

# COL106: Data Structures and Algorithms

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# Data Structures

## Queue and Stack

- Can you implement a stack using an array? What is the running time for each operation?
- Can you implement a stack using a queue? What is the running time for each operation?
- Can you implement a queue using a stack?
- Can you implement a queue using two stacks? What is the running time for each operation?

# Data Structures

Digression: Queue and Stack  $\rightarrow$  Amortized Analysis

## Problem

Implement a Queue using two stacks.

- Let the two stacks be  $A$  and  $B$ .
- Enqueue( $e$ ):  $\text{Push}_A(e)$

## Algorithm

Dequeue()

- If ( $A$  and  $B$  are empty)
  - return(*null*)
- If ( $B$  is not empty)
  - return( $\text{Pop}_B()$ )
- while( $A$  is not empty)
  - $\text{Push}_B(\text{Pop}_A())$
- return( $\text{Pop}_B()$ )



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- What is the running time of each of the basic operations:
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  - Dequeue():

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- What is the running time of each of the basic operations:
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  - Dequeue():  $O(n)$

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  - return(Pop $_B()$ )
- while( $A$  is not empty)
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- return(Pop $_B()$ )

- What is the running time of each of the basic operations:
  - Enqueue( $e$ ):  $O(1)$
  - Dequeue():  $O(n)$
- Comment: It is very pessimistic to say that the running time of the Dequeue() operation is  $O(n)$  (even though correct).
- Is there a better way to analyse the running time in such scenarios where an operation is costly **only sometimes**?

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- Amortized analysis: Per-operation running time averaged over a series of operations.
- Suppose a series of  $n$  operations are performed on the queue. What is the average running time of Dequeue() operation?

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- Suppose a series of  $n$  operations are performed on the queue. What is the average running time of `Dequeue()` operation?
  - When  $B$  is not empty, then the operation takes  $O(1)$  times.
  - When  $B$  is empty, then one has to pop all elements from  $A$  and push them into  $B$ . This would take  $O(|A|)$  time.



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- We can compute the total cost by considering the **cost per element** of the queue and then sum over all elements.
- What is the cost associated with each element?
  - 1 The element is pushed into Stack  $A$ .
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- We can compute the total cost by considering the **cost per element** of the queue and then sum over all elements.
- What is the cost associated with each element? **4 operations**
  - 1 The element is pushed into Stack  $A$ . This costs 1 operation.
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- We can compute the total cost by considering the **cost per element** of the queue and then sum over all elements.
- What is the cost of dequeue associated with each element? **4 operations**
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- So, the **amortized running time** for the operations are:
  - `Enqueue(e)`:  $O(1)$
  - `Dequeue()`:  $O(1)$

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- Another way of viewing this analysis is through of concept of *budgeting*.
- Here, we will argue that  $4n$  coins are enough to fund  $n$  Queue operation where you pay one coin for every simple operation performed in the implementation (that is, on the stack(s)).

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Digression: Queue and Stack → Amortized Analysis

- Amortized analysis: Per-operation running time averaged over a series of operations.
- Let us see another example of Amortized analysis in Data Structures.
- Arrays are most basic data structures where elements can be accessed using *indices*. Contiguous memory locations are used for arrays.
- One common issue while using Arrays is that the array size is fixed once defined and if the array becomes full then there is no way to handle the **overflow**.

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- **Dynamic Arrays** are arrays that are **resizable** and allows to accommodate arbitrary number of elements.
- Such arrays are dynamic in the sense that the array “dynamically adjusts itself in case of overflows”.

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- One common issue while using Arrays is that the array size is fixed once defined and if the array becomes full then there is no way to handle the **overflow**.
- **Dynamic Arrays** are arrays that are **resizable** and allows to accommodate arbitrary number of elements.
- Such arrays are dynamic in the sense that the array “dynamically adjusts itself in case of overflows”.
- Can you implement a dynamic arrays using an regular arrays?

## Problem

Implement Dynamic Arrays using regular Arrays.

- Initialisation: Create an array (say  $A$ ) of some constant size.
- Overflow: Every time the array *overflows*, do:
  - Create an array  $B$  double the size of the current array  $A$  (i.e.,  $|B| = 2|A|$ )
  - Copy all the elements of  $A$  into  $B$
  - Rename  $B$  as  $A$

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- What is the **Amortized** running time of insert operation?

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




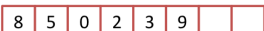


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- What is the running time of insert operation?  $O(n)$
- What is the **Amortized** running time of insert operation?
  - Suppose starting from the empty array (of size 1) one performs  $n$  insert operation in a sequence. What is the total running time?



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#	Operation	Work done	# basic ops.
1	Insert(8)		1
2	Insert(5)		(1 + 1)
3	Insert(0)		(2 + 1)
4	Insert(2)		1
5	Insert(3)		(4 + 1)
6	Insert(9)		1
7	Insert(4)		1
8	Insert(6)		1

- What is the **Amortized** running time of insert operation?
  - Suppose starting from the empty array (of size 1) one performs  $n$  insert operation in a sequence. What is the total running time?
  - If  $2^k \leq n < 2^{k+1}$ , then

$$\begin{aligned}\# \text{ Basic ops.} &= n + (1 + 2 + 2^2 + \dots + 2^k) \\ &= n + 2^{k+1} - 1 \\ &\leq 3n - 1 \\ &= O(n)\end{aligned}$$

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- So, the Amortized running time for the insert operation is  $O(1)$ .

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- What is the **Amortized** running time of insert operation?  $O(1)$
- Budgeting:
  - The cost of copying can be charged to the new cell locations that are created.
  - So, the total number of coins required will be  $n$  (for inserts) and at most  $2n$  (for copies).

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Implement Dynamic Arrays using regular Arrays.

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- What is the **Amortized** running time of insert operation?  $O(1)$

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## Linked List

- One issue with Arrays is that they are not re-sizeable.
- If the only operations that need to be supported are insert and search, then Dynamic Arrays solve the issue of overflow.
- Suppose we also need to support deletion of a particular element or insertion of an element in the middle of the array.
- These operations are costly on Arrays since the elements need to be “shifted” to maintain contiguity.
- One data structure that does not have this issue is **Linked List**.

- Linked List: A collection of nodes with linear ordering defined on them.
  - Each node holds an element and points to the next node in the order.
  - The first node in the ordering is called the **head** and the last is called the **tail**.
  - The tail points to a **null** reference.
  - The data structure is accessed using a reference to the head node.

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Figure : Visual representation of a Linked List



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- Advantages of linked list:
  - The size of the data structure is roughly equal to the size of the elements that need to be stored. So, it is **space-efficient**.
  - The data structure is **resizable**.
  - “Shifting” not required as in the case of Arrays.



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  - The tail points to a **null** reference.
  - The data structure is accessed using a reference to the head node.
- Give the mechanism for performing the following operations along with the running time:
  - Add an element at the beginning of the list:
  - Add an element at the end of the list:
  - Delete a particular node (given its reference):
  - Delete the first node containing element  $e$ :
  - Search element  $e$  in the linked list:
  - Remove the first element of the list:

End