

Course Survey and Final

- Course survey
 - <https://sakai.rutgers.edu/portal/site/sirs>
- Final
 - Dec 17, 2015: 4:00 PM - 7:00 PM
 - <https://finalexams.rutgers.edu/>

CS111

Introduction to Computer Science

Fall 2015

- Recursion
 - Factorial
 - Fibonacci
 - Palindromes
 - Towers of Hanoi
 - Binary Search
 - Mergesort

A problem divided into smaller identical sub-problems

Some problems can be divided into several sub-problems that are similar to the original problem but smaller in size

Factorial

$$n! = n * n-1 * n-2 * n-3 * \dots * 1$$

$$4! = 4 * 3 * 2 * 1$$

$$3! = 3 * 2 * 1$$

$$2! = 2 * 1$$

$$1! = 1$$

To solve for $n!$
 $n = n * (n-1)!$

Recursion

We can use a *recursive solution* to solve such a problem

- the solution to the problem depends on the solution of the sub-problems (smaller instances of the same problem)

Recursive algorithms

- to solve a given problem, they call themselves recursively

Recursive Factorial Solution

$$n! = n * (n-1)!$$

```
public static int factorial (int n) {  
    if (n == 1) return 1;  
    return n * factorial(n-1);  
}
```

base case

recursive
case

Two cases:

- recursive case
- base case (stopping point)

Recursive Factorial Solution

$$n! = n * (n-1)!$$

```
public static int factorial (int n) {  
    if (n == 1) return 1;  
    return n * factorial(n-1);  
}
```

Call stack for the execution of factorial(5)

```
factorial(5)  
    factorial(4)  
        factorial(3)  
            factorial(2)  
                factorial(1)  
                    return 1  
                return 2*1 = 2  
            return 3*2 = 6  
        return 4*6 = 24  
    return 5*24 = 120
```

Recursive Algorithms Analysis

- To analyze the running time of a recursive algorithm we write the recurrence relation as a function of the input size n

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

- Then we repeat the recurrence to find a pattern that will give us the running time.

Factorial Analysis

```
public static int factorial (int n) {  
    if (n == 1) return 1;  
    return n * factorial(n-1);  
}
```

- Checking the if statement and multiplying by n is $O(1)$
Time for factorial (n) = Time for factorial ($n-1$) + $O(1)$
- Dropping the Big O for the moment, we get the recurrence: $T(n) = T(n-1) + 1$

Factorial Analysis

- Then we repeat the recurrence

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

- The pattern is

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

- Let $k = n$

$T(n) = T(0) + k$ where $T(0) = 1$ which is the base case for $\text{factorial}(0)$

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

Method call and return

- When a method is *called*, it starts up from the *beginning* with a new frame (activation record)
- When a method *calls* a method, the method doing the call *waits*, and its frame is saved
- When a call *returns* to a waiting frame, that invocation activates the waiting frame and it continues from *where it left off*

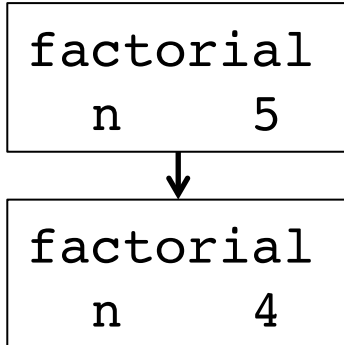
Execution of factorial(5)

factorial
n 5

Call Sequence

`factorial(5)`

Execution of factorial(5)

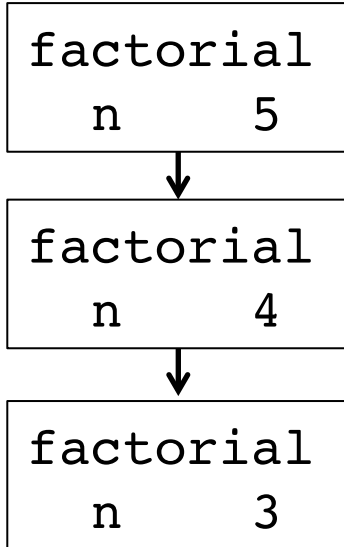


Call Sequence

`factorial(5)`

`factorial(4)`

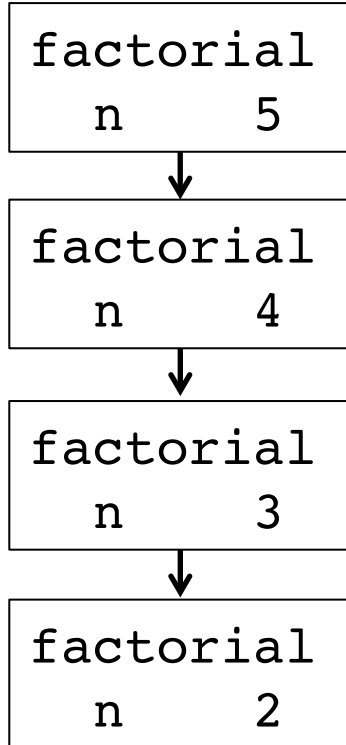
Execution of factorial(5)



Call Sequence

`factorial(5)`
`factorial(4)`
`factorial(3)`

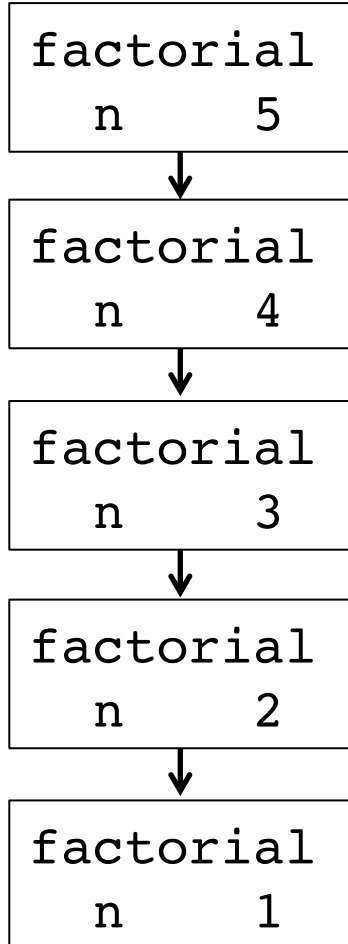
Execution of factorial(5)



Call Sequence

`factorial(5)`
`factorial(4)`
`factorial(3)`
`factorial(2)`

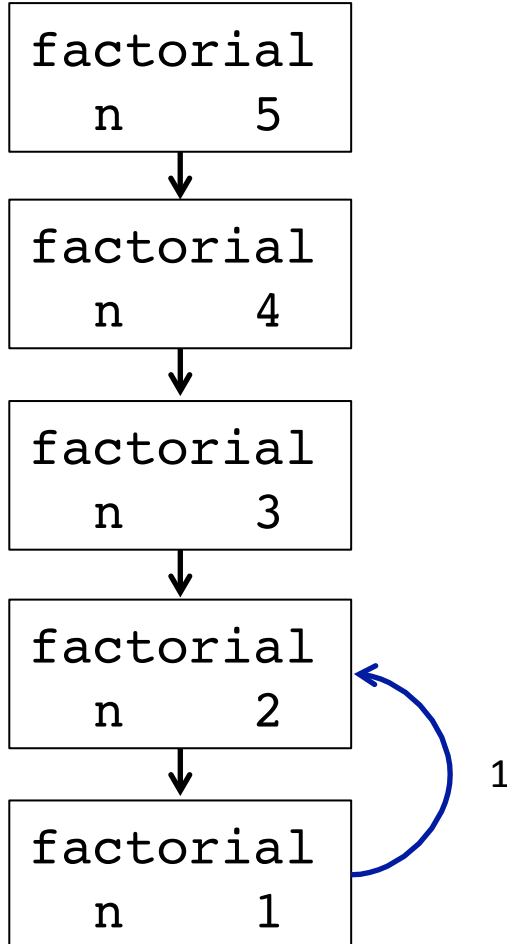
Execution of factorial(5)



Call Sequence

`factorial(5)`
`factorial(4)`
`factorial(3)`
`factorial(2)`
`factorial(1)`

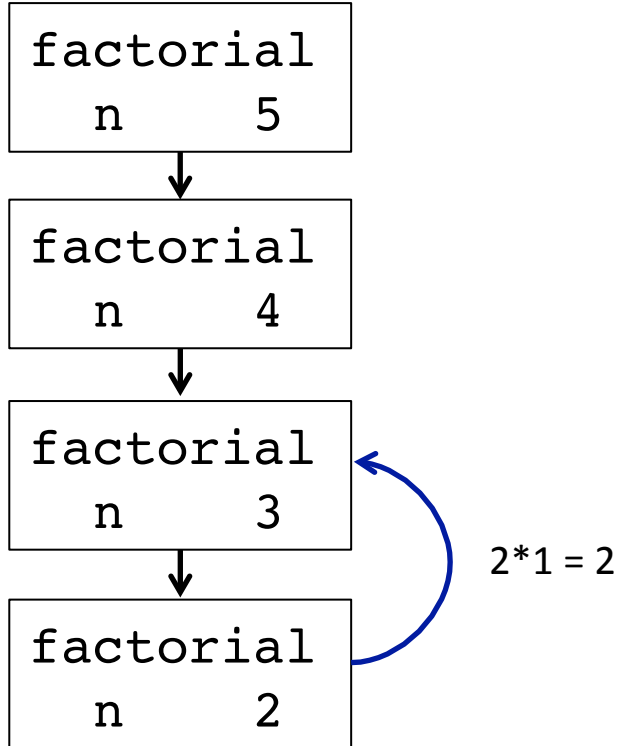
Execution of factorial(5)



Call Sequence

```
factorial(5)  
factorial(4)  
factorial(3)  
factorial(2)  
factorial(1)
```

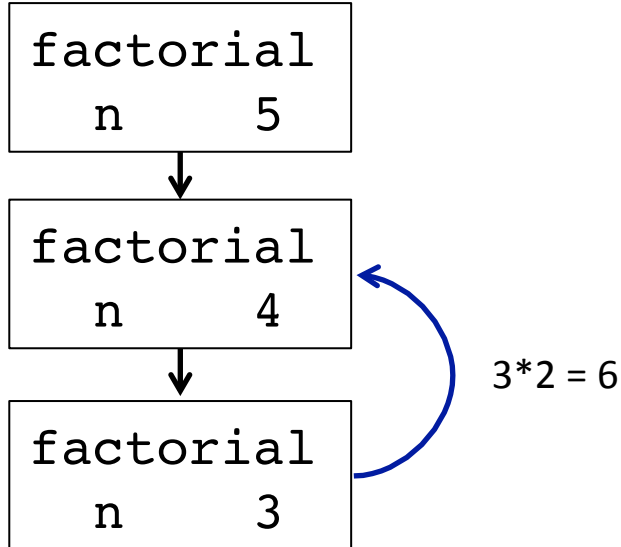

Execution of factorial(5)



Call Sequence

```
factorial(5)  
factorial(4)  
factorial(3)  
factorial(2)  
factorial(1)
```

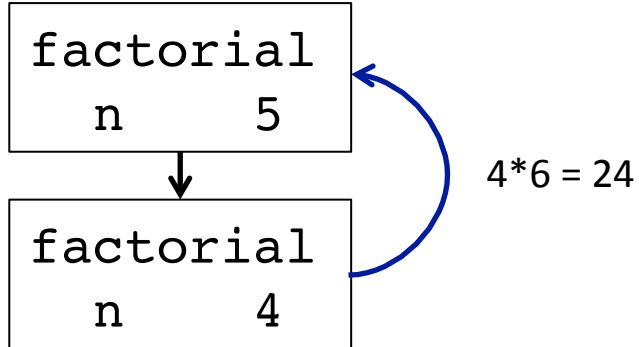
Execution of factorial(5)



Call Sequence

```
factorial(5)  
factorial(4)  
factorial(3)  
factorial(2)  
factorial(1)
```

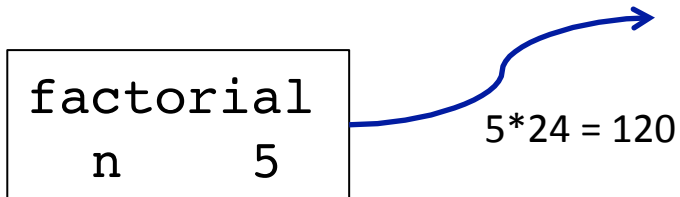
Execution of factorial(5)



Call Sequence

```
factorial(5)  
factorial(4)  
factorial(3)  
factorial(2)  
factorial(1)
```

Execution of factorial(5)



Call Sequence

`factorial(5)`
`factorial(4)`
`factorial(3)`
`factorial(2)`
`factorial(1)`

Output

`120`

Recursive versus Iterative

Both solve a problem one piece at a time

- Recursive
 - the solution to a problem depends on solutions to smaller instances of the same problem
- Iterative
 - the solution to a problem depends on repeating a process that after each iteration brings the result closer to the solution (without recursion)

Iterative Factorial Solution

$$n! = n * n-1 * n-2 * \dots * 1$$

```
public static int factorial (int n) {  
    int fact = 1;  
    for (int i = n; i > 1; i--) {  
        fact *= i;  
    }  
    return fact;  
}
```

Printing Pattern: a triangle

- Iterative view (non-recursive)

*

**

A size 4 triangle is four lines or
length 1, 2, 3 and 4

- Recursive view

*

**

A size 4 triangle is a size 3
triangle followed by a line of
length 4

Iterative Printing Pattern

```
public static void main(String[] args) {  
    for (int i = 1; i <= 3; i++) {  
        printNStars(i);  
    }  
}  
public static void printNStars (int n) {  
    System.out.println(nTimesChar(n, '*' ));  
}  
public static String nTimesChar (int n, char c) {  
    String result = "";  
    for (int i = 1; i <= n; i++) {  
        result = result + c;  
    }  
    return result;  
}
```


Recursive Printing Pattern

```
public static void triangle (int n) {
    if (n == 1) {
        printNStars(1);
    } else {
        triangle(n-1);
        printNStars(n);
    }
}

public static void printNStars (int n) {
    System.out.println(nTimesChar(n, '*'));
}

public static String nTimesChar (int n, char c) {
    String result = "";
    for (int i = 1; i <= n; i++) {
        result = result + c;
    }
    return result;
}
```

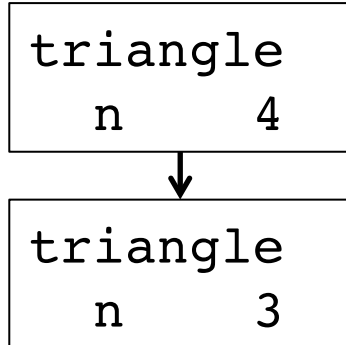
Recursive Printing Pattern: execution

<code>triangle</code>
<code> n 4</code>

Call Sequence

`triangle(4)`

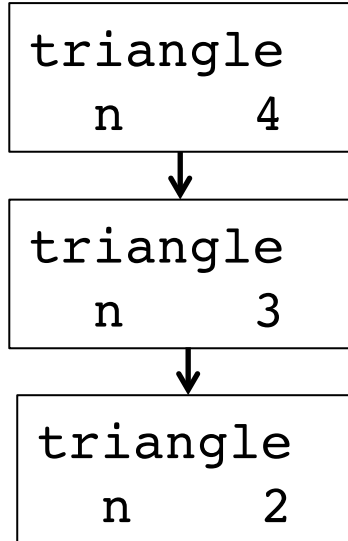
Recursive Printing Pattern: execution



Call Sequence

`triangle(4)`
`triangle(3)`

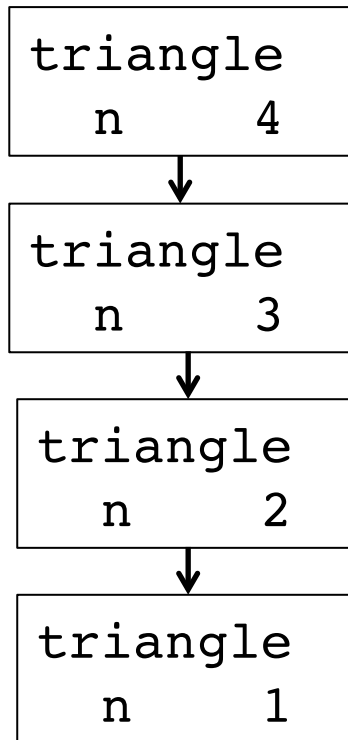
Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)  
triangle(3)  
triangle(2)
```

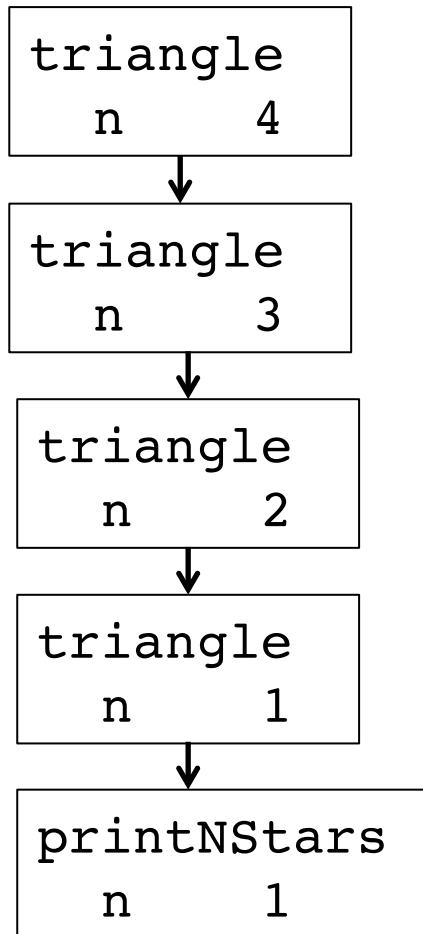
Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)  
triangle(3)  
triangle(2)  
triangle(1)
```

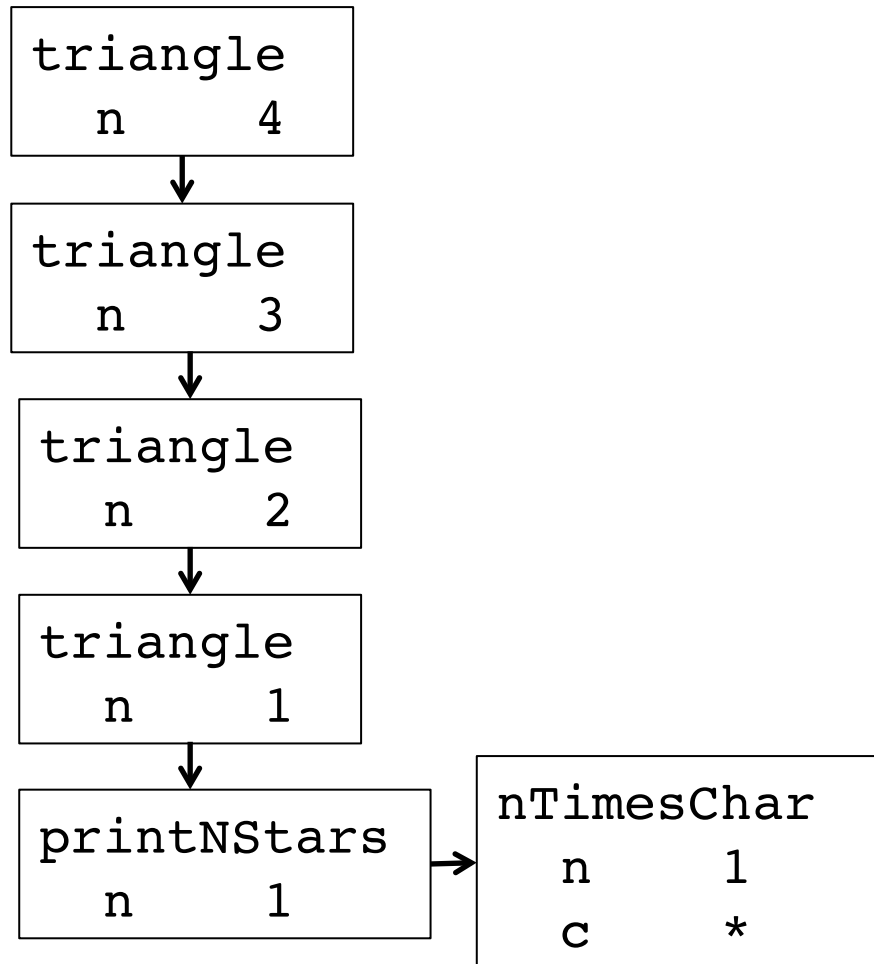
Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)  
triangle(3)  
triangle(2)  
triangle(1)  
printNStars(1)
```

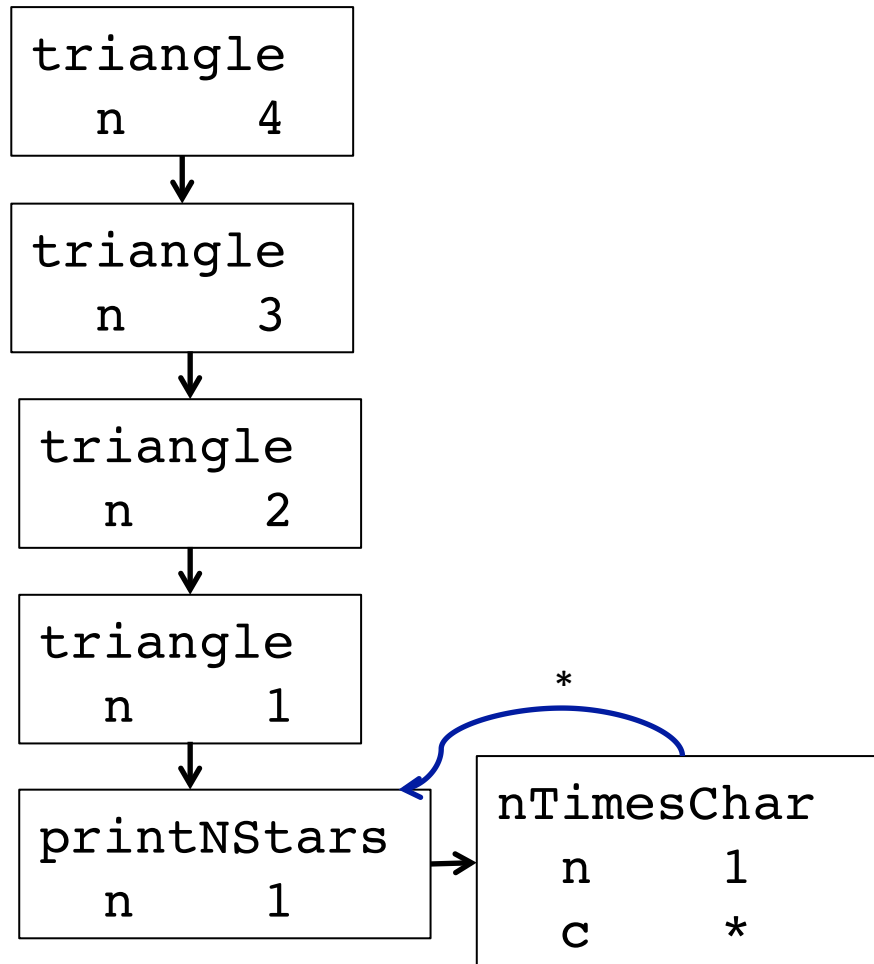
Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
```

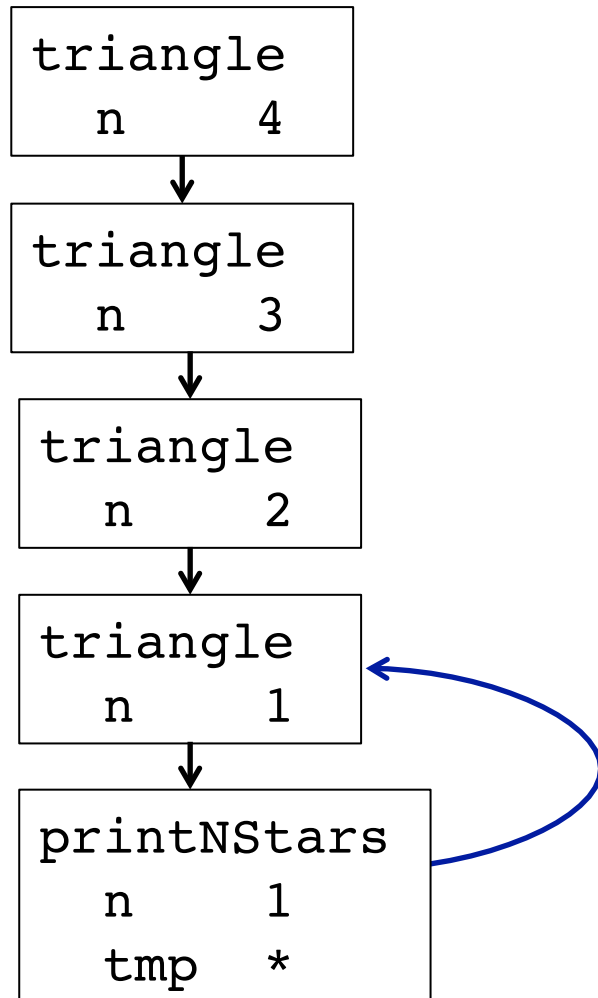
Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
```


Recursive Printing Pattern: execution



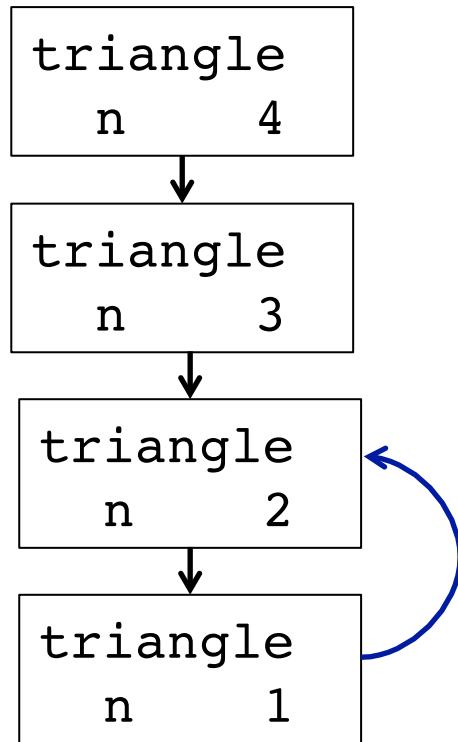
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*');
```

Output

*

Recursive Printing Pattern: execution



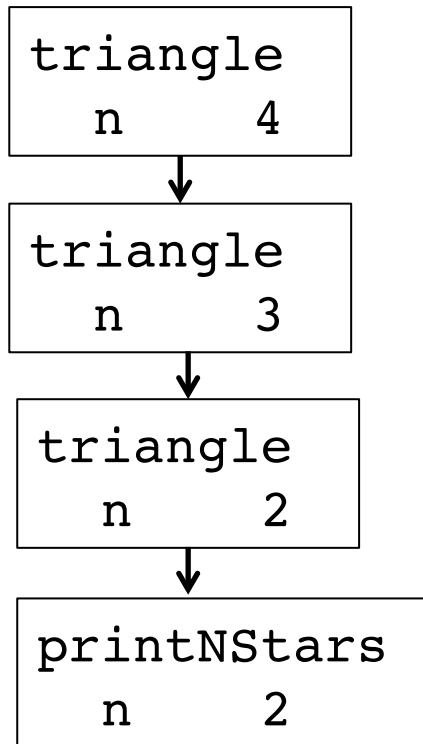
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*');
```

Output

*

Recursive Printing Pattern: execution



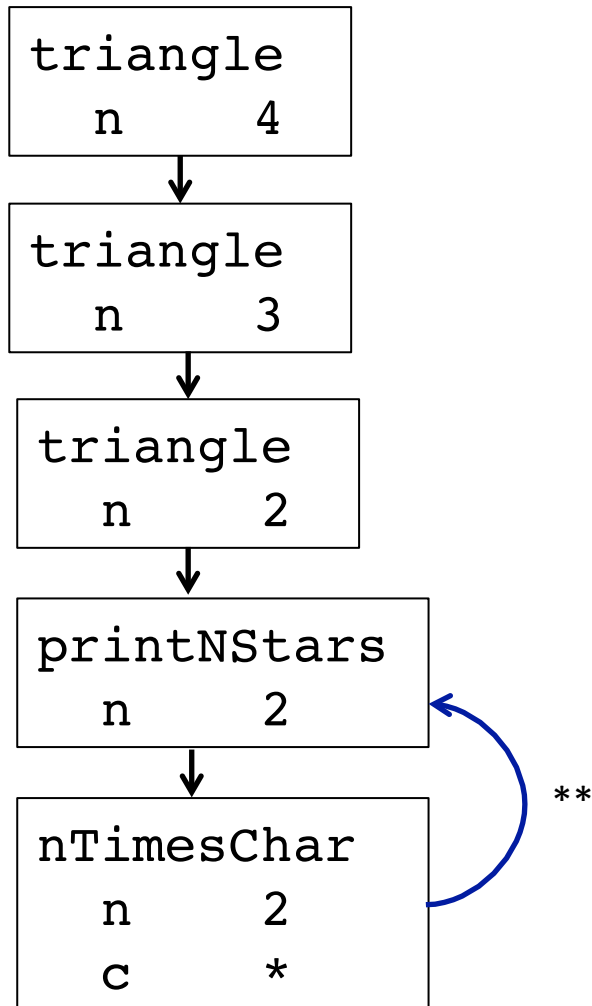
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
```

Output

*

Recursive Printing Pattern: execution



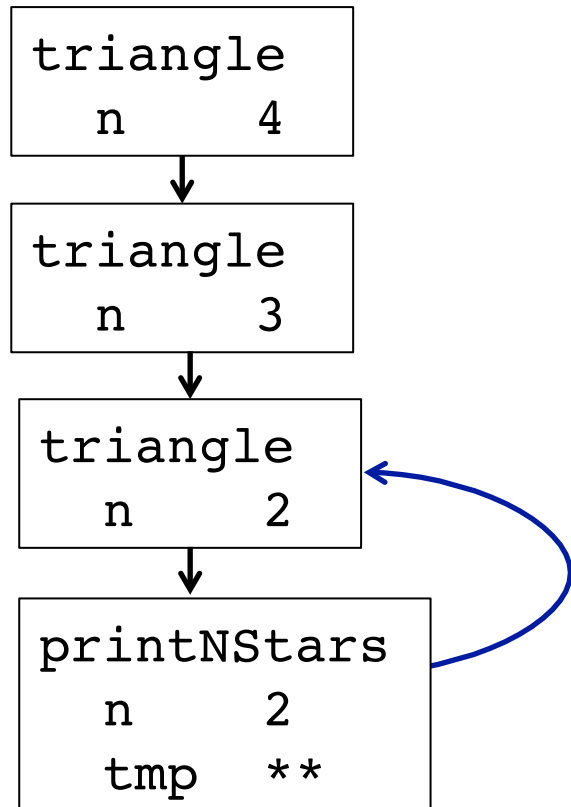
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
```

Output

*

Recursive Printing Pattern: execution



Call Sequence

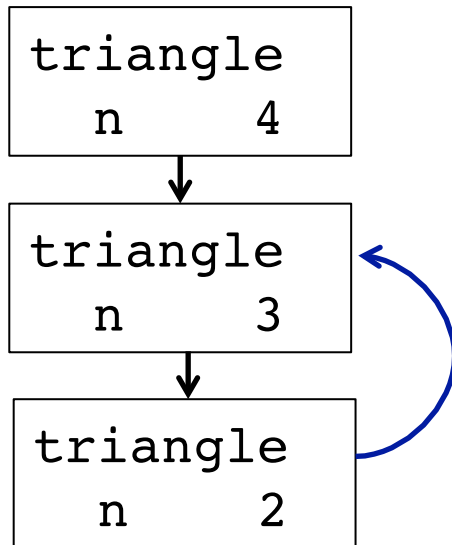
```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '**')
```

Output

```
*
```

```
**
```

Recursive Printing Pattern: execution



Call Sequence

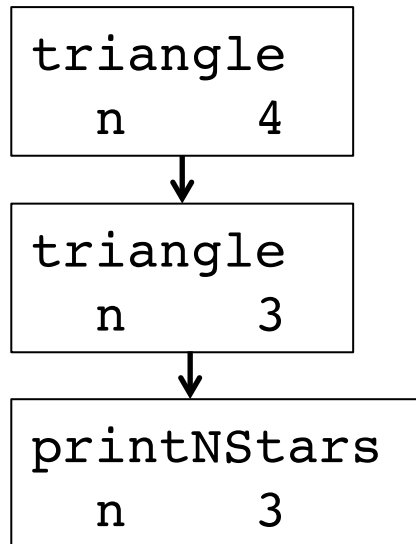
```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
```

Output

```
*
```

```
**
```

Recursive Printing Pattern: execution



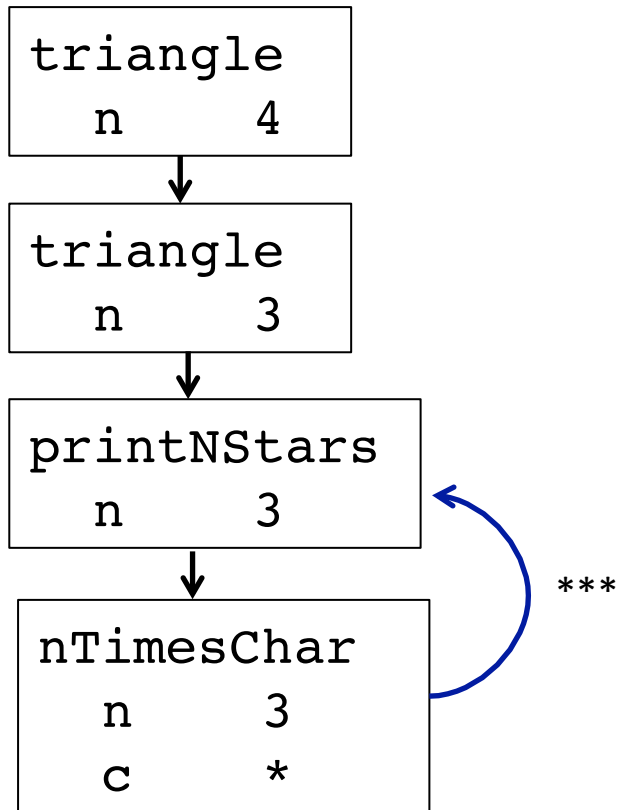
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
```

Output

```
*
**
```

Recursive Printing Pattern: execution



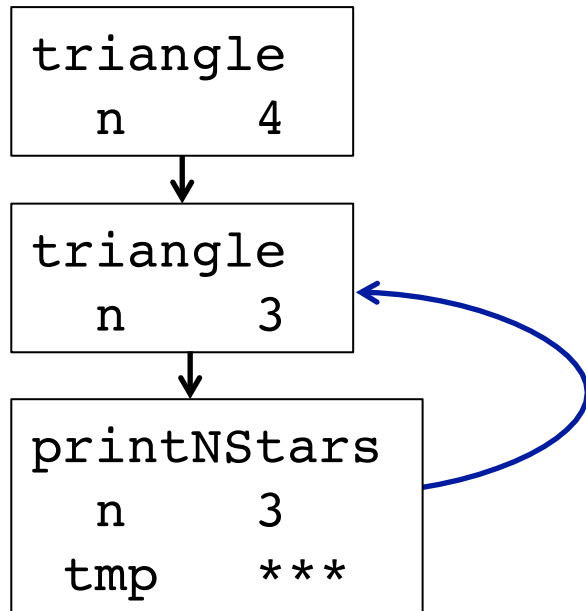
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
```

Output

```
*
**
```


Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
```

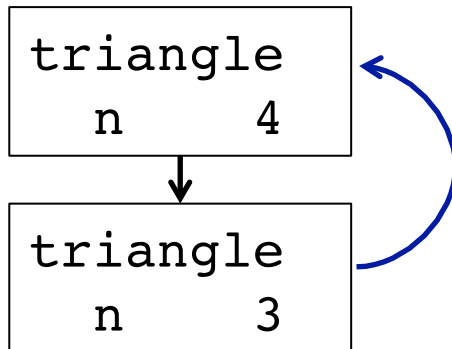
Output

```
*
```

```
**
```

```
***
```

Recursive Printing Pattern: execution



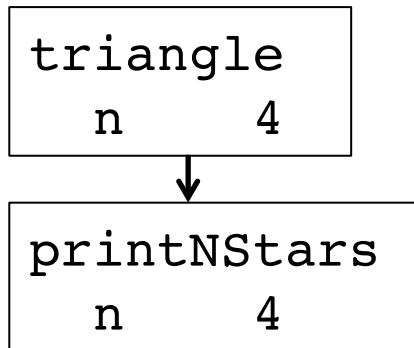
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
```

Output

```
*
**
***
```

Recursive Printing Pattern: execution



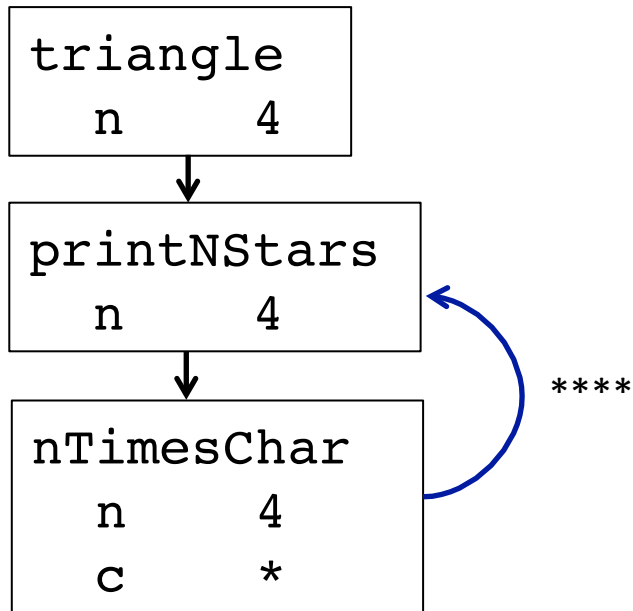
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
printNStars(4)
```

Output

```
*
**
***
```

Recursive Printing Pattern: execution



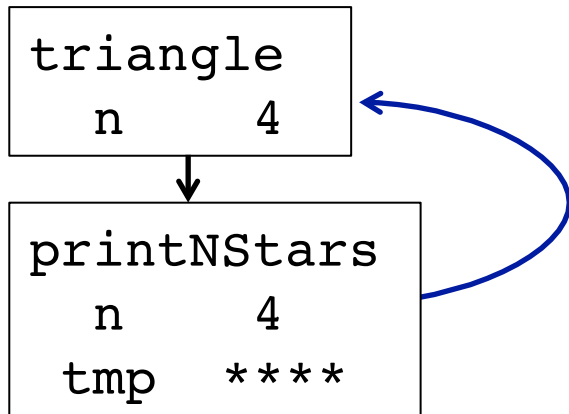
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
printNStars(4)
nTimesChar(4, '*')
```

Output

```
*
**
***
```

Recursive Printing Pattern: execution



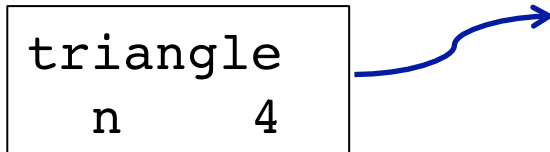
Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
printNStars(4)
nTimesChar(4, '*')
```

Output

```
*
**
***
****
```

Recursive Printing Pattern: execution



Call Sequence

```
triangle(4)
triangle(3)
triangle(2)
triangle(1)
printNStars(1)
nTimesChar(1, '*')
printNStars(2)
nTimesChar(2, '*')
printNStars(3)
nTimesChar(3, '*')
printNStars(4)
nTimesChar(4, '*')
```

Output

```
*
**
***
****
```

Iterative versus Recursive

Iterative

- Faster
 - no repetitive creation of activation records
- More code lines

Recursive

- Slower
 - each method call takes time to execute and takes memory space. If there are too many calls, could run out of memory
- Less code lines
 - code is easier to read, often more elegant

Palindromes

- A sequence of characters that reads the *same in both directions* (forward and backward)
 - e.g. radar, madam, eye
- How to write a recursive method to test if a string is palindrome?
 - disregard punctuation and space

Palindromes

- A string is palindrome if:
 - first and last characters are the same, and
 madam
 - rest of the string without the first and last characters is a palindrome
 ada
- A string of length 0 or 1 is a palindrome
 d

recursive
case

base case

Palindromes

```
public static boolean palindrome (String word) {  
    int length = word.length();  
    if (length <= 1) {  
        return true;  
    } else {  
        return word.charAt(0)==word.charAt(length-1) &&  
            palindrome(word.substring(1,length-1);  
    }  
}
```

base case

recursive
case

```
public static void main (String[] args) {  
    System.out.println(palindrome(args[0]));  
}
```

gets the string
from the
command line

Palindromes Analysis

- The recurrence $T(n)$
 - $T(n) = T(n-2) + 1$, where n is the string length
- The pattern is
 - $T(n) = T(n-2k) + k$
- Let $k = n/2$
 - $T(n) = O(n)$

Fibonacci Sequence

The first two numbers are 1 and 1, and each subsequent number is the sum of the previous two numbers

– 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, ...

- How to write the Fibonacci sequence using a recursive method?
 - base case?
 - recursive case?

Fibonacci Sequence

```
public static int fib (int n) {  
    if (n == 0 || n == 1) return 1;  
    else return fib(n-1) + fib(n-2);  
}
```

base case

recursive
case

- Call stack for the execution of fib(4):

```
fib(4)  
  fib(3)  
    fib(2)  
      fib(1)  
        fib(0)  
    fib(1)  
  fib(2)  
    fib(1)  
    fib(0)
```

- Recurrence Relation

- $T(0) = 1$
- $T(1) = 1$
- $T(n) = T(n-1) + T(n-2) + 1$

Fibonacci Analysis

- Then we repeat the recurrence

$$T(n) = T(n-1) + T(n-2) + 1 \quad \text{level 1}$$

$$= [T(n-2) + T(n-3) + 1] + [T(n-3) + T(n-4) + 1] + 1 \quad \text{level 2}$$

- Sometimes we can't write the full pattern but we can still figure out how many computation we are making
 - if we repeat the recurrence we are going to get 8 T's on level 3, 16 T's on level 4, 32, 64 and so on.
 - So, there are 2^k T's at level k
 - To get down to level $T(n-1)$ to the base case $T(1)$, we'll need to go to level $k = n-1$
 - We'll have 2^{n-1} T's there, so $T(n) = O(2^n)$

Towers of Hanoi

The objective is to move the entire stack of disks to another peg

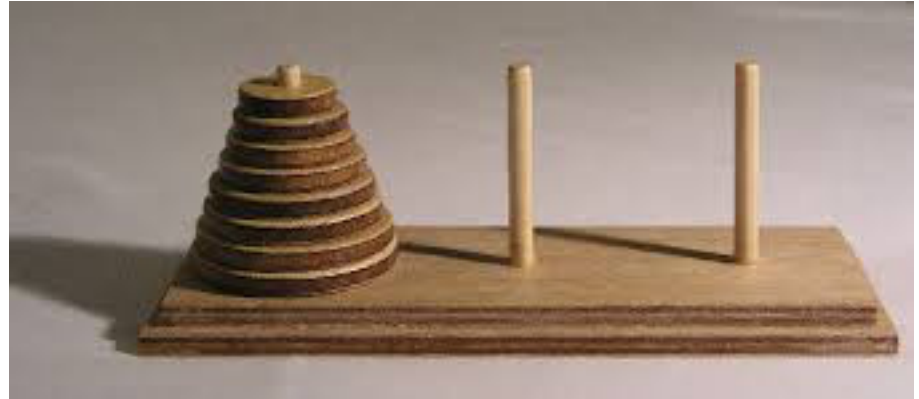


Image from Wikipedia

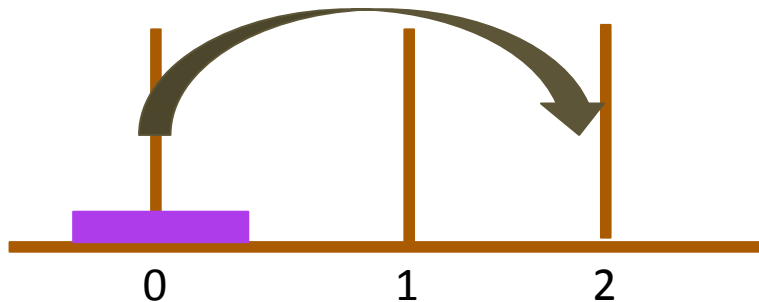
Rules

- 3 pegs and a set of disks of different sizes
- move only one disk at a time
 - take the top disk from a stack
 - put it on the top of another stack
- never place a larger disk on top of a smaller one

Towers of Hanoi with n disks

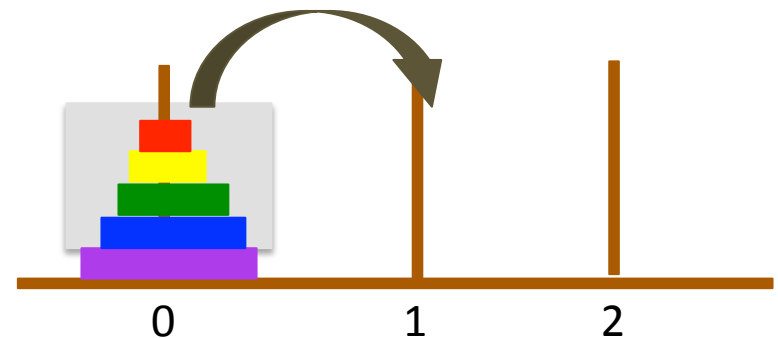
Base case

- identifying the stopping point, smallest Tower of Hanoi problem
- move only one disk



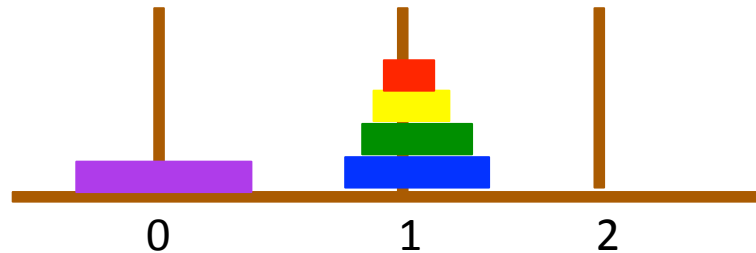
Recursive case

- identifying the smaller Towers of Hanoi problem within the Tower of Hanoi problem
- move $n-1$ disks to spare peg

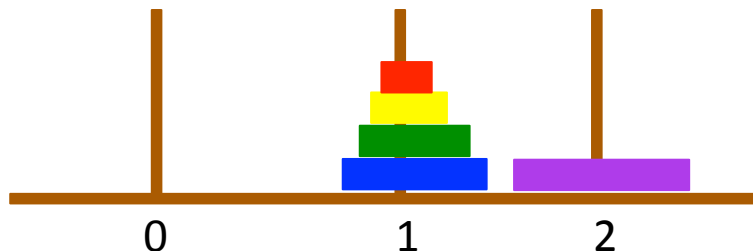


Towers of Hanoi

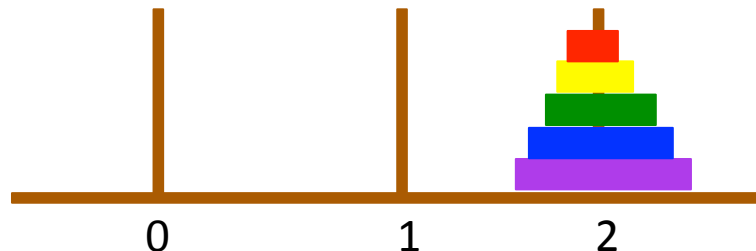
- Move the top $n-1$ disks to the *spare* peg



- Move the bottom disk to the *to* peg



- Move the $n-1$ disks from the *spare* to the *to* peg



Towers of Hanoi

```
static void towersOfHanoi(int disks, int from, int to, int
spare) {
    if (disks == 1) {
        // There is only one disk to be moved. Just move it.
        System.out.printf("Move disk 1 from stack %d to
stack %d\n", from, to);

    } else {
        // Move all but one disk to the spare stack
        towersOfHanoi(disks-1, from, spare, to);
        // move the bottom disk
        System.out.printf("Move disk %d from stack %d to
stack %d\n", disks, from, to);
        //then put all the other disks on top of it.
        towersOfHanoi(disks-1, spare, to, from);
    }
}
```

Towers of Hanoi: Efficiency

- Let $M(n)$ be the number of moves required to move n disks
- There are 2 recursive calls for $n-1$ disks and one constant time operation to move a disk
- Therefore:
 - $M(n) = 2M(n-1) + 1$
 - $M(1) = 1$
- Forward substitution
 - $M(2) = 2 M(1) + 1 = 3$
 - $M(3) = 2 M(2) + 1 = 7$
 - $M(4) = 2 M(3) + 1 = 15$

$$O(2^n)$$

Binary Search

- Searching an ordered array
 - How to find 12?

3	5	12	22	56	62	85	94	95	99
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0 1 2 3 4 5 6 7 8 9 Array index

Left	Right	Middle
0	9	4
0	3	1
2	3	2

12 == 56? **no** 12 < 56? **yes**

12 == 5? **no** 12 < 5? **no**

12 == 12? **yes** **Found it!**

Recursive Binary Search

```
int binarySearch(int[] a, int l, int r, int target){  
    if (l > r) return -1;  
    int middle = (l+r)/2;  
    if (a[middle] == target)  
        return middle;  
    else if (a[middle] > target)  
        return binarySearch(a, l, m-1, target);  
    else return binarySearch(a, m+1, r, target);  
}
```

- The comparisons and the computation of middle take constant time, $O(1)$
- Each call to binary search has three comparisons and a recursive call on half of the array, so the recurrence relation is:
$$T(n) = T(n/2) + O(1)$$
$$T(n) = T(n/2) + 1$$

Recursive Binary Search: Analysis

- Repeat the recurrence

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

$$= T(n/4) + 1 + 1$$

$$= T(n/8) + 1 + 1 + 1$$

$$\dots = T(n/2^k) + k$$

- Let $n = 2^k$

$$= T(2^k/2^k) + k$$

$$= T(1) + k$$

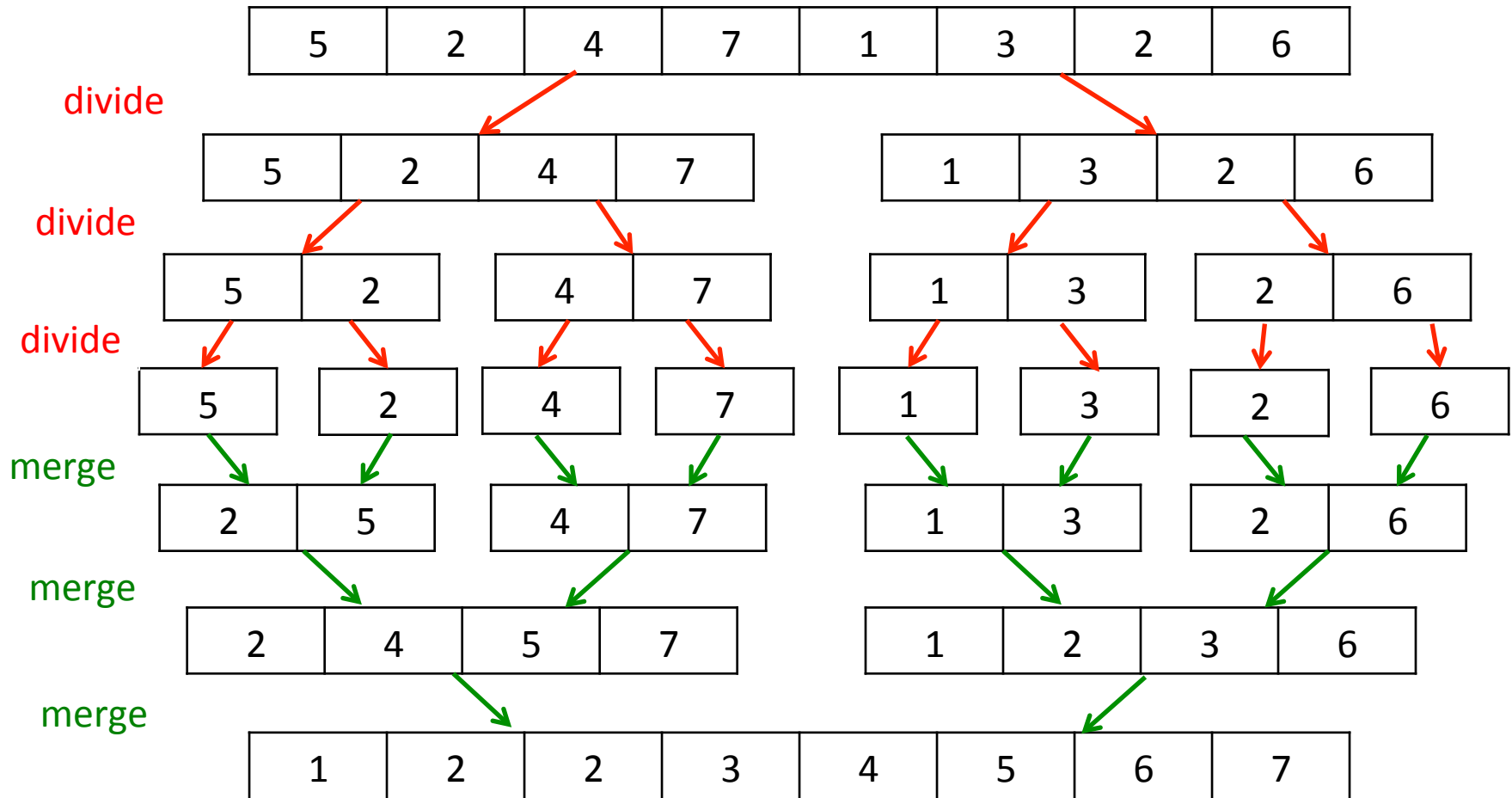
$$= 1 + k$$

if $n = 2^k$ then $k = \log n$ and $T(n) = 1 + \log n = O(\log n)$

Mergesort

- Follows the divide-and-conquer approach
 1. break the problem into several sub-problems that are similar to the original problem but smaller in size
 2. solve the sub-problems recursively
 3. then combine the sub-problems solution to create a solution to the original problem

Mergesort



Mergesort

Main idea for an array of n elements:

- Divide the unsorted array until there are n arrays, each containing 1 element.
 - Here the one element is considered as sorted.
- Repeatedly merge two sorted arrays until there is only 1 array remaining.
 - This will be the sorted array at the end.

Mergesort

```
void mergesort (int[] a, int l, int r){
    if (l > r) return;
    int middle = (l+r)/2;
    mergesort(a, l, m);
    mergesort(a, m+1, r);
    merge(a, l, m, r);
}
```

```
void merge (int[] a, int l, int m, int r){
    int[] aux = new int[r-l+1];
    for (int i=l; i<=r; i++) aux[i] = a[i]; //copy
    int i = l, j = m+1;
    for (int k=l; k<=r; k++) {
        if (i >= m) a[k] = aux[j++];
        else if (j >=r) a[k] = aux[i++];
        else if (aux[j] < aux[i]) a[k] = aux[j++];
        else a[k] = aux[i++];
    }
}
```

Mergesort: Analysis

- Merge: merges two halves of the array
 - making a copy of the array is $O(n)$
 - constant time for the assignment done n times
 - comparisons $O(n)$
 - each comparison takes constant time
 - in the worst case there are $n-1$ comparisons
 - $O(n) + O(n) = O(n)$

Mergesort: Analysis

- Mergesort
 - the comparison and the computation of middle is done in constant time $O(1)$
 - two calls to mergesort: each on half of the array
 - one call to merge $O(n)$
- Recurrence relation is
$$T(n) = T(n/2) + T(n/2) + O(n) + O(1)$$
$$= 2 * T(n/2) + n$$

Mergesort: Analysis

- Repeat the recurrence

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

$$= T(n/4) + n + n$$

$$= T(n/8) + n + n + n$$

$$\dots = T(n/2^k) + k*n$$

- Let $n = 2^k$

$$= T(2^k/2^k) + k*n$$

$$= T(1) + k*n$$

$$= 1 + k*n$$

if $n = 2^k$ then $k = \log n$ and $T(n) = 1 + \log n * n = O(n \log n)$