

Amortization!



# Data Structures

## Final Array Theory & Stacks and Queues

Tradeoffs



CS 225

September 10, 2025

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UNIVERSITY OF  
**ILLINOIS**  
URBANA - CHAMPAIGN

Department of Computer Science



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# Exam 1 (9/17 — 9/19)

Autograded MC and one coding question

Manually graded short answer prompt

Practice exam will be released on PL

Topics covered can be found on website

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<https://courses.engr.illinois.edu/cs225/fa2025/exams/>

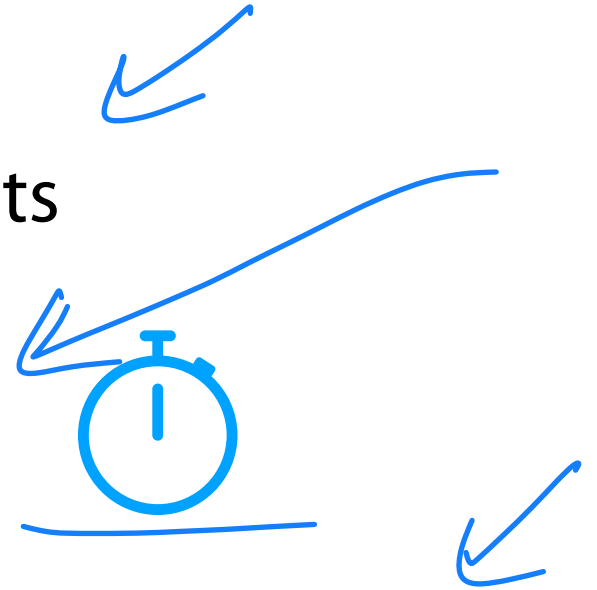
# Preparing for Exams

Make sure you understand the coding assignments

Review lecture slides — especially review slides!

Take a look at 'staff notes' — added to website for past lectures

Do the practice exam before watching practice exam solution video



# Learning Objectives

Discuss amortized analysis

On exam

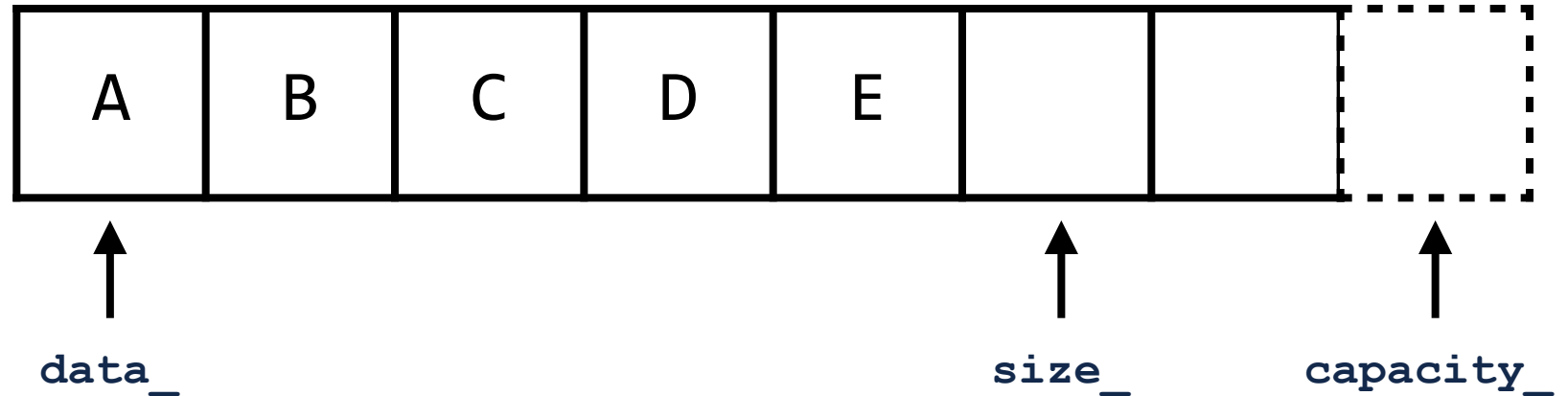
Consider extensions to lists (data structure tradeoffs)

Introduce the stack and the queue data structure

not  
on  
exam

Introduce and explore iterators

# Array List



In C++, vector is implemented as:

- 1) **Data:** Stored as a pointer to array start
- 2) **Size:** Stored as a pointer to the next available space
- 3) **Capacity:** Stored as a pointer past the end of the array

# Array List: Not at capacity

C	S	2	2	5					
---	---	---	---	---	--	--	--	--	--

finding values is fast  $O(1)$   
Modifying (moving all values) slow  $O(n)$

**@Front**

**@Back**

**@Index**

**Insert**

$O(n)$

$O(1)$

$O(n)$

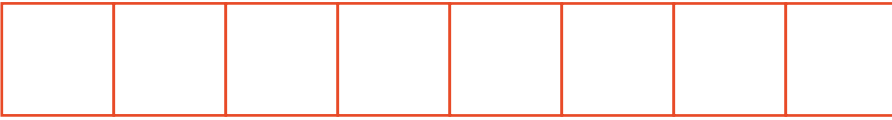
**Delete**

$O(n)$

$O(1)$

$O(n)$

# Resize Strategy: +2 elements every time





# Resize Strategy: +2 elements every time

Total copies for N inserts:  $\frac{N^2 + 2N}{4}$

## Amortized:

Precise total work over N calls

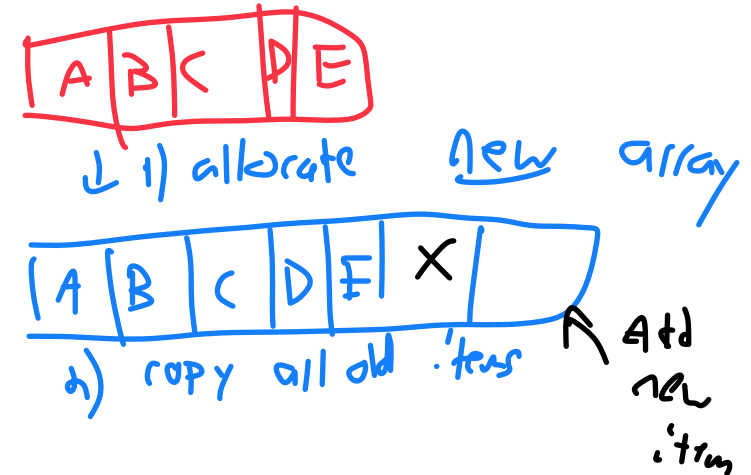
↳ How much total work "lost" for a single insert?

Single insert is  $\frac{\text{total}}{N} \Rightarrow \sim N$  Copies per insert

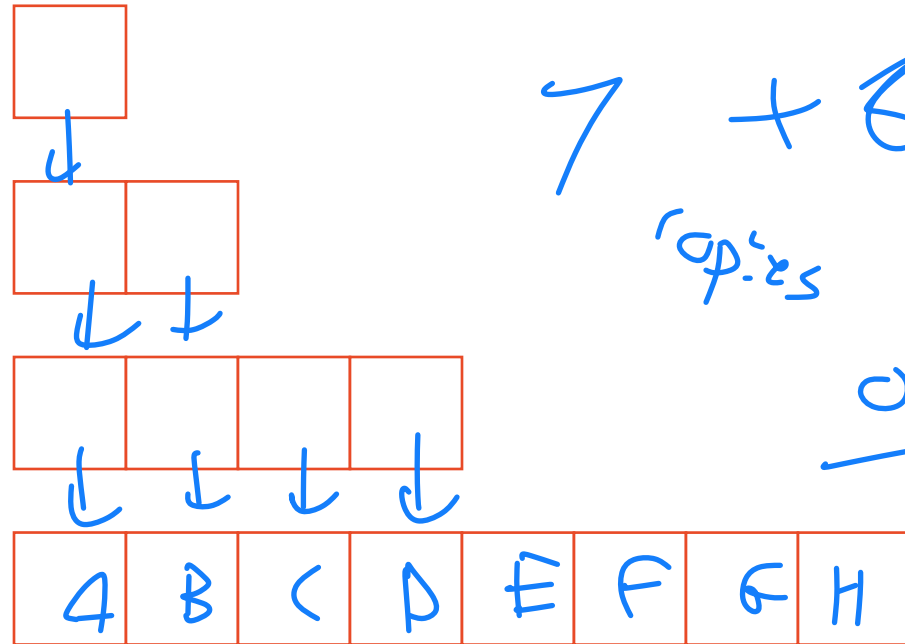
## Big O:

Upperbound on worst case

$O(N)$  for N items in list



# Resize Strategy: x2 elements every time



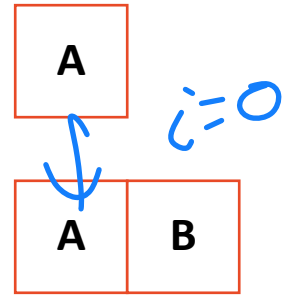
7 + 8  
ops. insert back  
 $O(1)$  per "insert"

1) Every operation has worst case  $O(n)$

2) By direct calcs we show that bad inserts  $[O(n)]$  happen exactly once after  $N/2$  "good"  $[O(1)]$  inserts



# Resize Strategy: x2 elements every time



**1) How many copy calls per reallocation?**

For reallocation  $i$ ,  $2^i$  copy calls are made

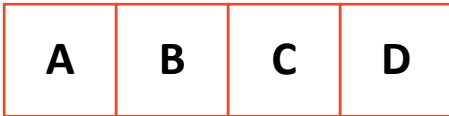
**2) Total reallocations for N objects?**

$k = \text{final realloc needed} = \lceil \log_2 n \rceil$

**Total number of copy calls:**

# Resize Strategy: x2 elements every time

## 1) How many copy calls per reallocation?



For reallocation  $i$ ,  $2^i$  copy calls are made

## 2) Total reallocations for N objects?

$k = \text{final realloc needed} = \lceil \log_2 n \rceil$

**Total number of copy calls:**

$$\sum_{i=0}^k 2^i = 2^{k+1} - 1$$

Sum of all reallocations

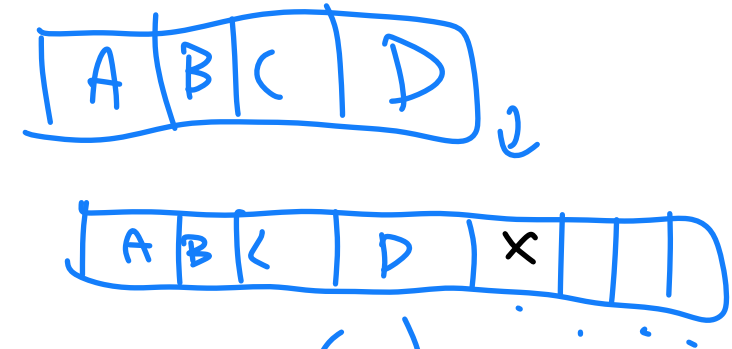
$\pm$  copies per realloc

**... For N objects:**  $2n - 1$

$2^{\log_2 N + 1}$

# Resize Strategy: x2 elements every time

Total copies for  $n$  inserts:  $2n - 1$



**Amortized:**  $\sim 2$  copies per insert  
amortized  $O(1)^*$

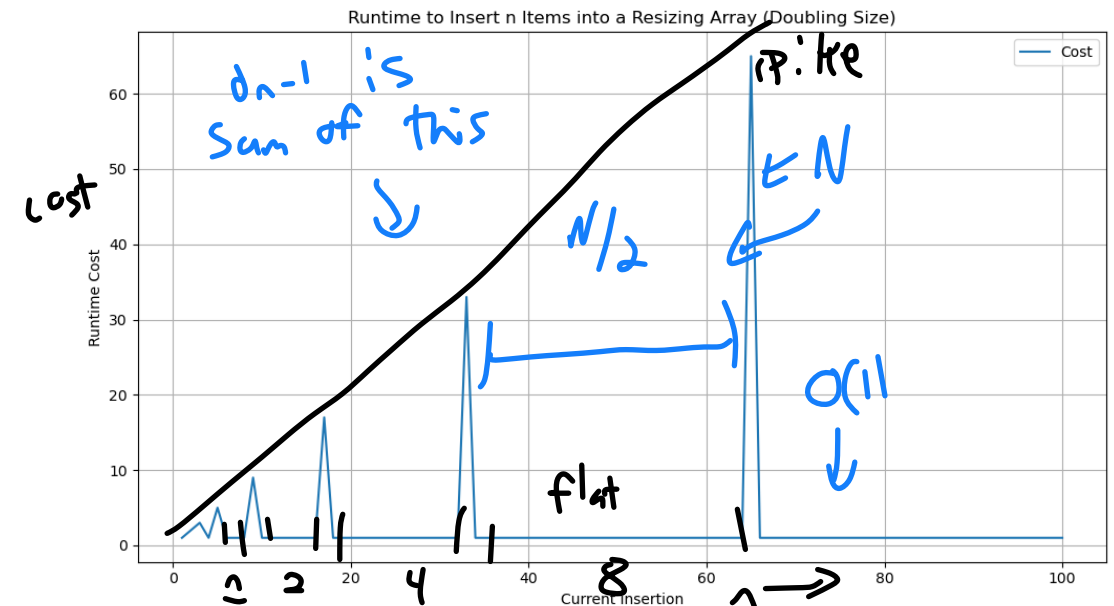
Precise total work over  $N$  calls

$\frac{2n-1}{N}$  to get expected work for each insert

$\sim 2$

**Big O:**  $O(1)$

Upperbound on worst case



# List Implementation



	Singly Linked List	Array
Look up <u>arbitrary</u> location ↳ random access	$O(n)$	$O(1)$ ☺
Insert after <b>given</b> element	$O(1)$ ☺	$O(n)$
Remove after <b>given</b> element	$O(1)$ ☺	$O(n)$
Insert at <b>arbitrary</b> location	Find is $O(n)$ Mod is $O(1)$ $O(n)$	Find is $O(1)$ Mod is $O(n)$ $O(n)$
Remove at <b>arbitrary</b> location	$O(n)$	$O(n)$
Search for an input <b>value</b>	$O(n)$	$O(n)$

Special Cases:

insert  
remove

Front

(head)

insert  
remove

Back

when not  
full

# Thinking critically about lists: tradeoffs

The implementations shown are foundational (simple).

Can we make our lists better at some things? What is the cost?

---

# Thinking critically about lists: tradeoffs

Getting the size of a linked list has a Big O of:  $O(n) \rightarrow O(1)$

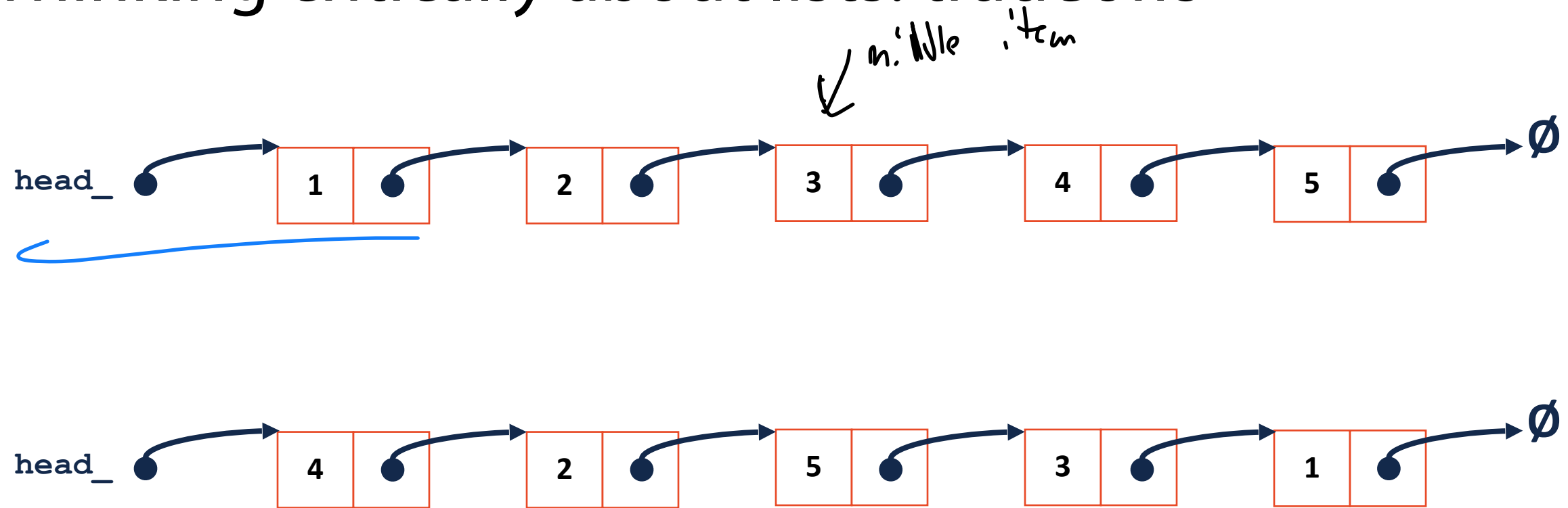
Diagram illustrating a linked list structure. The list contains nodes with values 'c', 's', '2', '7', '7', and a 'None' pointer. A blue arrow indicates the traversal path from 'head' to the end, labeled 'constant work increase to insert remove turns  $O(n)$  into  $O(1)$ '. A blue arrow under the node '2' is labeled 'Count++'.

Added to LinkedList class  
↳ unsigned size\_;

insert  
↳ size\_++;  
~~remove~~ remove  
↳ size\_--;



# Thinking critically about lists: tradeoffs



# Thinking critically about lists: tradeoffs

2	7	5	9	7	14	1	0	8	3
---	---	---	---	---	----	---	---	---	---

0	1	2	3	5	7	7	8	9	14
---	---	---	---	---	---	---	---	---	----

Benefit:

Search

$O(n)$

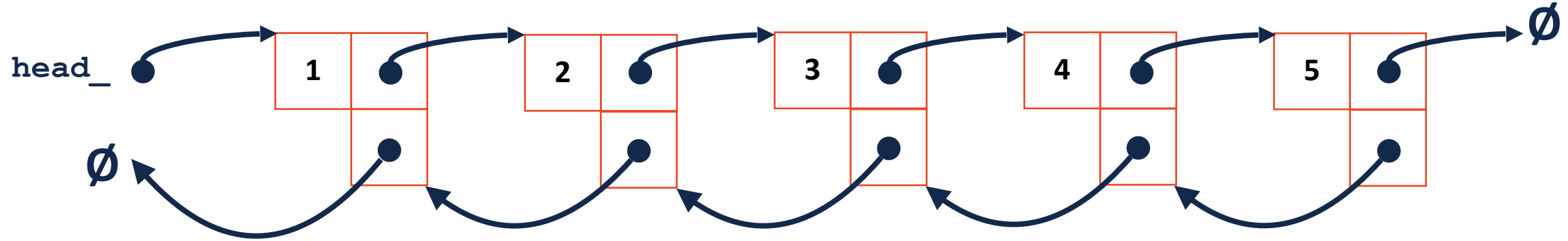
to

$O(\log n)$

Cost

insert Back doesn't exist

# Thinking critically about lists: tradeoffs



Doubly linked list!

Cost: Storage cost!

# Thinking critically about lists: tradeoffs

As we progress in the class, we will see that  $O(n)$  isn't very good.

Take searching for a specific list value:

2	7	5	9	7	14	1	0	8	3
---	---	---	---	---	----	---	---	---	---

0	1	2	3	5	7	7	8	9	14
---	---	---	---	---	---	---	---	---	----

# Thinking critically about lists: tradeoffs

Can we make a 'list' that is  $O(1)$  to insert and remove?

Possible if we remove our ability to do random  
access

# Stack Data Structure

A **stack** stores an ordered collection of objects (like a list)

However you can only do two\* operations:

**Push:** Put an item on top of the stack

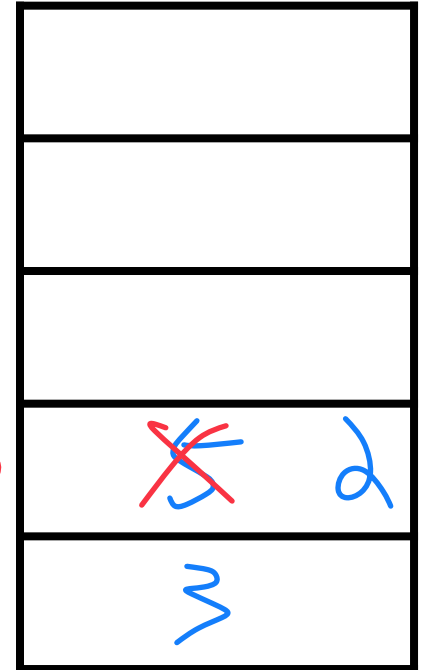
**Pop:** Remove the top item of the stack (and return it)

pop() →

Top: Look at top item

`push(3) ; push(5) ; pop() ; push(2)`

**Top**

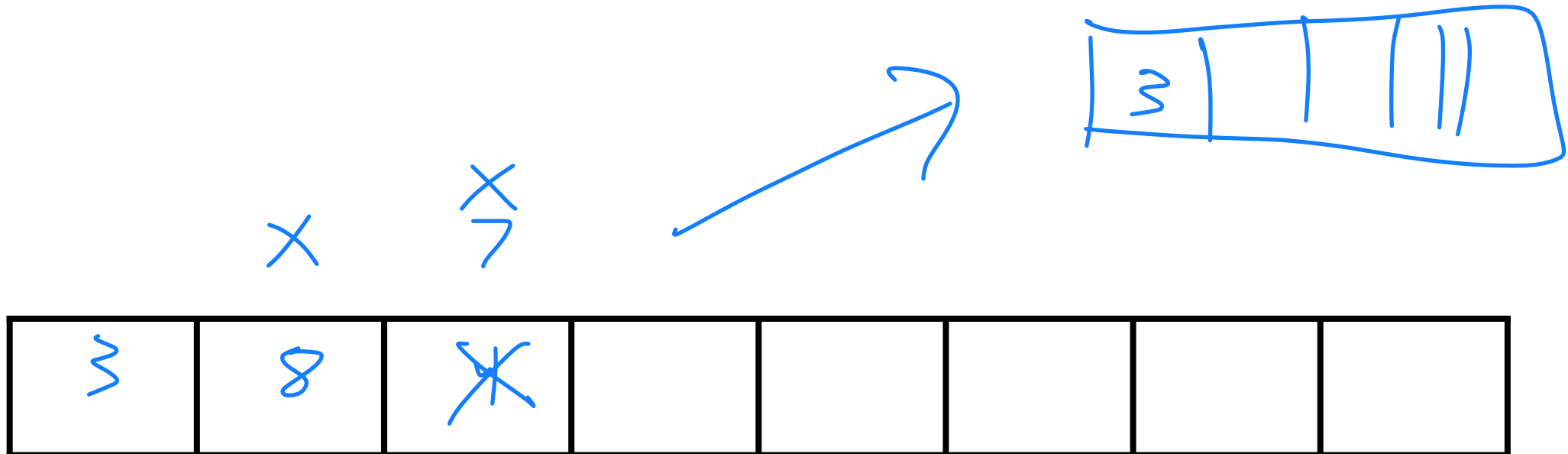


# Stack Data Structure

C++ has a built-in stack

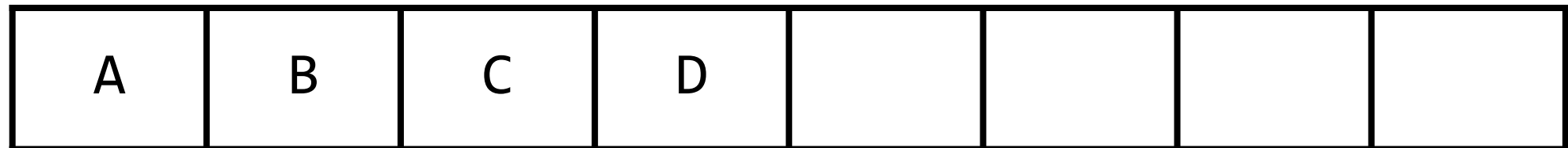
Underlying implementation is vector or deque

```
1 #include <stack>
2 int main() {
3     stack<int> stack;
4     stack.push(3);
5     stack.push(8);
6     stack.push(4);
7     stack.pop();
8     stack.push(7);
9     stack.pop();
10    stack.pop();
11 }
```



# Stack Data Structure

Push(X) is equivalent to ...





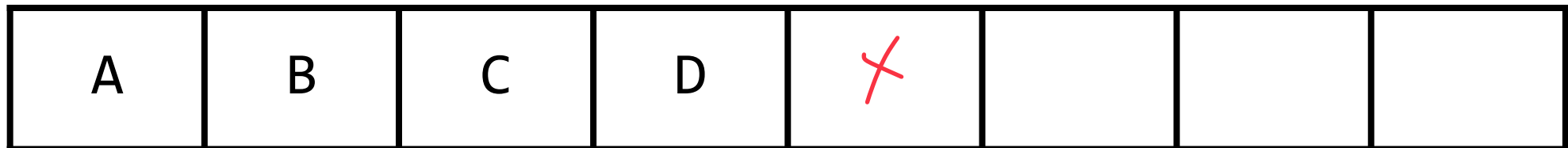
# Stack Data Structure

Push(X) is equivalent to insertBack(X)

$O(1)$

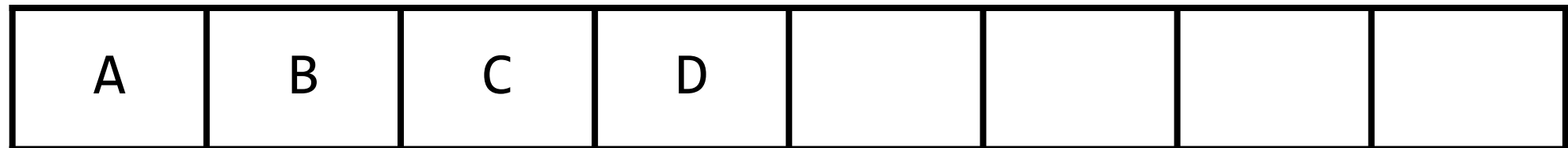
`*size = X;`

`size++;`



# Stack Data Structure

Pop() is equivalent to...



# Stack Data Structure

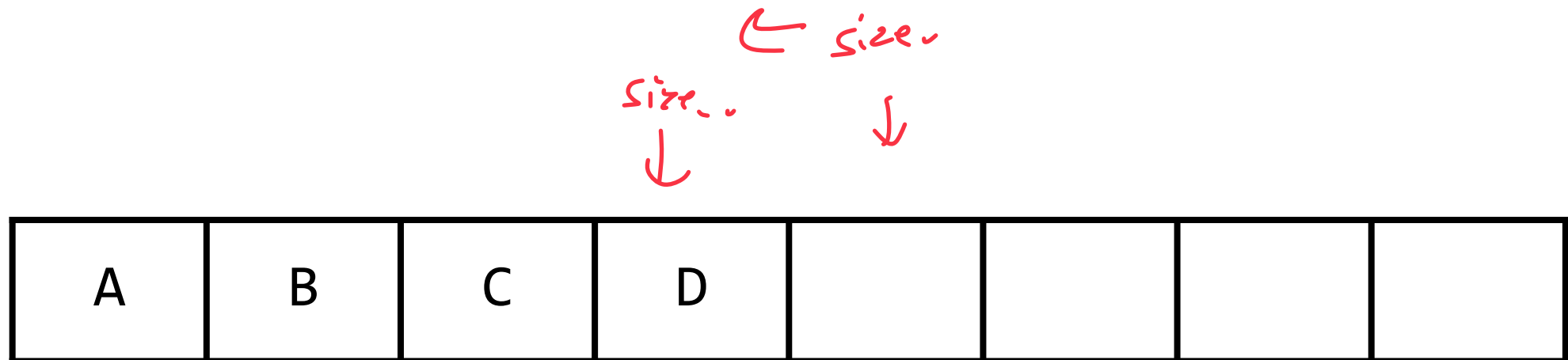
Pop() is equivalent to removeBack()

size--;  $O(1)$

$O(1)$

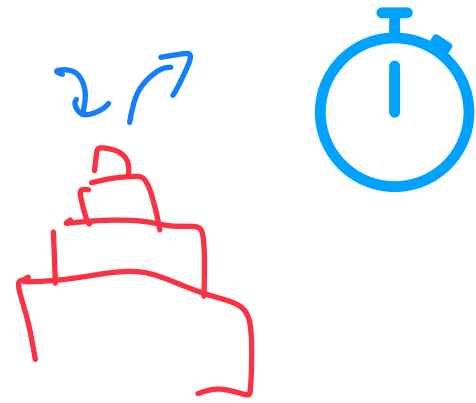
T tmp = \*size;  $O(1)$

return tmp;  $O(1)$



# Stack ADT

- [Order]: Last in first out (LIFO)

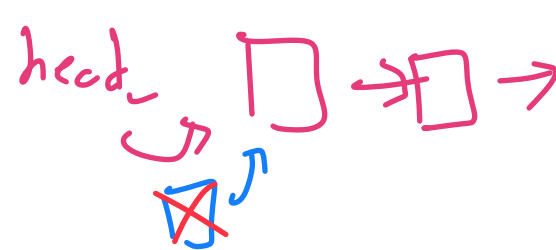


- [Implementation]: Trivially as an array!

Could I do this as a linked list? Yes! insert/remove front

- [Runtime]:  $O(1)$ \*

as long as array not full



This  
cant  
be full

# Queue Data Structure

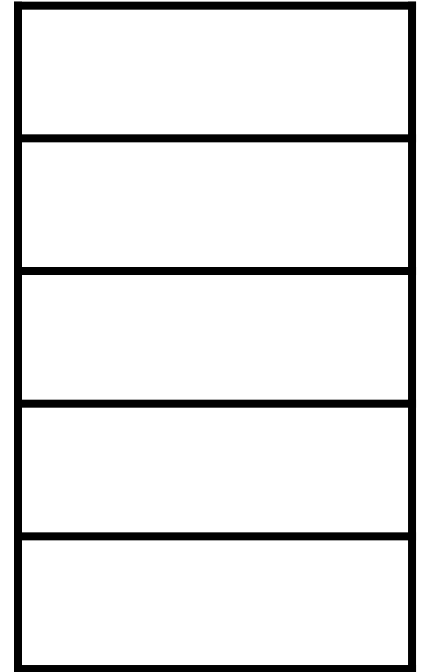
A **queue** stores an ordered collection of objects (like a list)

However you can only do two\* operations:

**Enqueue:** Put an item at the back of the queue

**Dequeue:** Remove and return the front item of the queue

**Front**



```
enqueue (3) ; enqueue (5) ; dequeue () ; enqueue (2)
```

# Queue Data Structure

The queue is a **first in — first out** data structure (FIFO)

What data structure excels at removing from the front?

Can we make that same data structure good at inserting at the end?

# Queue Data Structure

The C++ implementation of a queue is also a vector or deque — why?

# Engineering vs Theory Efficiency

	Time x1 billion	Like
L1 cache reference	0.5 seconds	Heartbeat 💖
Branch mispredict	5 seconds	Yawn 🥱
L2 cache reference	7 seconds	Long yawn 🥱 🥱 🥱
Mutex lock/unlock	25 seconds	Make coffee ☕
Main memory reference	100 seconds	Brush teeth
Compress 1K bytes	50 minutes	TV show 📺
Send 2K bytes over 1 Gbps network	5.5 hours	(Brief) Night's sleep 🛌
SSD random read	1.7 days	Weekend
Read 1 MB sequentially from memory	2.9 days	Long weekend
Read 1 MB sequentially from SSD	11.6 days	2 weeks for delivery 📦
Disk seek	16.5 weeks	Semester
Read 1 MB sequentially from disk	7.8 months	Human gestation 🐣
Above two together	1 year	🌍 ☀️
Send packet CA->Netherlands->CA	4.8 years	Ph.D. 🎓

(Care of <https://gist.github.com/hellerbarde/2843375>)



# Engineering vs Theory Efficiency

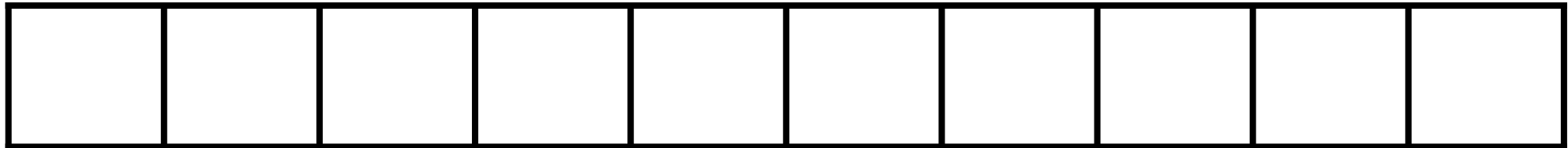
	Time x1 billion	Like
L1 cache reference	0.5 seconds	Heartbeat 💖
Main memory reference	100 seconds	Brush teeth
SSD random read	1.7 days	Weekend
Disk seek	16.5 weeks	Semester
Send packet CA->Netherlands->CA	4.8 years	Ph.D. 🎓

(Care of <https://gist.github.com/hellerbarde/2843375>)

# Queue Data Structure

```
q.enqueue(8);  
q.enqueue(4);  
q.dequeue();
```

What do we need to track to maintain a queue with an array list?

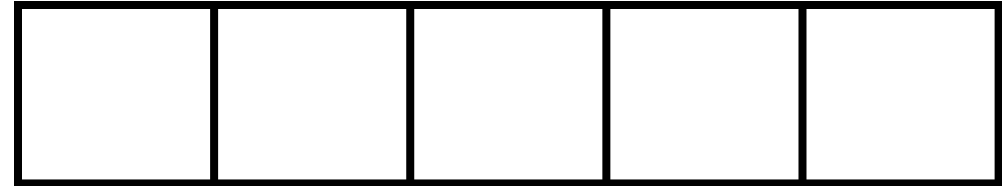


# Queue Data Structure

Unlike the array list, it is easier to implement a Queue using unsigned ints

## Queue.h

```
1  #pragma once
2
3  template <typename T>
4  class Queue {
5      public:
6          void enqueue(T e);
7          T dequeue();
8          bool isEmpty();
9
10     private:
11         T *data_;
12         unsigned size_;
13         unsigned capacity_;
14         unsigned front_;
15 };
```

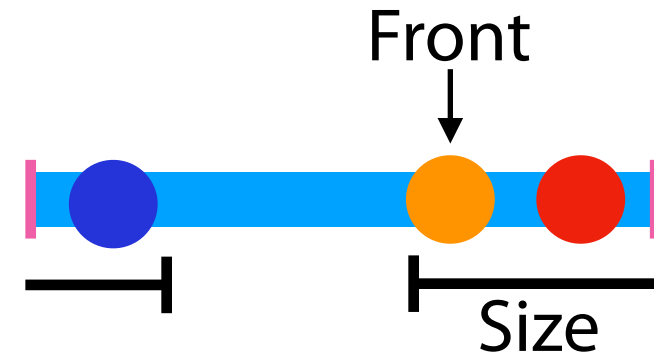
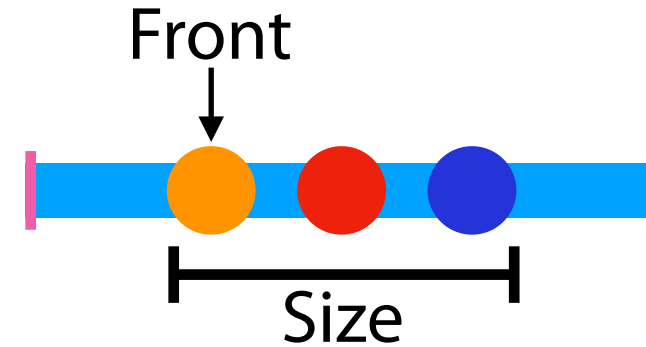


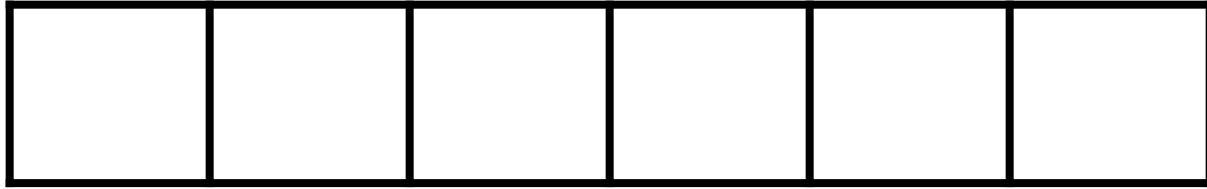
# (Circular) Queue Data Structure



## Queue.h

```
1 #pragma once
2
3 template <typename T>
4 class Queue {
5     public:
6         void enqueue(T e);
7         T dequeue();
8         bool isEmpty();
9
10    private:
11        T *data_;
12        unsigned capacity_;
13        unsigned size_;
14        unsigned front_;
15 };
```





Enqueue(D) :

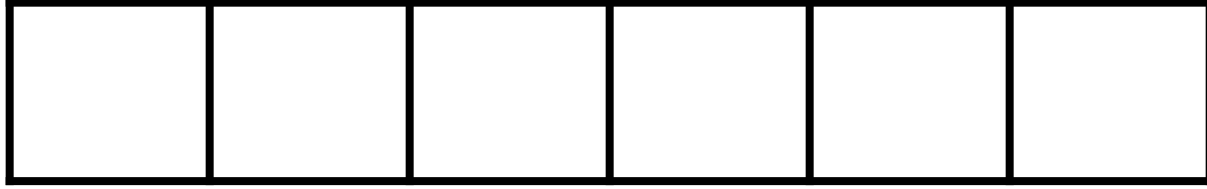
Dequeue() :

Size:

Front:

```
Queue<int> q;  
q.enqueue(3);  
q.enqueue(8);  
q.enqueue(4);  
q.dequeue();  
q.enqueue(7);  
q.dequeue();  
q.dequeue();  
q.enqueue(2);  
q.enqueue(1);  
q.enqueue(3);  
q.enqueue(5);  
q.dequeue();  
q.enqueue(9);
```

Capacity:



Enqueue(D): Insert @  $(\text{size} + \text{front}) \% \text{capacity}$   
size++ until size == capacity

Dequeue(): Remove @front  
 $\text{front} = (\text{front} + 1) \% \text{capacity}$   
size--

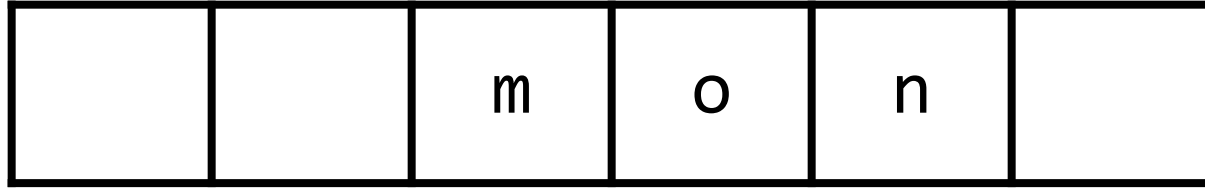
Size:

Front:

Capacity:

```
Queue<int> q;  
q.enqueue(3);  
q.enqueue(8);  
q.enqueue(4);  
q.dequeue();  
q.enqueue(7);  
q.dequeue();  
q.dequeue();  
q.enqueue(2);  
q.enqueue(1);  
q.enqueue(3);  
q.enqueue(5);  
q.dequeue();  
q.enqueue(9);
```

# Queue Data Structure: Resizing



```
Queue<char> q;
```

```
...
```

```
q.enqueue(d);
```

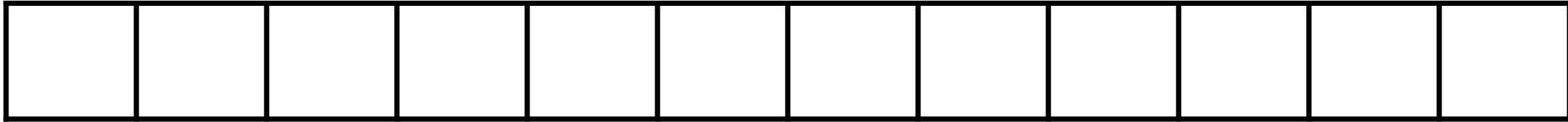
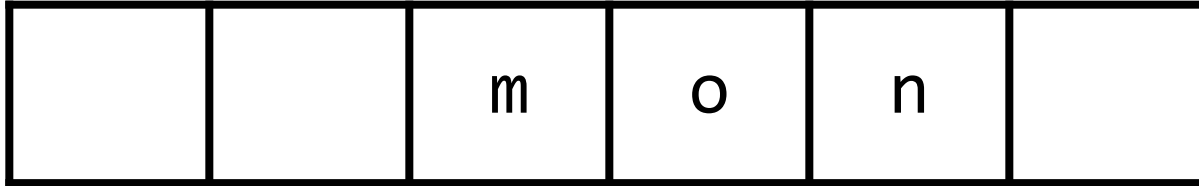
```
q.enqueue(a);
```

```
q.enqueue(y);
```

```
q.enqueue(i);
```

```
q.enqueue(s);
```

# Queue Data Structure: Resizing



```
Queue<char> q;
```

```
...
```

```
q.enqueue(d);
```

```
q.enqueue(a);
```

```
q.enqueue(y);
```

```
q.enqueue(i);
```

```
q.enqueue(s);
```



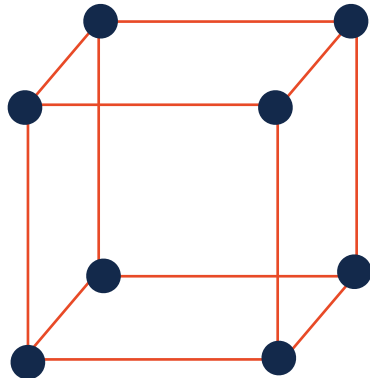
# Queue ADT

- [Order]:
- [Implementation]:
- [Runtime]:



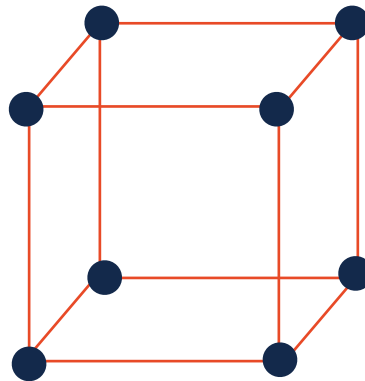
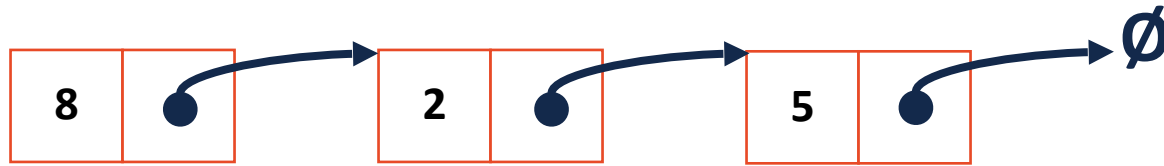
# Iterators

We want to be able to loop through all elements for any underlying implementation in a systematic way



# Iterators

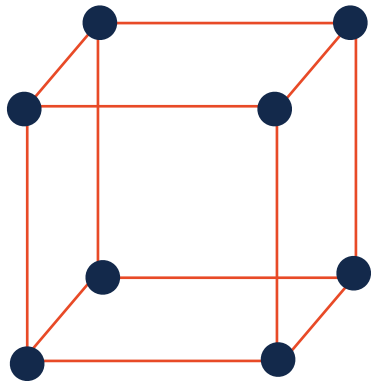
We want to be able to loop through all elements for any underlying implementation in a systematic way



Cur. Location	Cur. Data	Next
<code>ListNode *</code> <code>curr</code>		
<code>unsigned</code> <code>index</code>		
Some form of  <code>(x, y, z)</code>		

# Iterators

Iterators provide a way to access items in a container without exposing the underlying structure of the container



```
1 Cube::Iterator start = myCube.begin();  
2  
3 while (it != myCube.end()) {  
4     std::cout << *it << " ";  
5     it++;  
6 }  
7
```

# Iterators

For a class to implement an iterator, it needs two functions:

`Iterator begin()`

`Iterator end()`

# Iterators

The actual iterator is defined as a class **inside** the outer class:

1. It must be of base class **std::iterator**

2. It must implement at least the following operations:

`Iterator& operator ++()`

`const T & operator *()`

`bool operator !=(const Iterator &)`



# Iterators

Here is a (truncated) example of an iterator:

```
1  template <class T>
2  class List {
3
4      class ListIterator : public
5  std::iterator<std::bidirectional_iterator_tag, T> {
6      public:
7
8          ListIterator& operator++();
9
10         ListIterator& operator--();
11
12         bool operator!=(const ListIterator& rhs);
13
14         const T& operator*();
15     };
16
17     ListIterator begin() const;
18
19     ListIterator end() const;
20 };
```

```
1 #include <list>
2 #include <string>
3 #include <iostream>
4
5 struct Animal {
6     std::string name, food;
7     bool big;
8     Animal(std::string name = "blob", std::string food = "you", bool big = true) :
9         name(name), food(food), big(big) { /* nothing */ }
10 };
11
12 int main() {
13     Animal g("giraffe", "leaves", true), p("penguin", "fish", false), b("bear");
14     std::vector<Animal> zoo;
15
16     zoo.push_back(g);
17     zoo.push_back(p);    // std::vector's insertAtEnd
18     zoo.push_back(b);
19
20     for ( std::vector<Animal>::iterator it = zoo.begin(); it != zoo.end(); ++it ) {
21         std::cout << (*it).name << " " << (*it).food << std::endl;
22     }
23
24     return 0;
25 }
```



```
1
2 std::vector<Animal> zoo;
3
4
5 /* Full text snippet */
6
7     for ( std::vector<Animal>::iterator it = zoo.begin(); it != zoo.end(); ++it ) {
8         std::cout << (*it).name << " " << (*it).food << std::endl;
9     }
10
11
12 /* Auto Snippet */
13
14     for ( auto it = zoo.begin(); it != zoo.end(); ++it ) {
15         std::cout << animal.name << " " << animal.food << std::endl;
16     }
17
18 /* For Each Snippet */
19
20     for ( const Animal & animal : zoo ) {
21         std::cout << animal.name << " " << animal.food << std::endl;
22     }
23
24
25
```

# Trees

***“The most important non-linear data structure in computer science.”***

***- David Knuth, The Art of Programming, Vol. 1***

**A tree is:**

- 
- 

