leq n-1$$

For example, say $n = 7$

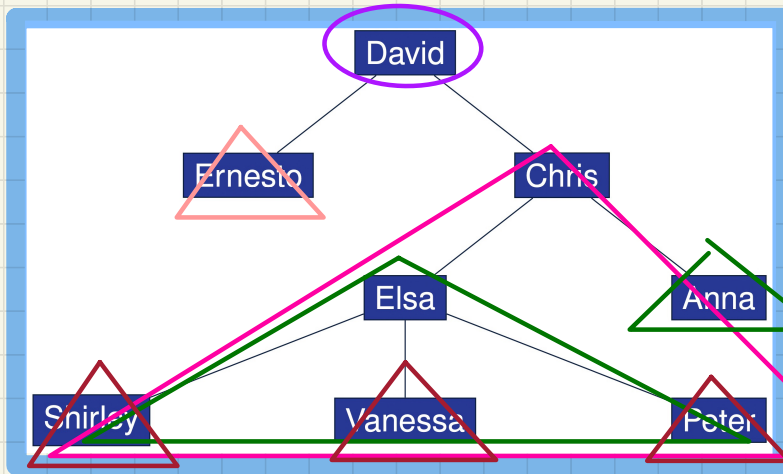
Minimum height $\rightarrow$ # nodes for min height.



Maximum height

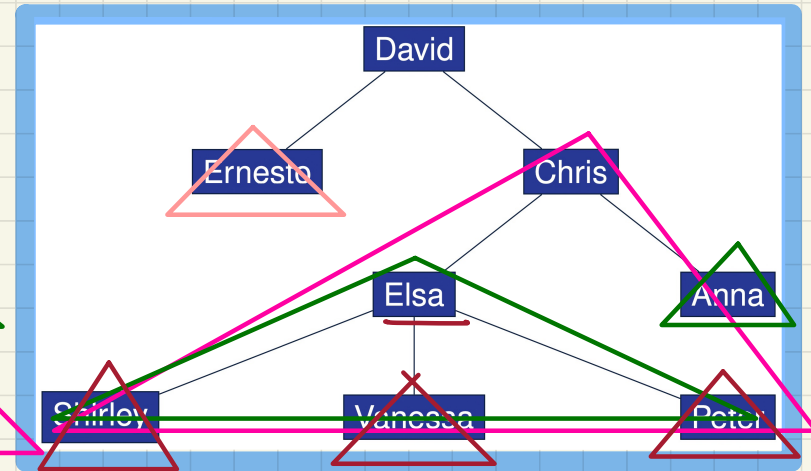


General Tree Traversals: Pre-Order vs. Post-Order



Pre-Order Traversal
from the Root

David Ernesto Chris Elsa S V P Anna
po(E) po(Chris) po(Anna)

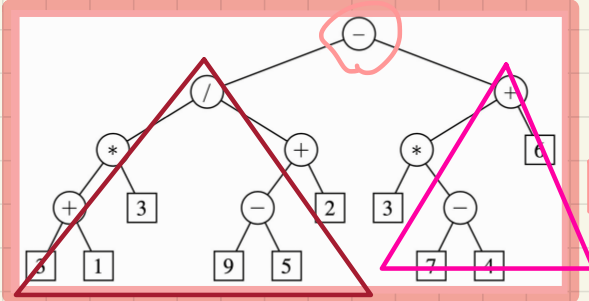


Post-Order Traversal
from the Root

Ernesto S V P Elsa Anna Chris David
po(E) po(Elsa) po(Anna) po(Chris)

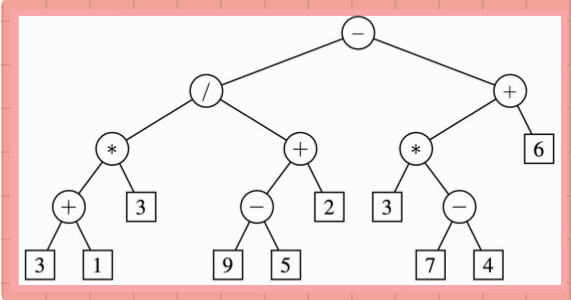


Binary Tree Traversals

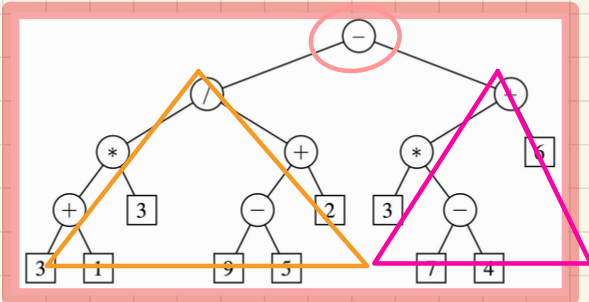


Pre-Order Traversal

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



In-Order Traversal



Post-Order Traversal

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

Review Q & A - Mar. 10

Written Test

Asymptotic Analysis
Instantiating Generics

```

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 }

```

Worst case
is when
the "" is never found
→ # iterations =
 n
 $names.length$

names →

0	1	2	3	4	5
"A"	"B"	"C"	"D"	"E"	"F"
T	T	T	T	T	F

$n = 5$

- ① I
- ② I
- ③ $(n+1) \cdot 4$
- ④, ⑤, ⑥ $6 \cdot n$

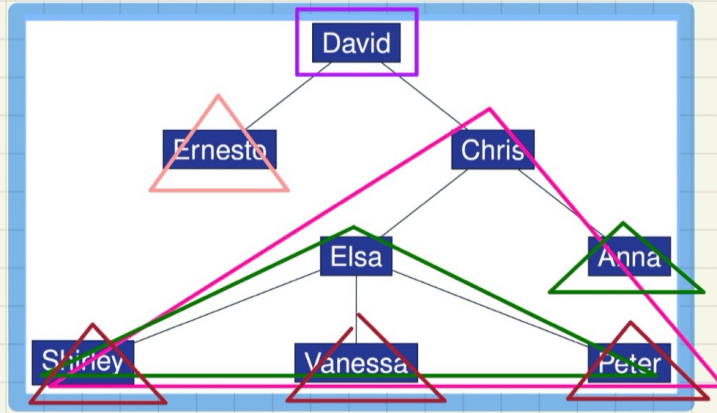
iterations : n

times while cond. is evaluated : $n+1$

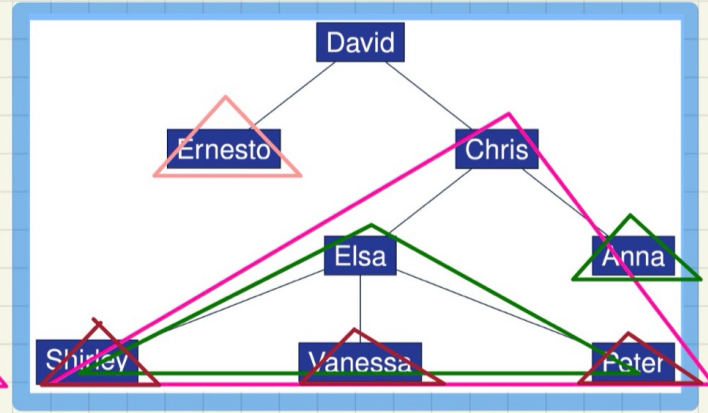
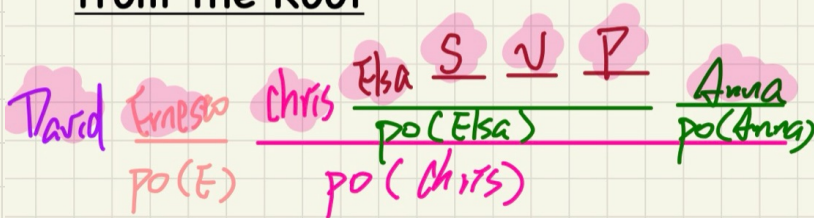
$I + I + (4n+4) + 6n$

$= 10n + 6$

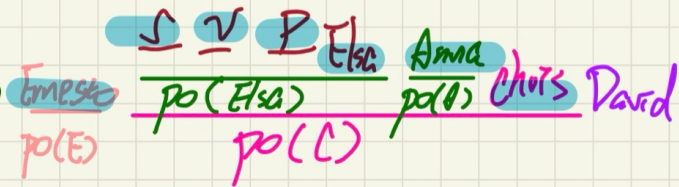
General Tree Traversals: **Pre-Order** vs. **Post-Order**



Pre-Order Traversal from the Root



Post-Order Traversal from the Root



$a1.length == n$ $a2.length == m$

boolean contentsMatch (int[] a1, int[] a2) {

$n \cdot m$

for (int i = 0; i < a1.length; i++) {

for (int j = 0; j < a2.length; j++) {

// check to see if $a2[j] == a1[i]$ $O(1)$

} }

for (int i = 0; i < a2.length; i++) {

for (int j = 0; j < a1.length; j++) {

// check to see if $a1[j] == a2[i]$ $O(1)$

} }

$O(n \cdot m \cdot 1 + m \cdot n \cdot 1)$
 $= O(2 \cdot n \cdot m)$
 $= O(n \cdot m) \cdot n \cdot n$

a1

1	2	3	4
---	---	---	---

a2

2	1	4	3
---	---	---	---

) true

a1

1	2	3
---	---	---

a2

2	1
---	---

) false

$$S1 = S2 \Leftrightarrow S1 \subseteq S2 \wedge S2 \subseteq S1$$

highest power
 $\underline{5}n^{\underline{2}} + \underline{3}n^{\underline{1}} \cdot \underline{\log n}^{\underline{1}} + \underline{2}n^{\underline{1}} + \underline{5}$ is $O(n^{\underline{2}})$ $g(n)$

$$[c = 15] \quad n_0 = \underline{1}]$$

$f(n)$

Proof

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

$$[n_0 = 1]$$

$$\text{Verify: } f(1) \leq \underline{C \cdot g(1)}$$

$$5 \cdot 1^2 + \underline{3 \cdot 1 \cdot \log 1} + 2 \cdot 1 + 5$$

$$\begin{aligned} &= 12 \\ &\leq 15 \cdot 1^2 = 15 \end{aligned}$$

```

public class MyClass<G, H, I> {
    private G[] a;
    public G m1 (I p1, H p2) {
        /* details of implementation omitted */
        return null;
    }
    public void m2 (H p1, G p2) {
        /* details of implementation omitted */
    }
}

```

Handwritten notes: I S B, obj1, S, I

```

public class MyClass<G, H, I> {
    private G[] a;
    public G m1 (I p1, H p2) {
        /* details of implementation omitted */
        return null;
    }
    public void m2 (H p1, G p2) {
        /* details of implementation omitted */
    }
}

```

Handwritten notes: B S I, obj2, S, B

Now consider the following declarations from another class (which intends to use the above generic class):

```

Boolean b;
String s;
Integer i;
MyClass<Integer, String, Boolean> obj1;
MyClass<Boolean, String, Integer> obj2;

```

Handwritten notes: ✓, ✓, obj1, obj2

Handwritten notes: word, X, does not compile

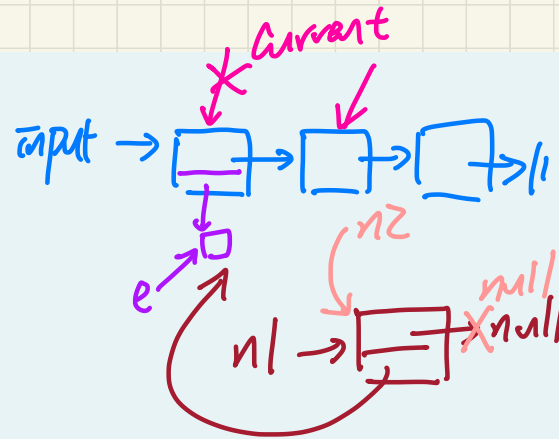
s = obj1.m2 ("alan", 5);	Choose...
b = obj2.m2 ("alan", false);	Choose...
obj1.m2 ("alan", 5);	✓ Choose...
obj2.m2 ("alan", false);	✓ Choose...
X obj1.m2 (5, "alan");	Choose...
obj2.m2 (false, "alan");	Choose...
i = obj1.m1 (true, "mark");	Choose...
b = obj2.m1 (3, "mark");	Choose...
b = obj1.m1 (true, "mark");	Choose...
i = obj2.m1 (3, "mark");	Choose...

Handwritten notes: word, X S, X I

Consider the following method which intends to reverse the input chain of nodes:

```
public Node<String> reverseOf(Node<String> input) {  
    Node<String> n2 = null;  
    Node<String> current = input;  
    while(current != null) {  
        String e = current.getElement();  
        Node<String> n1 = new Node<>(e, null);  
        /* missing some line(s) of code */  
        current = current.getNext();  
    }  
    return n2;  
}
```

n1.setNext(n2);
n2 = n1;



In the above method, some line or lines of code are missing (from where the comment is) in order for the implementation to be correct. Choose **the** line or **all** lines that are needed.

- ☐ n1.setNext(n2);
- ☐ n2 = n1;
- ☐ n2.setNext(n1);
- ☐ n1.setNext(current);
- ☐ n1 = n2;
- ☐ n2 = current;

Your answer is incorrect.

The correct answers are:

n1.setNext(n2);
n2 = n1;

Lecture 16 - March 11

Binary Trees, Binary Search

Bounding Internal vs. External Nodes
Proper Binary Trees
Binary Search: Ideas, Java

Announcements/Reminders

- **Assignment 3** (on linked Trees) released
- **WrittenTest** guide & example questions released
- **WrittenTest** review session materials posted
- **Makeup Lecture** (on **ADTs**, **Stacks**) posted
- Lecture notes template, Office Hours, TA Contact

BT Properties: Bounding # of External Nodes

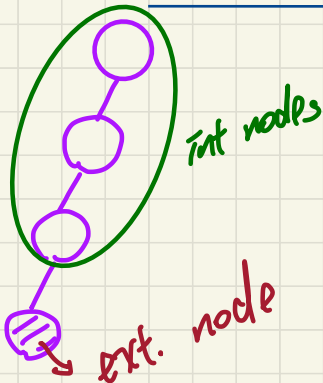
Given a **binary tree** with **height** h , the **number of external nodes** n_E is bounded as:

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

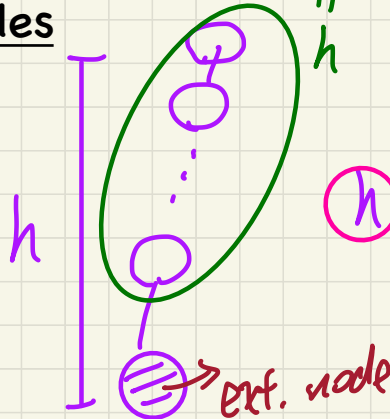
For example, say $h = 3$

→ max # of bottom edges from node to root.

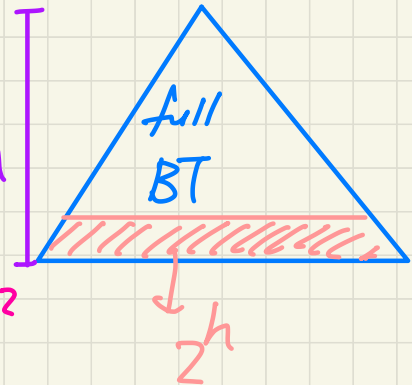
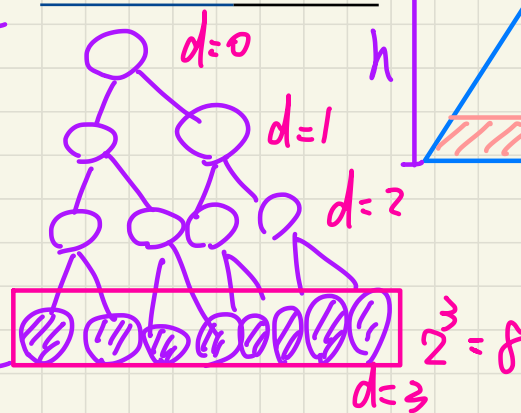
Minimum # of External Nodes



int. nodes
" h



Maximum # of External Nodes



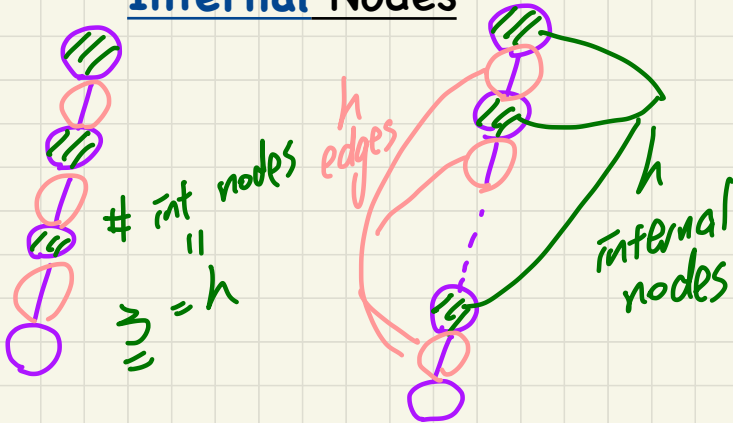
BT Properties: Bounding # of Internal Nodes $\sum_{k=0}^{h-1} 2^k = 2^h - 1$

Given a **binary tree** with **height** h , the **number of internal nodes** n_I is bounded as:

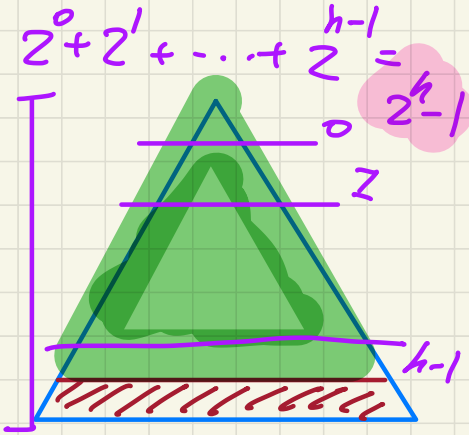
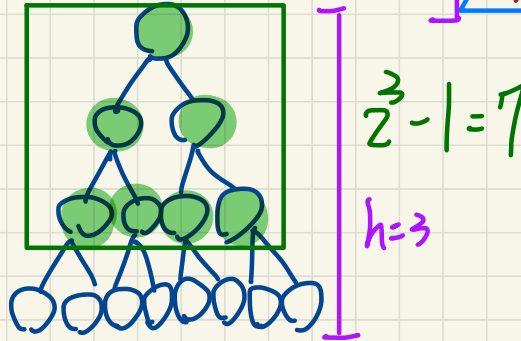
$$h \leq n_I \leq 2^h - 1$$

For example, say $h = 3$

Minimum # of Internal Nodes



Maximum # of Internal Nodes



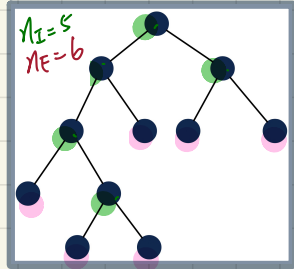
BT Properties: Relating #s of **Ext.** and **Int.** Nodes

before the ext $\leftarrow \begin{matrix} n_I \\ n_E \end{matrix}$ $\begin{matrix} n_I' \\ n_E' \end{matrix}$ after ext

Given a **binary tree** that is:

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

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

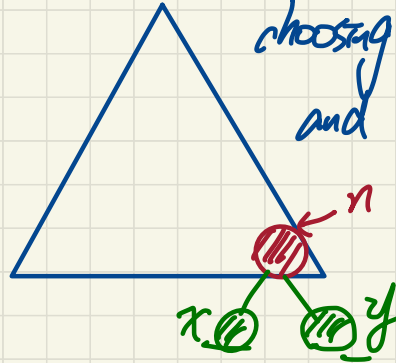


$$\begin{aligned} \textcircled{4} \quad n_E' &= n_E + 1 \\ \text{I.H.} \quad (n_I + 1) + 1 \\ &= n_I' + 1 \end{aligned}$$

$\textcircled{2}$ Inductive Hypothesis (I.H.):

For a proper BT of size > 1 : $n_E = n_I + 1$

$\textcircled{3}$ Given a proper BT, extend it by n choosing the right-most ext. node and converting it to an int. node with child nodes x and y .



$\textcircled{1}$ Base Case: Single Proper BT

REVIEW

$$\begin{aligned} n_E &= 1 \\ n_I &= 0 \end{aligned} \quad \text{property holds}$$

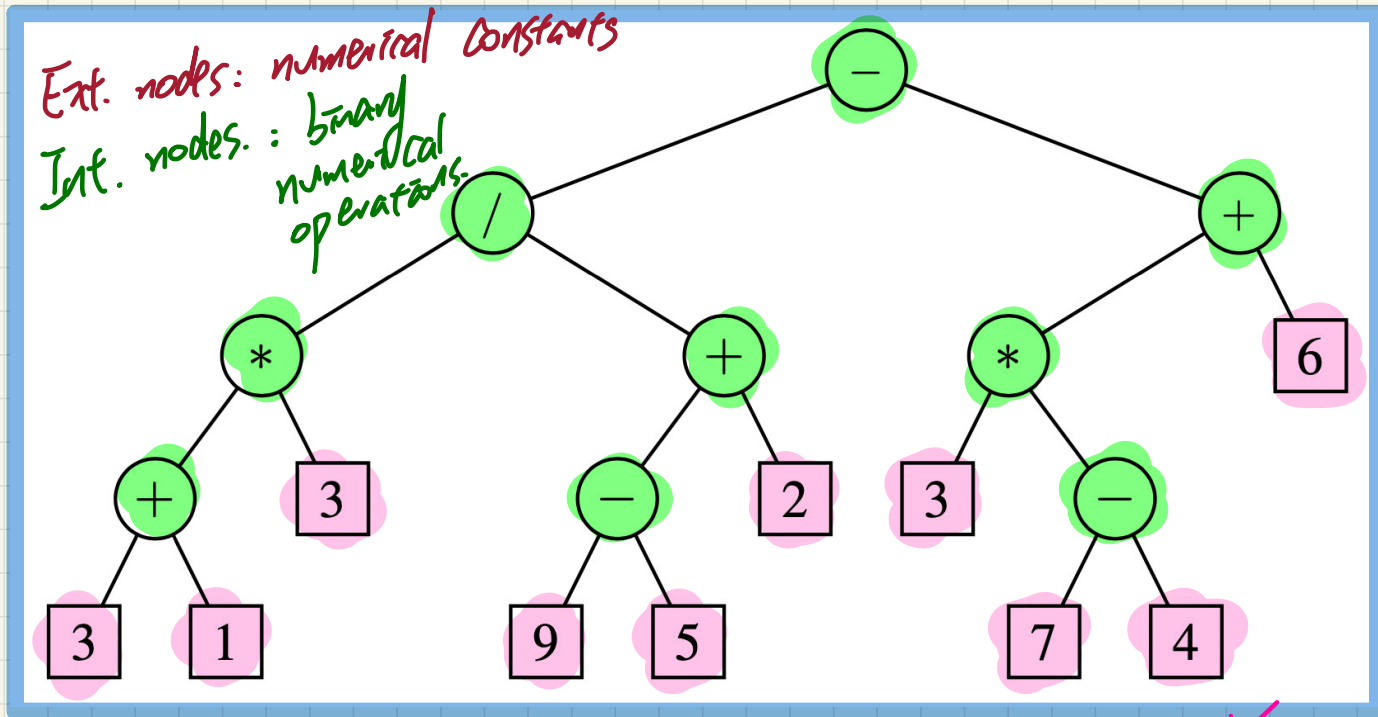


$$\textcircled{1} \quad n_E' = n_E - 1 + 2 = n_E + 1$$

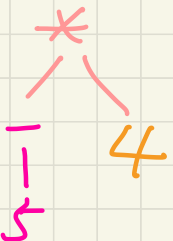
$$\textcircled{2} \quad n_I' = n_I + 1$$

show: $n_E' = n_I' + 1$

Applications of Binary Trees: Infix Notation



BT $\neq$ proper.

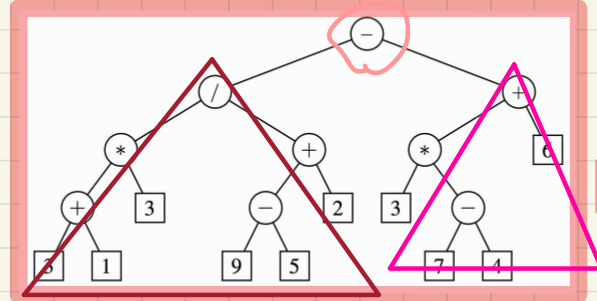


Q. Is the binary tree necessarily **proper**?



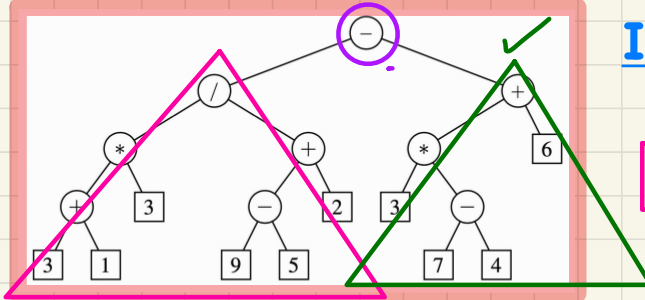


Binary Tree Traversals



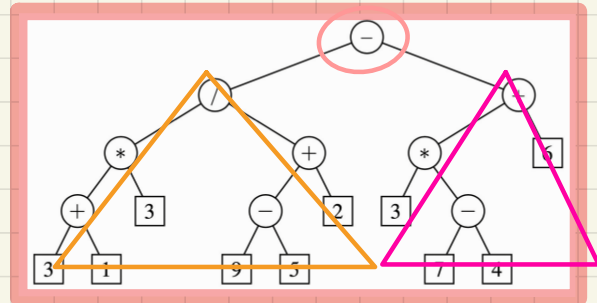
Pre-Order Traversal

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



In-Order Traversal

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



Post-Order Traversal

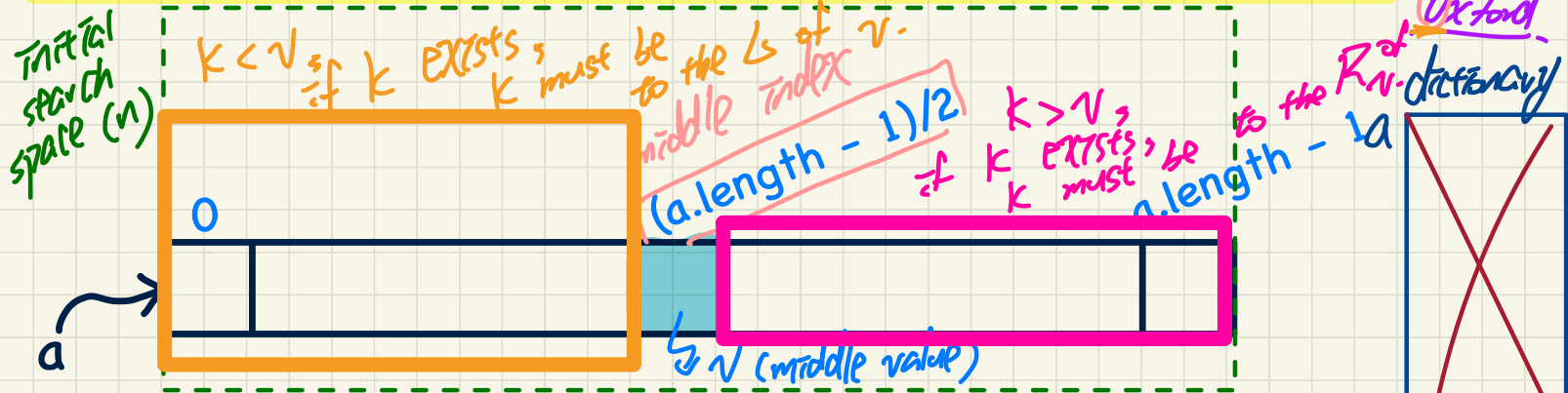
3 1 + 3 * 9 5 - 2 + / 3 7 4 - * 6 + -

Binary Search: Ideas

IPAD PLANNING



Precondition: Array sorted in non-descending order



Size of Search Space

Search: Does key k exist in array a ?

n
 $n/2$
 $n/4$
 $\vdots$

Comparisons

$\log n$
(worst case)

① Access the middle of search space

② Compare k against v :

$k == v \rightarrow$ found

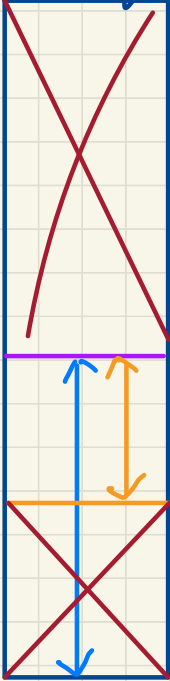
$k < v \rightarrow$ Recur on the left

$k > v \rightarrow$ Recur on the right.

$0 < k < v$

$0 < w < w$

z

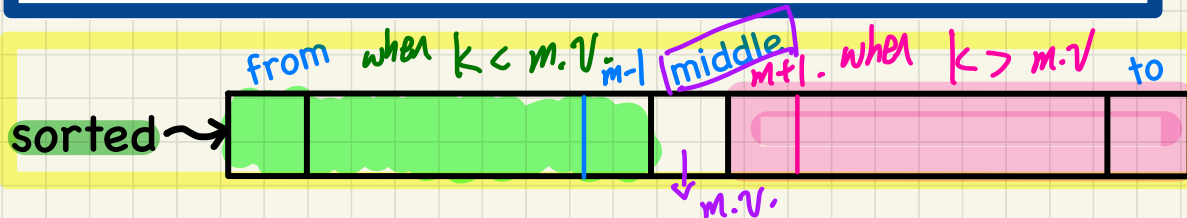


Binary Search in Java

```
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; } }  
}
```

base

recursion
CGSPS



Lecture 17 - March 18

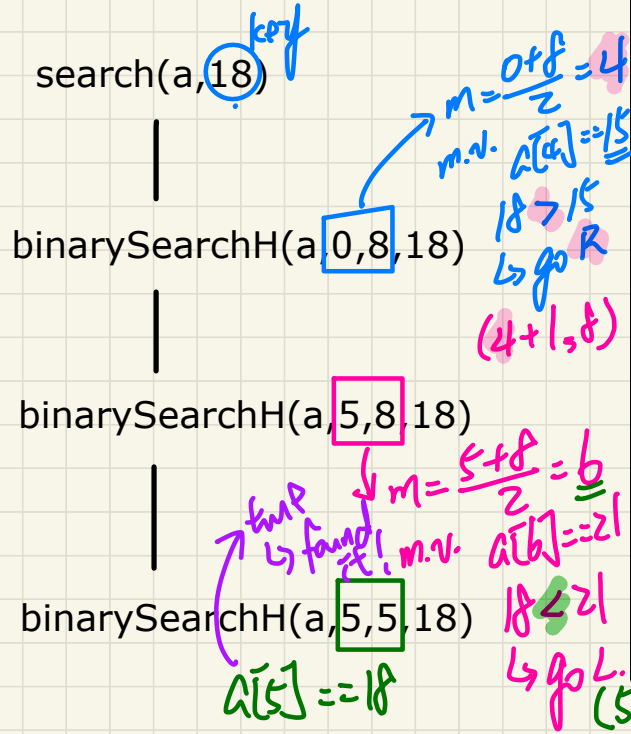
Binary Search, Merge Sort

Binary Search: Tracing, Running Time
MergeSort: Ideas, Java, Tracing

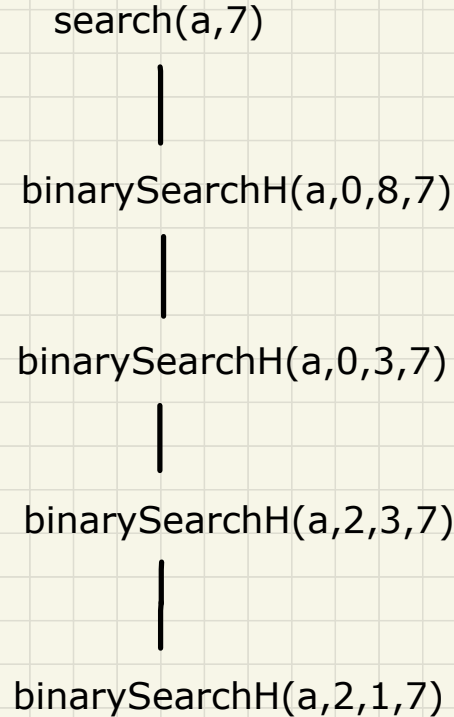
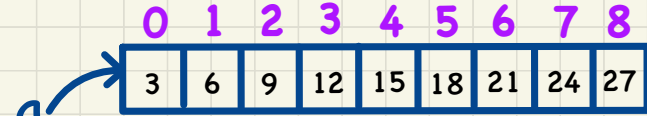
Announcements/Reminders

- **Assignment 3** (on linked Trees) solution released
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- Lecture notes template, Office Hours, TA Contact

Binary Search: Tracing



EXERCISE

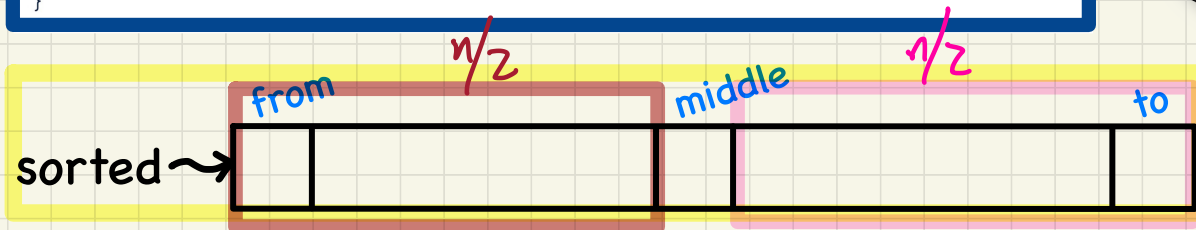
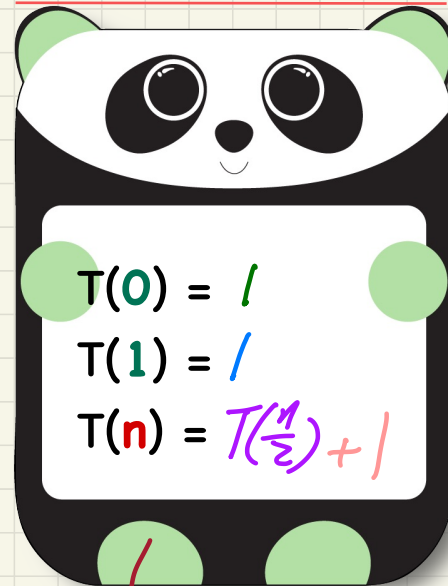


Binary Search: Running Time

```
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; }  
    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; }  
    }  
}
```

$T(n) = ?$
 $T(0) = 1$
 $T(1) = 1$
 $O(1)$ $n/2$ $n/2$

Running Time as a Recurrence Relation



wrong: ($\because$ if-else if)
 $T(n) = T(\frac{n}{2}) + T(\frac{n}{2}) + 1$

Running Time: Unfolding Recurrence Relation

$$T(0) = 1$$

$$T(1) = 1$$

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

Assume without loss of generality:
 $n = 2^x$ for $x > 0$

Warm-up: $T(\frac{n}{2}) = T(\frac{n/2}{2}) + 1 = T(\frac{n}{4}) + 1$

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

$$= \frac{(T(\frac{n}{4}) + 1)}{2^2} + 1$$

$$= \frac{((T(\frac{n}{8}) + 1) + 1)}{2^3} + 1$$

how many? $\log n$

$$= \checkmark T(1) + 1 + 1 + \dots + 1 = 1 + \log n \cdot 1 = \log n$$

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

$$\frac{n = 8}{8^n} = \frac{8^n}{2^{\log 8 \cdot n}} = 1$$

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



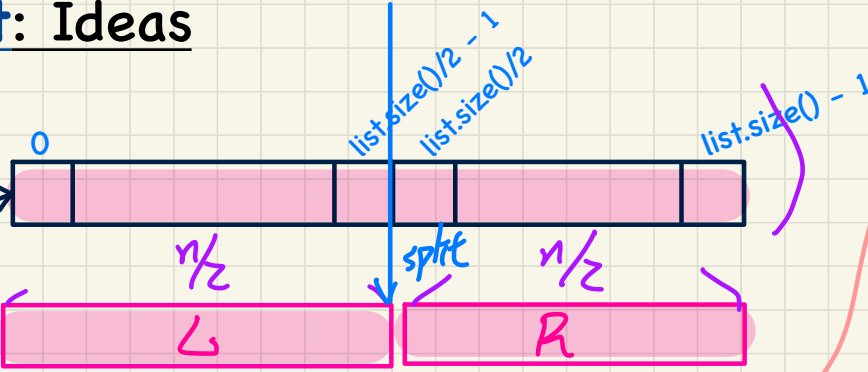
Merge Sort: Ideas



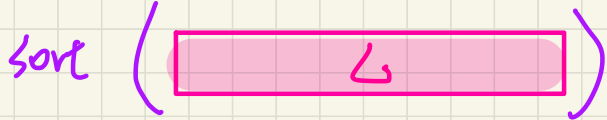
- split
- merge

sort

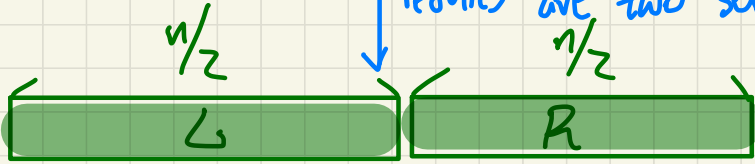
list



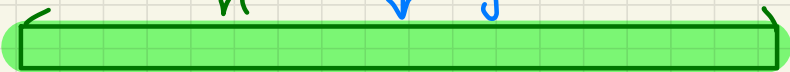
sort recursively



results are two sorted lists



merge



Each recursive call:

1. split ($n \rightarrow \frac{n}{2}, \frac{n}{2}$,
 $O(1)$ $\frac{n}{2} \rightarrow \frac{n}{4}, \frac{n}{4}$,
...

sorted
 $2 \rightarrow [1, 1]$

2. merge

$(1, 1 \rightarrow 2,$
 $2, 2 \rightarrow 4,$
...

$\frac{n}{4}, \frac{n}{4} \rightarrow \frac{n}{2}$
 $\frac{n}{2}, \frac{n}{2} \rightarrow n$

Merge Sort in Java

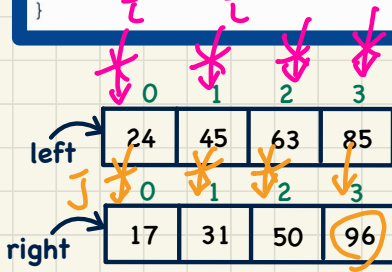
Total # iterations for merge: $(L.size + j) + (R.size - j)$
 RT for merge: * Exhaust either L or R = $O(1 \cdot (L.size + R.size))$

$\downarrow$ e.g. $\underline{L}$ is exhausted
 $O(1)$ $\underline{L.size} + \underline{R.size}$

$\approx \underline{L} + j$ iterations so far.

** Append remaining elements from R
 $\approx \underline{R.size - j}$ iterations

```
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;
}
```



Precondition:
 L and R
 are sorted



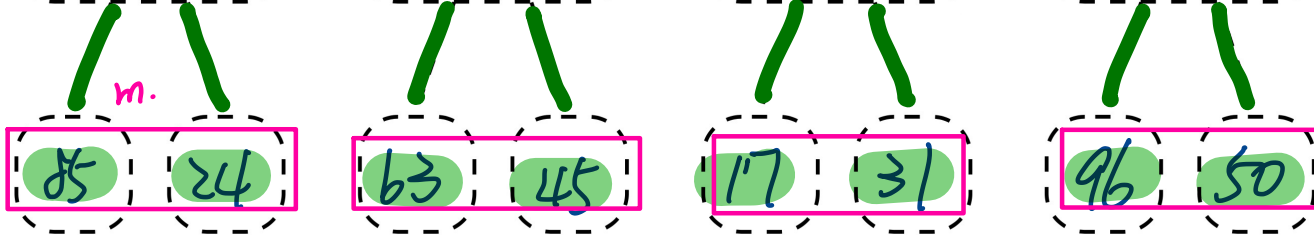
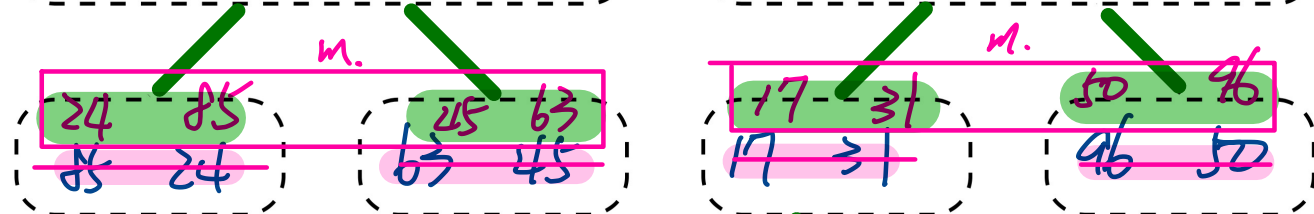
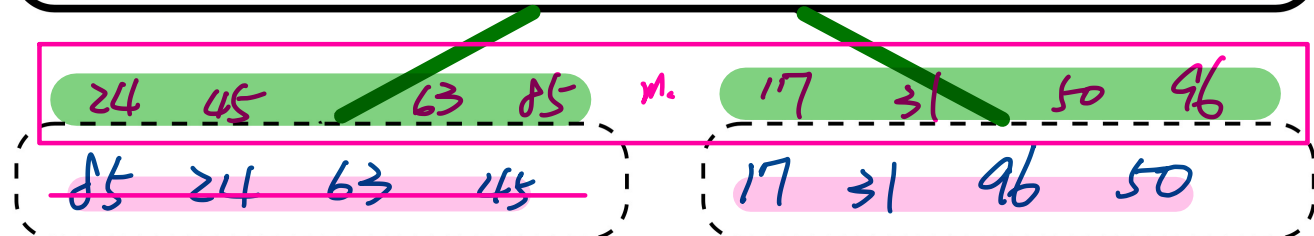
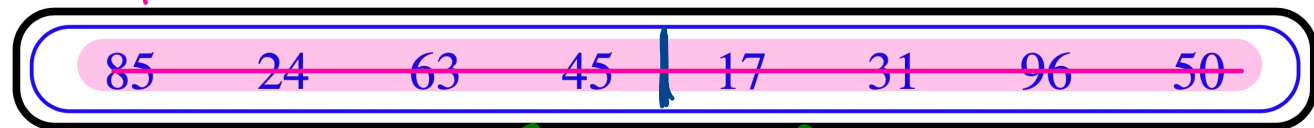
```
/* Assumption: L and R are both already sorted. */
private List<Integer> merge(List<Integer> L, List<Integer> R) {
    List<Integer> merge = new ArrayList<>();
    if (L.isEmpty() || R.isEmpty()) { merge.addAll(L); merge.addAll(R); }
    else {
        int i = 0;
        int j = 0;
        while (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;
}
```

append the remaining elements from the merged list.

Merge Sort: Tracing

→ split
→ merge

17 24 31 45 50 63 85 96



$\frac{n}{2}, \frac{n}{2} \rightarrow n$



Lecture 18 - March 20

Merge Sort, Quick Sort, BST

MergeSort: Recurrence Relation
QuickSort: Ideas, Java, RT

Announcements/Reminders

- **ProgTest2** info & example questions released
- **Assignment 3** (on linked Trees) solution released
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Merge Sort: Tracing

→ split
→ merge

Cost of merge at each level:

$\mathcal{O}(n)$

$\mathcal{O}(n)$

$\mathcal{O}(n)$

of levels of splits (to reach singleton list)

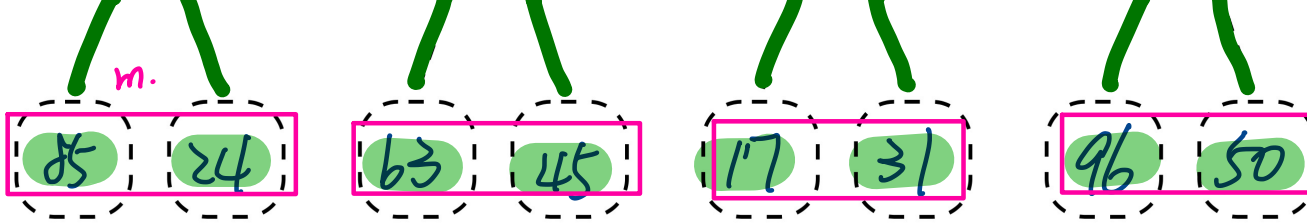
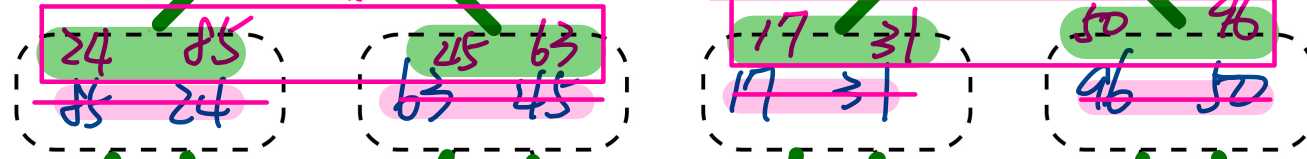
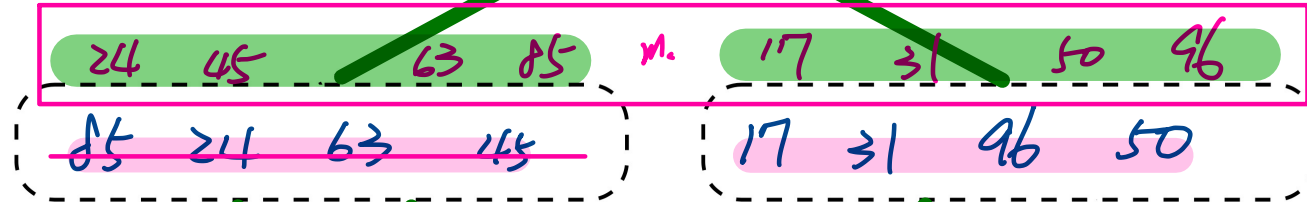
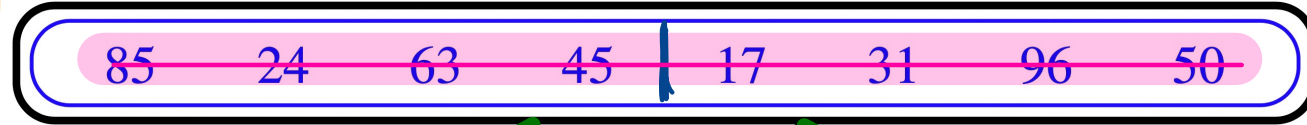
4, 4

log n

RT: $\mathcal{O}(n \cdot \log n)$

2, 2, 2, 2

1, 1, 1



Merge Sort: 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 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;
}
```

$T(0) = 1$

$T(1) = 1$

$O(n)$

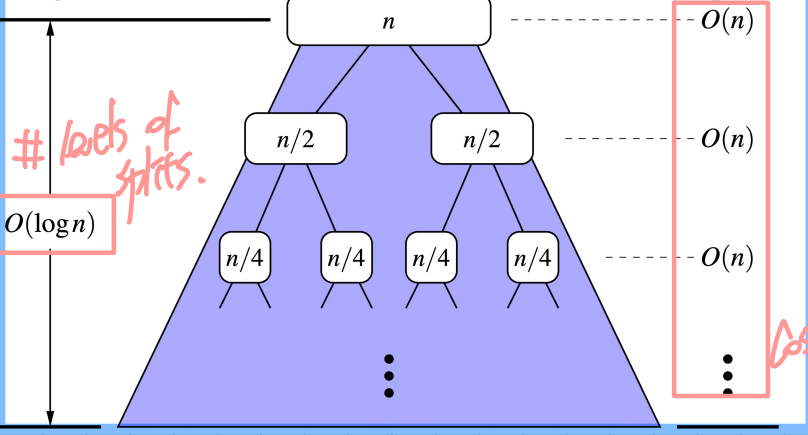
Assump: $T(\frac{n}{2})$

Assump: $T(\frac{n}{2})$

$O(n)$

Height

Time per level



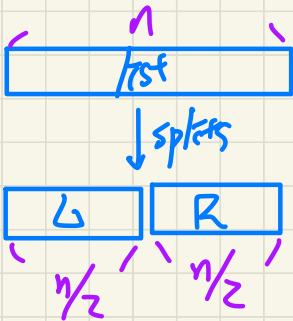
Running Time as a Recurrence Relation

$T(0) = 1$

$T(1) = 1$

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

Cost of merge at each level



Running Time: Unfolding Recurrence Relation $\frac{n}{4}$

$$T(0) = 1$$

$$T(1) = 1$$

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

$$\text{Ham-up: } T\left(\frac{n}{2}\right) = 2 \cdot T\left(\frac{n/2}{2}\right) + \frac{n}{2}$$

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

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

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

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

$$I = \frac{n}{1} = \frac{n}{2^{\log n}}$$

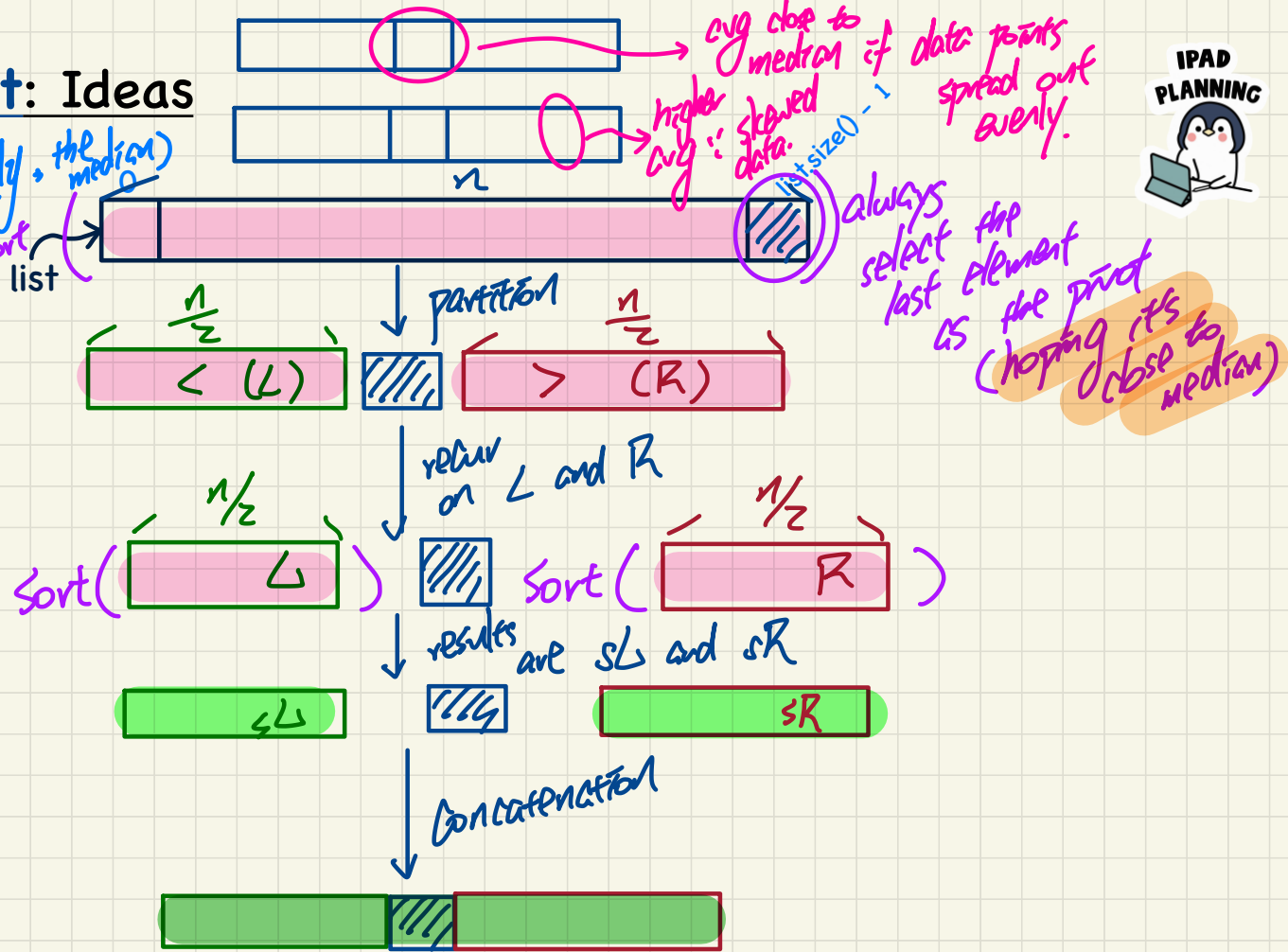
$$O(n \cdot \log n)$$
$$n + \log n \cdot n$$



Quick Sort: Ideas



- pivot selection & (ideally, the median)
- partition
- concatenation
- median of medians algorithm $\rightarrow$ find median in $O(n)$



is merging sL and sR necessary? No!

Quick Sort in Java

Median of medians algo: $O(n)$

↳ as opposed
sort and
select
middle

```
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;
}
```

$O(1)$

Comp. $O(1)$

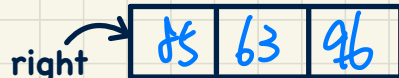
$T(\frac{n}{2})$ → only if
pivot ≈ median

linear scan
of the input list
is necessary: $O(n)$

partition

```
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;
}
```

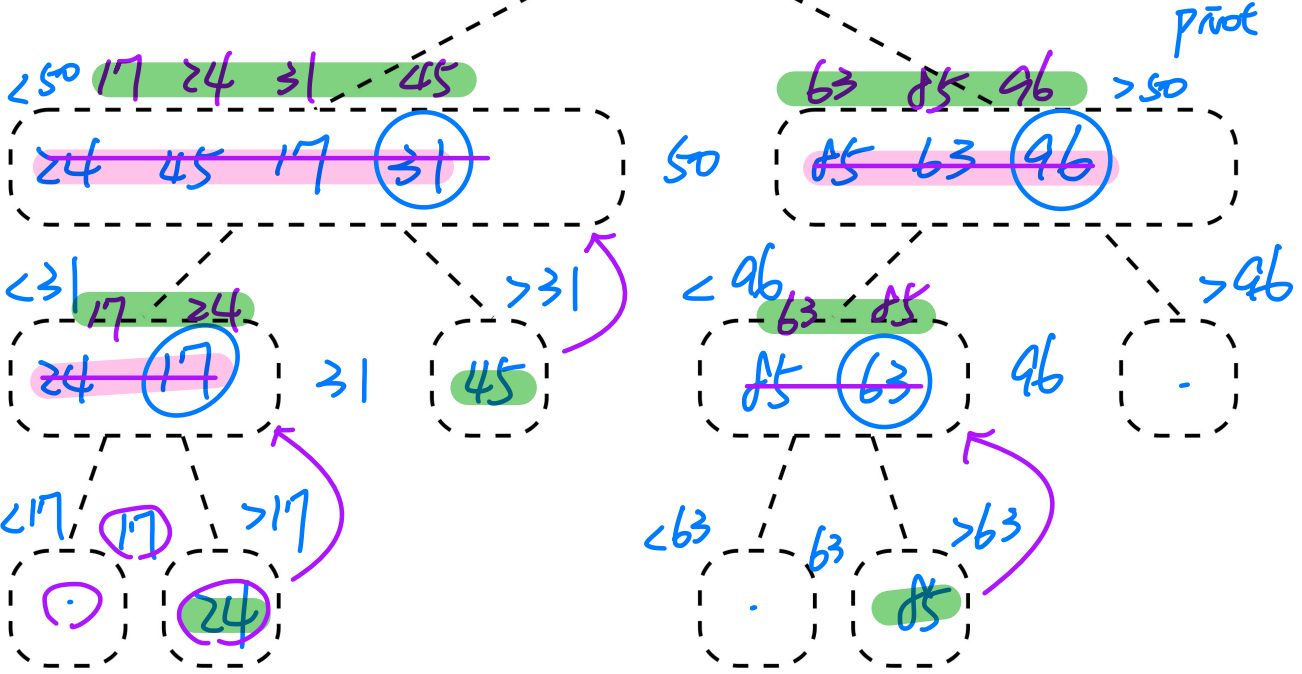
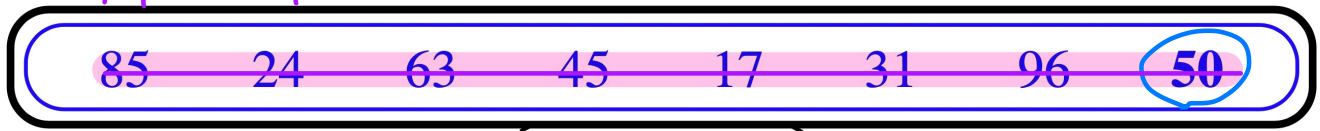


left
and
right
are
sorted!

Quick Sort: Tracing

→ split partition
→ concatenate

17 24 31 45 50 63 85 96



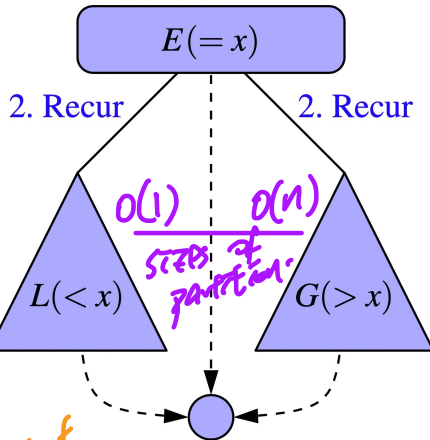
Quick Sort: Worst-Case Running Time

```
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;
}
```

bad pivot >> median
<< median

|left| << |right|
→ T(n) T(1)

1. Split using pivot x

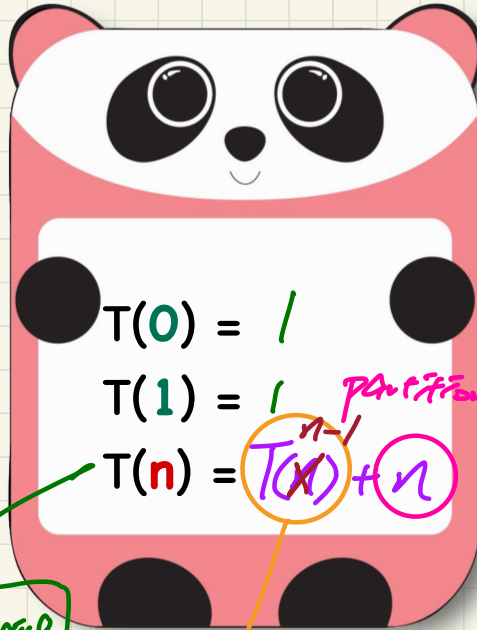


3. Concatenate

4 partitions
↓
1 9 7 5 3 1
↓
1 9 7 5 3
↓
1 9 7 5
↓
1 9 7
↓
1 9
↓
1 9

overall RT is
 $O(n^2)$ ~ selection/insertion sort

Running Time as a Recurrence Relation



$$T(0) = 1$$

$$T(1) = 1$$

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

[Exercise]

a half that's much larger than the other

Quick Sort: Best-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;
}
```

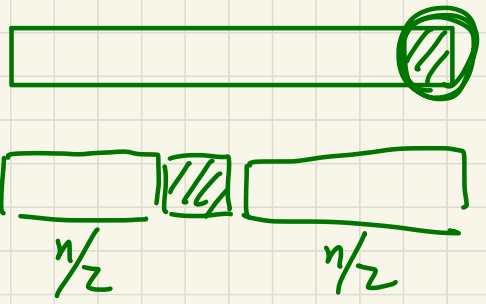
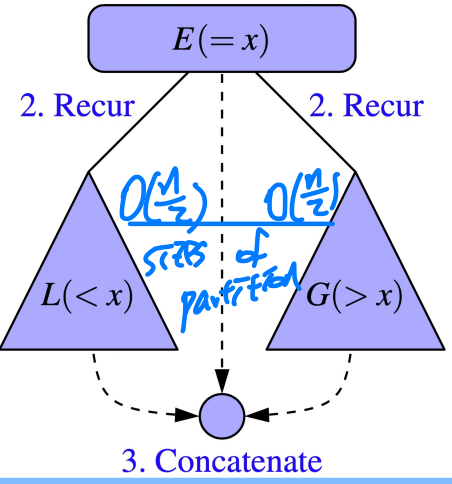
pivot $\approx$ median

$O(n)$

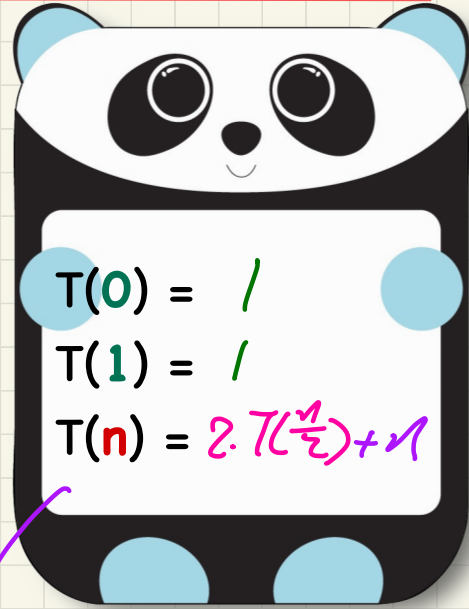
$O(1)$

*$T(\frac{n}{2})$
 $T(\frac{n}{2})$*

1. Split using pivot x



Running Time as a Recurrence Relation



$$T(0) = /$$

$$T(1) = /$$

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

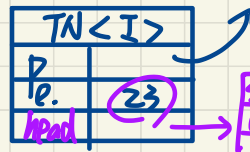
(Exercise)

Review Q & A - Mar. 21

Programming Test 2

Assignment 3 Solution

Generic Classes



This assignment requires the more intermediate use of generics. **Study carefully the TestGeneralTrees class given to you (in the tests package)**, which contains how the following two classes work together:

- **SLLNode<E>**: this class is essentially the **Node** class you used in Assignment 1.
- **TreeNode<E>**: this class is similar to but should be distinguished from the **TreeNode** class covered in Lecture W8. The version of **TreeNode** class you are given for this assignment stores **child nodes** as a **chain of singly-linked nodes**. **Remember that primitive arrays are forbidden in this assignment.**
- In the **TestGeneralTrees** class, pay attention to the following type declarations:
 - `TreeNode<String> n;` declares a tree node storing some string value: we write `n.getElement()` to retrieve the string value. In this case, the generic parameter **E** declared in the **TreeNode** class (i.e., **TreeNode<E>**) is instantiated by **String**.
 - `TreeNode<Integer> n;` declares a tree node storing some integer value: we write `n.getElement()` to retrieve the integer value. In this case, the generic parameter **E** declared in the **TreeNode** class (i.e., **TreeNode<E>**) is instantiated by **Integer**.
 - `SLLNode<TreeNode<String>> tn;` declares a singly-linked node storing the reference of some tree node (which in turn stores some string value): we write `tn.getElement()` to retrieve the tree node (of type **TreeNode<String>**) and write `tn.getElement().getElement()` to retrieve the stored string value. In this case, the generic parameter **E** declared in the **SLLNode** class (i.e., **SLLNode<E>**) is instantiated by **TreeNode<String>** (which in turn instantiates the generic parameter **E** in the **TreeNode** class by **String**).
 - `SLLNode<TreeNode<Integer>> tn;` declares a singly-linked node storing the reference of some tree node (which in turn stores some integer value): we write `tn.getElement()` to retrieve the tree node (of type **TreeNode<Integer>**) and write `tn.getElement().getElement()` to retrieve the stored integer value. In this case, the generic parameter **E** declared in the **SLLNode** class (i.e., **SLLNode<E>**) is instantiated by **TreeNode<Integer>** (which in turn instantiates the generic parameter **E** in the **TreeNode** class by **Integer**).

```
public class TreeNode<E> {
    • private E element; /* data object */
    • private TreeNode<E> parent; /* unique parent
    • private SLLNode<TreeNode<E>> headOfChildList
    • private SLLNode<TreeNode<E>> tailOfChildList
```

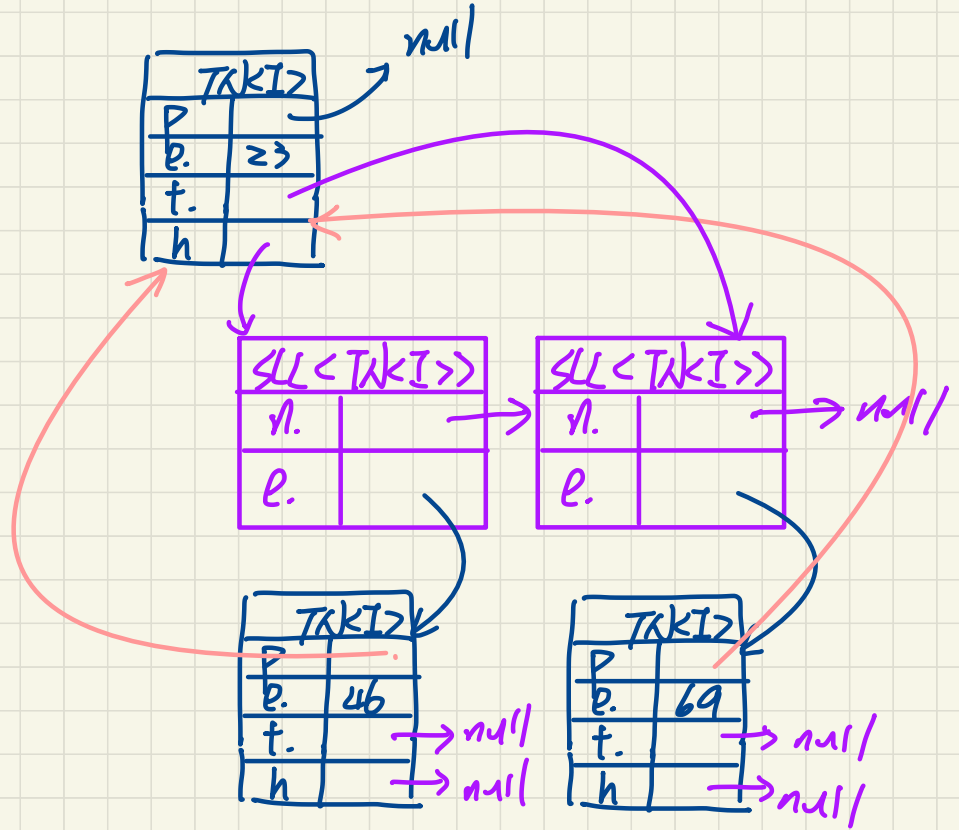
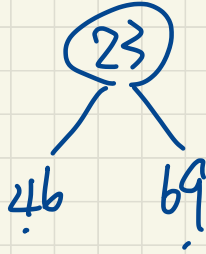
```
public TreeNode(E element) {
public E getElement() {
public void setElement(E element) {
public TreeNode<E> getParent() {
public void setParent(TreeNode<E> parent) {
public SLLNode<TreeNode<E>> getChildren() {
public void addChild(TreeNode<E> child) {
}
```

Handwritten notes: *head.getE. head.getE().getE() → Takes*

```
public class SLLNode<E> {
    private E element;
    private SLLNode<E> next;

    public SLLNode(E e, SLLNode<E> n) {
    public E getElement() {
    public SLLNode<E> getNext() {
    public void setNext(SLLNode<E> n) {
    public void setElement(E e) {
}
```

Handwritten note: *TN<E>*



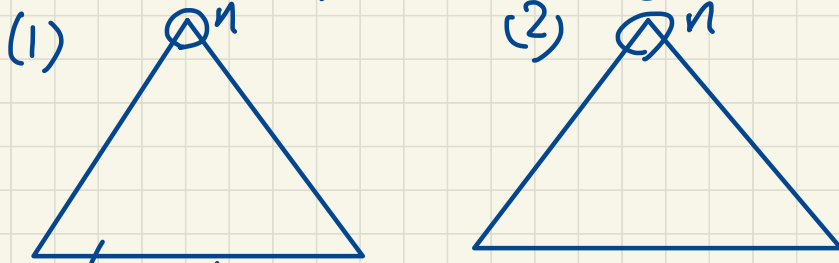
A3 starter

↳ tests

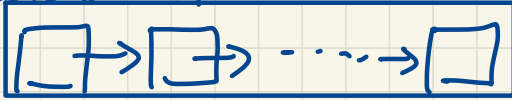
↳ TestTrees.java

Task 1 Rank

task1(TN n, int l, int j)



(a) pre-order or post-order traversal.
SLLNode chain



(b) sort the traversal result

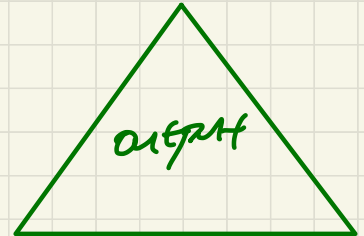
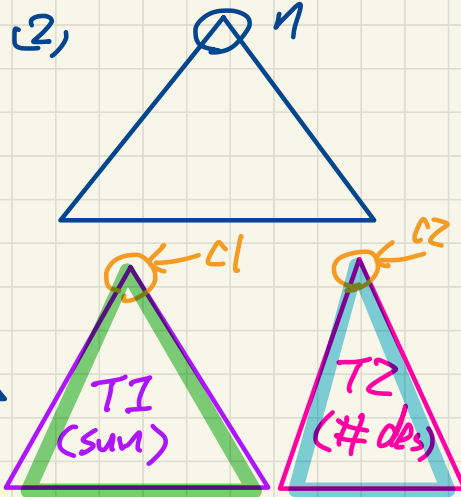
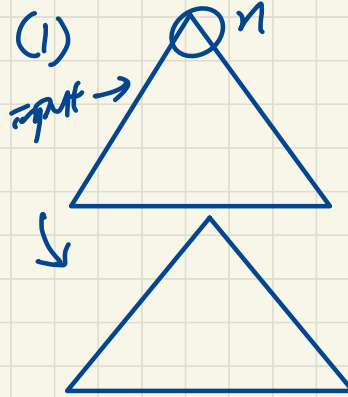
↳ e.g. insertion sort or selection sort

(c) extract nodes from indices l to j.

(a) traverse, and when each node is added, insert it s.t. the result chain of nodes remains sorted.

(b)

Task 2: Stats (sum of values, # des.)



Lecture 19 - March 27

Binary Search Trees

BST: Search Property

BST: Sorting Property

BST: Constructing BST Nodes

Announcements/Reminders

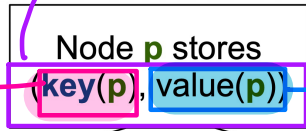
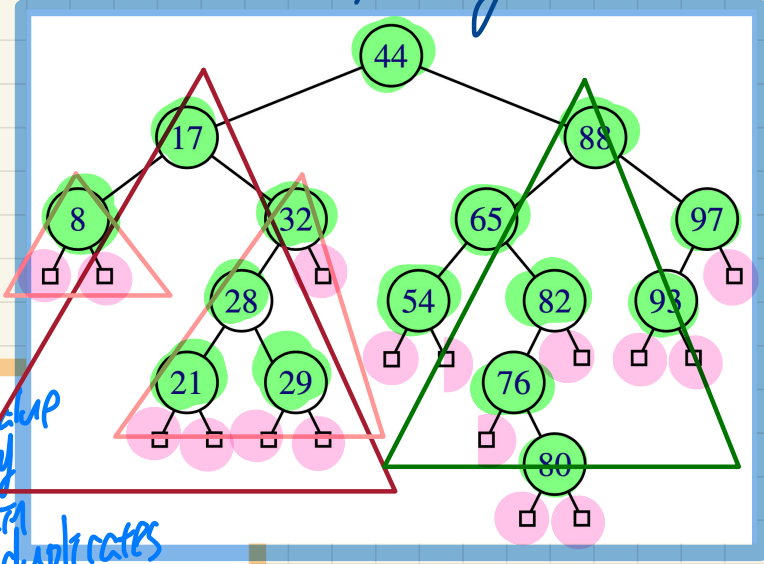
- **Assignment 4** (on linked Trees) released
- **Makeup Lecture** to be posted
- Lecture notes template, Office Hours, TA Contact

Binary Search Trees: Recursive Definition

Search Property: should hold recursively on the root of every subtree



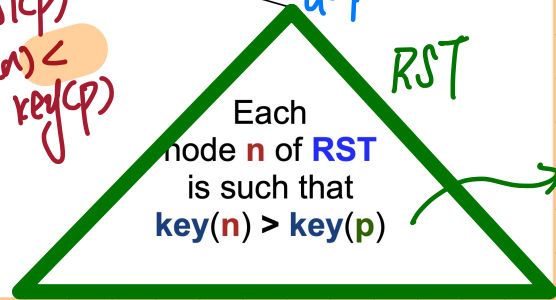
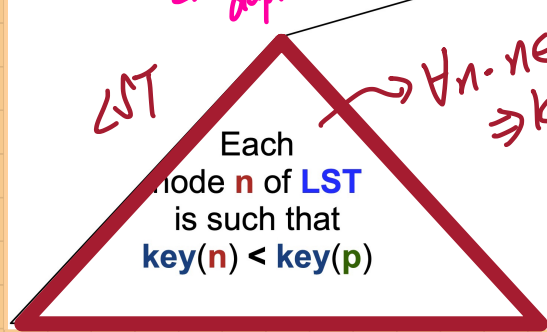
- external node
- internal node
- + LST
- + RST



for searching
→ no duplicates

entry

data value
→ may contain duplicates



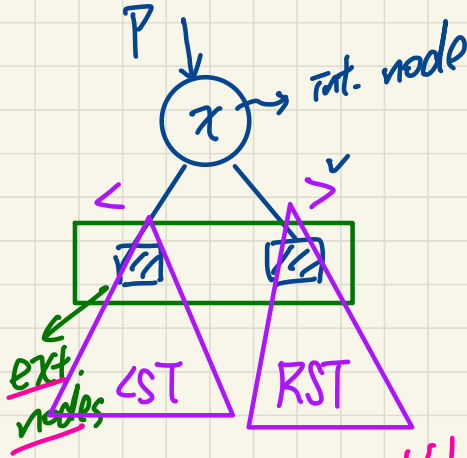
$\forall n \cdot n \in \text{LST}(p) \Rightarrow \text{key}(n) < \text{key}(p)$

$\forall n \cdot n \in \text{RST}(p) \Rightarrow \text{key}(n) > \text{key}(p)$

Is a Singleton **BT** a **BST**?

$$\forall x. \boxed{\text{false} \Rightarrow P(x)}$$

zero of $\Rightarrow$: True



↓
($\approx$ header/trailer in DLN
↳ code structure
↳ does not improve performance).

Search Property

$$\forall n: n \in \boxed{\text{LST}(p)} \Rightarrow \text{True}$$

false $\text{key}(n) < \text{key}(p)$

$$\wedge \forall n: n \in \boxed{\text{RST}(p)} \Rightarrow \text{True}$$

false $\text{key}(n) > \text{key}(p)$

Binary Search Trees: Sorting Property



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

Given a BT that's a BST:
(1) search property sat. (recursively)
(2) in-order traversal (T.O.T.):

Node **p** stores
(key(p), value(p))

$\neq$

lc

Each node **n** of **LST** is such that
 $\text{key}(n) < \text{key}(p)$

T.O.T.(p)
↳ T.O.T.(lc)
↳ p
↳ T.O.T.(rc)

rc

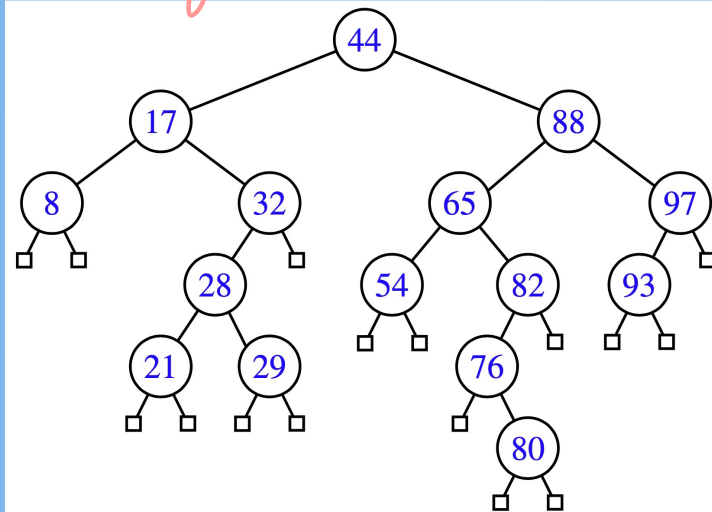
Each node **n** of **RST** is such that
 $\text{key}(n) > \text{key}(p)$

T.O.T. (LST)

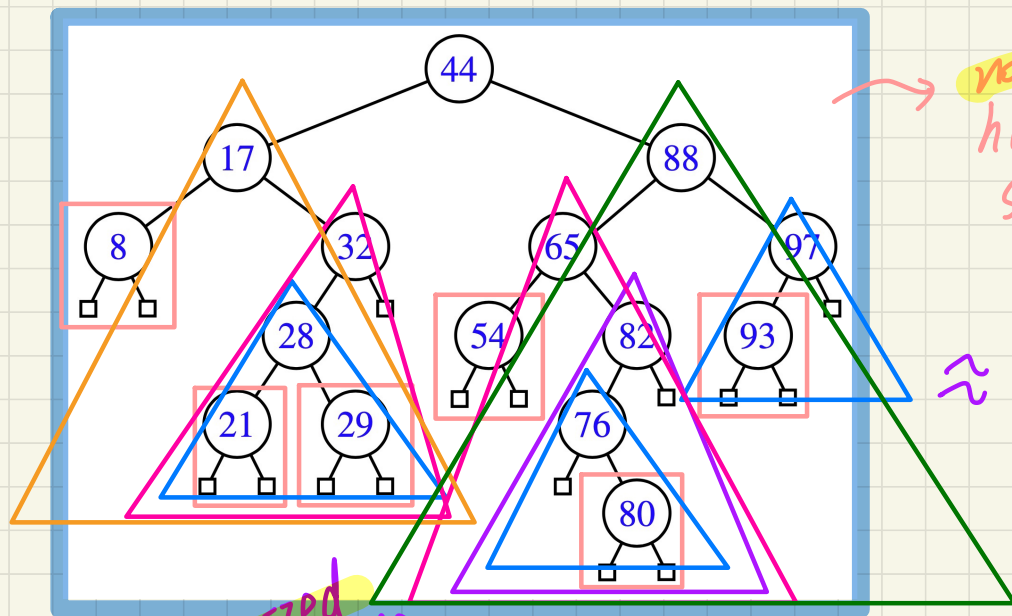
T.O.T. (RST)

sorted seq. of all keys in LST

$\approx$ Concat. in quicksort.
sorted seq. of all keys in RST



Building Sorted Seq. from In-Order Traversal on BST



non-linear,
hierarchical
structure

≈ concat. in
quick sort!

inverted
version of the
tree

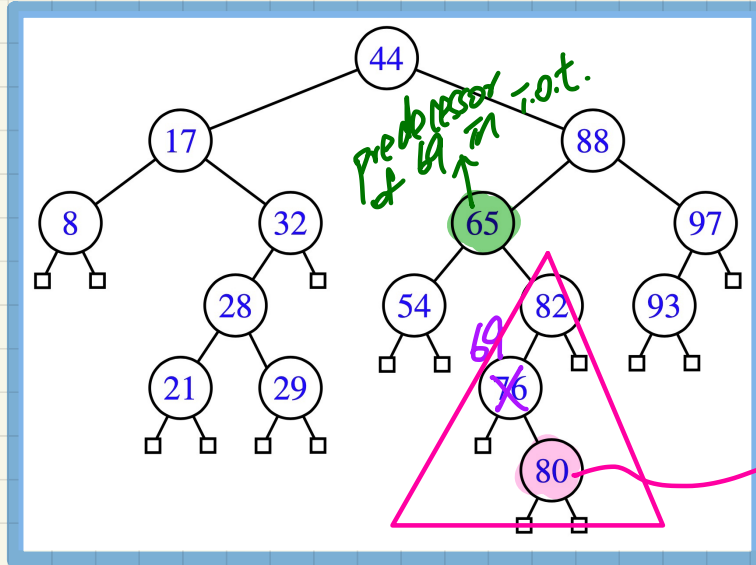
I.O.T.

8 17 21 28 29 32 44 54 65 76 80 82 88 93 97

Exercise: Checking the Search Property (1)

Remember: For a **BT** to be a **BST**, the **Search Property** should hold recursively on the root of each subtree.

In-Order: <8, 17, 21, 28, 29, 32, 44, 54, 65, ~~76~~, 80, 82, 88, 93, 97>



predecessor

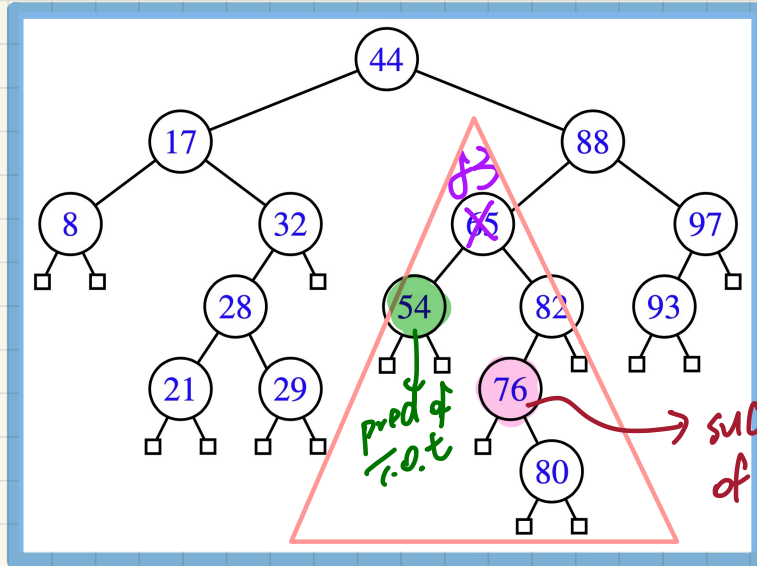
69
ok
 $65 < 69 < 80$

successor
of 69 in T.O.T.

Exercise: Checking the Search Property (2)

Remember: For a **BT** to be a **BST**, the **Search Property** should hold recursively on the root of each subtree.

In-Order: <8, 17, 21, 28, 29, 32, 44, 54, 65, 76, 80, 82, 88, 93, 97>



pred. $\neq$ succ.

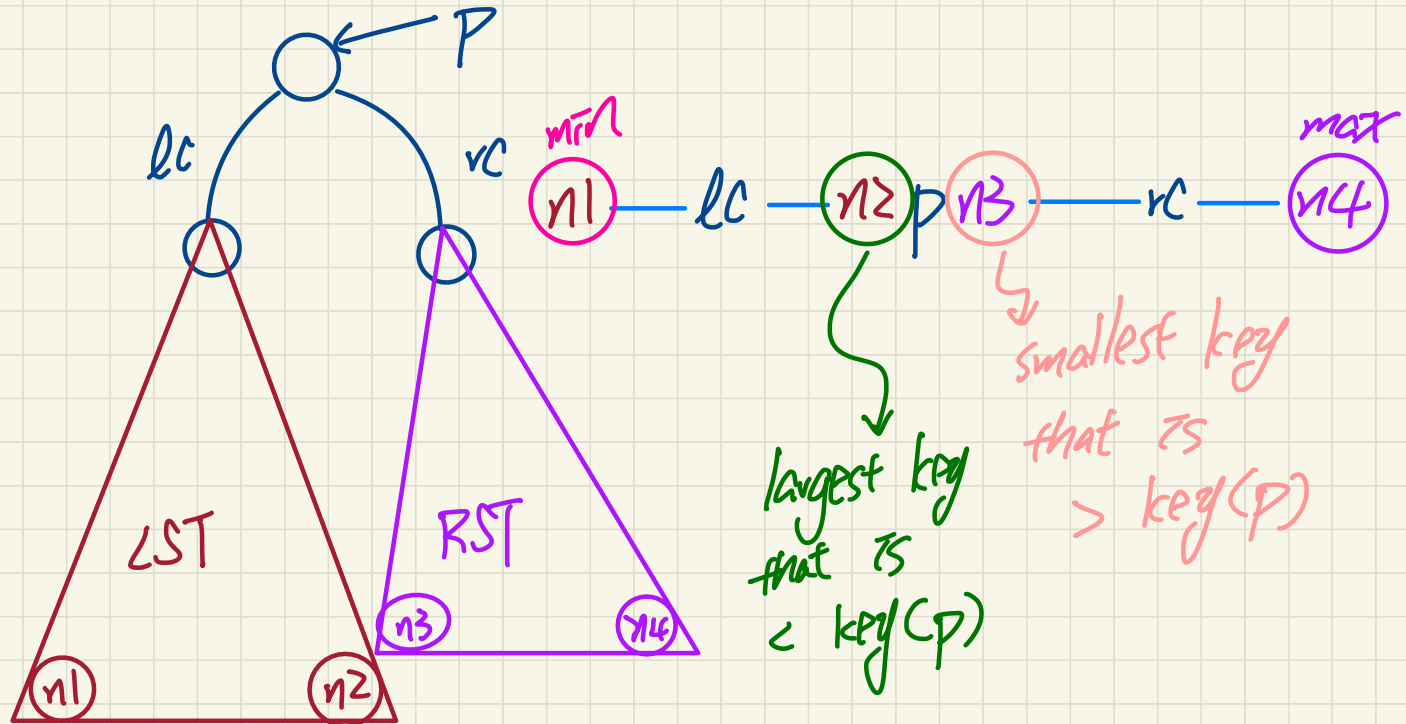
$54 < 83$

$83 \times < 76$ false

succ.
of r.o.t.

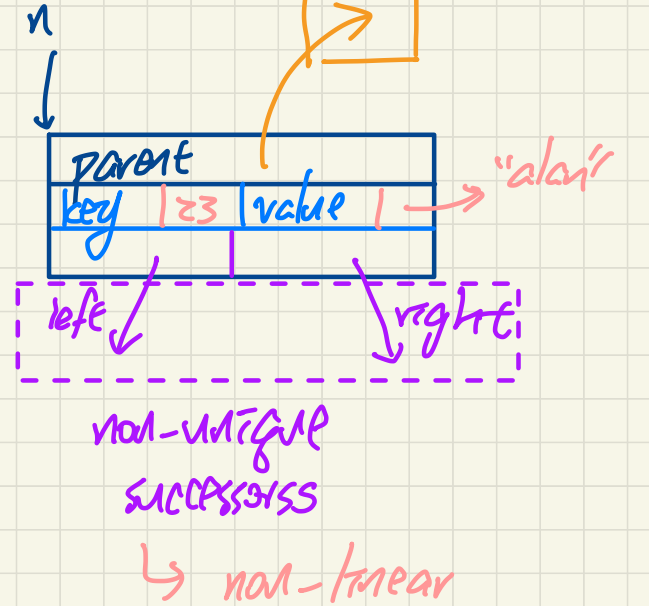
Visual Summary: In-Order Traversal on BST

BST



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.



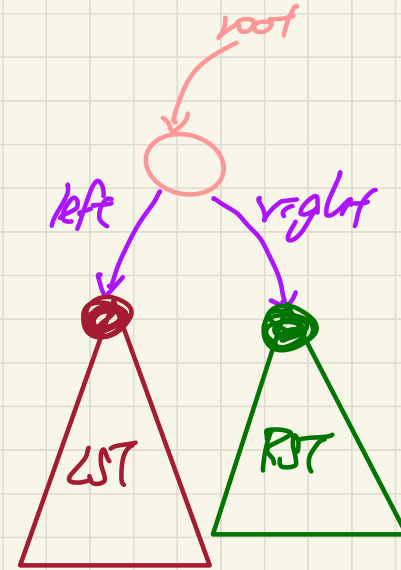
Generic, Binary Tree Nodes - Traversal

```
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;
    }
}
```



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());
```

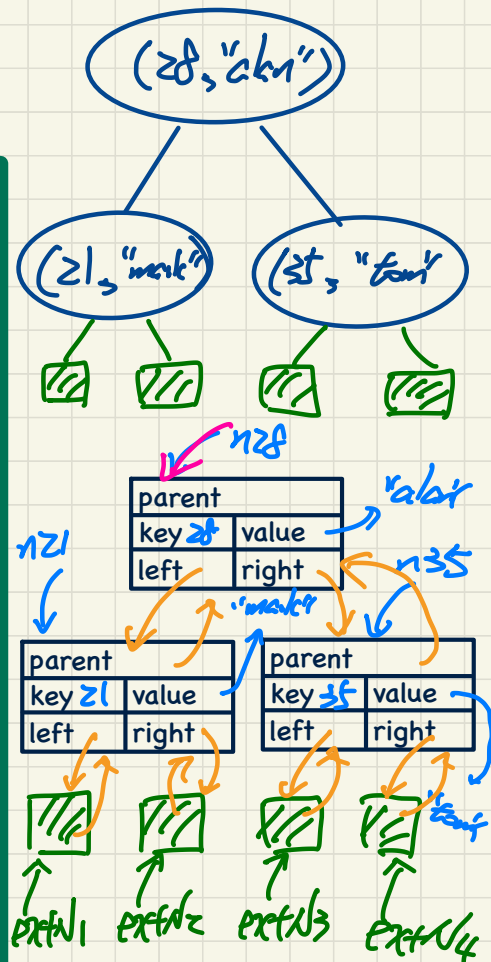
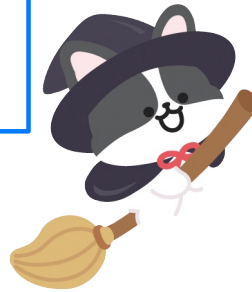
```
    assertEquals(28, inOrderList.get(1).getKey());
```

```
    assertEquals("alan", inOrderList.get(1).getValue());
```

```
    assertEquals(35, inOrderList.get(2).getKey());
```

```
    assertEquals("tom", inOrderList.get(2).getValue());
```

```
}
```



↓ sorted in-order seq.

Lecture 20 - April 1

Binary Search Trees, Balanced BSTs

***BST: Searching, Insertion
High Balance Property
Priority Queue: Introduction***

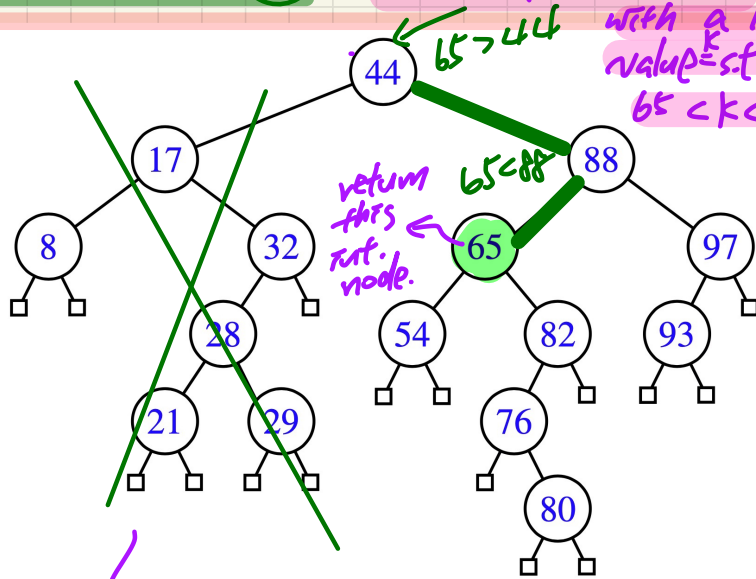
Announcements/Reminders

- **Assignment 4** (on linked Trees) released
- **Makeup Lecture** (for **ProgTest2**) to be posted
- Bonus opportunity: Final **Course Evaluation**
- Office hours 3pm Tue/Wed/Thu this week
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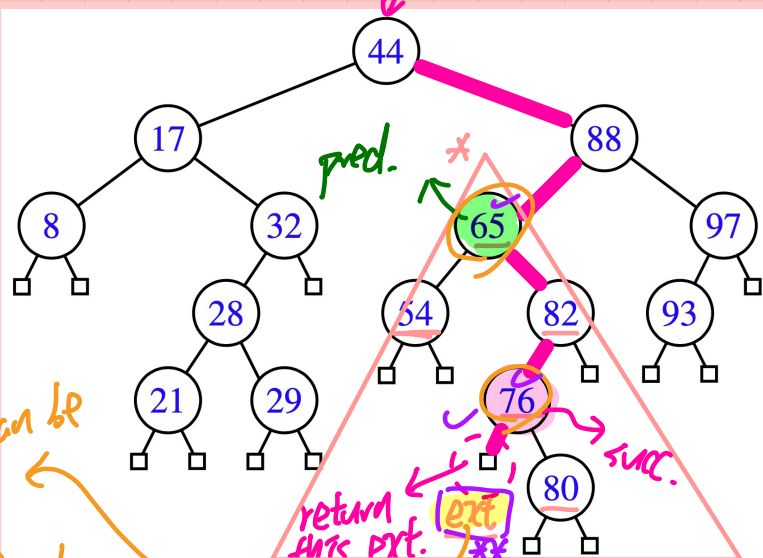
* i.o.t. : 54 65 [ext] 76 do 82 ...

BST Operation: Searching a Key

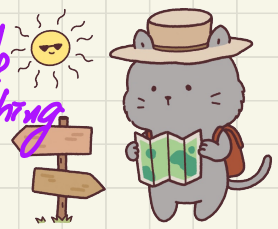
Search key 65



Search key 68



① successful
 ↳ r.m. int. node storing the matching key value
 ② unsuccessful
 ↳ r.m. ext. node
 65 < k(ext) < 76



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 */
```

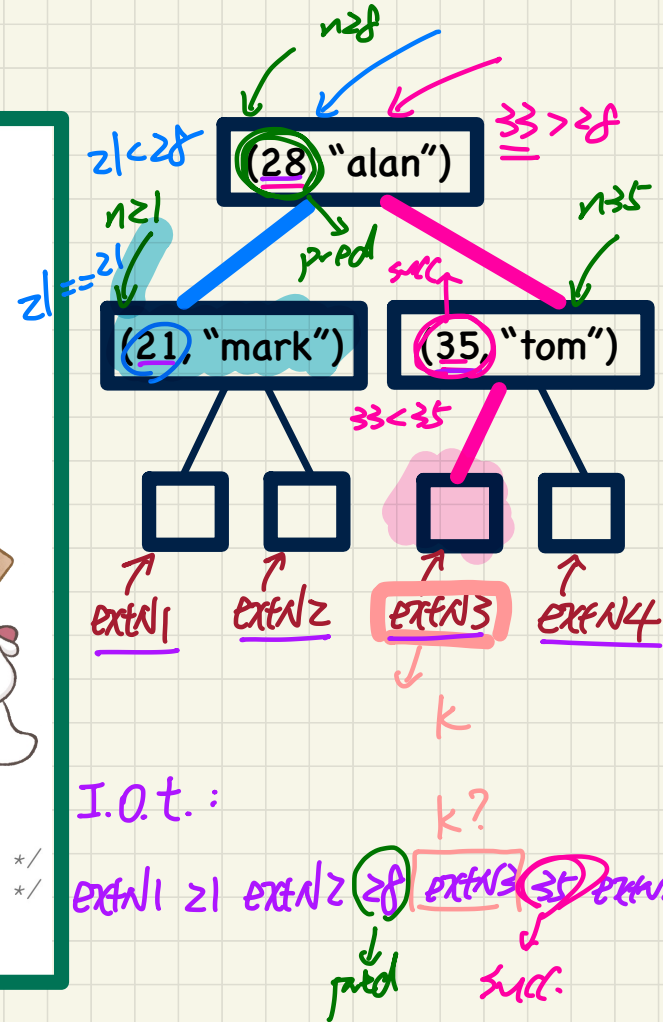
```
assertTrue(extN1 == u.search(n28, 17)); /* *17* < 21 */
```

```
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* */
```

```
}
```



* Revisit: given N nodes: $\underline{\quad} \leq h \leq \underline{\quad}$

Running Time: Search on a BST

→ ext. or int.

```
public BSTNode<E> search(BSTNode<E> p, int k) {
    BSTNode<E> result = null;
    if (p.isExternal()) {
        result = p; /* unsuccessful search */
    }
    else if (p.getKey() == k) {
        result = p; /* successful search */
    }
    else if (k < p.getKey()) {
        result = search(p.getLeft(), k);
    }
    else if (k > p.getKey()) {
        result = search(p.getRight(), k);
    }
    return result;
}
```

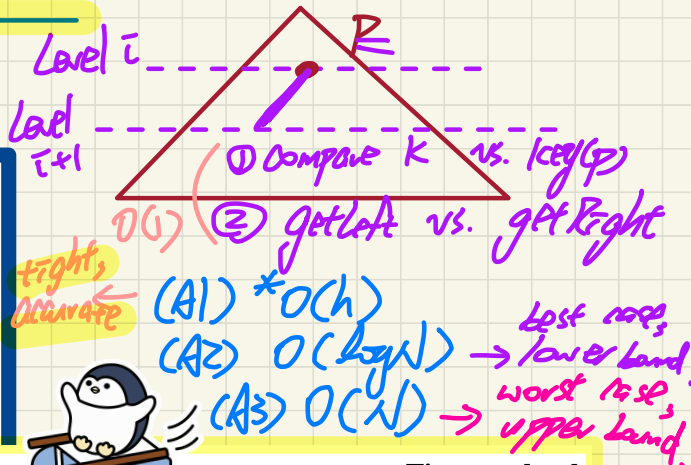
R1

R2

Height

h

Tree T:



Time per level

$O(1)$

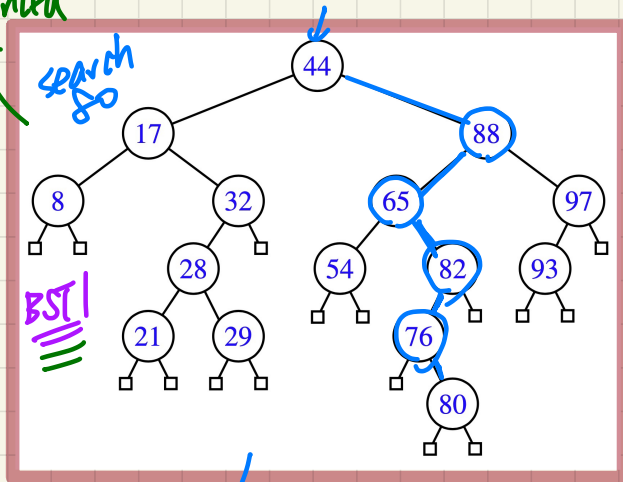
$O(1)$

$O(1)$

Total time: $O(h)$

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

balanced

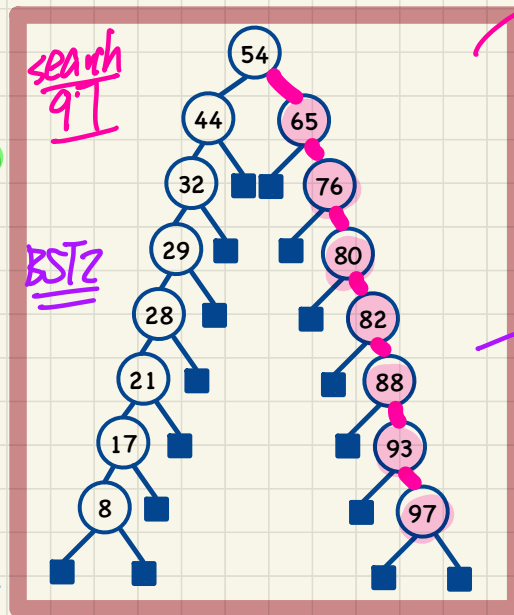


$N = 15$
 $h = 5$
 $\approx O(\log N)$

searching 80 on BST1 $\approx$ performing a binary search on a

T.O.T. (BST1) = T.O.T. (BST2) = O

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



unbalanced

$N = 15$
 $h = 7$
 $\frac{N}{2} \approx O(N)$

searching 97 on BST2 $\approx$ performing a linear search on a

REVIEW



Visualizing BST Operation: Insertion

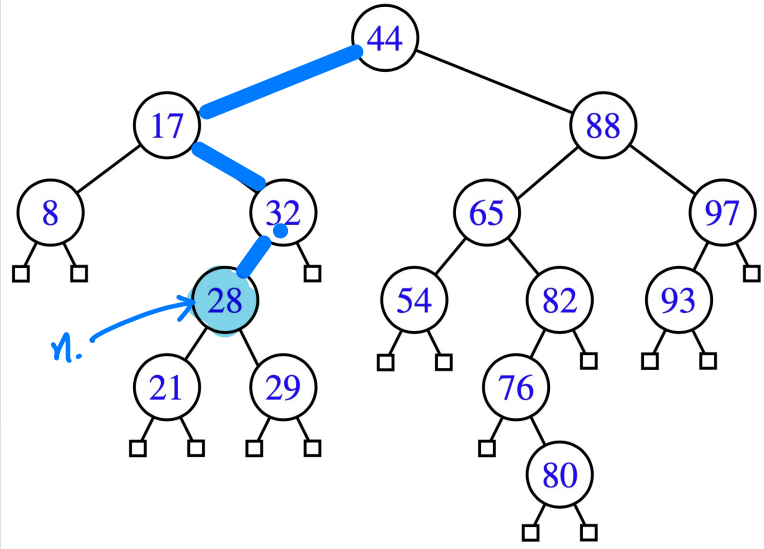
RT: dominated by $O(\log n)$
 searching $\rightarrow$ $O(\log n)$



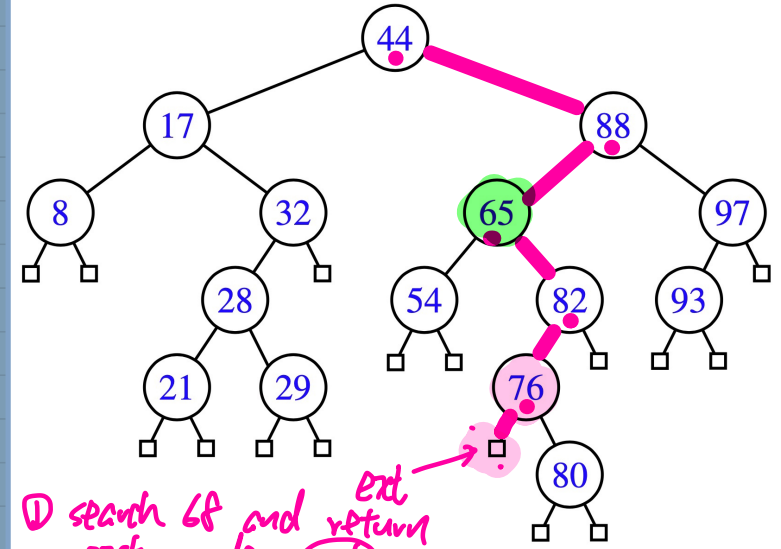
Insert Entry (28, "suyeon")

② Convert [ext] into an int. node.
 $\rightarrow$ (68, "yuna")

Insert Entry (68, "yuna")



- ① search 28 and return int. node n
- ② n.setElement("suyeon"):



- ① search 68 and return ext. node (ext)

Worst-Case RT: BST with Linear Height

Example 1: Inserted Entries with Decreasing Keys

<100, 75, 68, 60, 50, 1>

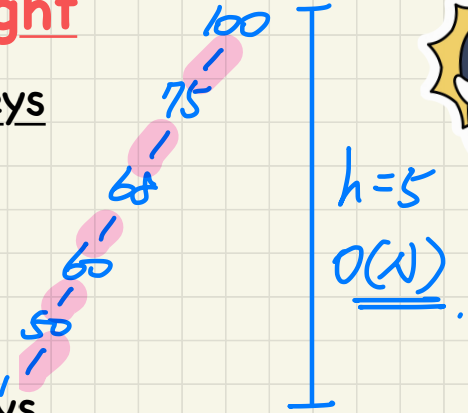
Example 2: Inserted Entries with Increasing Keys

<1, 50, 60, 68, 75, 100>

exercises
(heights?
N? logN?)

Example 3: Inserted Entries with In-Between Keys

<1, 100, 50, 75, 60, 68>



BST with $O(N)$ height
⇒ search/insert/delete
can be $O(N)$

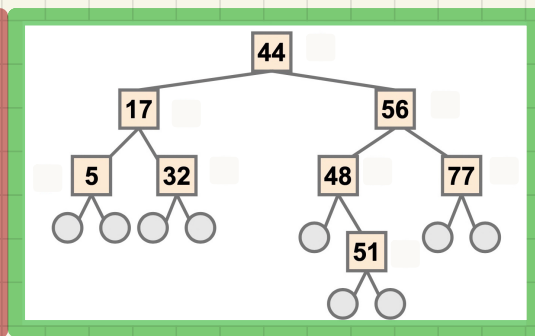
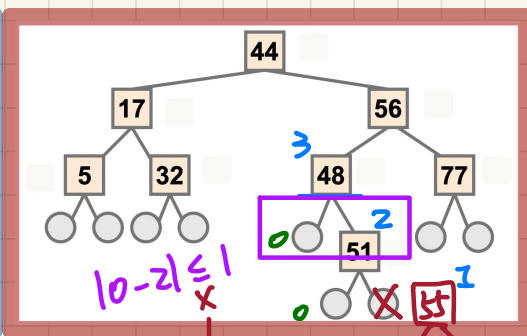
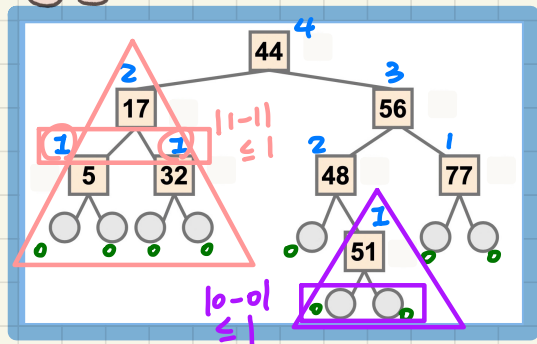
Balanced BST: Definition



- internal node
- height
- height balance

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

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



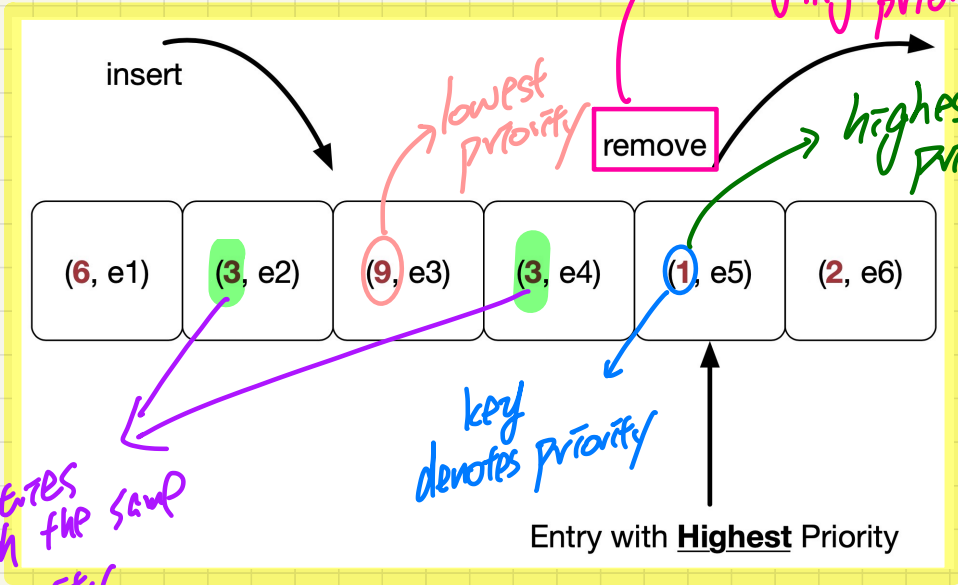
violation of HBP
logN search RT not guaranteed anymore!

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

Q. Still a **balanced BST** after inserting **55**?

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

k ↓ priority ↑



key denotes priority

Compare PQ with FIFO queue

1. Entities removed from PQ according to priorities.
2. Entities removed from FIFO acc. to chronological order

Lecture 21 - April 3

Priority Queues, Heap, Heap Sort

PQ: List Implementations

Heap: Structure, Relational Properties

Heap: Insertion, Deletion

Heap Sort

Announcements/Reminders

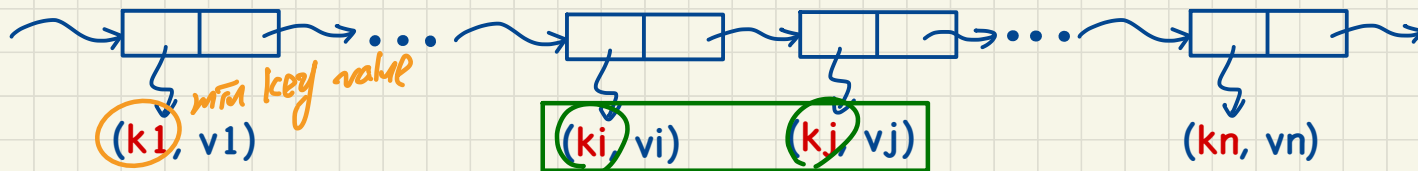
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List-Based Implementations of Priority Queue (PQ)

PQ Method	List Method	
	SORTED LIST	UNSORTED LIST
size		list.size $O(1)$
isEmpty		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 $O(N)$

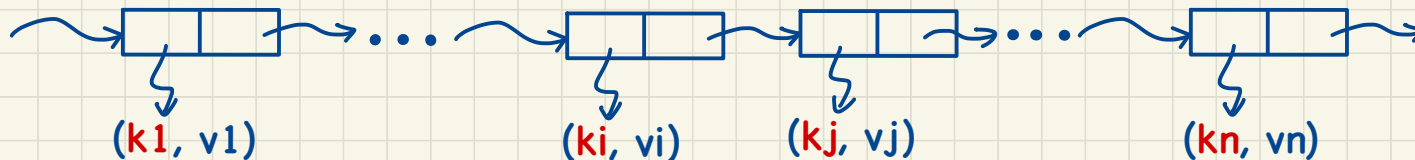
(2) infrequent expansion to P.Q.

Approach 1: Sorted List → more suitable:
(1) frequent retrieval/removal of top-prior. entries



Approach 2: Unsorted List

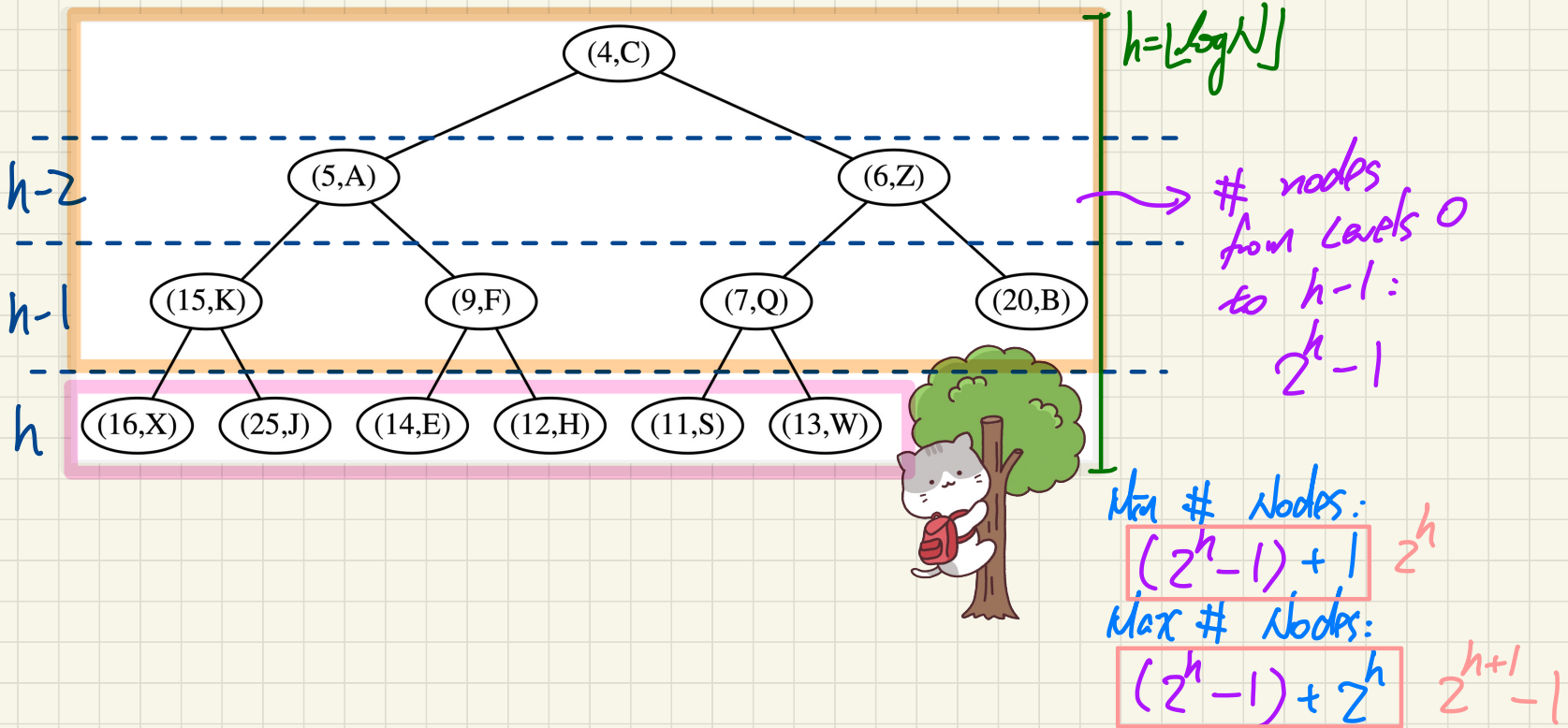
$$k_i \leq k_j$$



Heaps: Structural Properties of Nodes

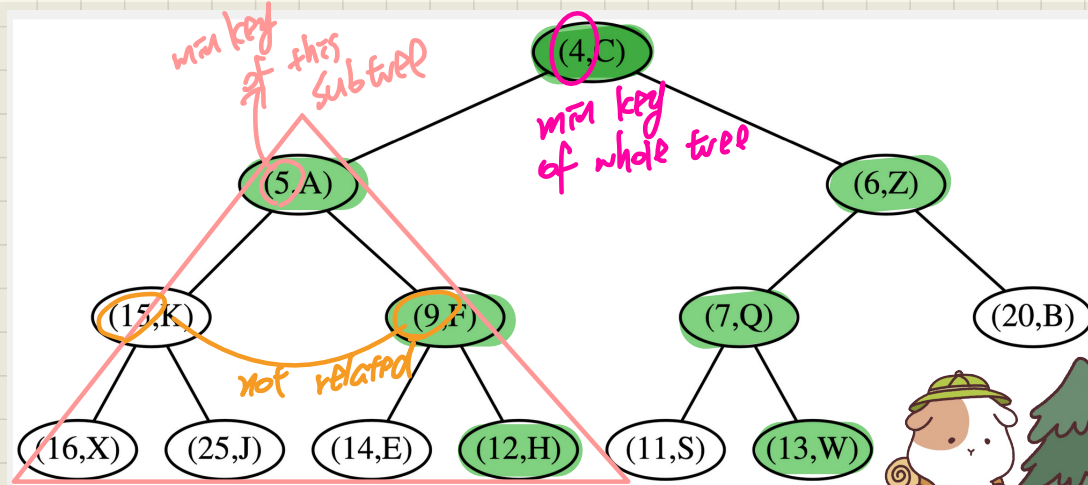
→ height: $\log N$.

Property: The tree is a complete Binary Tree



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 (non-ascending order)

P2. min key exists in the root

P3. keys between LST and RST are not related.



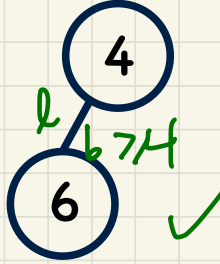
Example **Heaps**

Example 1

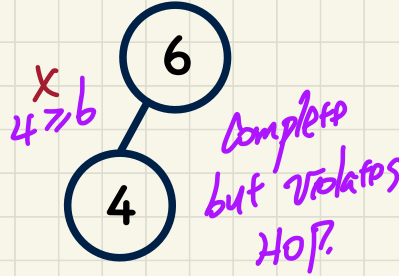


Smallest possible
one-node
heap.

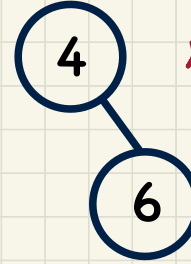
Example 2



Example 3

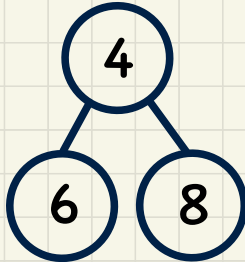


Example 4

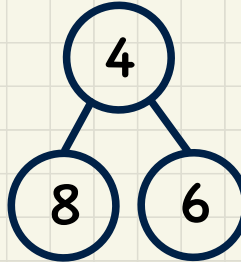


not complete
but sat.
HoP.

Example 5



Example 6



heaps!

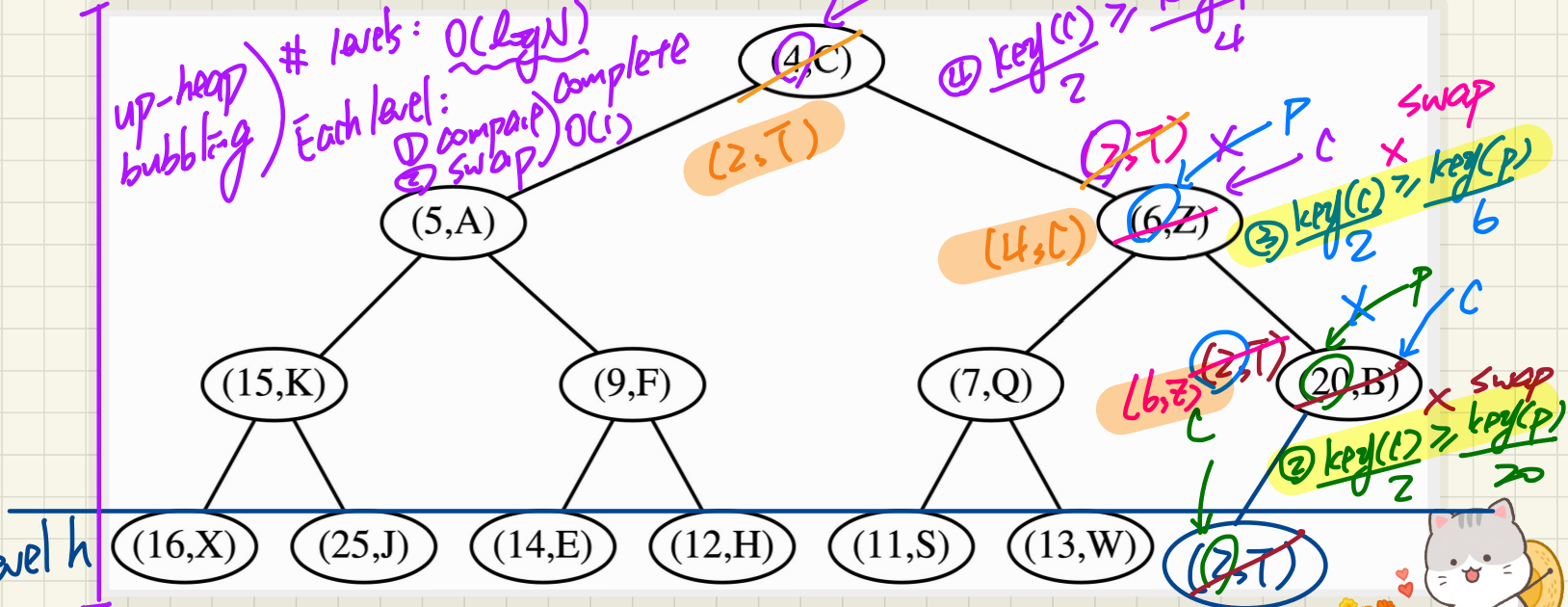
Full BT
⇒ Complete BT

Heap Operations: Insertion

Insert a new entry (2, T)

$O(1 \cdot \log N) = O(\log N)$ Insertion

up-heap bubbling
levels: $O(\log N)$
Each level: $O(1)$ (compare, swap)
complete



1. Store new entry as right-most node at level h.



Heap Operations: Deletion

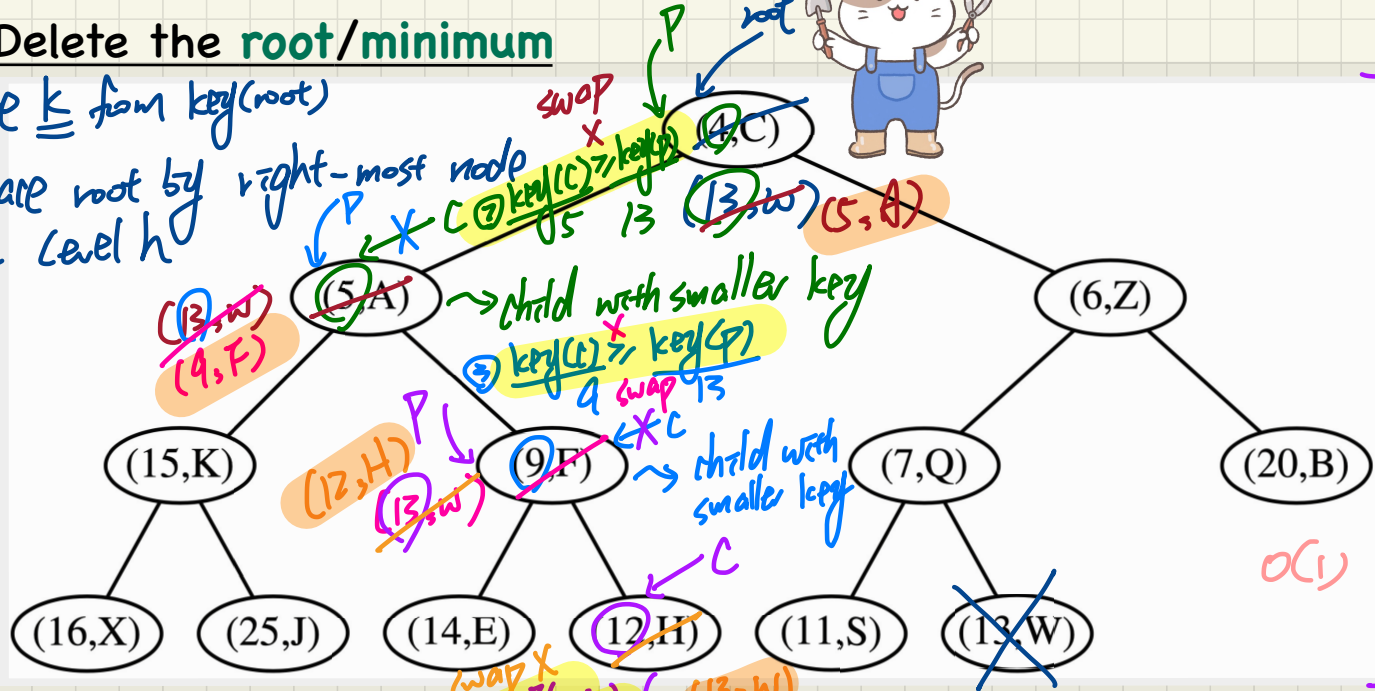
Entry with min key (root)

Delete the root/minimum



① store k from key(root)

Replace root by right-most node
at level h



down-heap
bubbling.

levels:
 $O(\log N)$

Each level:

- ① choose C
- ② compare
- ③ swap

$O(1)$

⑤ return k . $O(1 \cdot \log N)$
deletion $\leftarrow O(\log N)$

Heap Sort: Ideas

$O(N \cdot \log N)$



construct a heap out of N entries

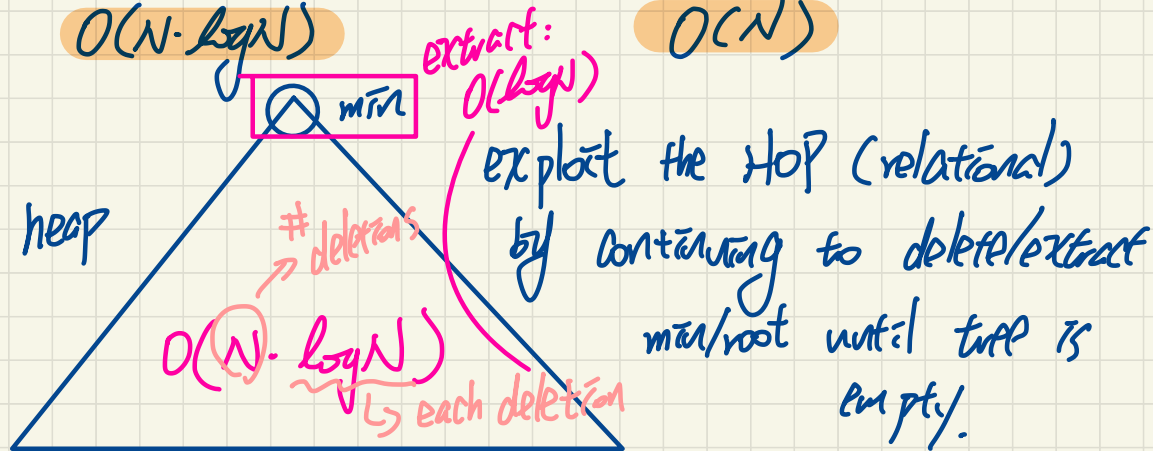
(A) Top-Down

$O(N \cdot \log N)$

(B) Bottom-Up

$O(N)$

$\approx$ selection sort
 $\hookrightarrow$ selection: $O(N)$



Exam

~ jeff
sunila
jadore

~ 1~2 review sessions

~ PDF guide

~ slides / i-Pad notes

~ question booklet (answer booklets)

~ example code

↳ no calculator 2^{10}

↳ BST/Node

↳ little to none multiple choice qs.

~ assignments

↳ definitions

↳ short answers (explanations, justifications)

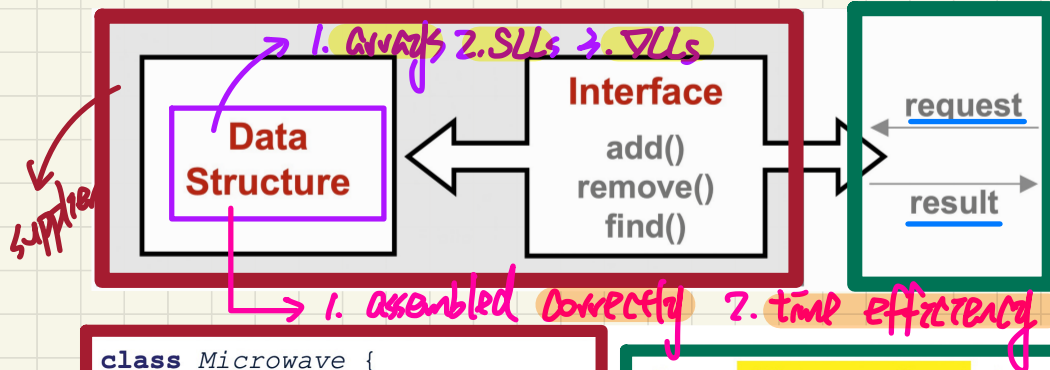
↳ coding/tracing

↳ proofs (e.g., asymptotic u.b.,
trees)

Makeup Lecture (ProgTest1)

ADTs, Stacks

Abstract Data Types (ADTs)



client
relates on
the public
interface of ADT

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

```
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

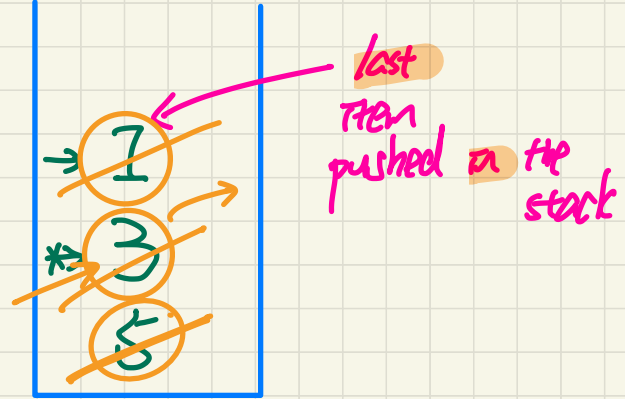
NullPointerException - if the specified element is null and this list does not permit null elements

IllegalArgumentException - if some property of the specified element prevents it from being added to this list

IndexOutOfBoundsException - if the index is out of range (`index < 0 || index >= size()`)

Stack ADT: Illustration

	isEmpty	size	top
<u>new stack</u>	T	0	n.a.
<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> ^{ret. 1}	F	2	<u>3</u>
<u>pop</u> ^{ret. 3}	F	1	<u>5</u>
<u>pop</u> ^{ret. 5}	T	0	n.a.



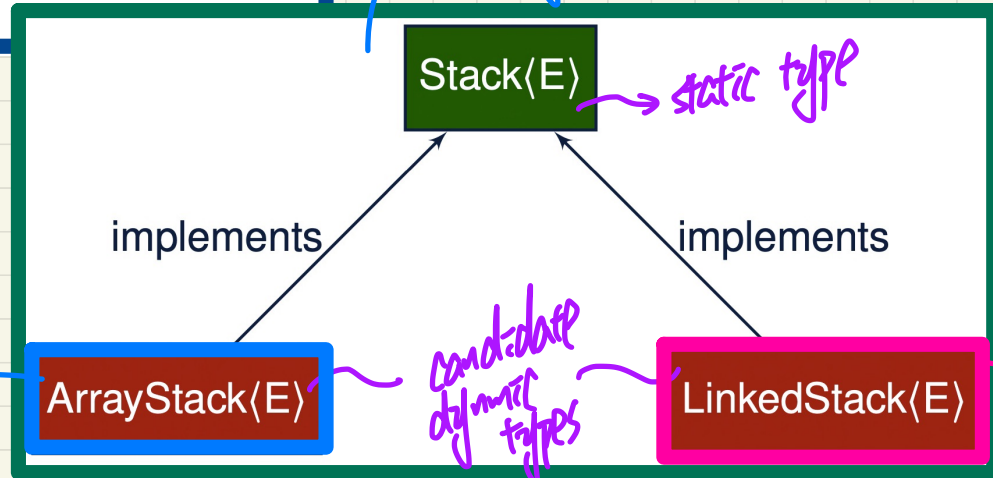
last pushed element
2nd last pushed element

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 inferable by a pre-set size

SZ:
pop: O(1)
unless DLL
↓
SL:
all ops. O(1)

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;
    }
}
```

ArrayStack<String>

↳ instantiates E for Stack:

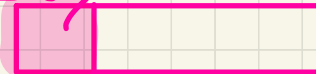
Stack<String>

(E[]) Object[_____]

↳ what you have to write in Java.

element of stack
top.

data → 0



goal: treat this first item as the top.

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

↳ limitation: fixed size

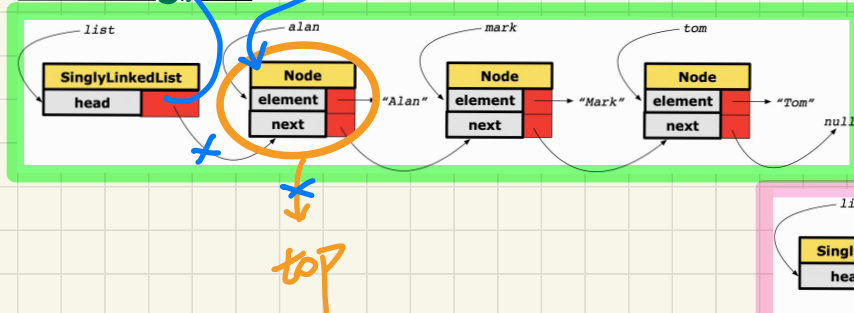
Implementing the Stack ADT using a SLL

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

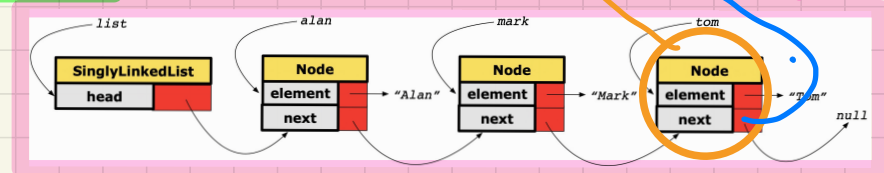
```
public class LinkedStack<E> implements Stack<E> {
    private SinglyLinkedList<E> list;
    ...
}
```

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

Strategy 1



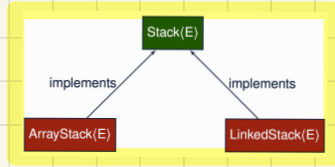
Strategy 2



Stack ADT: Testing Alternative Implementations

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

X 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

AS

LS

data

0 1 2 ... 999

"Alan"

"Mark"

SL

sh

```

@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());
}
    
```

version in AS.

version in LS. class of Stack?

DT changes

dynamic type

is the DT of S a descendant * . **

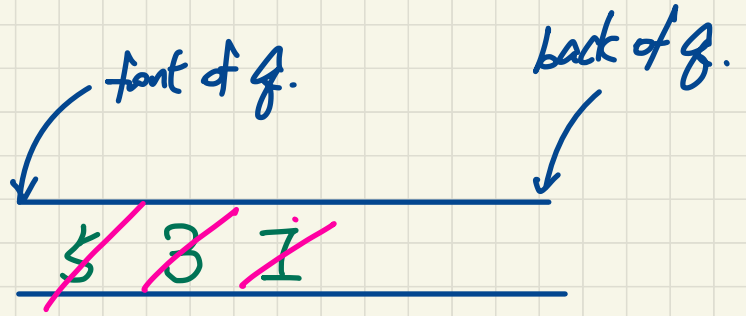
		*	**
S instantiated	Stack	T	T
S instantiated	ArrayStack	T	F
S instantiated	LinkedStack	F	T

Makeup Lecture (Written Test)

Queues, Circular Arrays, Deque

Queue ADT: Illustration

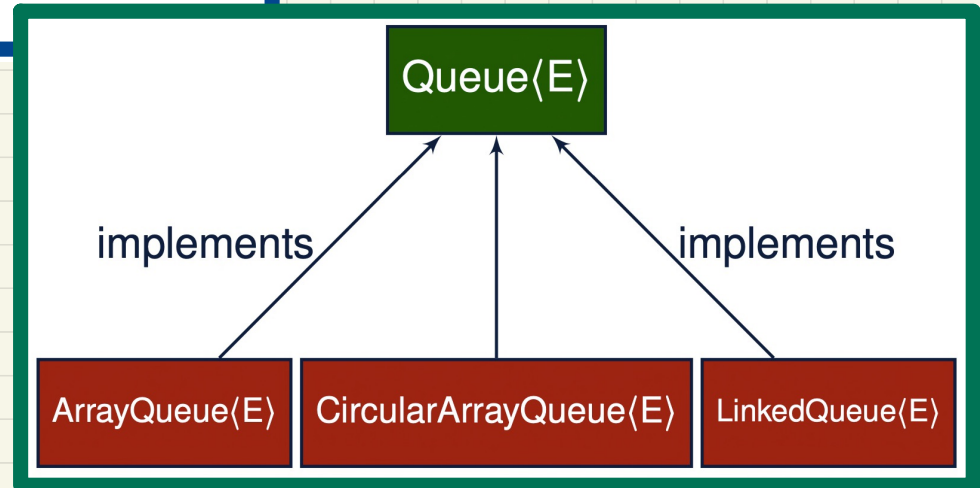
	isEmpty	size	first
<u>new queue</u>	T	0	n.a.
enqueue(<u>5</u>)	F	1	5
enqueue(<u>3</u>)	F	2	5
enqueue(<u>1</u>)	F	3	5
<u>rm. 5</u> dequeue	F	2	3
<u>rm. 3</u> dequeue	F	1	1
<u>rm. 1</u> dequeue	T	0	n.a.



First-In First-Out (FIFO)

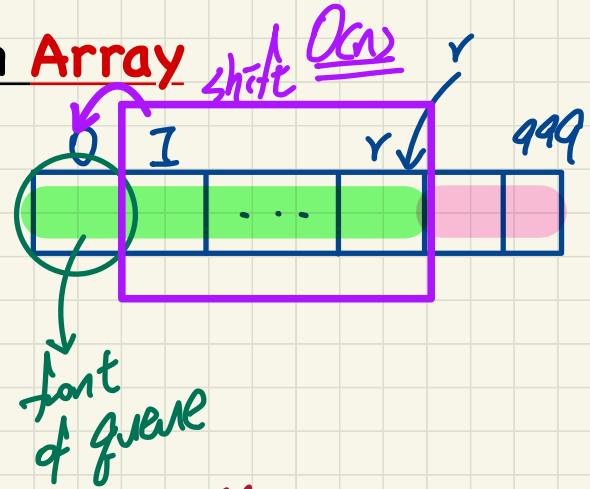
Implementing the Queue ADT in Java: Architecture

```
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 */ }
        else { return data[0]; }  $O(1)$ 
    }
    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;
        }
    }
}
```



Limitation:
no resizing.

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

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

Implementing the Queue ADT using a SLL

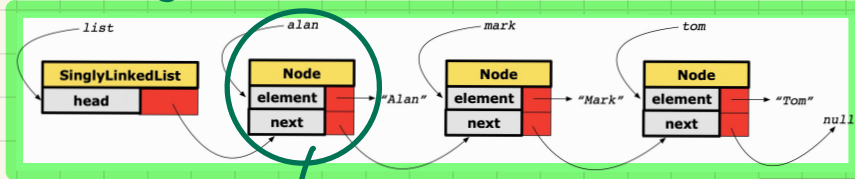
```
public class LinkedQueue<E> implements Queue<E> {  
    private SinglyLinkedList<E> list;  
    ...  
}
```

$O(n)$

① use SL instead
② use DLL instead

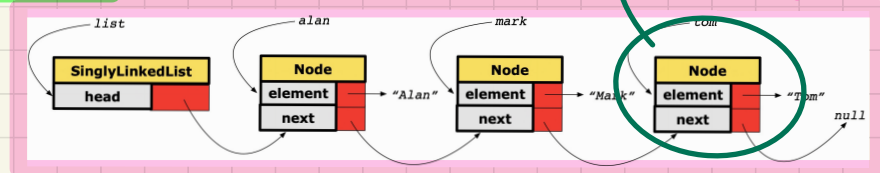
Queue Method	Singly-Linked List Method	
	Strategy 1	Strategy 2
size	list.size	list.size
isEmpty	list.isEmpty	list.isEmpty
first	list.first	list.last
enqueue	list.addLast	list.addFirst
dequeue	list.removeFirst	list.removeLast

Strategy 1



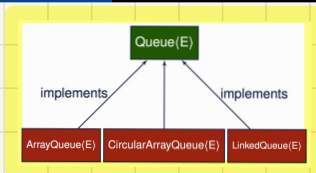
first of queue

Strategy 2



first of queue.

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;
        }
    }
}
```

dynamic 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 LinkedList<>();
    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());
}
```

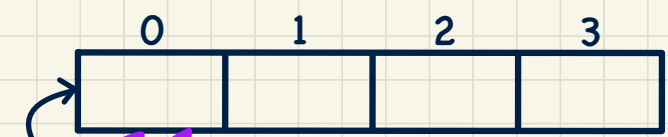
polymorphism

Size of queue vs. size of array % modulo

Implementing the Queue ADT using a Circular Array

Assume: A circular array of length 4.

Phase 0: Empty Queue q



$f=0$
 $r=0$

Empty Queue?

$r == f$

Phase 1: enqueue 3 elements

$data[r] = item$
 $r++$



Queue Full?
when r points to 3
is the only empty slot.

$(r+1) \% N$
 $\frac{3}{4}$

Size: $r > f$

empty slots before this index
slots before this index

Size: $r < f$
 $r + (N - f)$

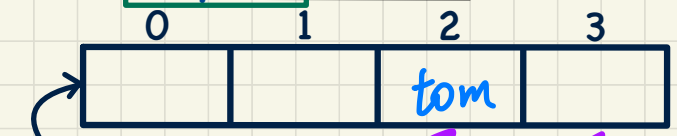
1. fix-sized (no resizing)

Circular Array

2. flexible for performing "dequeue"

$data[f] = null$
 $f++$

Phase 2: dequeue 2 times

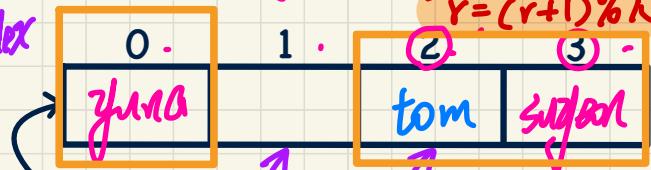


Size: $3 - 2 = 1$

Size of array: 4 (fixed)
Size of q: 1

Phase 3: enqueue 2 elements

$data[r] = item$
 $r++$
 $r = (r+1) \% N$



$[0, r-1]$

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

$[f, N-1]$

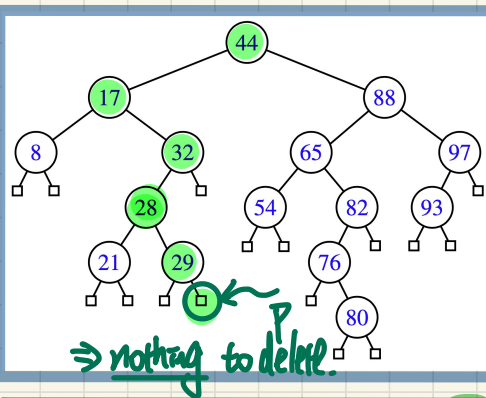
$(N-1) - f + 1 = N - f$

Makeup Lecture (ProgTest2)

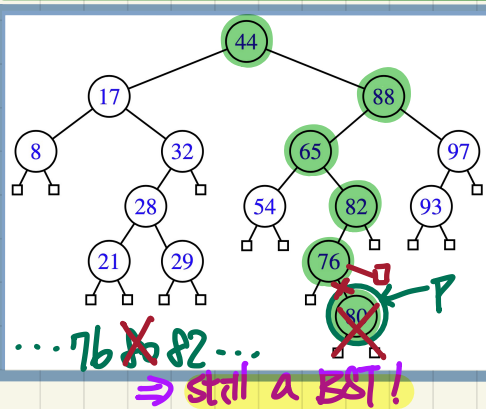
BST Deletions, Constructing Heap, Array-Based Implementations of BTs

Visualizing BST Operation: Deletion

Case 1: Delete Entry with Key 31

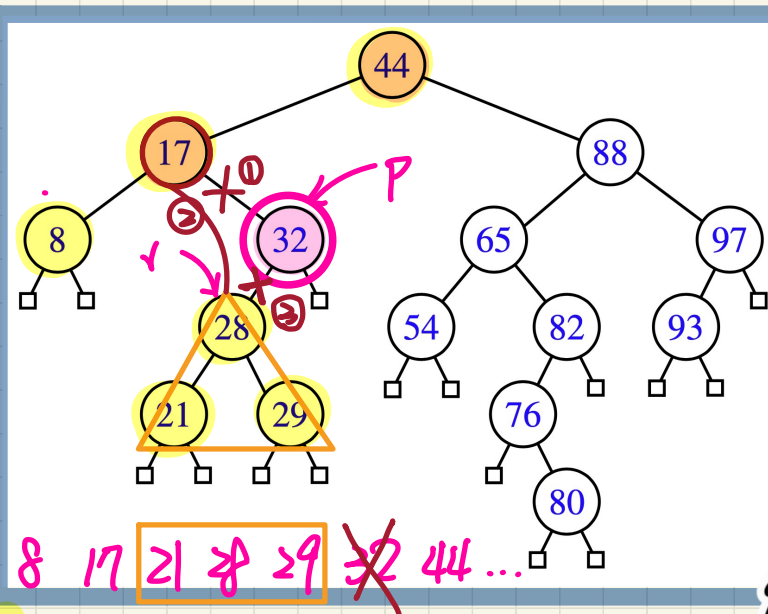


Case 2: Delete Entry with Key 80



orphan subtree:
a subtree rooted at an internal child node

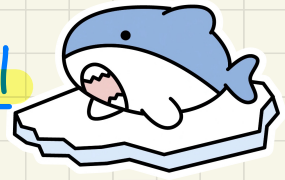
Case 3: Delete Entry with Key 32



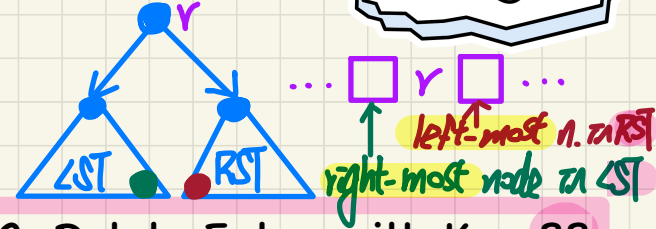
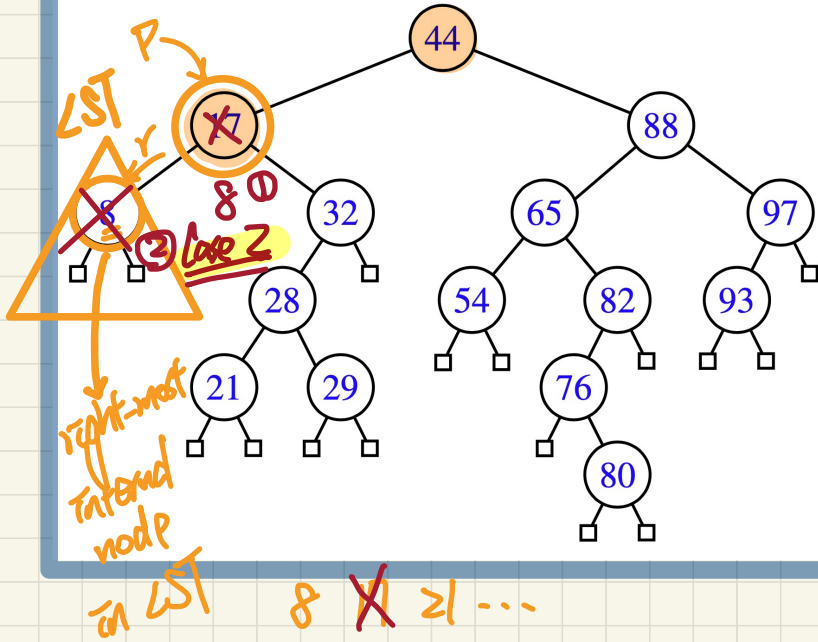
8 17 21 28 29 ~~32~~ 44 ...



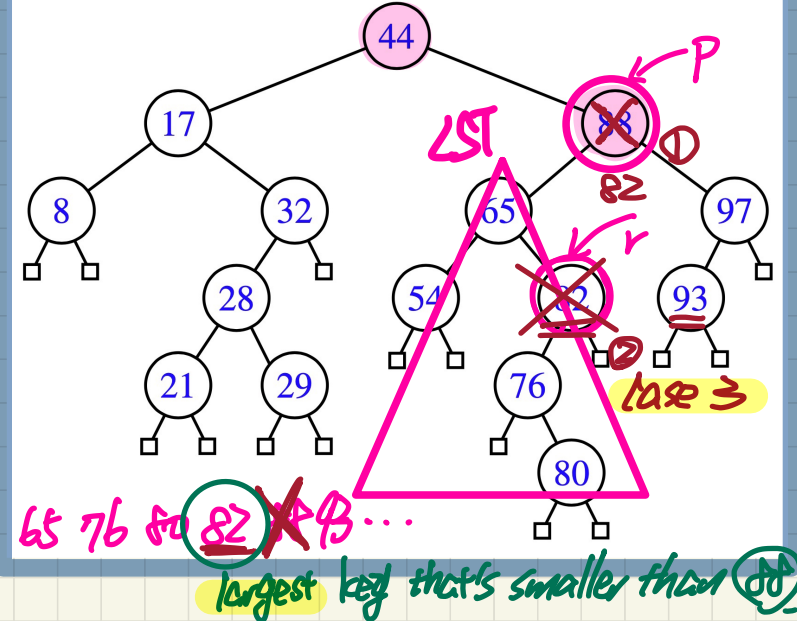
In-Order Traversal



Case 4.1: Delete Entry with Key 17



Case 4.2: Delete Entry with Key 88



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
 $* 1 + 2 + 2^2 + \dots + 2^{h-1} \leq \lg n$
 # up-heap building steps
 $\leq \lg n$
 $1 + 2 + 2^2 + \dots + 2^{h-1} \leq \lg n$
 $1 + 2 + 2^2 + \dots + 2^{h-1} \leq \lg n$

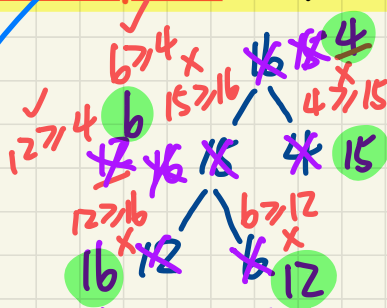
Exercise: Build a **heap** out of the following 15 keys:

<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

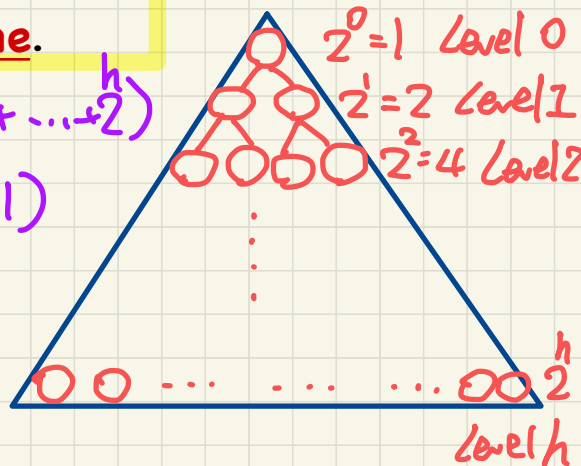


$$* \leq 1 + \lg_2 n \cdot (2^1 + 2^2 + \dots + 2^{h-1})$$

$$= 1 + \lg_2 n \cdot (n - 1)$$

$$O(n \cdot \lg n)$$

Exercise: Complete inserting the remaining keys to the heap.



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.

$$N = 2^{h+1} - 1 \text{ for some height } h \geq 1$$

$$[h = (\log(N + 1)) - 1]$$

- 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.

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>

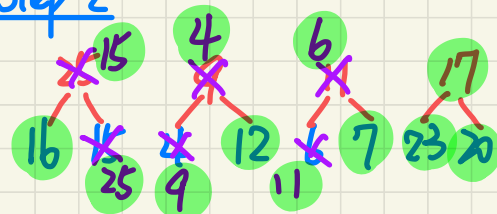
Assumption: Key values supplied all at once.

50% Step 1

8 heaps, size 1, height 0

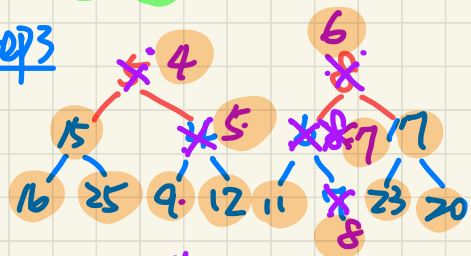
16 15 4 12 6 7 23 20

Step 2



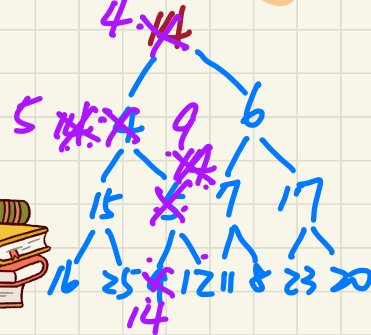
25%

Step 3

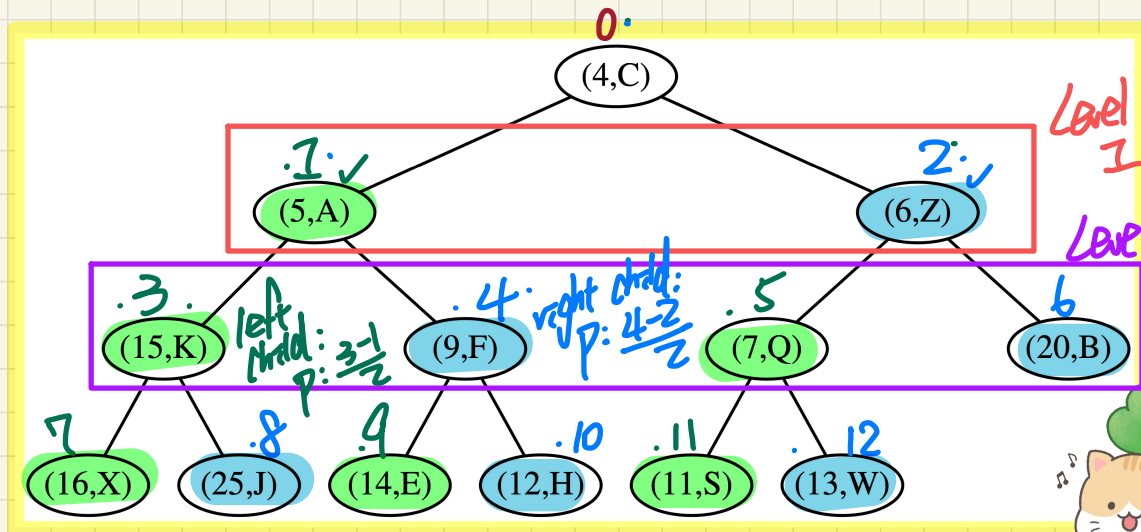


12.5%

Step



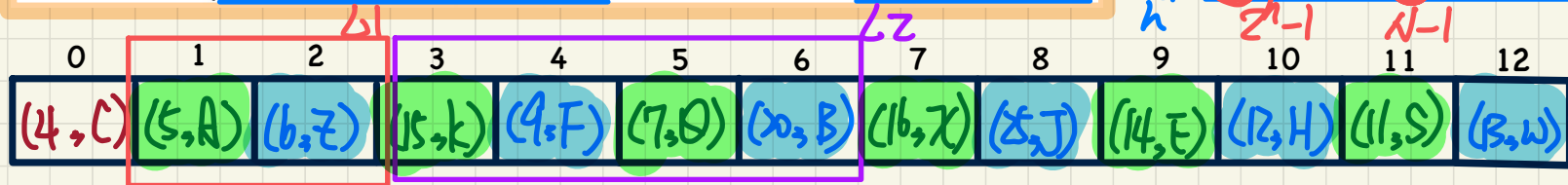
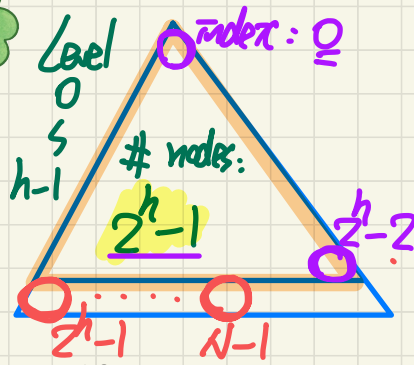
Array-Based Representation of a Complete BT



Exercise

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

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



I hope you enjoyed learning with me 



All the best to you ! 