

# Apply to be a Meiklejohn!

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Meiklejohn applications  
due February 14 at  
5:00pm



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[tinyurl.com/meikapply](https://tinyurl.com/meikapply)

# Announcements

- ▶ Sections have started!
- ▶ Clinic started last week!
  - ▶ Tue & Wed 6-8pm in CIT 227 (Motorola)
- ▶ Let us know if you don't receive graded Homework **1** via email by Thursday
- ▶ **Homework 2** due **Friday 5:00pm**
- ▶ **Seamcarve** due **Monday 11:59pm**

# Expanding Stacks & Queues

CS16: Introduction to Data Structures & Algorithms  
Spring 2019

# What is Running Time?

Asymptotic worst-case running time  
=  
*Number of elementary operations  
on worst-case input  
as a function of input size  $n$   
**when  $n$  tends to infinity***

In CS “running time” usually means asymptotic worst-case running time...but not always!

**we will learn about other kinds of running times**

# Outline

- ▶ Abstract data types
- ▶ Stacks
  - ▶ Capped-capacity
  - ▶ Expandable
- ▶ Amortized analysis
- ▶ Queues
  - ▶ Expandable queues



# Abstract Data Types

- ▶ Abstraction of a data structure
- ▶ Specifies “functionality”
  - ▶ type of data stored
  - ▶ operations it can perform
- ▶ Like a Java interface
  - ▶ Specifies name & purpose of methods
  - ▶ But not implementations





# Stacks

- ▶ Stores
  - ▶ arbitrary objects
- ▶ Operations
  - ▶ **Push**: adds object
  - ▶ **Pop**: returns last object
  - ▶ LIFO: last-in first-out
- ▶ Implemented
  - ▶ Linked list, array, ...



# Stack ADT

- ▶ **push**(object):
  - ▶ inserts object
- ▶ *object* **pop**( ):
  - ▶ returns and removes last inserted object
- ▶ *int* **size**( ):
  - ▶ returns number objects in stack
- ▶ *boolean* **isEmpty**( ):
  - ▶ returns TRUE if empty; FALSE otherwise





# Capped-capacity Stack

- ▶ Array-based Stack
  - ▶ Store objects in array
  - ▶ keep pointer to last inserted object
- ▶ Problem?
  - ▶ Size of stack bounded by size of array :- (

# Capped-capacity Stack

```
Stack( ):
    data = array of size 20
    count = 0
```

```
function isEmpty( ):
    return count == 0
```

```
function size( ):
    ?????
```

```
function push(object):
    ?????
```

```
function pop( ):
    ?????
```

## Activity #1

# Capped-capacity Stack

```
Stack( ):
    data = array of size 20
    count = 0
```

```
function isEmpty( ):
    return count == 0
```

```
function size( ):
    ?????
```

```
function push(object):
    ?????
```

```
function pop( ):
    ?????
```

• **Activity #1**

*2 min*

# Capped-capacity Stack

```
Stack( ):
    data = array of size 20
    count = 0
```

```
function isEmpty( ):
    return count == 0
```

```
function size( ):
    ?????
```

```
function push(object):
    ?????
```

```
function pop( ):
    ?????
```

● **Activity #1**

*1 min*

# Capped-capacity Stack

```
Stack( ):
    data = array of size 20
    count = 0
```

```
function isEmpty( ):
    return count == 0
```

```
function size( ):
    ?????
```

```
function push(object):
    ?????
```

```
function pop( ):
    ?????
```

• **Activity #1**

*O min*

# Capped-capacity Stack

```
Stack( ):  
    data = array of size 20  
    count = 0
```

```
function size( ):  
    return count
```

$O(1)$

```
function isEmpty( ):  
    return count == 0
```

$O(1)$

```
function push(object):  
    if count < 20:  
        data[count] = object  
        count++  
    else:  
        error("overfull")
```

$O(1)$

```
function pop( ):  
    if count == 0:  
        error("empty stack")  
    else:  
        count--  
        return data[count]
```

$O(1)$



# Expandable Stack



- ▶ Capped-capacity stack is fast
  - ▶ but not useful in practice
- ▶ How can we design an *uncapped* Stack?
- ▶ Strategy #1: **Incremental**
  - ▶ increase size of array by constant **c** when full
- ▶ Strategy #2: **Doubling**
  - ▶ double size of array when full

Arrays can't be resized!  
Can only be copied

# Expandable Stack



```
Stack( ):
```

```
data = array of size 20
```

```
count = 0
```

```
capacity = 20
```

What is the runtime?

```
function push(object):
```

```
data[count] = object
```

```
count++
```

```
if count == capacity
```

```
    new_capacity = capacity + c /* incremental */
```

```
                = capacity * 2 /* doubling */
```

```
new_data = array of size new_capacity
```

```
for i = 0 to capacity - 1
```

```
    new_data[i] = data[i]
```

```
capacity = new_capacity
```

```
data = new_data
```

# Expandable Stack

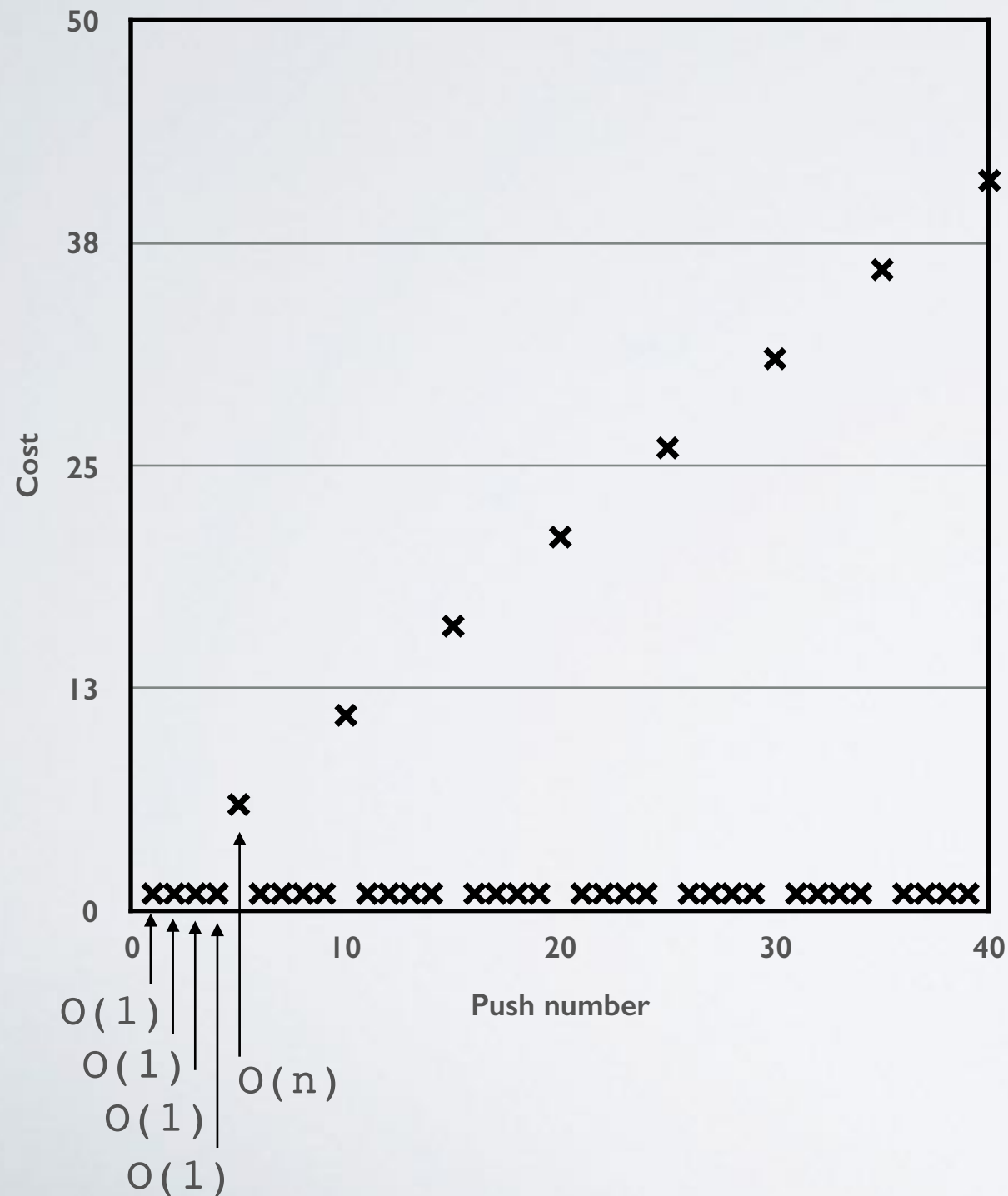


```
function push(object):  
    data[count] = object  
    count++  
    if count == capacity  
        new_capacity = capacity + c /* incremental */  
                       = capacity * 2 /* doubling */  
        new_data = array of size new_capacity  
        for i = 0 to capacity - 1  
            new_data[i] = data[i]  
        capacity = new_capacity  
        data = new_data
```

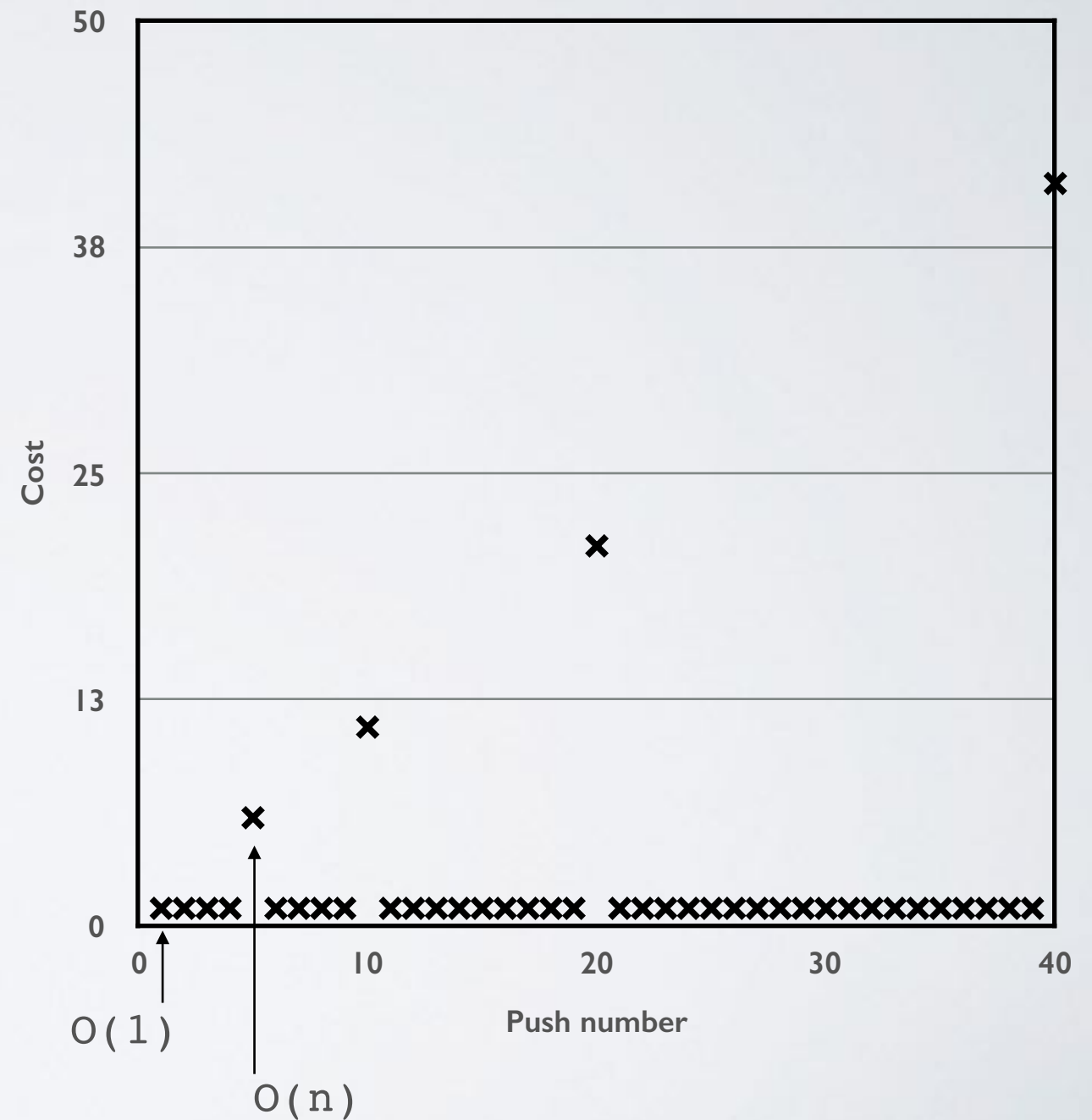
- ▶ Runtime when not expanding is  $O(1)$  & runtime when expanding is  $O(n)$
- ▶ When does it expand?
  - ▶ after  $n$  pushes, where  $n$  is capacity of array

# Incremental & Doubling

## Incremental (5)



## Doubling



# Incremental & Doubling

- ▶ What is the running time of incremental?
  - ▶  $O(1)$  or  $O(n)$ ?
- ▶ What is the running time of doubling?
  - ▶  $O(1)$  or  $O(n)$ ?
- ▶ It depends...



What's going on?



# Expandable Stack



```
Stack( ) :  
    data = array of size 20  
    count = 0  
    capacity = 20
```

**Run time depends on  
count which depends on  
*previous pushes***

```
function push(object):  
    data[count] = object  
    count++  
    if count == capacity  
        new_capacity = capacity + c /* incremental */  
                       = capacity * 2 /* doubling */  
        new_data = array of size new_capacity  
        for i = 0 to capacity - 1  
            new_data[i] = data[i]  
        capacity = new_capacity  
        data = new_data
```

A black arrow originates from the text 'Run time depends on count which depends on previous pushes' and points to the condition 'count == capacity' in the push function code block.

# Incremental & Doubling

- ▶ What is the running time of incremental?
  - ▶  $O(1)$  or  $O(n)$ ?
- ▶ What is the running time of doubling?
  - ▶  $O(1)$  or  $O(n)$ ?
- ▶ It depends...



**Measure cost on sequence of calls not a single call!**

# Towards Amortized Analysis

- ▶ For certain algorithms better to measure
  - ▶ **total** running time on **sequence** of calls
  - ▶ instead of running time on single call
  - ▶  $S(n)$ : total #calls on **sequence** of **n** calls
  - ▶ **Not runtime on a single input of size n**
  - ▶ Usually the case for data structure operations
- ▶ ex: Stack
  - ▶  $S(n)$ : cost push #1 + cost push #2 + ... + cost push #n

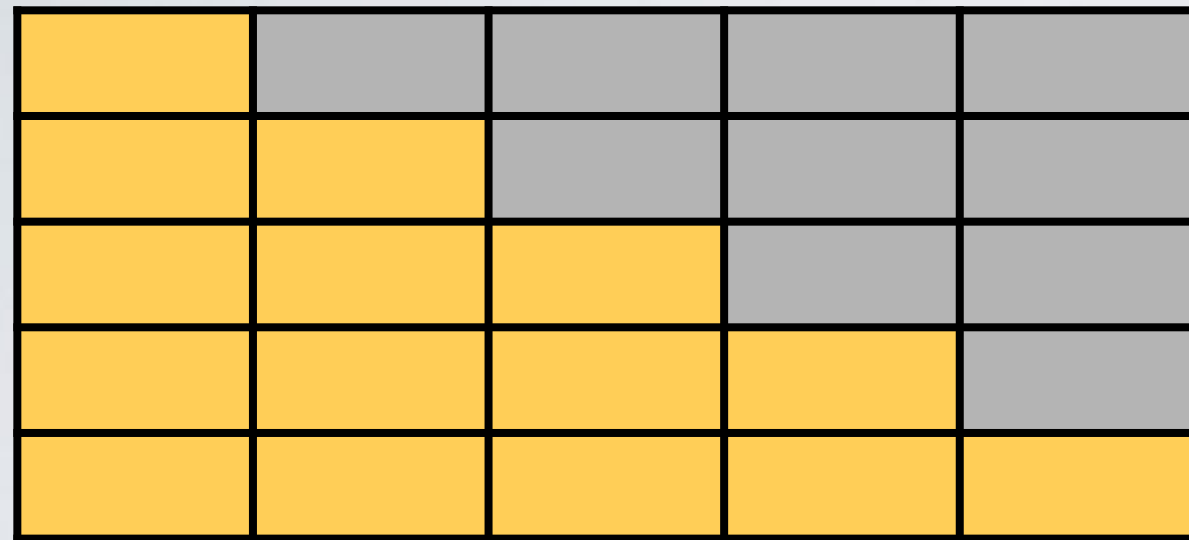
# Amortized Analysis

- ▶ Instead of reporting **total** cost of sequence
  - ▶ report cost of sequence **per call**

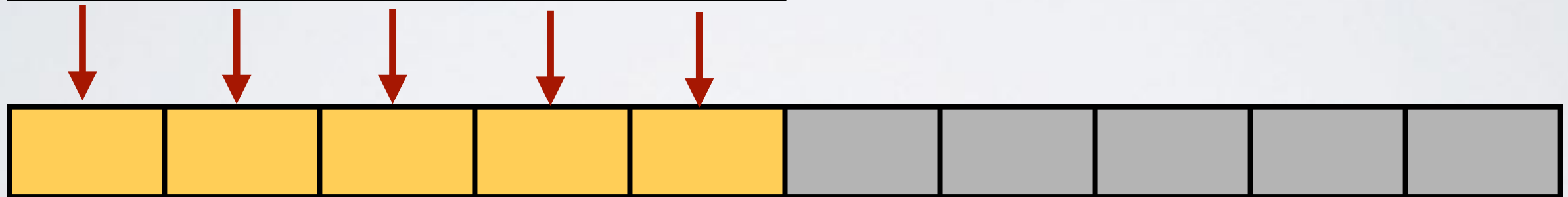
$$\frac{S(n)}{n}$$

*Average  
Joe's*  
GYM

# Amortized Analysis of Incremental

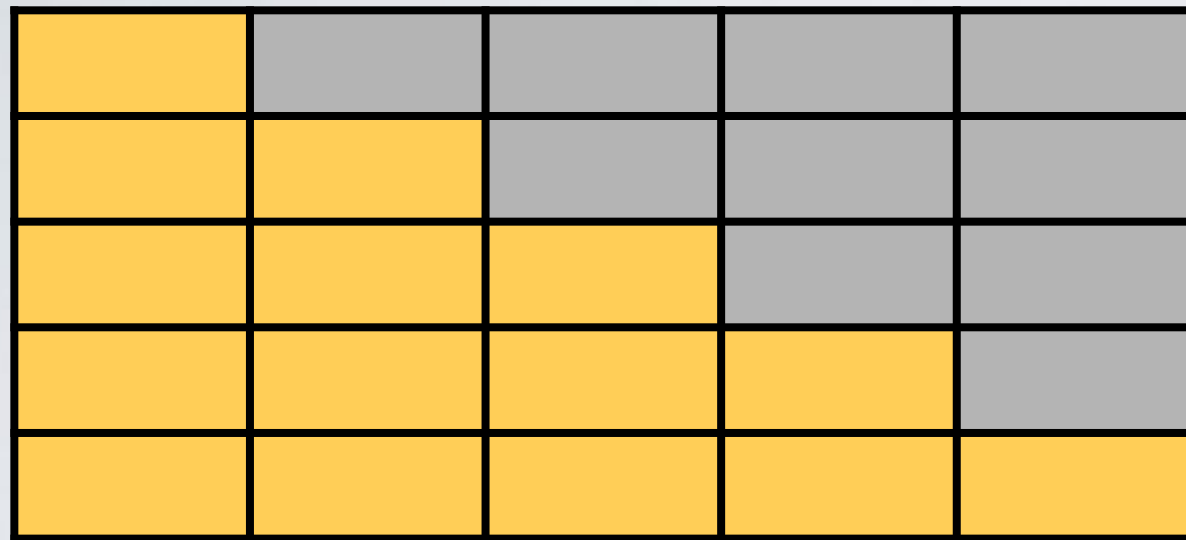


- ▶ Stack with capacity 5
- ▶ Expands by  $c = 5$

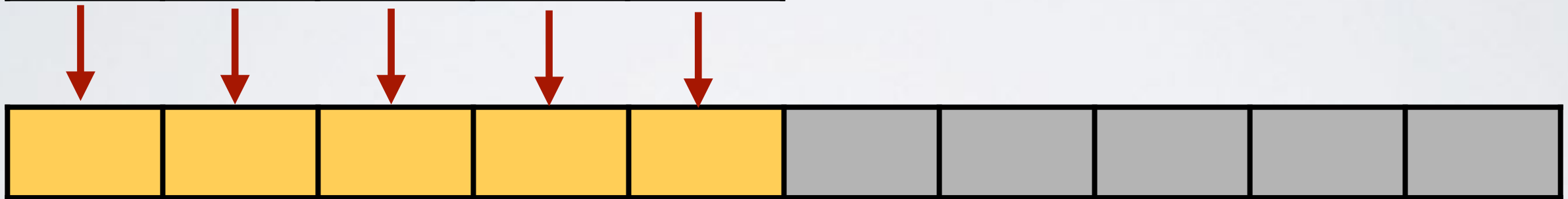


- ▶ 5th push brings to capacity
  - ▶ Objects copied to new array of size  $5+c = 10$
  - ▶ Total cost per push over 5 pushes?

# Amortized Analysis of Incremental



- ▶ Stack with capacity 5
- ▶ Expands by  $c = 5$



$$\frac{S(n)}{n} \Rightarrow \frac{5 + c}{5} \xleftarrow{\text{Cost of expansion}} \frac{5 + 5}{5} = 2$$

**Cost of 5 store ops**

**Cost of expansion**

Is each push  
 $O(1)$ ?



# Amortized Analysis of Incremental

- ▶ What if we push 5 more objects?
- ▶  $O(1)$  until 10th push brings to capacity
  - ▶ then all 10 objects copied to new array
  - ▶ of size  $10+c = 15$

$$\frac{S(n)}{n} = \frac{10 + c + 2c}{10} = \frac{10 + 5 + 10}{10} = 2.5$$

Cost of 10 pushes   Cost of 1st expansion   Cost of 2nd expansion

# Amortized Analysis of Incremental

$$\frac{S(n)}{n} = \frac{S(10)}{10} = \frac{10 + c + 2c}{10} = \frac{10 + 5 + 10}{10} = 2.5$$

$$\frac{S(n)}{n} = \frac{S(15)}{15} = \frac{15 + c + 2c + 3c}{15} = \frac{15 + 5 + 10 + 15}{15} = 3$$

$$\frac{S(n)}{n} = \frac{S(20)}{20} = ?$$

**Activity #2**

# Amortized Analysis of Incremental

$$\frac{S(n)}{n} = \frac{S(10)}{10} = \frac{10 + c + 2c}{10} = \frac{10 + 5 + 10}{10} = 2.5$$

$$\frac{S(n)}{n} = \frac{S(15)}{15} = \frac{15 + c + 2c + 3c}{15} = \frac{15 + 5 + 10 + 15}{15} = 3$$

$$\frac{S(n)}{n} = \frac{S(20)}{20} = ?$$

• **Activity #2**

*1 min*

# Amortized Analysis of Incremental

$$\frac{S(n)}{n} = \frac{S(10)}{10} = \frac{10 + c + 2c}{10} = \frac{10 + 5 + 10}{10} = 2.5$$

$$\frac{S(n)}{n} = \frac{S(15)}{15} = \frac{15 + c + 2c + 3c}{15} = \frac{15 + 5 + 10 + 15}{15} = 3$$

$$\frac{S(n)}{n} = \frac{S(20)}{20} = ?$$

• **Activity #2**

*O min*

# Amortized Analysis of Incremental

$$\frac{S(n)}{n} = \frac{S(10)}{10} = \frac{10 + c + 2c}{10} = \frac{10 + 5 + 10}{10} = 2.5$$

$$\frac{S(n)}{n} = \frac{S(15)}{15} = \frac{15 + c + 2c + 3c}{15} = \frac{15 + 5 + 10 + 15}{15} = 3$$

$$\frac{S(n)}{n} = \frac{S(20)}{20} = \frac{20 + c + 2c + 3c + 4c}{20} = \frac{20 + 5 + 10 + 15 + 20}{20} = 3.5$$

- ▶ So on and so forth...
- ▶ Looks linear...

# Amortized Analysis of Incremental

**n pushes w/o exp.**

**cost of exp. # n/c**

$$S(n) = n + c + 2c + 3c + \dots + \frac{n}{c} \cdot c$$

$$= n + c \cdot \left(1 + 2 + \dots + \frac{n}{c}\right) \leftarrow \text{---factoring out } c$$

$$= n + c \cdot \frac{1}{2} \cdot \left(\frac{n}{c} \left(\frac{n}{c} + 1\right)\right) \leftarrow \text{---using:}$$

$$(1 + 2 + \dots + k) = \frac{k \cdot (k + 1)}{2}$$

$$= n + \frac{n^2/c + n}{2} \leftarrow \text{--- distributing \& simplifying:}$$

$$= O(n^2)$$

$$\frac{S(n)}{n} = O(n)$$



# Amortized Analysis of Incremental

- ▶ Summary

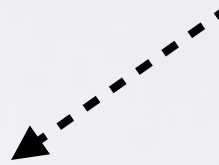
- ▶ Total cost of  $n$  pushes:  $S(n) = O(n^2)$


- ▶ Amortized cost of  $n$  pushes:  $S(n)/n = O(n)$

# Amortized Analysis of Doubling


- ▶ ex: doubling stack with initial capacity 5?
- ▶ pushes are  $O(1)$  until 5th push
- ▶ then linear in capacity

$$\frac{S(n)}{n} = \frac{S(5)}{5} = \frac{5 + 5}{5} = 2$$

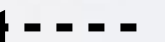

**cost of pushes  
w/o exp**


**cost of exp**

$$\frac{S(n)}{n} = \frac{S(10)}{10} = \frac{10 + 5 + 10}{10} = 2.5$$


**cost of exp  
#2**

$$\frac{S(n)}{n} = \frac{S(20)}{20} = \frac{20 + 5 + 10 + 20}{20} = 2.75$$


**cost of exp  
#3**

# Amortized Analysis of Doubling

**cost of n pushes**      **cost of last exp**      **cost of second to last exp**

$$\begin{aligned}
 S(n) &= n + n + \frac{n}{2} + \frac{n}{4} + \cdots + \frac{n}{2^{k-1}} \quad \leftarrow \text{cost of exp \#1} \\
 &= n + n \cdot \left( 1 + \frac{1}{2} + \frac{1}{4} + \cdots + \frac{1}{2^{k-1}} \right) \\
 &< n + n \cdot 2 \quad \leftarrow \text{using: } \lim_{k \rightarrow \infty} \sum_{i=0}^k \frac{1}{2^i} = 2 \\
 &= 3n
 \end{aligned}$$

Assume:  
 $c=2$   
 $n=2^k$

$$\frac{S(n)}{n} = O(1)$$

# Amortized Analysis

- ▶ Summary for Incremental
  - ▶ Total cost of  $n$  pushes:  $S(n) = O(n^2)$
  - ▶ Amortized cost of  $n$  pushes:  $S(n)/n = O(n)$
- ▶ Summary for Doubling
  - ▶ Total cost of  $n$  pushes:  $S(n) = O(n)$
  - ▶ Amortized cost of  $n$  pushes:  $S(n)/n = O(1)$

# Way to Think about Amortized

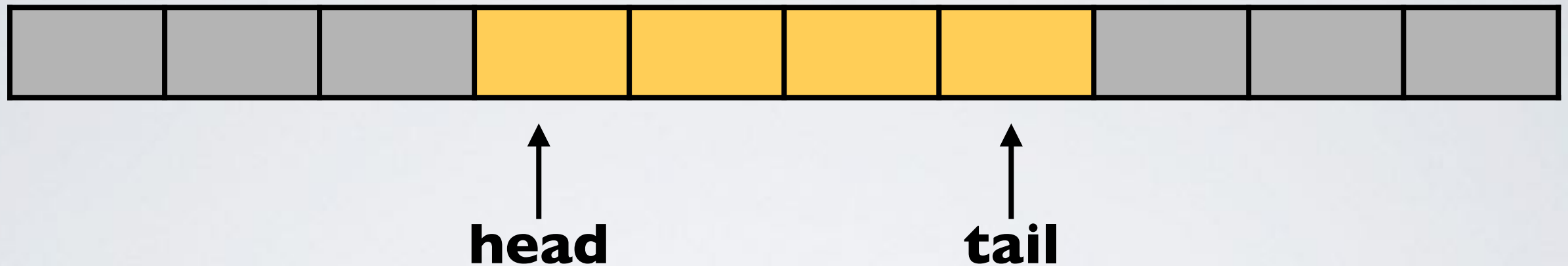
- ▶ Each fast operation adds some credit
- ▶ Need enough credits to execute slow operation

# Queue ADT

- ▶ **enqueue**(object):
  - ▶ inserts object
- ▶ *object* **dequeue**( ):
  - ▶ returns and removes first inserted object
- ▶ *int* **size**( ):
  - ▶ returns number objects in queue
- ▶ *boolean* **isEmpty**( ):
  - ▶ returns TRUE if empty; FALSE otherwise

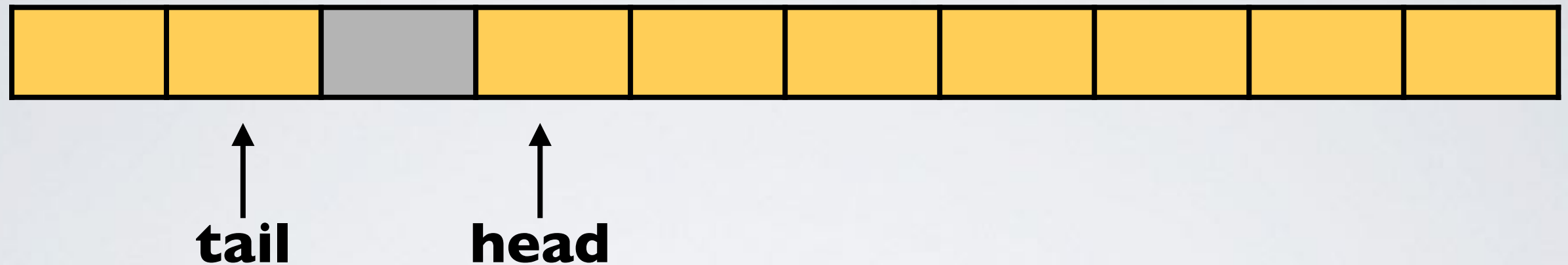


# Expandable Queue



- ▶ Can be implemented with expandable array
  - ▶ need to keep track of head and tail
- ▶ What happens when tail reaches end?
  - ▶ Is the queue full?
- ▶ So when should we expand array?

# Expandable Queue



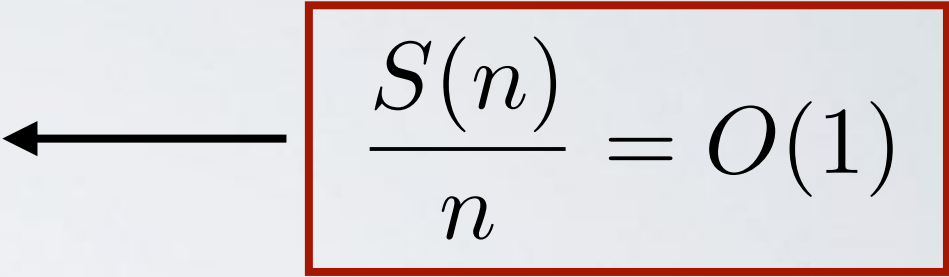
- ▶ Wrap around until array is completely full
- ▶ When expanding re-order objects properly



# Expandable Queue

```
function enqueue(object):  
    if size == capacity  
        double array and copy contents  
        reset head and tail pointers  
    data[tail] = object  
    tail = (tail + 1) % capacity  
    size++
```

```
function dequeue( ):  
    if size == 0  
        error("queue empty")  
    element = data[head]  
    head = (head + 1) % capacity  
    size--  
    return element
```


$$\frac{S'(n)}{n} = O(1)$$