

# Lecture 6: Modeling Complex Code

CSE 373: Data Structures and Algorithms

What's the theta bound for the runtime function for this piece of code?

```
public void method1(int n) {
    if (n <= 100) {
        System.out.println(``:3");
    } else {
        System.out.println(``:D");
        for (int i = 0; i<16; i++) {
            method1(n / 4);
        }
}</pre>
```

#### **Master Theorem**

```
T(n) = \begin{cases} d & \text{if } n \text{ is at most some constant} \\ aT\left(\frac{n}{b}\right) + f(n) & \text{otherwise} \end{cases}
Where f(n) \text{ is } \Theta(n^c)
If \quad \log_b a < c \quad \text{then} \quad T(n) \in \Theta(n^c)
If \quad \log_b a = c \quad \text{then} \quad T(n) \in \Theta(n^c \log n)
If \quad \log_b a > c \quad \text{then} \quad T(n) \in \Theta(n^{\log_b a})
```

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T(n) = \begin{cases} constant work & \text{if } n \le 100\\ 16T\left(\frac{n}{4}\right) + constant work & \text{otherwise} \end{cases}
```

#### **Master Theorem**

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Where f(n) is \Theta(n^c)

If \log_b a < c then T(n) \in \Theta(n^c)

If \log_b a = c then T(n) \in \Theta(n^c \log n)

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a = 16, b = 4, c = 0

**Master Theorem** What's the theta bound for the runtime function for this piece of code?  $T(n) = \begin{cases} d & \text{if } n \text{ is at most some constant} \\ aT\left(\frac{n}{b}\right) + f(n) & \text{otherwise} \end{cases}$ Where f(n) is  $\Theta(n^c)$ If  $\log_b a < c$  then  $T(n) \in \Theta(n^c)$ If  $\log_b a = c$  then  $T(n) \in \Theta(n^c \log n)$ If  $\log_b a > c$  then  $T(n) \in \Theta(n^{\log_b a})$ 

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**Master Theorem** 

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                                        \log_4 16 ? 0
                                                         T(n) \in \Theta(n^{\log_b a})
                                        \log_4 16 > 0
   a = 16, b = 4, c = 0
```

**Master Theorem** 

What's the theta bound for the runtime function for this piece of code?  $T(n) = \begin{cases} d & \text{if } n \text{ is at most some constant} \\ aT\left(\frac{n}{b}\right) + f(n) & \text{otherwise} \end{cases}$ Where f(n) is  $\Theta(n^c)$ If  $\log_b a < c$  then  $T(n) \in \Theta(n^c)$ If  $\log_b a = c$  then  $T(n) \in \Theta(n^c \log n)$ If  $\log_b a > c$  then  $T(n) \in \Theta(n^{\log_b a})$ 

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T(n) = \begin{cases} constant work & \text{if } n \le 100\\ 16T\left(\frac{n}{4}\right) + constant work & \text{otherwise} \end{cases}
                                          \log_4 16 ? 0
                                          \log_4 16 > 0 \qquad T(n) \in \Theta(n^{\log_b a})
   a = 16, b = 4, c = 0
                                          \Theta(n^{\log_4 16}) = \Theta(n^2)
```

What's the theta bound for the runtime function for this piece of code?  $T(n) = \begin{cases} d & \text{if } n \text{ is at most some constant} \\ aT\left(\frac{n}{b}\right) + f(n) & \text{otherwise} \end{cases}$ Where f(n) is  $\Theta(n^c)$ If  $\log_b a < c$  then  $T(n) \in \Theta(n^c)$ If  $\log_b a = c$  then  $T(n) \in \Theta(n^c \log n)$ If  $\log_b a > c$  then  $T(n) \in \Theta(n^{\log_b a})$ 

**Master Theorem** 

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### Administrivia

project1 due Wednesday 11:59pm

exercise1 due Friday 11:59pm

#### Piazza

- try to use the search bar before you post / use descriptive summary titles when possible - thank you

#### **Office Hours**

- please come to them! Piazza is super busy and office hours are less busy. We promise we won't bite 🙂

#### anonymous feedback

- lectures + projects are so different?
- it'll be better soon we didn't have time to cram in Deques (it's probably the least relevant ADT) or make a new assignment this quarter. We're aware, should be better for the future since the next few projects are all implementing new data structures and algorithms (HashMap, Binary Heaps, Graphs, ArrayDisjointSets, Kruskal's and Dijkstra's algorithms) we talk about directly in lecture.
- exercises + experiments should help connect lecture topics (while also not being \_too\_ much time)
- is there time to give an intro to the projects in lecture?
  - maybe barely we can try to see if it fits on a week-to-week



### Questions

# **Code Analysis Process**



### **Recursive Patterns**

Pattern #1: Halving the Input

**Binary Search** Θ(logn)

Pattern #2: Constant size input and doing work

**Merge Sort** Θ(nlogn)

Pattern #3: Doubling the Input

**Calculating Fibonacci** 

# **Calculating Fibonacci**

```
public int fib(int n) {
    if (n <= 1) {
        return 1;
    }
    return fib(n-1) + fib(n-1);</pre>
```

- Each call creates 2 more calls
- Each new call has a copy of the input, almost
- Almost doubling the input at each call

Pattern #3 – Doubling the Input



# Calculating Fibonacci Recurrence to Big-O

 $T(n) = \begin{cases} d \text{ when } n \leq 1\\ 2T(n-1) + c \text{ otherwise} \end{cases}$ 

Take 1 min to respond to activity

www.pollev.conm/cse373activity Finish the recurrence, what is the model for the recursive case? Can we use master theorem?

#### **Master Theorem**

 $T(n) = \begin{cases} d & \text{if } n \text{ is at most some constant} \\ aT\left(\frac{n}{b}\right) + f(n) & \text{otherwise} \end{cases}$ 

Uh oh, our model doesn't match that format... Can we intuit a pattern? T(1) = d T(2) = 2T(2-1) + c = 2(d) + c T(3) = 2T(3-1) + c = 2(2(d) + c) + c = 4d + 3c T(4) = 2T(4-1) + c = 2(4d + 3c) + c = 8d + 7c T(5) = 2T(5-1) + c = 2(8d + 7c) + c = 16d + 25cLooks like something's happening but it's tough Maybe geometry can help!

# Calculating Fibonacci Recurrence to Big-O

### How many layers in the function call tree?

How many layers will it take to transform "n" to the base case of "1" by subtracting 1

For our example, 4 -> Height = n

#### How many function calls per layer?

Layer	Function calls
0	1
1	2
2	4
3	8

How many function calls on layer k? **2**<sup>k-1</sup>

How many function calls TOTAL for a tree of k layers?

 $1 + 2 + 3 + 4 + \dots + 2^{k-1}$ 

 $T(n) = \begin{cases} d \text{ when } n \leq 1\\ 2T(n-1) + c \text{ otherwise} \end{cases}$ 



# Calculating Fibonacci Recurrence to Big-O

Patterns found:

How many layers in the function call tree? n

How many function calls on layer k? 2<sup>k-1</sup>

How many function calls TOTAL for a tree of k layers?

 $1 + 2 + 4 + 8 + \dots + 2^{k-1}$ 

Total runtime = (total function calls) x (runtime of each function call)

Total runtime =  $(1 + 2 + 4 + 8 + ... + 2^{k-1}) \times (\text{constant work})$ 

1+2+4+8+...+2<sup>k-1</sup> =  $\sum_{i=1}^{k-1} 2^i = \frac{2^k - 1}{2-1} = 2^k - 1$ 

Summation Identity Finite Geometric Series  $\sum_{k=1}^{k-1} x^{i} = \frac{x^{k} - 1}{x - 1}$ 

 $T(n) = 2^n - 1 \in \Theta(2^n)$ 

### **Recursive Patterns**

**Pattern #1:** Halving the Input **Binary Search** Θ(logn)

Pattern #2: Constant size input and doing workMerge Sort Θ(nlogn)

Pattern #3: Doubling the Input

**Calculating Fibonacci** Θ(2<sup>n</sup>)





#### **Runtime Comparison**



#### CSE 373 20 WI – HANNAH TANG 16



### Questions



# **Code Analysis Process**



# Recurrence to Big O Techniques

A recurrence is a mathematical function that includes itself in its definition

This makes it very difficult to find the dominating term that will dictate the asymptotic growth

Solving the recurrence or "finding the closed form" is the process of eliminating the recursive definition. So far, we've seen three methods to do so:  $T(n) = \begin{cases} d \text{ when } n \leq 1 \\ 2T(n-1) + c \text{ otherwise} \end{cases}$ 

- 1. Apply Master Theorem
  - Pro: Plug and chug convenience
  - Con: only works for recurrences of a certain format
- 2. Unrolling
  - Pro: Least complicated setup
  - Con: requires intuitive pattern matching
- 3. Tree Method
  - Pro: Plug and chug
  - Con: Complex setup

 $T(n) = \begin{cases} d & \text{if } n \text{ is at most some constant} \\ aT\left(\frac{n}{b}\right) + f(n) & \text{otherwise} \end{cases}$  T(1) = d T(2) = 2T(2-1) + c = 2(d) + c T(3) = 2T(3-1) + c = 2(2(d) + c) + c = 4d + 3c T(4) = 2T(4-1) + c = 2(4d + 3c) + c = 8d + 7c T(5) = 2T(5-1) + c = 2(8d + 7c) + c = 16d + 25c

**Master Theorem** 

### Tree Method

Draw out call stack, what is the input to each call? How much work is done by each call?

### How much work is done at each layer?

64 for this example -> n work at each layer

Work is variable per layer, but across the entire layer work is constant - always n

# How many layers are in our function call tree?

Hint: how many levels of recursive calls does it take *binary search* to get to the base case?

 $Height = log_2 n$ 

It takes  $log_2n$  divisions by 2 for n to be reduced to the base case 1

 $log_264 = 6 \rightarrow 6$  levels of this tree



... and so on...



### **Tree Method Practice**

- 1. What is the size of the input on level *i*?  $\frac{n}{2^i}$
- 2. What is the work done by each node on the  $i^{th}$   $(\frac{n}{2^i})$  recursive level?
- 3. What is the number of nodes at level i?  $2^i$
- 4. What is the total work done at the *i*<sup>th</sup>recursive level?

numNodes \* workPerNode =  $2^{i} \left(\frac{n}{2^{i}}\right) = n$ 

5. What value of *i* does the last level occur?

 $\frac{n}{2^i} = 1 \rightarrow n = 2^i \rightarrow i = \log_2 n$ 

6. What is the total work across the base case level?  $numNodes * workPerNode = 2^{log_2n}(1) = n$ 

$$T(n) = - \begin{bmatrix} 1 \text{ when } n \leq 1 \\ 2T \binom{n}{2} + n \text{ otherwise} \end{bmatrix}$$

Level (i)	Number of Nodes	Work per Node	Work per Level
0	1	n	n
1	2	$\frac{n}{2}$	n
2	4	$\frac{n}{4}$	n
3	8	$\frac{n}{8}$	n
log <sub>2</sub> n	n	1	

Combining it all together...

$$T(n) = \sum_{i=0}^{\log_2 n - 1} n + n = n \log_2 n + n = \Theta(n \log n)$$
  
Summation of a constant

сп

$$\sum_{i=0}^{n-1} c =$$

 $x^{\log_b y} = y^{\log_b x}$ 



### Questions



# Modeling Complex Loops

Write a mathematical model of the following code

```
for (int i = 0; i < n; i++) {
    for (int j = 0; j < i; j++) {
        System.out.println("Hello!"); +1
    }
}</pre>
```



Keep an eye on loop bounds!

# Modeling Complex Loops

for (int i = 0; i < n; i++) {  
for (int j = 0; j < i; j++) {  
System.out.print("Hello! "); +1 
$$0+1+2+3+...+1-1$$
 n  
Sysem.out.println();  
}  
T(n) =  $(0+1+2+3+...+i-1)$   
How do we summations!  
model this part?  $1+2+3+4+...+n = \sum_{i=1}^{n} i$   
T(n) =  $\sum_{i=0}^{n-1} \sum_{j=0}^{i-1} 1$  What is the Big O?





### Questions





### **Tree Method Practice**

- 1. What is the size of the input on level *i*?  $\frac{n}{4^i}$
- 2. What is the work done by each node on the  $i^{th} \left(\frac{n}{4^i}\right)^2$  recursive level?
- 3. What is the number of nodes at level i?  $3^i$
- 4. What is the total work done at the *i*<sup>th</sup>recursive level?  $3^{i} \left[ \left( \frac{n}{A^{i}} \right) \right]^{2} = \left( \frac{3}{16} \right)^{i} n^{2}$
- 5. What value of *i* does the last level occur?

 $\frac{n}{4^i} = 1 \rightarrow n = 4^i \rightarrow i = \log_4 n$ 

6. What is the total work across the base case level?  $3^{\log_4 n} \cdot 4$  power of a log  $4 \cdot n^{\log_4 3}$ 

 $x^{\log_b y} = y^{\log_b x}$ 

$$T(n) = -\begin{cases} 4 \text{ when } n \leq 1\\ 3T\left(\frac{n}{4}\right) + n^2 \text{ otherwise} \end{cases}$$

Level (i)	Number of Nodes	Work per Node	Work per Level
0	1	$n^2$	$n^2$
1	3	$\left(\frac{n}{4}\right)^2$	$\frac{3}{4^2}n^2$
2	9	$\left(\frac{n}{4^2}\right)^2$	$\frac{3^2}{4^4}n^2$
base	$3^{\log_4 n}$	4	$4 * 3^{\log_4 n}$

5 Minutes

Combining it all together...

$$T(n) = \sum_{i=0}^{\log_4 n - 1} \left(\frac{3}{16}\right)^i n^2 + 4n^{\log_4 3}$$

### **Tree Method Practice**

$$T(n) = \sum_{i=0}^{\log_4 n - 1} \left(\frac{3}{16}\right)^i n^2 + 4n^{\log_4 3}$$

Identities are on the <u>webpage</u>. You don't need to memorize them.

on't need to memorize them.

So what's the big- $\Theta$ ...

$$T(n) = n^2 \left(-\frac{16}{13}\right) \left(\frac{3}{16}\right)^{\log_4 n} + \left(\frac{16}{13}\right) n^2 + 4n^{\log_4 3}$$

$$T(n) = n^2 \left( -\frac{16}{13} \right) (n)^{\log_4 \frac{3}{16}} + \left( \frac{16}{13} \right) n^2 + 4n^{\log_4 3}$$
$$T(n) \in \Theta(n^2)$$

finite geometric series  

$$\sum_{i=0}^{n-1} x^i = \frac{x^n - 1}{x - 1}$$

Closed form:  $T(n) = n^{2} \left( \frac{\left(\frac{3}{16}\right)^{\log_{4} n} - 1}{\frac{3}{16} - 1} \right) + 4n^{\log_{4} 3}$ 

factoring out a constant  $\sum_{i=a}^{b} cf(i) = c \sum_{i=a}^{b} f(i)$ 

$$T(n) = n^2 \sum_{i=0}^{\log_4 n^{-1}} \left(\frac{3}{16}\right)^i + 4n^{\log_4 3}$$

### More Tree Method

$$T(n) = \begin{cases} 6T\left(\frac{n}{2}\right) + 2n \text{ if } n > 8\\ 3 & \text{otherwise} \end{cases}$$

### **Tree Method Practice**

$$T(n) = \begin{cases} 6T\left(\frac{n}{2}\right) + 2n \text{ if } n > 8\\ 3 & \text{otherwise} \end{cases}$$

Answer the following questions:

- 1. What is the size of the input on level *i*?
- 2. What is the work done by each node on the *i*<sup>th</sup> recursive level
- 3. What is the number of nodes at level *i*?
- 4. What is the total work done at the i^th recursive level?
- 5. What value of *i* does the last level occur?
- 6. What is the total work across the base case level?

### **Tree Method Practice**

- 1. What is the size of the input on level *i*?  $\frac{n}{2^i}$
- 2. What is the work done by each node on the  $i^{th} 2\frac{n}{2^i}$  recursive level?
- 3. What is the number of nodes at level *i*?  $6^i$
- 4. What is the total work done at the *i*<sup>th</sup>recursive level?  $6^{i} \left[ 2 \frac{n}{2^{i}} \right] = 2 \cdot 3^{i} \cdot n$
- 5. What value of *i* does the last level occur?

 $\frac{n}{2^{i}} = 2 \rightarrow n = 2^{i+1} \rightarrow i = \log_2(n) - 1$ 

6. What is the total work across the base case level?

$$\begin{cases} 2 & \text{power of a log} \\ 6^{\log_2(n) - 1} \cdot 3 & x^{\log_b y} = y^{\log_b x} \end{cases} \quad \frac{3 \cdot 6^{\log_2 n}}{6} = \frac{1}{2} \cdot n^{\log_2 6} = \frac{1}{2} \cdot n^{\log_2 6} \end{cases}$$

$$T(n) = \begin{cases} 6T\left(\frac{n}{2}\right) + 2n \text{ if } n > 2\\ 3 & \text{otherwise} \end{cases}$$

Level (i)	Number of Nodes	Work per Node	Work per Level
0	1	2 <i>n</i>	2 <i>n</i>
1	2	$\frac{2n}{8}$	$\frac{n}{2}$
2	4	$2\left(\frac{n}{8^2}\right)$	$\frac{n}{8}$
base	$2^{\log_8 n-1}$	3	$\frac{3}{2}n^{1/3}$

Combining it all together...

$$T(n) = \sum_{i=0}^{\log_2(n) - 2} 2 \cdot 3^i n + \frac{1}{2} n^{\log_2 6}$$

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#### 5 Minutes



### **Summation Practice**

```
public static void primesUpToN(int n) {
     System.out.print("1 2 "); +1
     for (int i = 3; i <= n; i++) {
             for (int j = 2; j < i; j++) {
     System.out.println();+1
T(n) = 1 + \sum_{i=3}^{n} \sum_{j=2}^{i-1} 5 = 1 + \sum_{i=0}^{n-3} \sum_{j=0}^{i-3} 5 = 1 + \sum_{i=0}^{n-3} 5(i-2) = 1 + 5(\sum_{i=0}^{n-3} i - \sum_{i=0}^{n-3} 2) - = 1 + 5(\frac{(n-2)(n-3)}{2} - (n-2)(2))
```

