## Induction

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## Admin

- Any questions?


# Motivating Recursion (Induction <br> Intro) 

## Where to start?

```
public static int numX(String s) {
    if(s.length() == 0) {
        return 0;
    }
    if(s.charAt(s.lengt()-1) == 'X') {
        return 1 + numX(s.substring(0,s.length() - 1));
    else {
        return numX(s.substring(0,s.length() - 1));
    }
}
```

- If s has length $\theta$, then this algorithm correctly returns $\theta$.
- What if $s$ has length 1 ?


## Our strategy

- Start with base case
- Slowly argue that it works for larger and larger strings


## Visualizing our Strategy

- How can we climb to the top of a ladder?
- Here's a two step process:
- Figure out how to get on some rung of the ladder
- Figure out a method to get from one rung to the next rung
- I always make it to the top of the ladder?


## Our strategy

Ladder analogy: each step of the ladder is the length of the string in our recursive method. We want to show that our method is correct for a string of a certain length.

- Start with base case
- Slowly argue that it works for larger and larger strings


# Induction 

## Induction

- Formalizes this idea
- Incredibly powerful and widely-used proof technique, especially in computer science and discrete math
- Two motivations:
- Prove that your approach works (and that mathematical equations hold)
- Analyze your code inductively: tracking down what happens when code behaves unexpectedly.


## Induction: Classic Example

- Let's prove that for all $n \geq 1$ :

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

- Also can be written:

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

## Induction

- Sometimes say that we are proving a collection of statements
- I could say "numX is correct".
- Or I could say "numX is correct for strings of length 1 , and strings of length 2 , and strings of length $3, \ldots$ "
- I could say that $1+2+\ldots+n=\frac{n(n+1)}{2}$.
- Or I could say that $1=1(2) / 2$, and $1+2=2(3) / 2$, and $1+2+3=3(4) / 2 \ldots$
- Climbing the ladder is like proving these statements one at a time. Taken together, I've proven the full statement.


## Induction Recipe

Any inductive proof needs (let's say we're doing induction on $n$ ):

- A Base Case: need to show that the proof is correct for some value
- An Inductive Hypothesis: write the assumption you are making for a given $n$
- An Inductive Step: Prove that if you assume the inductive hypothesis for $n$, you can prove it for $n+1$.

You should always write all three steps explicitly when doing an induction in this class.

## Induction Recipe (End of ladder analogy)

Any inductive proof needs (let's say we're doing induction on $n$ ):

- A Base Case: need to show that the proof is correct for some value get on ladder
- An Inductive Hypothesis: write the assumption you are making for a given $n \quad$ make it clear what the "rungs" of the ladder are
- An Inductive Step: Prove that if you assume the inductive hypothesis for $n$, you can prove it for $n+1$. get from one rung to the next


## Induction: Classic Example

- Let's prove that for all $n \geq 1$ :

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

- Base case?
- Base case $n=1$. If $n=1,1=1(2) / 2$; works!
- Inductive hypothesis: for some $n$, we have

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

## Inductive Step

Goal: let's assume the inductive hypothesis for $n$. Can we use it to show the inductive hypothesis for $n+1$ ?

- Assume that

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

- Then

$$
\begin{aligned}
1+2+3+\ldots+n+(n+1)= & \frac{n(n+1)}{2}+(n+1) \\
& =\frac{n^{2}+n+2 n+2}{2} \\
& =\frac{(n+1)(n+2)}{2}
\end{aligned}
$$

- But this is the inductive hypothesis for $n+1$ ! So we are done.


## What have we done?

- We have shown that for all $n$,

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

- Questions?


## On the board

- For all $n$,

$$
1+2+4+\ldots+2^{n}=2^{n+1}-1
$$

- Can also be written

$$
\sum_{i=\theta}^{n} 2^{n}=2^{n+1}-1
$$

- Remember: base case, inductive hypothesis, inductive step


## Proving statements about algorithms

(We'll be using this a lot on Monday, and with more interesting examples)

- How do we know contains() works on a Vector?
- Base case: contains() returns true if the element is in position $\theta$ in the vector; otherwise it moves past the Oth element without returning
- Inductive hypothesis: if the element is in the first $i$ positions of the vector then contains() returns true; otherwise it moves past the first $i$ elements without returning
- Inductive step: assume the inductive hypothesis for $i$. If the element is in position $\leq i$, then contains returns true by the inductive hypothesis. If the element is in position $i+1$, then contains does not return while looking at the first $i$ elements by the inductive hypothesis. It examines the $i+1$ st element, and returns true if it is found; otherwise, contains moves to the next element.


## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add(). Let's assume that the Vector starts with size 1.
- First, let's say ensureCapacity adds 1 to the capacity of the Vector each time. How many operations does this take in total?
- Let's write the total operations.
- It takes $O(i)$ operations to call ensureCapacity on a vector of size $i$.
- Total operations:

$$
O(1)+O(2)+\ldots+O(n)
$$

- How do we add $O$ ? We can just use the definition: we can upper bound $O(i)$ with ci.


## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add(). Let's assume that the Vector starts with size 1.
- First, let's say ensureCapacity adds 1 to the capacity of the Vector each time. How many operations does this take in total?
- Total operations:

$$
O(1)+O(2)+\ldots+O(n)
$$

- Total operations:

$$
\begin{gathered}
c_{1}+2 c_{1}+3 c_{1}+\ldots+c_{1} n=c_{1}(1+2+3+\ldots+n)= \\
c_{1} \frac{n(n+1)}{2}=c_{1} n^{2} / 2+c_{1} n / 2=O\left(n^{2}\right)
\end{gathered}
$$

## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add(). Let's assume that the Vector starts with size 1.
- First, let's say ensureCapacity adds 1 to the capacity of the Vector each time. How many operations does this take in total? Answer: $O\left(n^{2}\right)$
- Then, let's say ensureCapacity adds 10 to the capacity of the Vector each time. How many operations does this take in total?
- Finally, let's say ensureCapacity doubles the size of the Vector each time it is called. How many operations does this take in total?


## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add(). Let's assume that the Vector starts with size 1.
- Then, let's say ensureCapacity adds 10 to the capacity of the Vector each time. How many operations does this take in total?

$$
O(1 \theta)+O(2 \theta)+\ldots+O(n)
$$

- Rewrite as:

$$
c_{2} 1 \theta+c_{2} 2 \theta+\ldots+c_{2} n=1 \theta c_{2} \cdot 1+1 \theta c_{2} \cdot 2+\ldots+1 \theta c_{2} \cdot n / 1 \theta=
$$

- Rewrite as:

$$
=1 \theta c_{2} \frac{\frac{n}{1 \theta}\left(\frac{n}{1 \theta}+1\right)}{2}=O\left(n^{2}\right)
$$

## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add(). Let's assume that the Vector starts with size 1.
- First, let's say ensureCapacity adds 1 to the capacity of the Vector each time. How many operations does this take in total? Answer: $O\left(n^{2}\right)$
- Then, let's say ensureCapacity adds 10 to the capacity of the Vector each time. How many operations does this take in total? Answer: $O\left(n^{2}\right)$
- Finally, let's say ensureCapacity doubles the size of the Vector each time it is called. How many operations does this take in total?


## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add(). Let's assume that the Vector starts with size 1.
- Finally, let's say ensureCapacity doubles the size of the Vector each time it is called. How many operations does this take in total?
- Total operations:

$$
O(1)+O(2)+O(4)+\ldots+O(n)
$$

- Total operations:

$$
c_{1}+2 c_{1}+4 c_{1}+\ldots+c_{1} n=c_{1}(1+2+4+\ldots+n) \leq
$$

- Reminder: $1+2+4+\ldots+2^{i}=2^{i+1}-1$
- Substitute $i=\log _{2} n$ :

$$
c_{1}\left(2^{i+1}-1\right)=2 c_{1} n-c_{1}=O(n)
$$

## Comparing performance of extending a Vector

- Let's say we insert $n$ items into a Vector one at a time; each time we use add (). Let's assume that the Vector starts with size 1.
- First, let's say ensureCapacity adds 1 to the capacity of the Vector each time. How many operations does this take in total? Answer: $O\left(n^{2}\right)$
- Then, let's say ensureCapacity adds 18 to the capacity of the Vector each time. How many operations does this take in total?
- Finally, let's say ensureCapacity doubles the size of the Vector each time it is called. How many operations does this take in total? Answer: $O(n)$

We save a factor $n$ in number of operations by doubling vector size every time!

## Printing a linked list

Let's look at two ways to print a singly linked list. First, we call get () on each index. Second, we iterate through the nodes of the list.

How long does each take?

## Printing a linked list

```
public String toString() {
    String ret = "";
    for(int i = 0; i < count; i++) {
        ret += get(i).toString();
    }
}
```

public String toString() \{
Node<E> current = head;
String ret = "";
while(head != null) \{
ret += current.value().toString();
current = current.next();
\}
\}

## Printing a linked list

- First method: calling get () takes $O(n)$ time.
- get () is called $n$ times
- Total is $O\left(n^{2}\right)$ time.
- Second method: calling next() and toString() are $O(1)$ time
- Called $n$ times. Total: $O(n)$ time.


## Linked List Discussion

## Tail pointer for singly linked list?

- Singly linked lists have very slow operations at the end of the list
- What if we maintain a tail pointer to the last element of the list? What can we maintain efficiently?
- How about addLast()?
- How about removeLast()?


## Doubly vs Singly Linked List Tradeoffs

- What are some advantages of a doubly linked list?
- What are some advantages of a singly linked list?

