Recursion



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CHEN-WEI WANG



• Fantastic resources for sharpening your recursive skills for the exam:

http://codingbat.com/java/Recursion-1

http://codingbat.com/java/Recursion-2

• The *best* approach to learning about recursion is via a functional programming language:

Haskell Tutorial: https://www.haskell.org/tutorial/

Recursion: Principle



- *Recursion* is useful in expressing solutions to problems that can be *recursively* defined:
 - Base Cases: Small problem instances immediately solvable.
 - Recursive Cases:
 - Large problem instances not immediately solvable.
 - Solve by reusing *solution(s)* to strictly smaller problem instances.
- Similar idea learnt in high school: [mathematical induction]
- Recursion can be easily expressed programmatically in Java:

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

- In the body of a method *m*, there might be *a call or calls to m itself*.
- Each such self-call is said to be a recursive call.
- ° Inside the execution of m(i), a recursive call m(j) must be that j < i.

Tracing Method Calls via a Stack



- When a method is called, it is *activated* (and becomes *active*) and *pushed* onto the stack.
- When the body of a method makes a (helper) method call, that (helper) method is *activated* (and becomes *active*) and *pushed* onto the stack.
 - \Rightarrow The stack contains activation records of all *active* methods.
 - Top of stack denotes the current point of execution .
 - Remaining parts of stack are (temporarily) suspended.
- When entire body of a method is executed, stack is *popped*.
 - ⇒ The current point of execution is returned to the new top of stack (which was suspended and just became active).
- Execution terminates when the stack becomes empty.

Recursion: Factorial (1)



• Recall the formal definition of calculating the *n* factorial:

$$n! = \begin{cases} 1 & \text{if } n = 0\\ n \cdot (n-1) \cdot (n-2) \cdots 3 \cdot 2 \cdot 1 & \text{if } n \ge 1 \end{cases}$$

• How do you define the same problem *recursively*?

$$n! = \begin{cases} 1 & \text{if } n = 0\\ n \cdot (n-1)! & \text{if } n \ge 1 \end{cases}$$

• To solve *n*!, we combine *n* and the solution to (*n* - 1)!.

```
int factorial (int n) {
    int result;
    if(n == 0) { /* base case */ result = 1; }
    else { /* recursive case */
        result = n * factorial (n - 1);
    }
    return result;
}
```


Common Errors of Recursive Methods

• Missing Base Case(s).



Base case(s) are meant as points of stopping growing the runtime stack.

• Recursive Calls on Non-Smaller Problem Instances.



Recursive calls on *strictly smaller* problem instances are meant for moving gradually towards the base case(s).

• In both cases, a StackOverflowException will be thrown.

Recursion: Factorial (2)





Recursion: Factorial (3)



- When running *factorial(5)*, a *recursive call factorial(4)* is made. Call to *factorial(5)* suspended until *factorial(4)* returns a value.
- When running *factorial*(4), a *recursive call factorial*(3) is made. Call to *factorial*(4) suspended until *factorial*(3) returns a value.
- *factorial(0)* returns 1 back to *suspended call factorial(1)*.
- factorial(1) receives 1 from factorial(0), multiplies 1 to it, and returns 1 back to the suspended call factorial(2).
- factorial(2) receives 1 from factorial(1), multiplies 2 to it, and returns 2 back to the suspended call factorial(3).
- factorial(3) receives 2 from factorial(1), multiplies 3 to it, and returns 6 back to the suspended call factorial(4).
- factorial(4) receives 6 from factorial(3), multiplies 4 to it, and returns 24 back to the suspended call factorial(5).
- factorial(5) receives 24 from factorial(4), multiplies 5 to it, and returns 120 as the result.

Recursion: Factorial (4)



- When the execution of a method (e.g., *factorial(5)*) leads to a nested method call (e.g., *factorial(4)*):
 - The execution of the current method (i.e., *factorial(5)*) is suspended, and a structure known as an *activation record* or *activation frame* is created to store information about the

progress of that method (e.g., values of parameters and local variables).

- The nested methods (e.g., *factorial(4)*) may call other nested methods (*factorial(3)*).
- When all nested methods complete, the activation frame of the *latest suspended* method is re-activated, then continue its execution.
- What kind of data structure does this activation-suspension process correspond to? [LIFO Stack]

Recursion: Fibonacci (1)



Recall the formal definition of calculating the n_{th} number in a Fibonacci series (denoted as F_n), which is already itself recursive:

$$F_n = \begin{cases} 1 & \text{if } n = 1 \\ 1 & \text{if } n = 2 \\ F_{n-1} + F_{n-2} & \text{if } n > 2 \end{cases}$$

```
int fib (int n) {
    int result;
    if(n == 1) { /* base case */ result = 1; }
    else if(n == 2) { /* base case */ result = 1; }
    else { /* recursive case */
        result = fib (n - 1) + fib (n - 2);
    }
    return result;
}
```

Recurcion: Fibonacci (2)

=



[fib(5) = fib(4) + fib(3); push(fib(5)); suspended: (fib(5)); active: fib(4)] fib(4) + fib(3) = $\{fib(4) = fib(3) + fib(2); suspended: (fib(4), fib(5)); active: fib(3)\}$ (fib(3) + fib(2)) + fib(3){fib(3) = fib(2) + fib(1); suspended: (fib(3), fib(4), fib(5)); active: fib(2)} = ((fib(2) + fib(1)) + fib(2)) + fib(3){fib(2) returns 1; suspended: (fib(3), fib(4), fib(5)); active: fib(1)} = ((1 + fib(1)) + fib(2)) + fib(3){fib(1) returns 1; suspended: (fib(3), fib(4), fib(5)); active: fib(3)} = ((1+1) + fib(2)) + fib(3){fib(3) returns 1 + 1; pop(); suspended: (fib(4), fib(5)); active: fib(2)} = (2 + fib(2)) + fib(3){fib(2) returns 1; suspended: (fib(4), fib(5)); active: fib(4)} = (2+1) + fib(3){fib(4) returns 2 + 1; pop(); suspended: (fib(5)); active: fib(3)} = 3 + fib(3) $\{fib(3) = fib(2) + fib(1); suspended: (fib(3), fib(5)); active: fib(2)\}$ 3 + (fib(2) + fib(1)){fib(2) returns 1; suspended: (fib(3), fib(5)); active: fib(1)} = 3 + (1 + fib(1)){fib(1) returns 1; suspended: (fib(3), fib(5)); active: fib(3)} = 3 + (1 + 1){fib(3) returns 1 + 1; pop() ; suspended: (fib(5)); active: fib(5)} = 3 + 2{fib(5) returns 3 + 2; suspended: ()} = 11 of 52⁵

Java Library: String



```
public class StringTester
 public static void main(String[] args) {
   String s = "abcd";
   System.out.println(s.isEmpty()); /* false */
   /* Characters in index range [0, 0) */
   String t0 = s.substring(0, 0);
   System.out.println(t0); /* "" */
   /* Characters in index range [0, 4) */
   String t1 = s.substring(0, 4);
   System.out.println(t1); /* "abcd" */
   /* Characters in index range [1, 3) */
   String t2 = s.substring(1, 3);
   System.out.println(t2); /* "bc" */
   String t3 = s.substring(0, 2) + s.substring(2, 4);
   System.out.println(s.equals(t3)); /* true */
   for(int i = 0; i < s.length(); i ++) {</pre>
    System.out.print(s.charAt(i));
   System.out.println();
```

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Problem: A palindrome is a word that reads the same forwards and backwards. Write a method that takes a string and determines whether or not it is a palindrome.

System.out.println(isPalindrome("")); true System.out.println(isPalindrome("a")); true System.out.println(isPalindrome("madam")); true System.out.println(isPalindrome("racecar")); true System.out.println(isPalindrome("man")); false

Base Case 1: Empty string \longrightarrow Return *true* immediately. **Base Case 2**: String of length 1 \longrightarrow Return *true* immediately. **Recursive Case**: String of length $\ge 2 \longrightarrow$

• 1st and last characters match, and

the rest (i.e., middle) of the string is a palindrome.

Recursion: Palindrome (2)



```
boolean isPalindrome (String word) {
 if(word.length() == 0 || word.length() == 1) {
  /* base case */
   return true;
 else {
  /* recursive case */
   char firstChar = word.charAt(0);
   char lastChar = word.charAt(word.length() - 1);
   String middle = word.substring(1, word.length() - 1);
   return
       firstChar == lastChar
      /* See the API of java.lang.String.substring. */
      && isPalindrome (middle);
```

Recursion: Reverse of String (1)



Problem: The reverse of a string is written backwards. Write a method that takes a string and returns its reverse.

System.out.println(reverseOf("")); /* "" */
System.out.println(reverseOf("a")); "a"
System.out.println(reverseOf("ab")); "ba"
System.out.println(reverseOf("abc")); "cba"
System.out.println(reverseof("abcd")); "dcba"

Base Case 1: Empty string \rightarrow Return *empty string*.

Base Case 2: String of length $1 \rightarrow$ Return *that string*.

Recursive Case: String of length $\ge 2 \longrightarrow$

1) Head of string (i.e., first character)

2) Reverse of the tail of string (i.e., all but the first character)

Return the concatenation of 2) and 1).



Recursion: Reverse of a String (2)

```
String reverseOf (String s) {
 if(s.isEmpty()) { /* base case 1 */
  return "";
 else if(s.length() == 1) { /* base case 2 */
  return s:
 else { /* recursive case */
   String tail = s.substring(1, s.length());
   String reverseOfTail = reverseOf (tail);
  char head = s.charAt(0);
   return reverseOfTail + head;
```

Recursion: Number of Occurrences (1)



Problem: Write a method that takes a string s and a character c, then count the number of occurrences of c in s.

System.out.println(occurrencesOf(", 'a')); /* 0 */ System.out.println(occurrencesOf("a", 'a')); /* 1 */ System.out.println(occurrencesOf("b", 'a')); /* 0 */ System.out.println(occurrencesOf("baaba", 'a')); /* 3 */ System.out.println(occurrencesOf("baaba", 'b')); /* 2 */ System.out.println(occurrencesOf("baaba", 'c')); /* 0 */

Base Case: Empty string \longrightarrow Return 0.

Recursive Case: String of length $\geq 1 \longrightarrow$

1) Head of s (i.e., first character)

2) Number of occurrences of $_{\rm C}$ in the $\underline{tail \mbox{ of } \underline{s}}$ (i.e., all but the first character)

If head is equal to c, return 1 + 2).

If head is not equal to c, return 0 + 2).



Recursion: Number of Occurrences (2)

<pre>int occurrencesOf (String s, char c) {</pre>
<pre>if(s.isEmpty()) {</pre>
/* Base Case */
return 0;
}
else {
/* Recursive Case */
<pre>char head = s.charAt(0);</pre>
<pre>String tail = s.substring(1, s.length());</pre>
$if(head == c) \{$
<pre>return 1 + occurrencesOf (tail, c);</pre>
}
else {
<pre>return 0 + occurrencesOf (tail, c);</pre>
}
}
}
<pre>else { return 0 + occurrencesOf (tail, c); } }</pre>

Making Recursive Calls on an Array

- Recursive calls denote solutions to *smaller* sub-problems.
- Naively, explicitly create a new, smaller array:

```
void m(int[] a) {
    if(a.length == 0) { /* base case */ }
    else if(a.length == 1) { /* base case */ }
    else {
        int[] sub = new int[a.length - 1];
        for(int i = 1]; i < a.length; i ++) { sub[0] = a[i - 1]; }
        m(sub) }
</pre>
```

• For *efficiency*, we pass the *reference* of the same array and specify the *range of indices* to be considered:



Recursion: All Positive (1)



Problem: Determine if an array of integers are all positive.

System.out.println(allPositive({})); /* true */
System.out.println(allPositive({1, 2, 3, 4, 5})); /* true */
System.out.println(allPositive({1, 2, -3, 4, 5})); /* false */

Base Case: Empty array → Return *true* immediately.

The base case is *true* \therefore we can *not* find a counter-example (i.e., a number *not* positive) from an empty array. **Recursive Case**: Non-Empty array \longrightarrow

• 1st element positive, and

• the rest of the array is all positive.

Exercise: Write a method boolean somePostive (int [] a) which recursively returns true if there is some positive number in a, and false if there are no positive numbers in a.
Hint: What to return in the base case of an empty array? [false]
∴ No witness (i.e., a positive number) from an empty array

Recursion: All Positive (2)



```
boolean allPositive(int[] a) {
 return allPositiveHelper (a, 0, a.length - 1);
boolean allPositiveHelper (int[] a, int from, int to) {
 if (from > to) { /* base case 1: empty range */
  return true;
 else if (from == to) { /* base case 2: range of one element */
   return a[from] > 0;
 else { /* recursive case */
   return a[from] > 0 && allPositiveHelper (a, from + 1, to);
```

Recursion: Is an Array Sorted? (1)



Problem: Determine if an array of integers are sorted in a non-descending order.

```
System.out.println(isSorted({})); true
System.out.println(isSorted({1, 2, 2, 3, 4})); true
System.out.println(isSorted({1, 2, 2, 1, 3})); false
```

Base Case: Empty array \longrightarrow Return *true* immediately. The base case is *true* \therefore we can *not* find a counter-example (i.e., a pair of adjacent numbers that are *not* sorted in a non-descending order) from an empty array. **Recursive Case**: Non-Empty array \longrightarrow

 $\circ~$ 1st and 2nd elements are sorted in a non-descending order, and

the rest of the array, starting from the 2nd element,

are sorted in a non-descending positive .

Recursion: Is an Array Sorted? (2)



```
boolean isSorted(int[] a) {
 return isSortedHelper (a, 0, a.length - 1);
boolean isSortedHelper (int[] a, int from, int to) {
 if (from > to) { /* base case 1: empty range */
   return true;
 else if (from == to) { /* base case 2: range of one element */
   return true;
 else {
   return a[from] <= a[from + 1]
    && isSortedHelper (a, from + 1, to);
```

Recursive Methods: Correctness Proofs



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

- Via mathematical induction, prove that allPosH is correct: Base Cases
 - In an empty array, there is no non-positive number ∴ result is *true*. [L3]
 - In an array of size 1, the only one elements determines the result. [L4] Inductive Cases
 - Inductive Hypothesis: allPosH(a, from + 1, to) returns *true* if a[from + 1], a[from + 2], ..., a[to] are all positive; *false* otherwise.
 - allPosH(a, from, to) should return *true* if: 1) a[from] is positive;
 and 2) a[from + 1], a[from + 2], ..., a[to] are all positive.
 - By I.H., result is a[from] > 0 ^ allPosH(a, from + 1, to) . [L5]
- allPositive(a) is correct by invoking allPosH(a, 0, a.length - 1), examining the entire array. [L1]

Recursion: Binary Search (1)



Searching Problem

Input: A number *a* and a sorted list of *n* numbers $\langle a_1, a_2, \ldots, a_n \rangle$ such that $a'_1 \leq a'_2 \leq \ldots \leq a'_n$ **Output:** Whether or not *a* exists in the input list

An Efficient Recursive Solution

Base Case: Empty list \longrightarrow *False*.

Recursive Case: List of size $\geq 1 \longrightarrow$

- Compare the middle element against a.
 - All elements to the left of *middle* are $\leq a$
 - All elements to the right of *middle* are $\geq a$
- If the *middle* element *is* equal to $a \rightarrow True$.
- If the *middle* element *is not* equal to *a*:
 - If *a* < *middle*, recursively find *a* on the left half.
 - If a > middle, recursively find a on the right half.

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Recursion: Binary Search (2)



```
boolean binarySearch(int[] sorted, int key) {
 return binarySearchHelper (sorted, 0, sorted.length - 1, key);
boolean binarySearchHelper (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] == kev; }
 else {
   int middle = (from + to) / 2;
   int middleValue = sorted[middle];
   if(key < middleValue)</pre>
    return binarySearchHelper (sorted, from, middle - 1, key);
   else if (key > middleValue) {
    return binarySearchHelper (sorted, middle + 1, to, key);
  else { return true; }
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```



We use T(n) to denote the running time function of a binary search, where *n* is the size of the input array.

$$\begin{cases} T(0) &= 1 \\ T(1) &= 1 \\ T(n) &= T(\frac{n}{2}) + 1 & \text{where } n \ge 2 \end{cases}$$

To solve this recurrence relation, we study the pattern of T(n) and observe how it reaches the *base case(s)*.

Running Time: Binary Search (2)



Without loss of generality, assume $n = 2^{i}$ for some non-negative *i*.

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

= $(T(\frac{n}{4}) + 1) + 1$
= $(T(\frac{n}{4}) + 1) + 1$
= $((T(\frac{n}{8}) + 1) + 1) + 1$
 $T(\frac{n}{4})$ = $T(\frac{n}{4}) + 1$
= $T(\frac{n}{2\log n}) = T(1)$ interval $T(\frac{n}{2\log n}) = T(1)$

 \therefore *T*(*n*) is *O*(*log n*)

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Tower of Hanoi: Specification





- Given: A tower of 8 disks, initially stacked in decreasing size on one of 3 pegs
- Rules:
 - Move only one disk at a time
 - Never move a larger disk onto a smaller one
- *Problem*: Transfer the entire tower to one of the other pegs.



The general, recursive solution requires 3 steps:

- **1.** Transfer the *n* 1 smallest disks to a different peg.
- 2. Move the largest to the remaining free peg.
- **3.** Transfer the n 1 disks back onto the largest disk.

Tower of Hanoi in Java (1)



```
void towerOfHanoi(String[] disks) {
 tohHelper (disks, 0, disks.length - 1, 1, 3);
void tohHelper(String[] disks, int from, int to, int ori, int des) {
 if(from > to) {
 else if(from == to) {
  print("move " + disks[to] + " from " + ori + " to " + des);
 else {
   int intermediate = 6 - ori - des:
   tohHelper (disks, from, to - 1, ori, intermediate);
   print("move" + disks[to] + "from" + ori + "to" + des);
   tohHelper (disks, from, to - 1, intermediate, des);
```

• tohHelper(disks, from, to, ori, des) moves disks {disks[from], disks[from + 1],..., disks[to]} from peg ori to peg des.

• Peg id's are 1, 2, and $3 \Rightarrow$ The intermediate one is 6 - ori - des. 31 of 52

Tower of Hanoi in Java (2)



Say ds (disks) is $\{A, B, C\}$, where A < B < C.



Tower of Hanoi in Java (3)





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Running Time: Tower of Hanoi (1)



- Generalize the problem by considering *n* disks.
- Let *T*(*n*) denote the number of moves required to to transfer *n* disks from one to another under the rules.
- Recall the general solution pattern:
 - **1.** Transfer the *n* 1 smallest disks to a different peg.
 - 2. Move the largest to the remaining free peg.
 - 3. Transfer the *n* 1 disks back onto the largest disk.
- We end up with the following recurrence relation that allows us to compute *T_n* for any *n* we like:

$$\begin{pmatrix} T(1) = 1 \\ T(n) = 2 \times T(n-1) + 1 & \text{where } n > 0 \end{pmatrix}$$

• To solve this recurrence relation, we study the pattern of T(n) and observe how it reaches the base case(s).

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Running Time: Tower of Hanoi (2)

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

= 2 × (2 × T(n-2) + 1) + 1
= 2 × (2 × (2 × T(n-3) + 1) + 1) + 1
= 2 × (2 × (2 × ((2 × T(n-3) + 1) + 1) + 1) + 1)
= ...
= 2 × (2 × (2 × ((...×(2 × T(1) + 1) + ...)) + 1) + 1) + 1)
= 2^{n-1} + (n-1)

 $\begin{array}{c} \therefore T(n) \text{ is } O(2^n) \\ {}_{35 \text{ of } 52} \end{array}$

Recursion: Merge Sort



Sorting Problem

Input: A list of *n* numbers $\langle a_1, a_2, \ldots, a_n \rangle$

Output: A permutation (reordering) $\langle a'_1, a'_2, \ldots, a'_n \rangle$ of the input list such that $a'_1 \leq a'_2 \leq \ldots \leq a'_n$

• Recursive Solution

Base Case 1: Empty list \rightarrow Automatically sorted.

Base Case 2: List of size $1 \longrightarrow$ Automatically sorted.

Recursive Case: List of size $\ge 2 \longrightarrow$

- Split the list into two (unsorted) halves: L and R;
- Recursively sort L and R: sortedL and sortedR;
- Return the *merge* of *sortedL* and *sortedR*.

Recursion: Merge Sort in Java (1)



[O(n)]

```
/* 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 i = 0;
  while(i < L.size() && j < R.size()) {</pre>
    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;
```



Recursion: Merge Sort in Java (2)

```
public List<Integer> sort (List<Integer> list) {
 List<Integer> sortedList;
 if(list.size() == 0) { sortedList = new ArrayList<>(); }
 else if(list.size() == 1) {
   sortedList = new ArrayList<>();
   sortedList.add(list.get(0));
 else {
   int middle = list.size() / 2;
   List<Integer> left = list.subList(0, middle);
   List<Integer> right = list.subList(middle, list.size());
   List<Integer> sortedLeft = sort (left);
   List<Integer> sortedRight = sort (right);
   sortedList = | merge (sortedLeft, sortedRight);
 return sortedList:
  RT(sort) = RT(merge) × # splits until size 0 or 1
                                           O(\log n)
                  O(n)
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```



Recursion: Merge Sort Example (1)



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Recursion: Merge Sort Example (2)



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Recursion: Merge Sort Example (4)





Recursion: Merge Sort Example (5)



Recursion: Merge Sort Running Time (1)



Base Case 1: Empty list \rightarrow Automatically sorted. [O(1)] **Base Case 2**: List of size 1 \rightarrow Automatically sorted. [O(1)] **Recursive Case**: List of size $\geq 2 \rightarrow$ \circ Split the list into two (unsorted) halves: *L* and *R*; [O(1)] \circ **Recursively** sort *L* and *R*: sortedL and sortedR; How many times to split until *L* and *R* have size 0 or 1? [O(log n)]

• Return the *merge* of *sortedL* and *sortedR*.

RT

```
= (RT each RC)
```

```
\times (# RCs)
```

```
(RT merging sortedL and sortedR) × (# splits until bases)
```

```
= n \cdot \log n
```

=

Recursion: Merge Sort Running Time (2)



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We use T(n) to denote the running time function of a merge sort, where *n* is the size of the input list.

$$\begin{cases} T(0) = 1 \\ T(1) = 1 \\ T(n) = 2 \cdot T(\frac{n}{2}) + n \text{ where } n \ge 2 \end{cases}$$

To solve this recurrence relation, we study the pattern of T(n) and observe how it reaches the *base case(s)*.

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Recursion: Merge Sort Running Time (4)



Without loss of generality, assume $n = 2^{i}$ for some non-negative *i*.

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

$$= \underbrace{2 \times (2 \times T(\frac{n}{4}) + \frac{n}{2}) + n}_{2 \text{ terms}}$$

$$= \underbrace{2 \times (2 \times (2 \times T(\frac{n}{8}) + \frac{n}{4}) + \frac{n}{2}) + n}_{3 \text{ terms}}$$

$$= \underbrace{2 \times (2 \times (2 \times T(\frac{n}{8}) + \frac{n}{4}) + \frac{n}{2}) + n}_{\log n \text{ terms}}$$

$$= \underbrace{2 \times (2 \times (2 \times \dots \times (2 \times T(\frac{n}{2^{\log n}}) + \frac{n}{2^{\log n-1}}) + \dots + \frac{n}{4}) + \frac{n}{2}) + n}_{\log n \text{ terms}}$$

$$= 2^{\log n} + (\underbrace{2 \cdot \frac{n}{2} + 2^2 \cdot \frac{n}{4} + \dots + 2^{\log n-1} \cdot \frac{n}{2^{\log n-1}} + n}_{\log n \text{ terms}})$$

$$\therefore T(n) \text{ is } O(n \cdot \log n)$$

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Beyond this lecture



• Notes on Recursion:

http://www.eecs.yorku.ca/~jackie/teaching/ lectures/2019/F/EECS2030/slides/EECS2030_F19_ Notes_Recursion.pdf

• API for String:

https://docs.oracle.com/javase/8/docs/api/ java/lang/String.html

• Fantastic resources for sharpening your recursive skills for the exam:

http://codingbat.com/java/Recursion-1
http://codingbat.com/java/Recursion-2

• The *best* approach to learning about recursion is via a functional programming language:

Haskell Tutorial: https://www.haskell.org/tutorial/

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