

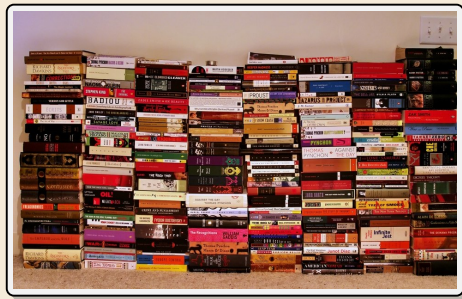
5 October 2022

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Learning Outcomes

1. Understand and demonstrate the difference between *abstract data type (ADT)* and its *implementation*
2. Be able to define the ADTs *stack*, *queue*, *priority queue* and *dictionary/symbol table*
3. Understand *array*-based implementations of stack and queue
4. Understand *linked lists* and the corresponding implementations of stack and queue
5. Know *binary heaps* and their performance characteristics
6. Understand *binary search trees* and their performance characteristics

Unit 2: Fundamental Data Structures



Outline

2 Fundamental Data Structures

- 2.1 Stacks & Queues
- 2.2 Resizable Arrays
- 2.3 Priority Queues & Binary Heaps
- 2.4 Operations on Binary Heaps
- 2.5 Symbol Tables
- 2.6 Binary Search Trees
- 2.7 Ordered Symbol Tables
- 2.8 Balanced BSTs

Recap: The Random Access Machine

- ▶ Data structures make heavy use of pointers and dynamically allocated memory.
- ▶ Recall: Our RAM model supports
 - ▶ basic pseudocode (\approx simple Python code)
 - ▶ creating arrays of a fixed/known size.
 - ▶ creating instances (objects) of a known class.



Python abstracts this away!

There are *no* arrays in Python, only its built-in *lists*.

no predefined capacity!



But: Python *implementations* create lists based on fixed-size arrays (stay tuned!)



Python \neq RAM:

Not every built-in Python instruction runs in $O(1)$ time!

2.1 Stacks & Queues

Abstract Data Types

abstract data type (ADT)

- ▶ list of supported operations
- ▶ **what** should happen
- ▶ **not:** how to do it
- ▶ **not:** how to store data

≈ Java interface, Python ABCs
(with comments)

abstract base classes



VS.

data structures

- ▶ specify exactly **how** data is represented
- ▶ **algorithms** for operations
- ▶ has concrete costs
(space and running time)

≈ Java/Python class
(non abstract)

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Why separate?

- ▶ Can swap out implementations ~~~ “drop-in replacements”

~~~ **reusable code!**

- ▶ (Often) better abstractions
- ▶ Prove generic lower bounds ( ~~~ Unit 3)

# Abstract Data Types

## abstract data type (ADT)

- ▶ list of supported operations
- ▶ **what** should happen
- ▶ **not**: how to do it
- ▶ **not**: how to store data

abst

≈ Java interface, Python ABC  
(with comments)

### *Why separate?*

- ▶ Can swap out implementation

⇒ **reusable code!**

- ▶ (Often) better abstractions
- ▶ Prove generic lower bounds ( ⇒ Unit 3)





## Clicker Question



Which of the following are examples of abstract data types?

- |                             |                                  |
|-----------------------------|----------------------------------|
| <b>A</b> ADT                | <b>G</b> resizable array         |
| <b>B</b> Stack              | <b>H</b> heap                    |
| <b>C</b> Deque              | <b>I</b> priority queue          |
| <b>D</b> Linked list        | <b>J</b> dictionary/symbol table |
| <b>E</b> binary search tree | <b>K</b> hash table              |
| <b>F</b> Queue              |                                  |



→ *sli.do/comp526*

## Clicker Question

Which of the following are examples of abstract data types?



**A** ~~ADT~~

**B** Stack ✓

**C** Deque ✓

**D** ~~Linked list~~

**E** ~~binary search tree~~

**F** Queue ✓

**G** ~~resizable array~~

**H** ~~heap~~

**I** priority queue ✓

**J** dictionary/symbol  
table ✓

**K** ~~hash table~~



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# Stacks



## Stack ADT

- ▶ `top()`  
Return the topmost item on the stack  
Does not modify the stack.
- ▶ `push( $x$ )`  
Add  $x$  onto the top of the stack.
- ▶ `pop()`  
Remove the topmost item from the stack  
(and return it).
- ▶ `isEmpty()`  
Returns `true` iff stack is empty.
- ▶ `create()`  
Create and return an new empty stack.

## Clicker Question

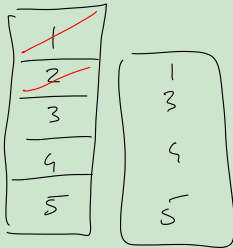
Suppose a stack initially contains the numbers 1,2,3,4,5 with 1 at the top.

What is the content of the stack after the following operations:

`pop(); pop(); push(1);`



- A** 1,2,3,1
- B** 3,4,5,1
- C** 1,3,4,5
- D** empty
- E** 1,2,3,4,5



→ [sli.do/comp526](https://sli.do/comp526)

## Clicker Question

Suppose a stack initially contains the numbers 1,2,3,4,5 with 1 at the top.

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**C** 1,3,4,5 ✓

**D** ~~empty~~

**E** ~~1,2,3,4,5~~

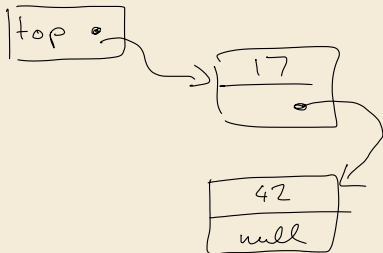


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# Linked-list implementation for Stack

## Invariants:

- ▶ maintain pointer *top* to topmost element
- ▶ each element points to the element below it (or null if bottommost)



```
1 class Node
```

```
2   value
```

```
3   next
```

```
4
```

```
5 class Stack
```

```
6   top := null
```

```
7   procedure top()
```

```
8       return top.value
```

```
9   procedure push(x)
```

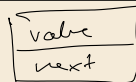
```
10       top := new Node(x, top)
```

```
11   procedure pop()
```

```
12       t := top()
```

```
13       top := top.next
```

```
14       return t
```



↓ is  $\text{Emp}_x$

# Linked-list implementation for Stack – Discussion

## Linked stacks:

👍 require  $\Theta(n)$  space when  $n$  elements on stack

👍 All operations take  $O(1)$  time

👎 require  $\Theta(n)$  space when  $n$  elements on stack

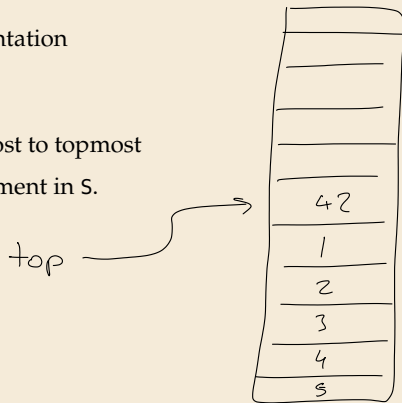
Can we avoid extra space for pointers?

# Array-based implementation for Stack

If we want no pointers  $\rightsquigarrow$  array-based implementation

## Invariants:

- ▶ maintain array  $S$  of elements, from bottommost to topmost
- ▶ maintain index  $top$  of position of topmost element in  $S$ .





# Array-based implementation for Stack

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What to do if stack is full upon push?

## Array stacks:

- ▶ require *fixed capacity*  $C$  (decided at creation time)!
- ▶ require  $\Theta(C)$  space for a capacity of  $C$  elements
- ▶ all operations take  $O(1)$  time

## 2.2 Resizable Arrays

## Digression – Arrays as ADT

Arrays can also be seen as an ADT!

### Array operations:

► `create( $n$ )`     *Java*: `A = new int[ $n$ ];`    *Python*: `A = [0] *  $n$`   
Create a new array with  $n$  cells, with positions  $0, 1, \dots, n - 1$ ;  
we write  $A[0..n) = A[0..n - 1]$

► `get( $i$ )`     *Java/Python*: `A[ $i$ ]`  
Return the content of cell  $i$

► `set( $i, x$ )`     *Java/Python*: `A[ $i$ ] =  $x$ ;`  
Set the content of cell  $i$  to  $x$ .

↪ Arrays have *fixed* size (supplied at creation).     ( $\neq$  lists in Python)

## Digression – Arrays as ADT

Arrays can also be seen as an ADT! ... but are commonly seen as specific data structure

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↪ Arrays have *fixed* size (supplied at creation).     ( $\neq$  lists in Python)

Usually directly implemented by compiler + operating system / virtual machine.



Difference to “real” ADTs: *Implementation usually fixed*  
to “a contiguous chunk of memory”.

## Doubling trick

*Can we have unbounded stacks based on arrays?*      Yes!

# Doubling trick

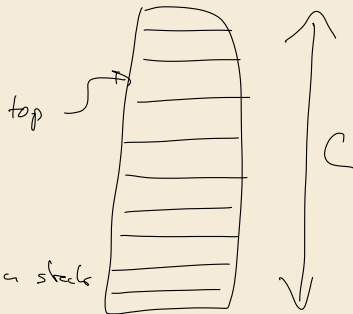
Can we have unbounded stacks based on arrays? Yes!

## Invariants:

- ▶ maintain array  $S$  of elements, from bottommost to topmost
- ▶ maintain index  $top$  of position of topmost element in  $S$
- ▶ maintain capacity  $C = S.length$  so that  $\frac{1}{4}C \leq n \leq C$

~> can always push more elements!

$\parallel$   
# elements on stack



# Doubling trick

Can we have unbounded stacks based on arrays?      Yes!

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~> can always push more elements!

*How to maintain the last invariant?*

- ▶ before push  
If  $n = C$ , allocate new array of size  $2n$ , copy all elements.
- ▶ after pop  
If  $n < \frac{1}{4}C$ , allocate new array of size  $2n$ , copy all elements.

~> ***“Resizing Arrays”***

← an implementation technique, not an ADT!

## Clicker Question



Which of the following statements about resizable array that currently stores  $n$  elements is correct?

- ☐ A The elements are stored in an array of size  $2n$ .
- ☐ B Adding or deleting an element at the end takes constant time.
- ☐ C A sequence of  $m$  insertions or deletions at the end of the array takes time  $O(n + m)$ .
- ☐ D Inserting and deleting any element takes  $O(1)$  amortized time.



→ [sli.do/comp526](https://sli.do/comp526)

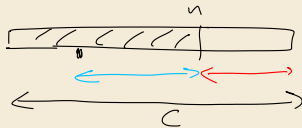


## Amortized Analysis

- ▶ Any individual operation push / pop can be expensive!  
 $\Theta(n)$  time to copy all elements to new array.
- ▶ **But:** An one expensive operation of cost  $T$  means  $\Omega(T)$  next operations are cheap!

# Amortized Analysis

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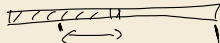


- But:** An one expensive operation of cost  $T$  means  $\Omega(T)$  next operations are cheap!  $\frac{1}{4}C \leq n \leq C$

Formally: consider "credits/potential"  $\Phi = \min\{n - \frac{1}{4}C, C - n\} \in [0, 0.6n]$

distance to boundary

since  $n \leq C \leq 4n$



- amortized cost of an operation = actual cost (array accesses) - 4 · change in  $\Phi$ 
  - cheap push/pop: actual cost 1 array access, consumes  $\leq 1$  credits  $\rightsquigarrow$  amortized cost  $\leq 5$
  - copying push: actual cost  $2n + 1$  array accesses, creates  $\frac{1}{2}n + 1$  credits  $\rightsquigarrow$  amortized cost  $\leq 5$
  - copying pop: actual cost  $2n + 1$  array accesses, creates  $\frac{1}{2}n - 1$  credits  $\rightsquigarrow$  amortized cost 5



sequence of  $m$  operations: total actual cost  $\leq$  total amortized cost + final credits  
 here:  $\leq 5m + 4 \cdot 0.6n = \Theta(m + n)$

$$a_i = c_i - 4(\phi_i - \phi_{i-1}) \leq 5$$

$$\sum_{i=1}^m a_i \leq 5m \geq \sum_{i=1}^m a_i = \sum_{i=1}^m c_i - 4 \underbrace{\sum_{i=1}^m (\phi_i - \phi_{i-1})}_{\phi_m - \phi_0}$$

$$\begin{aligned} \sum_{i=1}^m c_i &\leq 5m + 4\phi_m - 4\phi_0 \\ &\leq 5m + 4\phi_m \end{aligned}$$

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- ☐ D ~~Inserting and deleting any element takes  $O(1)$  amortized time.~~



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# Queues

## Operations:

- ▶ `enqueue( $x$ )`  
Add  $x$  at the end of the queue.
- ▶ `dequeue()`  
Remove item at the front of the queue and return it.



Implementations similar to stacks.

# Bags

*What do Stack and Queue have in common?*

# Bags

*What do Stack and Queue have in common?*

They are special cases of a **Bag**!

## Operations:

- ▶ `insert(x)`  
Add *x* to the items in the bag.
- ▶ `delAny()`  
Remove any one item from the bag and return it.  
(Not specified which; any choice is fine.)
- ▶ roughly similar to Java's `java.util.Collection`  
Python's `collections.abc.Collection`



Sometimes it is useful to state that order is irrelevant  $\rightsquigarrow$  Bag  
Implementation of Bag usually just a Stack or a Queue