

THE “BIG-OH” NOTATION

Example: Prove that $8n-2$ is $O(n)$.

Justification:

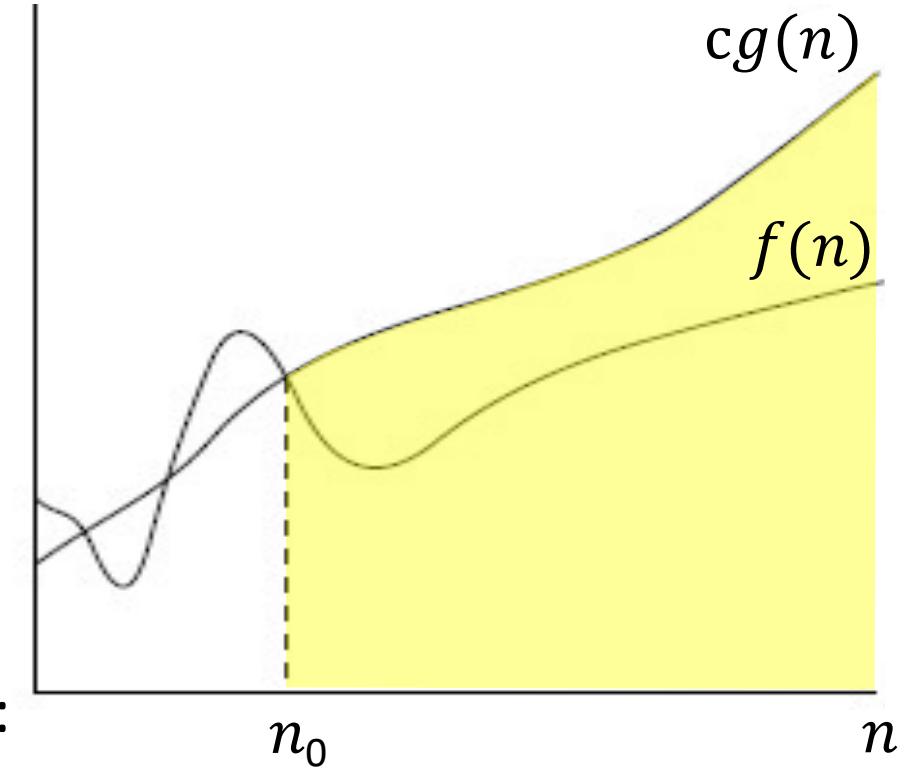
- $f(n) = 8n-2$, $g(n) = n$, and we need to find $c > 0$ and $n_0 \geq 1$ such that:

$$f(n) \leq cg(n), \text{ for } n \geq n_0$$

$$\rightarrow 8n-2 \leq cn, \text{ for } n \geq n_0$$

- A possible choice is $c = 8$ and $n_0 = 1$, because:

$$8n - 2 \leq 8n, \text{ for } n \geq 1$$

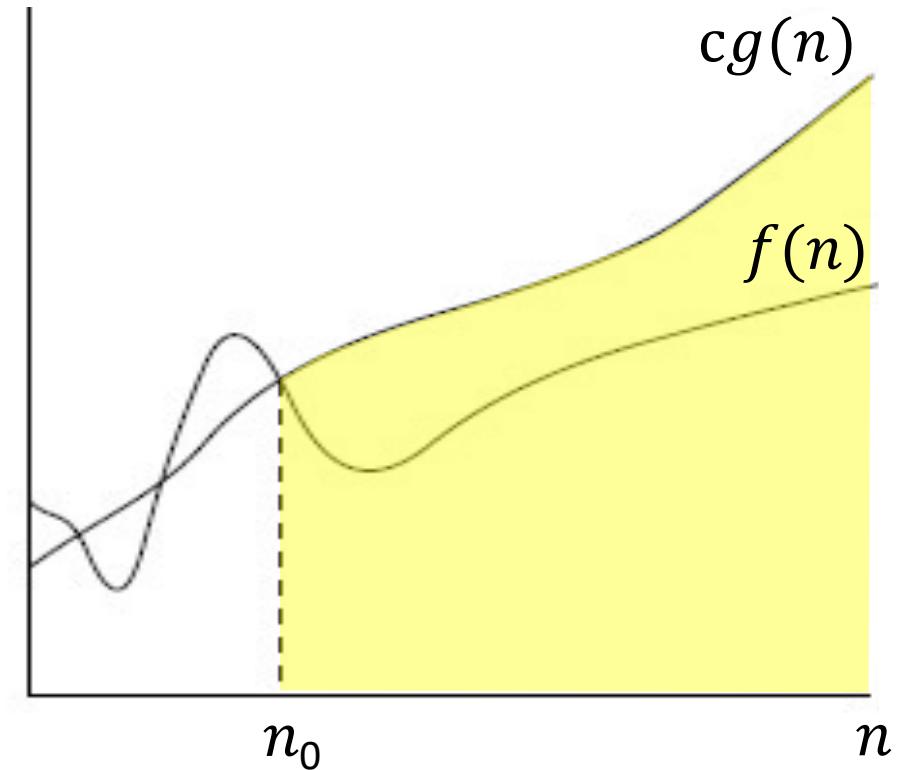


THE “BIG-OH” NOTATION

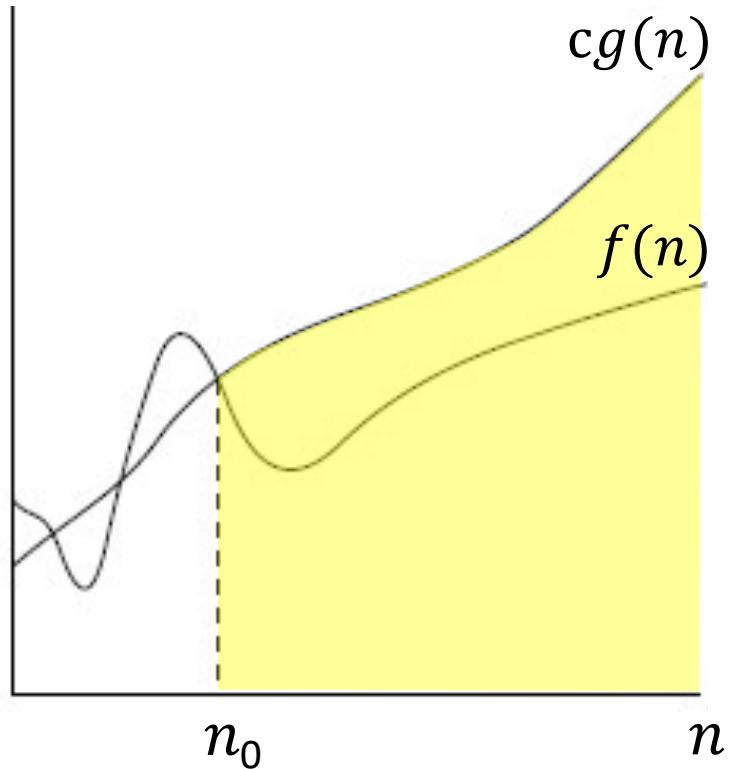
Rule: If $f(n)$ is a polynomial of degree d , i.e.,

$$f(n) = a_0 + a_1n + \dots + a_dn^d$$

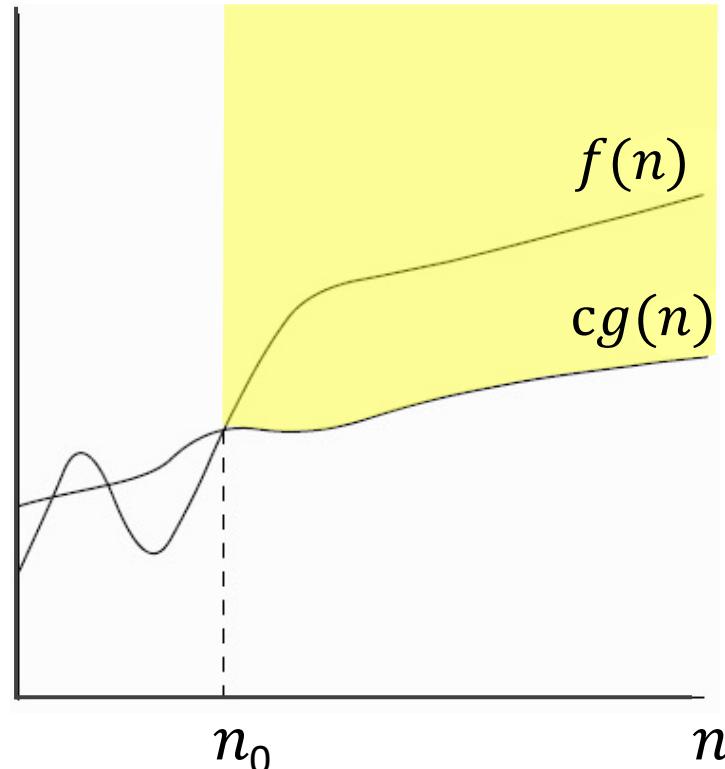
and $a_d > 0$, then: $f(n)$ is $O(n^d)$



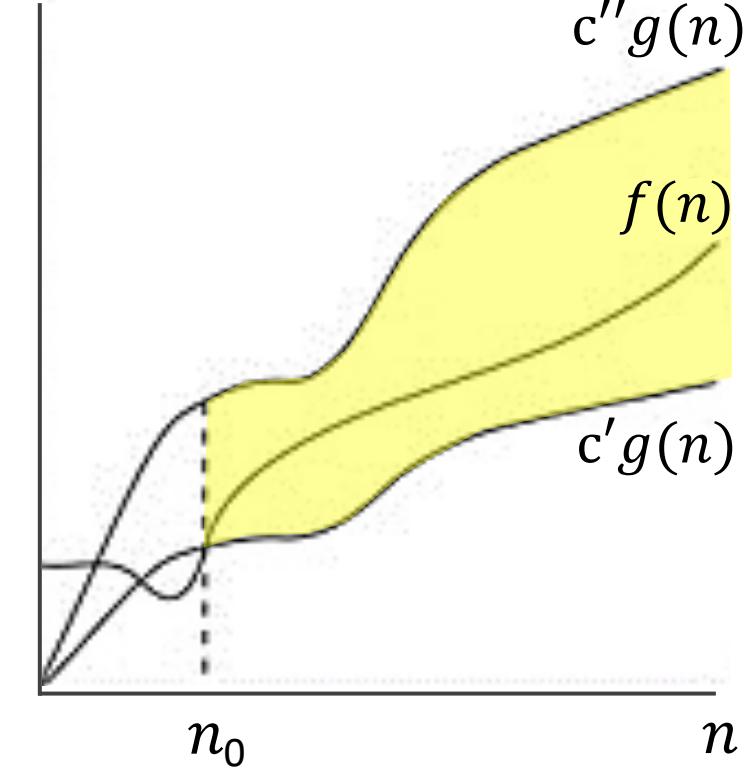
“BIG-OH” VS. “BIG-OMEGA” VS. “BIG-THETA”



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



$f(n)$ is $\Omega(g(n))$



$f(n)$ is $\Theta(g(n))$

WHY DO WE USE THE “BIG-OH”

- The big-Oh notation is used widely to **characterize running time** and **space bound** in terms of some parameter, which may vary from an algorithm to another, but is always defined as a chosen **measure of the “size” of the algorithm**.
- It allows us to **ignore constant coefficients and lower order terms** and focus on the main components of a function that *affect its growth*, i.e. the **“order” of the function**.

THE “BIG-OH” - CONVENTION

- The **seven functions that we've seen** are the most commonly used, e.g.:
 - An algorithm that runs in worst-case time $4n^2 + n \log n$ is said to be a **quadratic-time** algorithm, since it runs in $O(n^2)$ time.
 - An algorithm running in time at most $5n+20 \log n+4$ would be called a **linear-time** algorithm, since it runs in $O(n)$ time.

THE “BIG-OH” - EXAMPLES

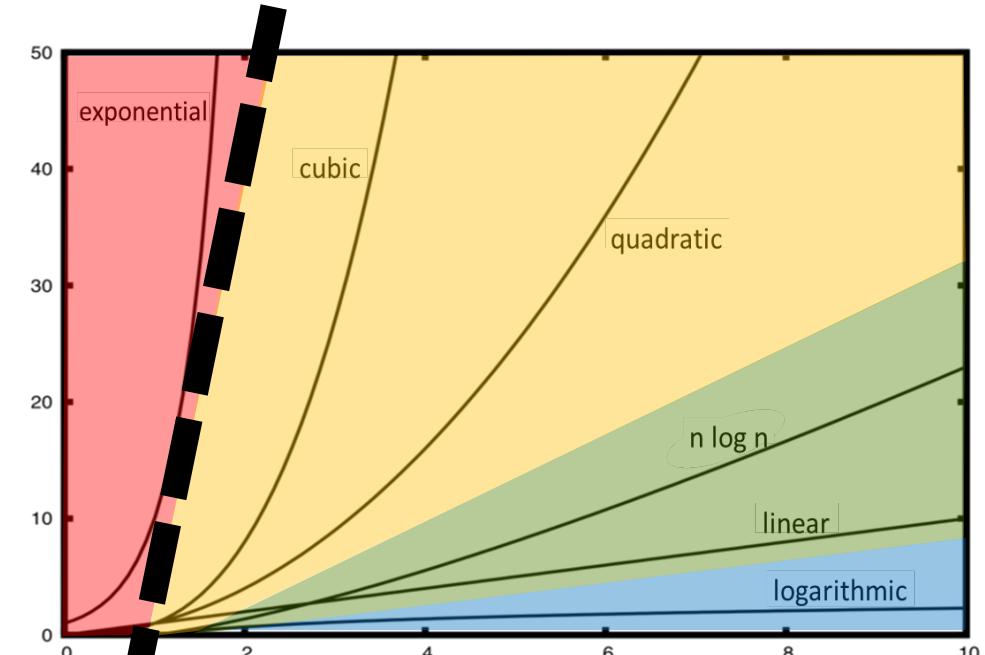
What is the growth rate in big-oh notation for each of these functions?

- $5n^2 + 3n \log n + 2n + 5$ $O(n^2)$
- $20n^3 + 10n \log n + 5$ $O(n^3)$
- $3 \log n + 2$ $O(\log n)$
- 2^{n+2} $O(2^n)$
- $2n + 100 \log n$ $O(n)$

WHAT IS AN “EFFICIENT” ALGORITHM?

What is an efficient algorithm?

- If we must draw a line between **efficient** and **inefficient** algorithms, then this line is often considered to fall between algorithms running in **polynomial** time and those running in **exponential** time.



ANALYSIS EXAMPLE 1 – PREFIX AVERAGE

- Given an array, X , of n elements, design an algorithm that returns an array, A , such that:
 $A[i]$ equals the **average** of the elements $X[0], X[1], \dots, X[i]$
- Here is a potential algorithm. **What is the complexity?**

Algorithm prefixAverages1(X):

for $i \leftarrow 0$ **to** $n - 1$ **do**

$a \leftarrow 0$  No. of executions: n $O(n)$

for $j \leftarrow 0$ **to** i **do**

$a \leftarrow a + X[j]$  No. of executions: $(1+2+3+\dots+n) = \frac{n(n+1)}{2}$ $O(n^2)$

$A[i] \leftarrow a/(i+1)$  No. of executions: n $O(n)$

return array A

- Thus, runtime is a polynomial of degree 2, which is $O(n^2)$

ANALYSIS EXAMPLE 1 – PREFIX AVERAGE

- Given an array, X , of n elements, design an algorithm that returns an array, A , such that:
 $A[i]$ equals the **average** of the elements $X[0], X[1], \dots, X[i]$
- However, one can develop an **alternative** algorithm by exploiting the similarity between $A[i-1]$ and $A[i]$:

$$A[i-1] = (X[0] + X[1] + \dots + X[i-1]) / i$$

$$A[i] = (X[0] + X[1] + \dots + X[i-1] + X[i]) / (i+1)$$

- Thus, if we use a temporary variable, s , that is computed for every i as follows:

$$s = (X[0] + X[1] + \dots + X[i-1])$$

we can compute $A[i]$ as follows:

$$A[i] = s + X[i] / (i+1)$$

ANALYSIS EXAMPLE 1 – PREFIX AVERAGE

- Given an array, X , of n elements, design an algorithm that returns an array, A , such that:
 $A[i]$ equals the **average** of the elements $X[0], X[1], \dots, X[i]$
- Here is the new algorithm. **What is the complexity?**

Algorithm prefixAverages2(X):

$s \leftarrow 0$  No. of executions: 1 $O(1)$

for $i \leftarrow 0$ **to** $n - 1$ **do**

$s \leftarrow s + X[i]$  No. of executions: n $O(n)$

$A[i] \leftarrow s/(i + 1)$  No. of executions: n $O(n)$

return array A

- Thus, it runs in $O(n)$ time, which is **much faster than the previous algorithm!**

ANALYSIS EXAMPLE 2 – POWER FUNCTION

- Design an algorithm that computes power function: $p(x,n) = x^n$
- One potential algorithm uses recursion, based on this definition:

$$p(x,n) = \begin{cases} 1 & \text{if } n = 0 \\ x \cdot p(x, n-1) & \text{otherwise} \end{cases}$$

- Here is the algorithm. **What is the complexity?**

```
int p( int x, int n) {  
    if (n==0) return 1;  
    else return x * p(x,n-1);    ← No. of recursive calls: n O(n)  
}
```

- But did you know there is another recursive definition of $p(x,n)$?

$$p(x,n) = \begin{cases} 1 & \text{if } n = 0 \\ x \cdot p(x, (n-1)/2)^2 & \text{if } n > 0 \text{ is odd} \\ p(x,n/2)^2 & \text{if } n > 0 \text{ is even} \end{cases}$$

ANALYSIS EXAMPLE 2 – POWER FUNCTION

- Let us explain this definition using an **example** where $x = 2$ and $n = 40$:

$$p(x, n) = \begin{cases} 1 & \text{if } n = 0 \\ x \cdot p(x, (n-1)/2)^2 & \text{if } n > 0 \text{ is odd} \\ p(x, n/2)^2 & \text{if } n > 0 \text{ is even} \end{cases}$$

This means if we design a recursive algorithm that uses this definition, it can compute 2^{40} using just 5 recursive calls instead of 40.

- Step 1:** $2^{40} = (2^{40/2})^2 = (2^{20})^2$
- Step 2:** $2^{20} = (2^{20/2})^2 = (2^{10})^2$
- Step 3:** $2^{10} = (2^{10/2})^2 = (2^5)^2$
- Step 4:** $2^5 = 2(2^{4/2})^2 = 2(2^2)^2$ (because 5 is an odd number)
- Step 5:** $2^2 = (2^{2/2})^2 = (2^1)^2$
- Step 6:** $2^1 = 2(2^0)^2 = 2 \times 1 = 2$ (because 1 is an odd number)

ANALYSIS EXAMPLE 2 – POWER FUNCTION

- Here is the new algorithm:

Algorithm Power(x, n):

if $n = 0$ **then**
return 1

if n is odd **then**
 $y \leftarrow \text{Power}(x, (n - 1)/2)$
return $x \cdot y \cdot y$

else
 $y \leftarrow \text{Power}(x, n/2)$
return $y \cdot y$

What is the runtime of this algorithm?

- Each recursive call of Power(x, n) divides the exponent, n , by two.
- Thus, there are $O(\log n)$ recursive calls
- This is much faster than the previous algorithm that made $O(n)$ recursive calls!

CHAPTER 5: STACKS, QUEUES, AND DEQUES

ABSTRACT DATA TYPES

- An **abstract data type** (ADT) is a mathematical model of a **data structure** that specifies:
 - The **type of the data** stored (a.k.a. attributes)
 - The **operations** supported on the data (a.k.a. methods)
 - The types of the **parameters of those operations** (a.k.a. arguments)

As developers, we try to implement ADTs via programming languages in a more complete and detailed representation.

- Here, we will discuss three **examples of ADTs**:
 - Stacks
 - Queues
 - Deques

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STACKS



STACKS

- A **stack** is a data structure that stores objects, which can be added or removed according to the “*Last-in First-out (LIFO)*” principle.



Push a new book on top



Pop a book from top

STACKS

- Formally, a stack is an abstract data type (ADT) that supports the following operations:
 - **push(e)**: Insert element **e** at the top of the stack.
 - **pop()**: Remove the top element from the stack (error if empty).
 - **top()**: Return a reference to the value of the top element on the stack without removing that element (error if empty).
 - **size()**: Return the number of elements in the stack.
 - **empty()**: Return true if the stack is empty and false otherwise

EXAMPLE

- In this example, if we write a stack as follows:

(x,y,z)

It means that:

- z is the **top** of the stack
- x is at the **bottom**

Now, let's fill this table!

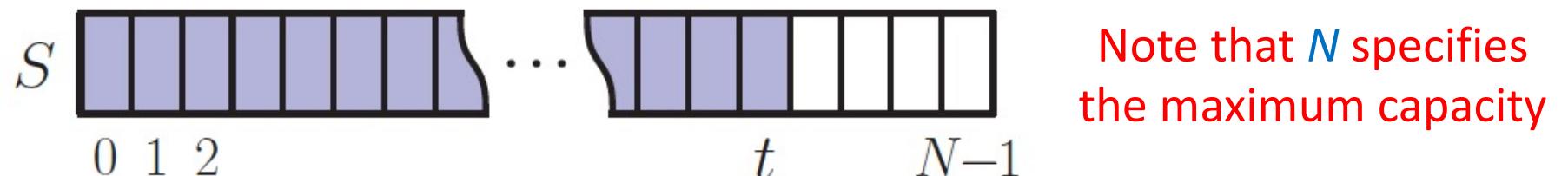
Under “Output” write:

- “error” if there is an error
- The value returned (if the function returns a value)
- “—” if there is no error and the function returns no value

Operation	Output	Stack Contents
push(5)	—	(5)
push(3)	—	(5,3)
pop()	—	(5)
push(7)	—	(5,7)
pop()	—	(5)
top()	5	(5)
pop()	—	()
pop()	“error”	()
top()	“error”	()
empty()	true	()
push(9)	—	(9)
push(7)	—	(9,7)
push(3)	—	(9,7,3)
push(5)	—	(9,7,3,5)
size()	4	(9,7,3,5)
pop()	—	(9,7,3)
push(8)	—	(9,7,3,8)
pop()	—	(9,7,3)
top()	3	(9,7,3)

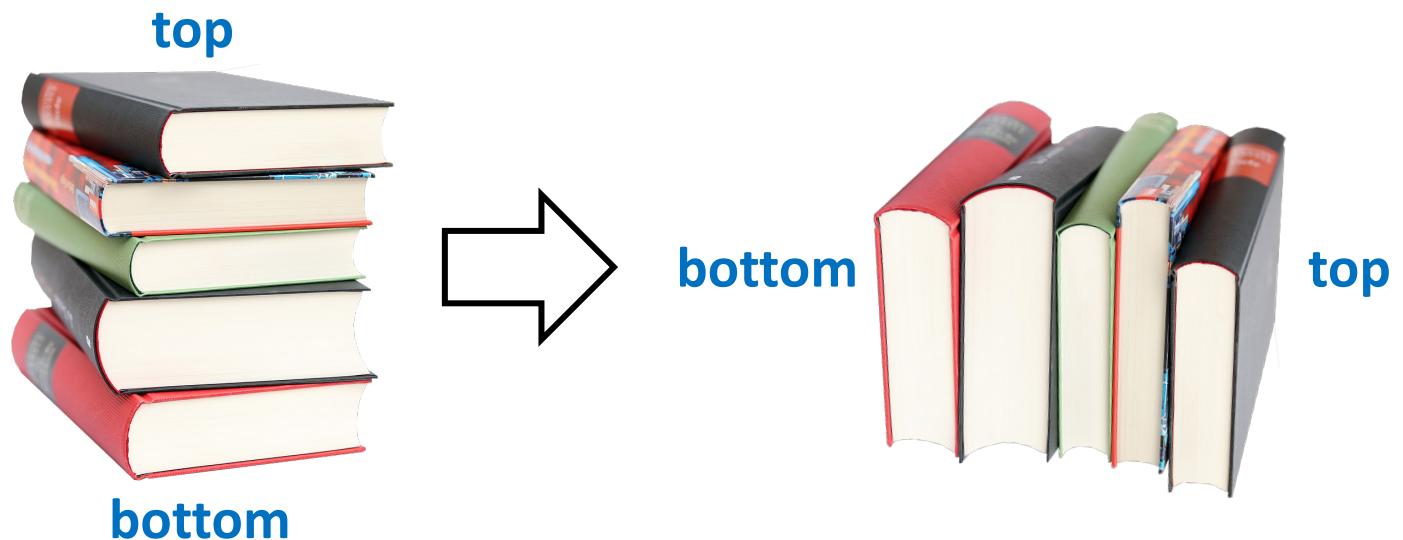
IMPLEMENTATION VIA AN ARRAY

- We can implement a stack by storing its elements in an array S of a fixed-size N , where the bottom element is $S[0]$ and the top one is $S[t]$



Note that N specifies the maximum capacity

- It is as if we rotated the stack clockwise:



THE STACK CLASS STRUCTURE

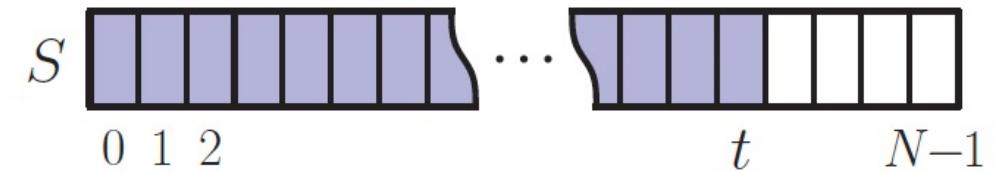
- Main Attributes:

- The predefined capacity of the stack
- An array to store the elements of the stack
- The index of the top element in the stack

- Main Methods:

- `top()`, `push(e)`, `pop()`, `size()` , `empty()`

CLASS DEFINITION



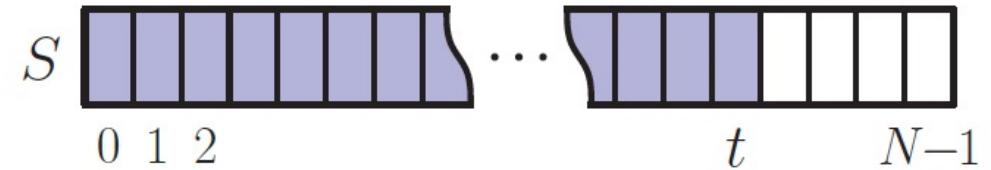
```
template <typename E>
class ArrayStack {
    enum { DEF_CAPACITY = 100 };
public:
    // public members go here...
private:
    E* S; // We will define S as an array that store the elements (see the figure above!)
    int capacity; // stack's maximum capacity (i.e., this is "N" in the figure above!)
    int t; // index of the top of the stack (see the figure above!)
};
```

This line is equivalent to:

const int DEF_CAPACITY = 100;

Which represents the default stack capacity

CLASS DEFINITION



```
template <typename E>
class ArrayStack {
    enum { DEF_CAPACITY = 100 };
public:
    ArrayStack(int cap = DEF_CAPACITY); /* constructor with a parameter “cap”
whose default value is DEF_CAPACITY */
```

```
private:
    E* S;
    int capacity;
    int t;
};
```

In general, you can specify the default value of a parameter, e.g.,

```
void printMessage( string m = “Hello!” ){
    cout << m;
}
```

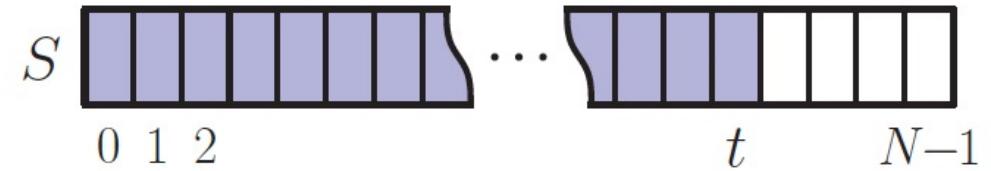
Now if you don’t specify the value of “m”, it will be set to “Hello!”

```
printMessage( ); // this line prints “Hello!”
```

But you can still specify any value you want for “m”, e.g.,

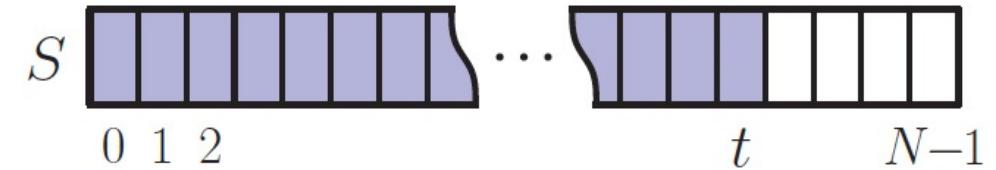
```
printMessage( “Goodbye” ); // this line prints “Goodbye!”
```

CLASS DEFINITION



```
template <typename E>
class ArrayStack {
    enum { DEF_CAPACITY = 100 };
public:
    ArrayStack(int cap = DEF_CAPACITY); /* constructor with a parameter “cap”
                                            whose default value is DEF_CAPACITY */
    int size() const; /* returns the number of elements currently in the stack
                        (we will see its implementation in the coming slides) */
    bool empty() const; // returns “true” if the stack is empty
    const E& top() const throw(StackEmpty); // returns the top element
    void push(const E& e) throw(StackFull); // push element “e” onto stack
    void pop() throw(StackEmpty); // pop the stack (i.e., remove top element)
private:
    E* S; // We will define S as an array that store the elements (see the figure above!)
    int capacity; // stack’s maximum capacity (i.e., this is “N” in the figure above!)
    int t; // index of the top of the stack (see the figure above!)
};
```

METHOD DEFINITION

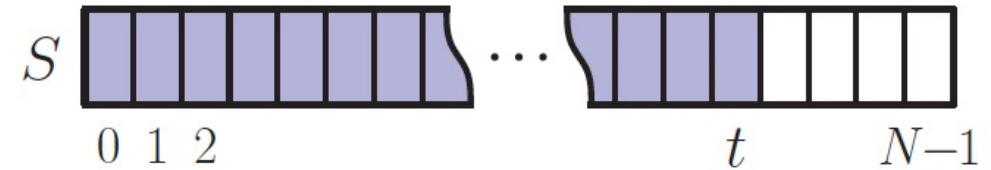


```
// constructor
template <typename E> ArrayStack<E>::ArrayStack(int cap)
: S(new E[cap]), capacity(cap), t(-1) { }
```

This is an initializer list! Remember,
this is the same as writing:

```
S = new E[ cap ];
capacity = cap;
t = -1;
```

METHOD DEFINITION



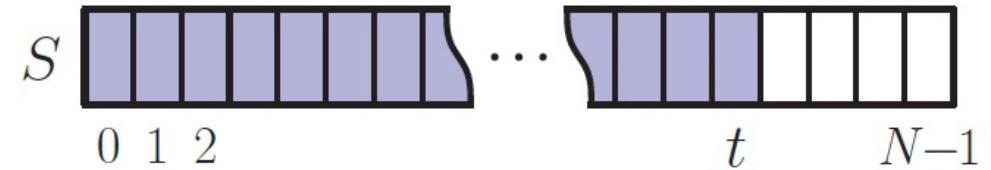
```
// constructor
template <typename E> ArrayStack<E>::ArrayStack(int cap)
: S(new E[cap]), capacity(cap), t(-1) { }

// returns the number of items in the stack
template <typename E> int ArrayStack<E>::size() const {
    return (t + 1);
}

// is the stack empty?
template <typename E> bool ArrayStack<E>::empty() const {
    return (t < 0);
}

// return top of stack
template <typename E> const E& ArrayStack<E>::top() const throw(StackEmpty) {
    if (empty()) throw StackEmpty("Top of empty stack");
    return S[t];
}
```

METHOD DEFINITION

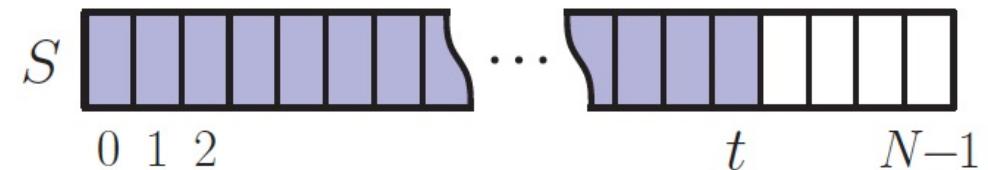


```
// push element onto the stack
template <typename E> void ArrayStack<E>::push(const E& e) throw(StackFull)
{
    if (size() == capacity) throw StackFull("Push to full stack");
    S[++t] = e;
}

// pop the stack
template <typename E> void ArrayStack<E>::pop() throw(StackEmpty)
{
    if (empty()) throw StackEmpty("Pop from empty stack");
    --t;
}
```

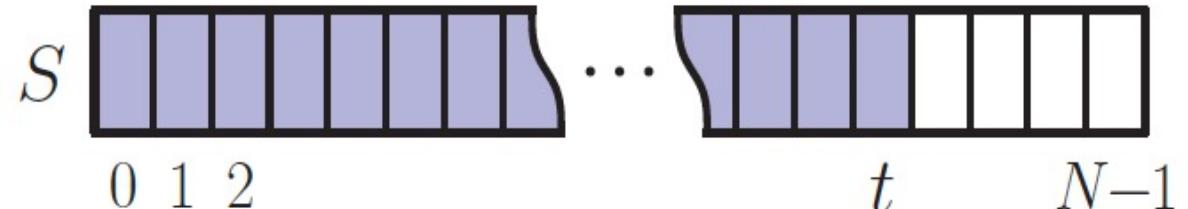
EXAMPLE

```
ArrayStack<int> A;  
A.push(7);  
A.push(13);  
cout << A.top() << endl; A.pop();  
A.push(9);  
cout << A.top() << endl;  
cout << A.top() << endl; A.pop();  
ArrayStack<string> B(10);  
B.push("Bob");  
B.push("Alice");  
cout << B.top() << endl; B.pop();  
B.push("Eve");
```



```
// A = [], size = 0  
// A = [7*], size = 1  
// A = [7, 13*], size = 2  
// A = [7*], outputs: 13  
// A = [7, 9*], size = 2  
// A = [7, 9*], outputs: 9  
// A = [7*], outputs: 9  
// B = [], size = 0  
// B = [Bob*], size = 1  
// B = [Bob, Alice*], size = 2  
// B = [Bob*], outputs: Alice  
// B = [Bob, Eve*], size = 2
```

COMPLEXITY



- What is the complexity of the different methods?

```
// returns the number of items in the stack
template <typename E> int ArrayStack<E>::size() const {
    return (t + 1);
}
// is the stack empty?
template <typename E> bool ArrayStack<E>::empty() const {
    return (t < 0);
}
// return top of stack
template <typename E> const E& ArrayStack<E>::top() const throw(StackEmpty) {
    if (empty()) throw StackEmpty("Top of empty stack");
    return S[t];
}
// push element onto the stack
template <typename E> void ArrayStack<E>::push(const E& e) throw(StackFull)
{
    if (size() == capacity) throw StackFull("Push to full stack");
    S[++t] = e;
}

// pop the stack
template <typename E> void ArrayStack<E>::pop() throw(StackEmpty)
{
    if (empty()) throw StackEmpty("Pop from empty stack");
    --t;
}
```

<i>Operation</i>	<i>Time</i>
size	$O(1)$
empty	$O(1)$
top	$O(1)$
push	$O(1)$
pop	$O(1)$