Data Structures and Algorithms Big-O Notation, Stack and Queue

2022-07-01 Ping-Han Hsieh

Overview

- Data Structures:
 - Linked-List, Array
 - Stack, Queue
 - Union Find, Hash Table
 - Binary Search Tree, Heap
 - Graph
- Algorithms
 - Big-O Notation
 - Sorting
 - Graph Algorithms
 - Dynamic Programming

Overview

- Data Structures:
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Variables, Linked-list and Array

Variables

Normal Variable

value

memory address

94022476780288

memory size

28

Pointer Variable

memory address

94022476780320

memory size

8



94022476780320 94022476780288

94022476780288

0000000000001

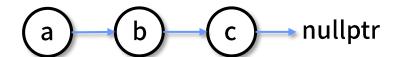
dereference

value

94022476780288

Linked-list and Array

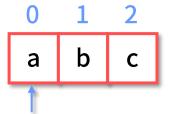
Linked-list



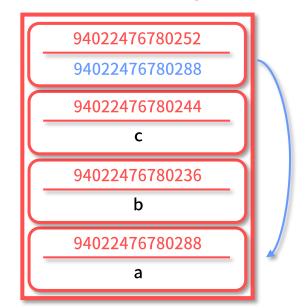
Stack Memory







Stack Memory



Linked-list

Data structure



Initialization

```
from __future__ import annotations
from typing import Any, Optional
...

class Node:

    def __init__(self, item: Any, next_node: Optional[Node] = None):
        self.item: Any = item
        self.next_node: Node = next_node
```

Big-O Notation

Big-O Notation (1)

How do we estimate the running time without executing it.

```
a = 0
for i in range(0, 5):
  tmp = a + 1
  a = tmp

a = 0
for i in range(0, 5):
  a += 1
```

Big-O Notation (1)

How do we estimate the running time without executing it.

- How do we deal with different execution time of different command.
 - We assume they are the same (T) if they do not scale with the input.
 - But the example shown here should have the same time complexity.

Big-O Notation (2)

Formulation

$$f(x) = O(g(x))$$
 for $x \to \infty$

Finding Big-O notation

find positive integer M and n_0 such that $f(n) \leq Mg(n)$ for all $n > n_0$

Example (1)

$$f(x)=2x$$
 if $M=3, n_0=1, g(x)=x$ then $f(n)=2n\leq 3 imes g(x)=3n$ for all $n\geq 1$ $ightarrow f(n)=2n=O(n)$

Example (2)

$$f(x)=x+t,\;\;t\geq 0$$
 if $M=1,n_0=1+\lceil t
ceil,g(x)=x$ then $f(n)=n+t\leq 1 imes g(n)=n+\lceil t
ceil$ for all $n\geq 1$ $o f(n)=O(n)$

Big-O Notation (3)

Comparison

NP-Complete

NP-Hard

$$O(1) < O(\log^* n) < O(\log n) < O(n) < O(n\log^* n) < O(n\log n) < O(n^x) <$$

x > 1

Iterated logarithmic

$$\log^* n := \left\{ egin{array}{ll} 0 & ext{if } n \leq 1; \ 1 + \log^* (\log n) & ext{if } n > 1 \end{array}
ight.$$

Resize Array (1)

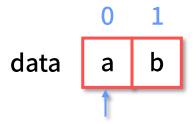
Initialization

```
def resize(self, size: int = 0):
    duplicate = [None] * size
    for i in range(0, self.n):
        duplicate[i] = self.data[i]

self.data = duplicate
    self.n = size
    return
```

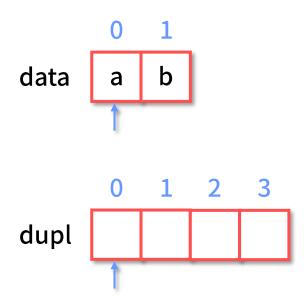
Command

```
array.resize(4)
```



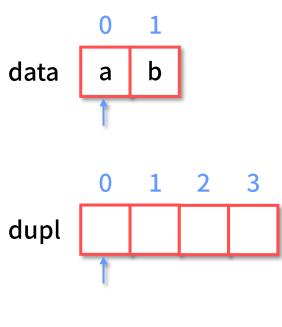
Resize Array (2)

Initialization



Resize Array (3)

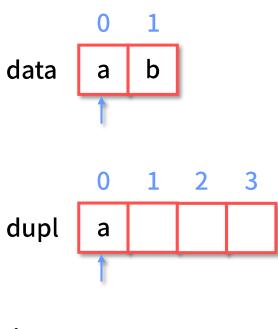
Initialization



$$i = 0$$

Resize Array (3)

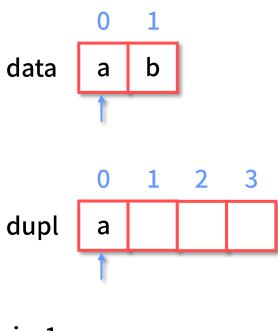
Initialization



$$i = 0$$

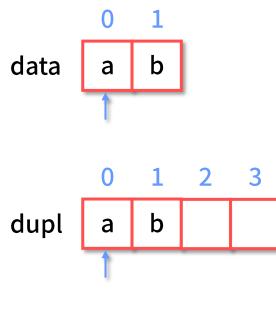
Resize Array (4)

Initialization



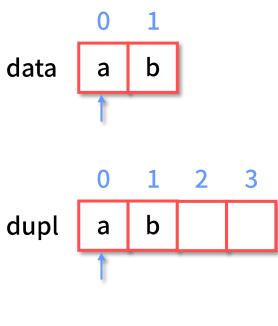
Resize Array (5)

Initialization



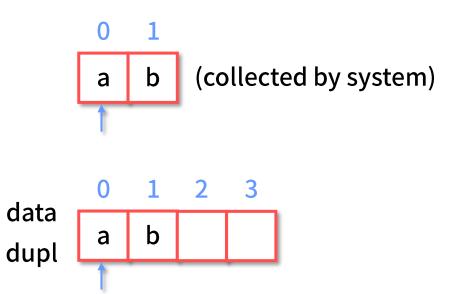
Resize Array (6)

Initialization



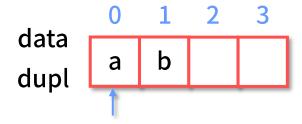
Resize Array (7)

Initialization



Resize Array (8)

Initialization

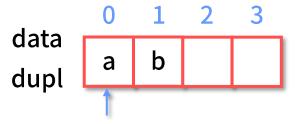


Resize Array (9)

Initialization

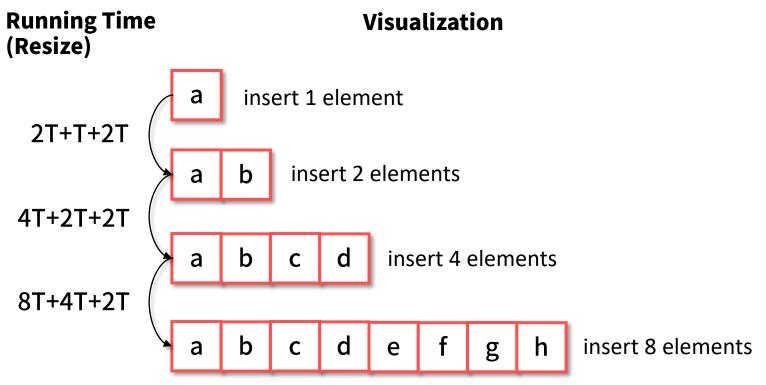
Time Complexity

$$egin{aligned} f(N_{new}) &= N_{new}T + N_{old}T + 2T \ &= rac{3}{2}N_{new}T + 2T \ &= O(N_{new}) \end{aligned} \quad ext{(let } N_{old} = rac{1}{2}N_{new})$$



Amortized Time Complexity for Insertion

• If we resize the array twice the original size when it is full



Total Time (Insert 2^k Element)

$$egin{aligned} f(n=2^k) &= (2+\ldots+2^k)T + (2^0+\ldots+2^{k-1}) + 2kT \ &= 2 imes 2^{k-1} + 1 imes 2^{k-2} + 2kT \ &= 2^k + 2^{k-2} + 2kT \ &= rac{5}{4}2^k + 2kT \end{aligned}$$

Amortized Time (Insert 2^k Element)

$$rac{f(n=2^k)}{2^k} = 5/4 + rac{2kT}{2^k} \sim O(1)$$

Binary Search (1)

Function

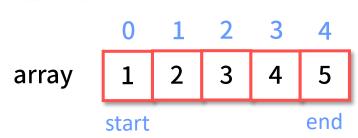
```
def binary_search(sorted_array, item, start: int, end: int):
   if end < start:
      return -1
   middle = (start + end) // 2
   if sorted_array[middle] == item:
      return middle
   elif sorted_array[middle] > item:
      return binary_search(sorted_array, item, start, middle-1)
   elif sorted_array[middle] < item:
      return binary_search(sorted_array, item, middle+1, end)</pre>
```

Command

```
array = [1, 2, 3, 4, 5]
binary_search(array, 5, 0, 4)
```

Visualization

item: 5



Binary Search (2)

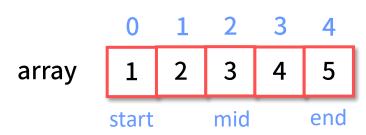
Function

Function Call Stack

```
binary_search(array, 5, 0, 4)
```

Visualization

item: 5



Binary Search (2)

Function

Function Call Stack

```
binary_search(array, 5, 0, 4)
```

Visualization

item: 5

0 1 2 3 4

array 1 2 3 4 5

start

mid

end

Binary Search (3)

Function

Function Call Stack

```
binary_search(array, 5, 3, 4)
binary_search(array, 5, 0, 4) at most 6T
```

Visualization

item: 5



Binary Search (4)

Function

Function Call Stack

```
binary_search(array, 5, 3, 4)
binary_search(array, 5, 0, 4) at most 6T
```

Visualization

item: 5

0 1 2 3 4

array 1 2 3 4 5

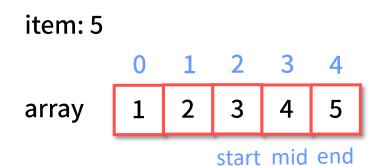
start mid end

Binary Search (5)

Function

Function Call Stack

```
binary_search(array, 5, 3, 4) at most 6T binary_search(array, 5, 0, 4) at most 6T
```



Binary Search (6)

Function

Function Call Stack

```
binary_search(array, 5, 4, 4) at most 9T
binary_search(array, 5, 3, 4) at most 9T
binary_search(array, 5, 0, 4) at most 9T
```

Visualization

item: 5

0 1 2 3 4

array 1 2 3 4 5

end mid start

Binary Search (7)

Function

Function Call Stack

```
binary_search(array, 5, 4, 4) return 4 at most 6T
binary_search(array, 5, 3, 4) at most 6T
binary_search(array, 5, 0, 4) at most 6T
```

Visualization

item: 5

0 1 2 3 4

array 1 2 3 4 5

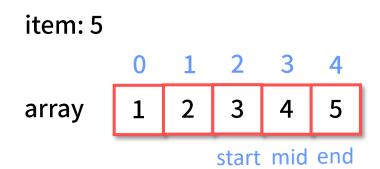
end
mid
start

Binary Search (8)

Function

Function Call Stack

```
binary_search(array, 5, 3, 4) return 4 at most 6T binary_search(array, 5, 0, 4) at most 6T
```

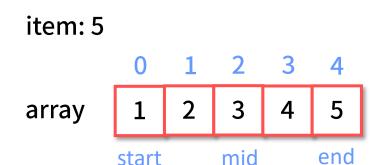


Binary Search (9)

Function

Function Call Stack

```
binary_search(array, 5, 0, 4) return 4 at most 6T
```



Binary Search (10)

Function

Function Call Stack

```
binary_search(array, 5, 0, 4) at most 6T
```

Each binary search call take at most 6T time How many time the function needs to be called

Visualization

item: 5

0 1 2

array 1 2 3 4 5
start mid end

4

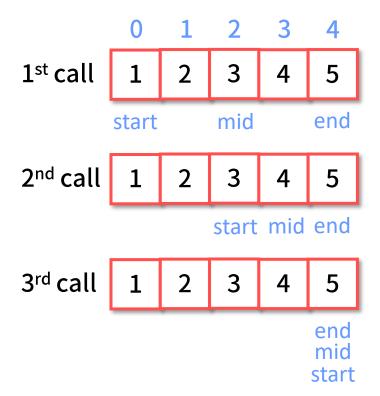
Binary Search (11)

Function

Function Call Stack

```
binary_search(array, 5, 0, 4) at most 6T
```

Each binary search call take at most 6T time How many time the function needs to be called



Binary Search (12)

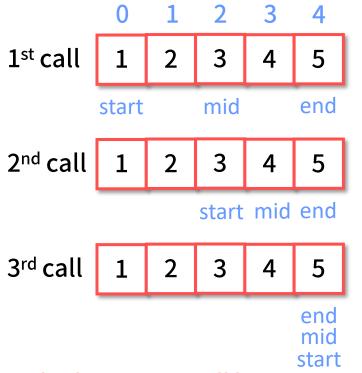
Function

Function Call Stack

```
binary_search(array, 5, 0, 4) at most 6T
```

Each binary search call take at most 6T time How many time the function needs to be called

Visualization



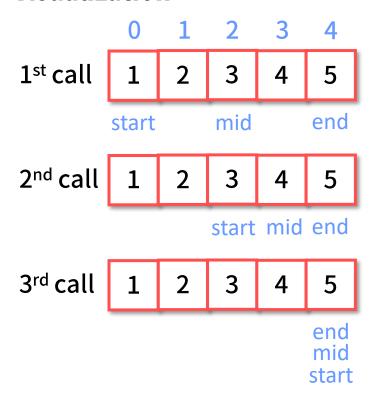
end subtract start will be halved until end equals start

Binary Search (13)

- From the 1st function call to the last:
 - end start will be halved until end equals start.
- From the last function call to the 1st:
 - end start will expand by a factor of 2 until end start = n
- The function needs to be called $log_2 n$ times.
- Total time complexity:

$$f(n) = 6Tlog_2(n) = O(log_2(n))$$

Visualization



Time Complexity for Recursive Functions (1)

Theorem (Master Method) Consider the recurrence

$$T(n) = aT(n/b) + f(n), \tag{1}$$

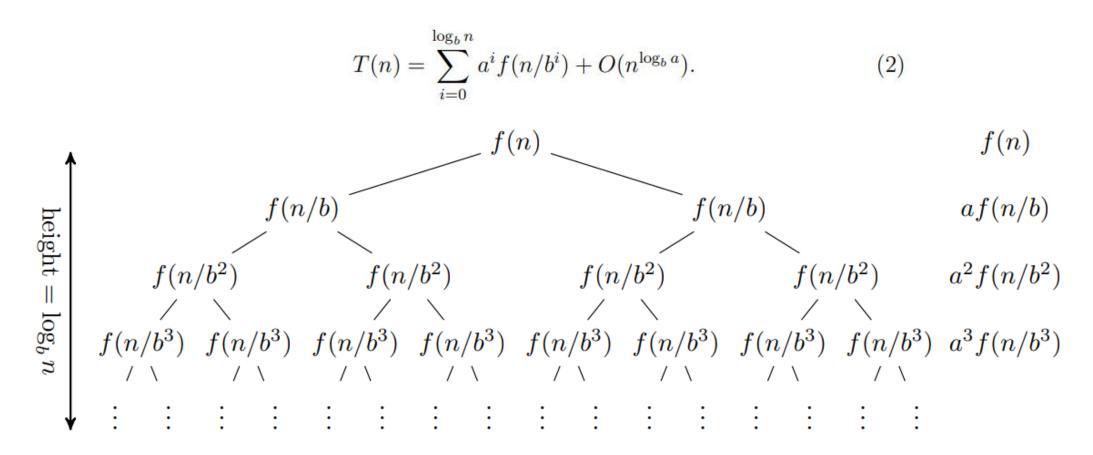
where a, b are constants. Then

- (A) If $f(n) = O(n^{\log_b a \varepsilon})$ for some constant $\varepsilon > 0$, then $T(n) = O(n^{\log_b a})$.
- (B) If $f(n) = \Theta(n^{\log_b a})$, then $T(n) = \Theta(n^{\log_b a} \log n)$.
- (C) If $f(n) = \Omega(n^{\log_b a + \varepsilon})$ for some constant $\varepsilon > 0$, and if f satisfies the smoothness condition $af(n/b) \leq cf(n)$ for some constant c < 1, then $T(n) = \Theta(f(n))$.

a: number of functions called in recursive function

b: scale factor for turning function into subproblems

Time Complexity for Recursive Functions (2)



Time Complexity for Recursive Functions (3)

Case (A). From (2), we have

$$T(n) = \sum_{i=0}^{\log_b n} a^i f(n/b^i) + O(n^{\log_b a}) \le \sum_{i=0}^{\log_b n} a^i (n/b^i)^{\log_b a - \varepsilon} + O(n^{\log_b a}), \quad (3)$$

and

$$\begin{split} \sum_{i=0}^{\log_b n} a^i (n/b^i)^{\log_b a - \varepsilon} &= n^{\log_b a - \varepsilon} \sum_{i=0}^{\log_b n} a^i b^{-i \log_b a} b^{i \varepsilon} = n^{\log_b a - \varepsilon} \sum_{i=0}^{\log_b n} a^i a^{-i} b^{i \varepsilon} \\ &= n^{\log_b a - \varepsilon} \sum_{i=0}^{\log_b n} b^{\varepsilon i} = n^{\log_b a - \varepsilon} \frac{b^{\varepsilon (\log_b n + 1)} - 1}{b^{\varepsilon} - 1} \\ &= n^{\log_b a - \varepsilon} \frac{n^{\varepsilon} b^{\varepsilon} - 1}{b^{\varepsilon} - 1} \leq n^{\log_b a - \varepsilon} \frac{n^{\varepsilon} b^{\varepsilon}}{b^{\varepsilon} - 1} = n^{\log_b a} \frac{b^{\varepsilon}}{b^{\varepsilon} - 1} \\ &= O(n^{\log_b a}). \end{split}$$

Time Complexity for Recursive Functions (4)

Case (A). From (2), we have

$$T(n) = \sum_{i=0}^{\log_b n} a^i f(n/b^i) + O(n^{\log_b a}) \le \sum_{i=0}^{\log_b n} a^i (n/b^i)^{\log_b a - \varepsilon} + O(n^{\log_b a}), \quad (3)$$

and

$$\begin{split} \sum_{i=0}^{\log_b n} a^i (n/b^i)^{\log_b a - \varepsilon} &= n^{\log_b a - \varepsilon} \sum_{i=0}^{\log_b n} a^i b^{-i \log_b a} b^{i \varepsilon} = n^{\log_b a - \varepsilon} \sum_{i=0}^{\log_b n} a^i a^{-i} b^{i \varepsilon} \\ &= n^{\log_b a - \varepsilon} \sum_{i=0}^{\log_b n} b^{\varepsilon i} = n^{\log_b a - \varepsilon} \frac{b^{\varepsilon (\log_b n + 1)} - 1}{b^{\varepsilon} - 1} \\ &= n^{\log_b a - \varepsilon} \frac{n^{\varepsilon} b^{\varepsilon} - 1}{b^{\varepsilon} - 1} \leq n^{\log_b a - \varepsilon} \frac{n^{\varepsilon} b^{\varepsilon}}{b^{\varepsilon} - 1} = n^{\log_b a} \frac{b^{\varepsilon}}{b^{\varepsilon} - 1} \\ &= O(n^{\log_b a}). \end{split}$$

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Time Complexity for Recursive Functions (5)

Case (B). Here we have

$$\sum_{i=0}^{\log_b n} a^i (n/b^i)^{\log_b a} = n^{\log_b a} \sum_{i=0}^{\log_b n} a^i b^{-i \log_b a} = n^{\log_b a} \sum_{i=0}^{\log_b n} a^i a^{-i}$$
$$= n^{\log_b a} (\log_b n + 1) = \Theta(n^{\log_b a} \log n),$$

Combining this with (2) and the assumption of (B), to within constant factor bounds we have

$$T(n) = \sum_{i=0}^{\log_b n} a^i f(n/b^i) + O(n^{\log_b a}) = \sum_{i=0}^{\log_b n} a^i (n/b^i)^{\log_b a} + O(n^{\log_b a})$$
$$= \Theta(n^{\log_b a} \log n) + O(n^{\log_b a}) = \Theta(n^{\log_b a} \log n).$$

Time Complexity for Recursive Functions (6)

Case (C). The lower bound is immediate, because f(n) is a term of the sum (2). For the upper bound, we will use the smoothness condition. This condition is satisfied by $f(n) = n^{\log_b a + \varepsilon}$ for any $\varepsilon > 0$ with $c = b^{-\varepsilon} < 1$:

$$af(n/b) = a(n/b)^{\log_b a + \varepsilon} = an^{\log_b a + \varepsilon}b^{-\log_b a}b^{-\varepsilon} = f(n)b^{-\varepsilon}.$$

In this case, we have $a^i f(n/b^i) \leq c^i f(n)$ (easy induction on i using the smoothness condition), therefore

$$T(n) = \sum_{i=0}^{\log_b n} a^i f(n/b^i) + O(n^{\log_b a}) \le \sum_{i=0}^{\log_b n} c^i f(n) + O(n^{\log_b a})$$

$$\le f(n) \sum_{i=0}^{\infty} c^i + O(n^{\log_b a}) = f(n) \frac{1}{1-c} + O(n^{\log_b a}) = O(f(n)).$$

Time Complexity for Recursive Functions (7)

Binary Search

let
$$a=1,b=2,f(n)=6T$$

then $\log_2 1=0,$
since $f(n)=6T=\Theta(n^{\log_2 1})=\Theta(1)$
use Case 2 of Master Theorem

$$T(n) = \Theta(n^0 \log n)$$
 $= \Theta(\log n)$
 $= O(\log n)$
 $= \Omega(\log n)$

Master Theorem

Theorem (Master Method) Consider the recurrence

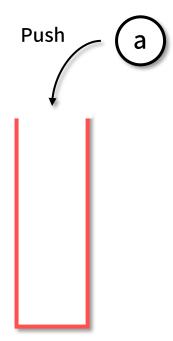
$$T(n) = aT(n/b) + f(n), \tag{1}$$

where a, b are constants. Then

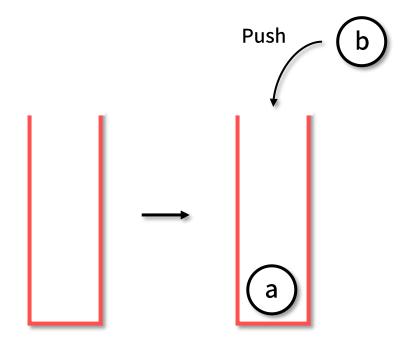
- (A) If $f(n) = O(n^{\log_b a \varepsilon})$ for some constant $\varepsilon > 0$, then $T(n) = O(n^{\log_b a})$.
- (B) If $f(n) = \Theta(n^{\log_b a})$, then $T(n) = \Theta(n^{\log_b a} \log n)$.
- (C) If $f(n) = \Omega(n^{\log_b a + \varepsilon})$ for some constant $\varepsilon > 0$, and if f satisfies the smoothness condition $af(n/b) \leq cf(n)$ for some constant c < 1, then $T(n) = \Theta(f(n))$.

Stack

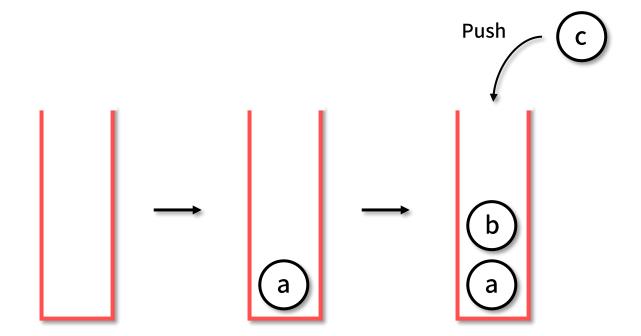
Stack (1) Insert



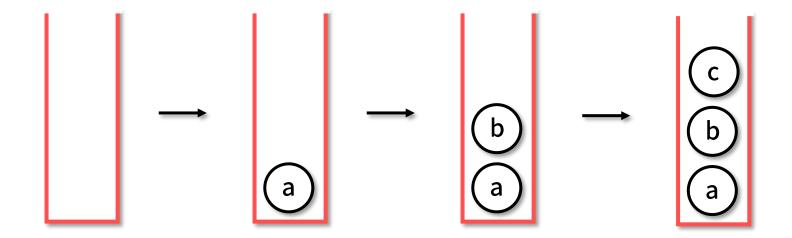
Stack (2) Insert



Stack (3) Insert

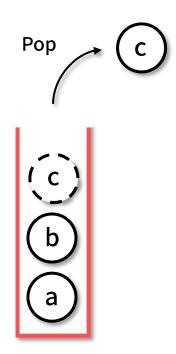


Stack (4) Insert



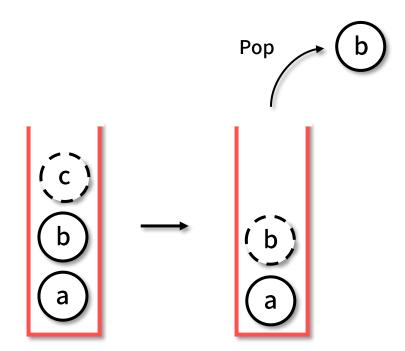
Stack (5)

Remove



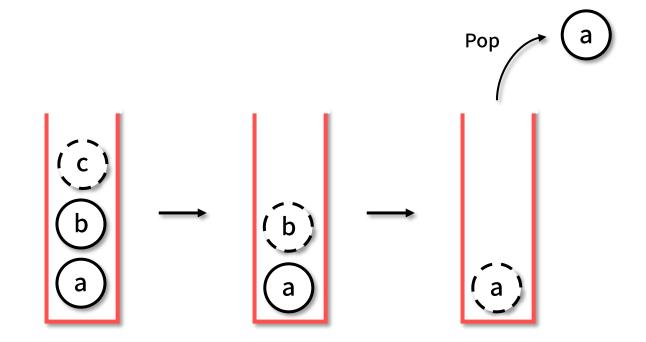
Stack (6)

Remove



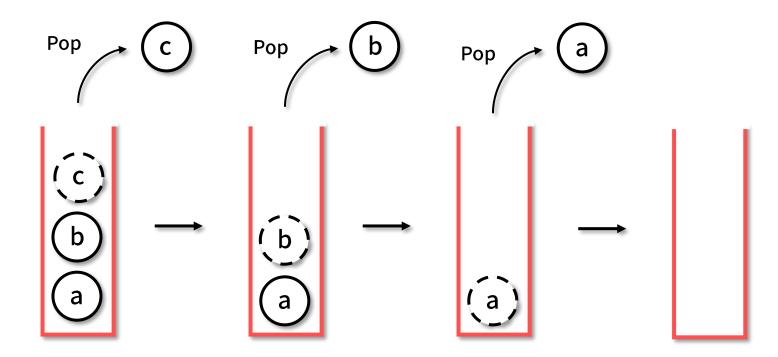
Stack (7)

Remove



Stack (8)

Remove



Initialization

```
class LinkedStack(Iterable):
  def __init__(self):
    self.n: int = 0
    self.last: Optional[Node] = None
  def __iter__(self) -> Iterator[LinkedStack]: ...
  def __len__(self) -> int: ...
  def __str__(self) -> str: ...
                                         check if the Stack is empty
  def is empty(self) -> bool: ...
                                           check last inserted item
  def peek(self) -> Any: ...
  def pop(self) -> Any: ··· remove and return the last inserted item
  def push(self, item: Any) -> None: ...
                                                        insert item
```

Visualization

```
n = 0
last → nullptr
```

Insert (1)

Insert

```
def push(self, item: Any) -> None:
   node = Node(item)

if self.is_empty():
   self.last = node
   else:
   node.next_node = self.last
   self.last = node
   self.n += 1
   return
```

Command

```
stack = LinkedStack()
stack.push('a')
```

Visualization

Insert (2)

Insert

```
def push(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
        self.last = node
   else:
        node.next_node = self.last
        self.last = node
        self.last = node
        self.n += 1
        return
```

Insert (3)

Insert

```
def push(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
       self.last = node
   else:
       node.next_node = self.last
       self.last = node
   self.n += 1
   return
```

Insert (4)

Insert

```
def push(self, item: Any) -> None:
   node = Node(item)

if self.is_empty():
   self.last = node
   else:
   node.next_node = self.last
   self.last = node
   self.n += 1
   return
```

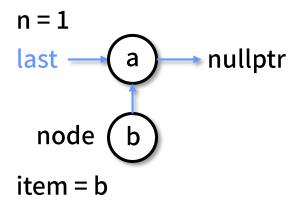
Command

```
stack.push('b')
```

Insert (5)

Insert

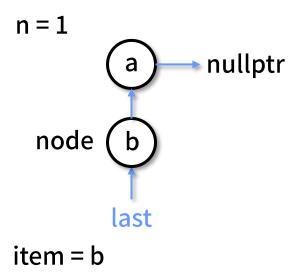
```
def push(self, item: Any) -> None:
  node = Node(item)
  if self.is_empty():
    self.last = node
  else:
    node.next_node = self.last
    self.last = node
  self.n += 1
  return
```



Insert (6)

Insert

```
def push(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
       self.last = node
   else:
       node.next_node = self.last
       self.last = node
   self.n += 1
   return
```



Insert (7)

Insert

```
def push(self, item: Any) -> None:
  node = Node(item)
  if self.is_empty():
    self.last = node
  else:
    node.next_node = self.last
    self.last = node

self.n += 1
  return
```

Stack (using Linked-list) Remove (1)

Remove

```
def pop(self) -> Any:
   item = self.last.item
   self.last = self.last.next_node
   self.n -= 1
   return item
```

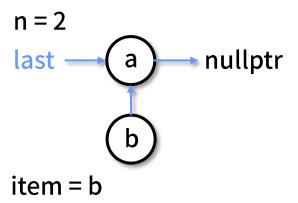
Command

```
stack.pop()
```

Stack (using Linked-list) Remove (2)

Remove

```
def pop(self) -> Any:
   item = self.last.item
   self.last = self.last.next_node
   self.n -= 1
   return item
```



Stack (using Linked-list) Remove (3)

Remove

```
def pop(self) -> Any:
   item = self.last.item
   self.last = self.last.next_node
   self.n -= 1
   return item
```

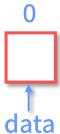
Stack (using Array)

Initialization

```
class Stack(Iterable):
  def __init__(self):
    self.n: int = 0
   self.data: Array = Array(1)
  def __len__(self) -> int: ...
  def __str__(self) -> str: ...
  def __iter__(self) -> Iterator[Stack]: ...
  def is_empty(self) -> bool: ...
                                             check if the Stack is empty
                                                check last inserted item
  def peek(self) -> Any: ...
  def pop(self) -> Any: ··· remove and return the last inserted item
                                                             insert item
  def push(self, item: Any) -> None: ...
```

Visualization

$$n = 0$$



Stack (using Array) Insert (1)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
      self.data.resize(2 * self.n)
   self.data[self.n] = item
   self.n += 1
   return
```

Command

```
stack = Stack()
stack.push('a')
```

$$n = 0$$
 item = a

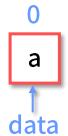


Stack (using Array) Insert (2)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
      self.data.resize(2 * self.n)
   self.data[self.n] = item
   self.n += 1
   return
```

$$n = 0$$
 item = a

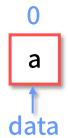


Stack (using Array) Insert (3)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
     self.data.resize(2 * self.n)
     self.data[self.n] = item
   self.n += 1
   return
```

```
n=1 item = a
```



Stack (using Array) Insert (4)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
      self.data.resize(2 * self.n)
   self.data[self.n] = item
   self.n += 1
   return
```

Command

```
stack.push('b')
```

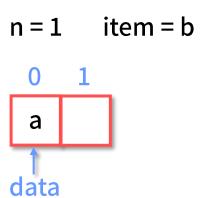
```
n = 1 item = b
```



Stack (using Array) Insert (5)

Insert

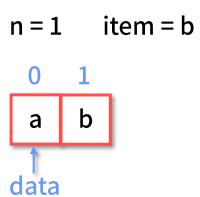
```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
     self.data.resize(2 * self.n)
     self.data[self.n] = item
     self.n += 1
     return
```



Stack (using Array) Insert (6)

Insert

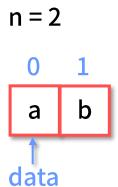
```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
        self.data.resize(2 * self.n)
        self.data[self.n] = item
        self.n += 1
        return
```



Stack (using Array) Insert (7)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
       self.data.resize(2 * self.n)
       self.data[self.n] = item
       self.n += 1
       return
```



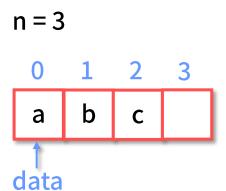
Stack (using Array) Insert (8)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
      self.data.resize(2 * self.n)
   self.data[self.n] = item
   self.n += 1
   return
```

Command

```
stack.push('c')
```



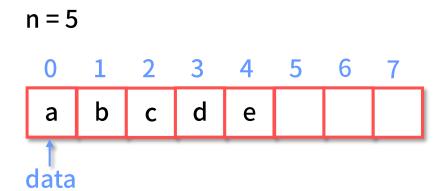
Stack (using Array) Insert (9)

Insert

```
def push(self, item: Any) -> None:
   if self.n == len(self.data):
      self.data.resize(2 * self.n)
   self.data[self.n] = item
   self.n += 1
   return
```

Command

```
stack.push('d')
stack.push('e')
```



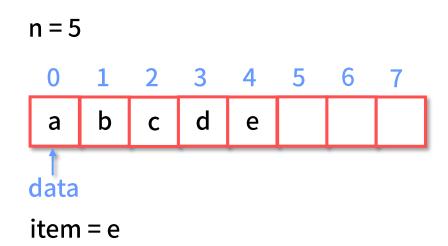
Stack (using Array) Remove (1)

Remove

```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None
   self.n -= 1
   if self.n > 0 and self.n <= len(self.data) // 4:
        self.data.resize(len(self.data) // 2)
   return item</pre>
```

Command

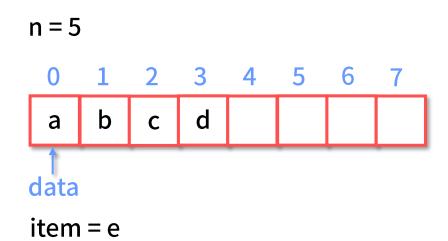
```
stack.pop()
```



Stack (using Array) Remove (2)

Remove

```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None
   self.n -= 1
   if self.n > 0 and self.n <= len(self.data) // 4:
        self.data.resize(len(self.data) // 2)
   return item</pre>
```



Stack (using Array) Remove (3)

Remove

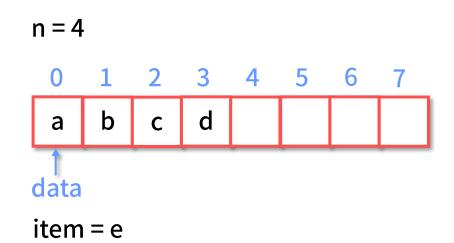
```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None

self.n -= 1

if self.n > 0 and self.n <= len(self.data) // 4:
   self.data.resize(len(self.data) // 2)
   return item</pre>
```

Command

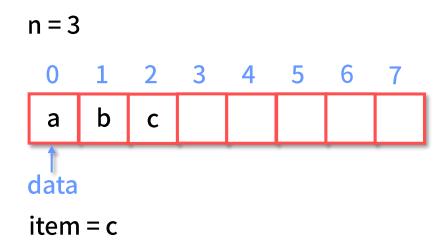
```
stack.pop()
stack.pop()
```



Stack (using Array) Remove (4)

Remove

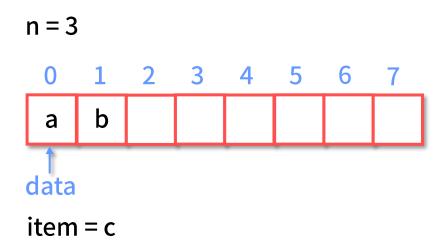
```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None
   self.n -= 1
   if self.n > 0 and self.n <= len(self.data) // 4:
        self.data.resize(len(self.data) // 2)
   return item</pre>
```



Stack (using Array) Remove (5)

Remove

```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None
   self.n -= 1
   if self.n > 0 and self.n <= len(self.data) // 4:
        self.data.resize(len(self.data) // 2)
   return item</pre>
```



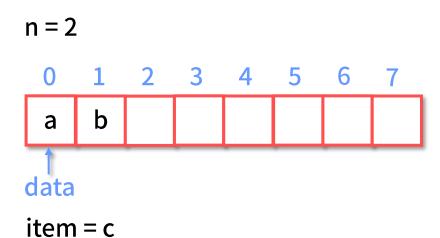
Stack (using Array) Remove (6)

Remove

```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None

self.n -= 1

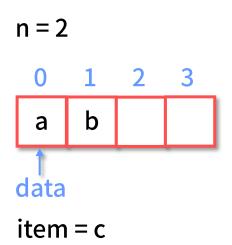
if self.n > 0 and self.n <= len(self.data) // 4:
   self.data.resize(len(self.data) // 2)
   return item</pre>
```



Stack (using Array) Remove (7)

Remove

```
def pop(self) -> Any:
   item = self.data[self.n-1]
   self.data[self.n-1] = None
   self.n -= 1
   if self.n > 0 and self.n <= len(self.data) // 4:
        self.data.resize(len(self.data) // 2)
   return item</pre>
```



Stack Summary

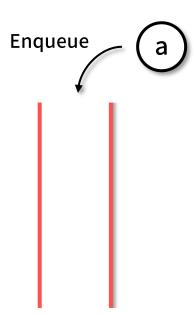
Time Complexity

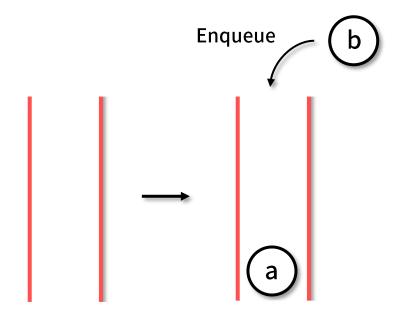
	Linked-list	Array
Initialization	O(1)	O(1)
Push	O(1)	O(1)*
Рор	O(1)	O(1)*
Peek	O(1)	O(1)

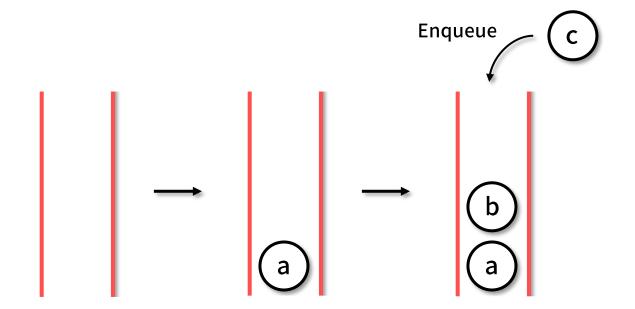
^{*}amortized time complexity

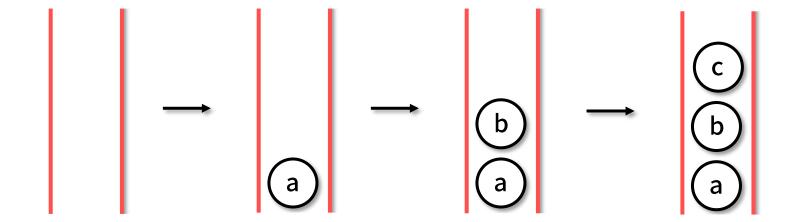
Stack (Practice)

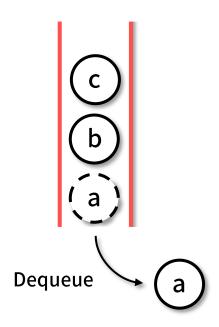
- 1. Valid Parathesis (Leetcode Problem 20)
- 2. Min Stack (Leetcode Problem 155)

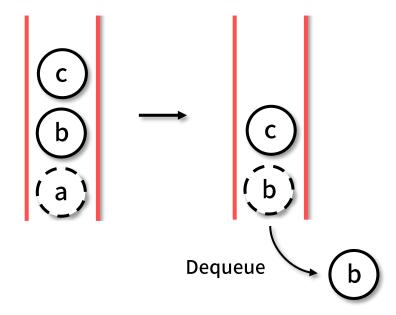


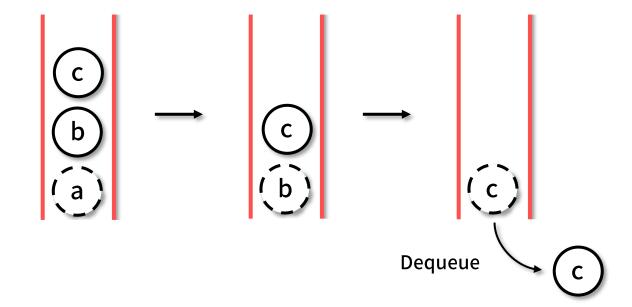


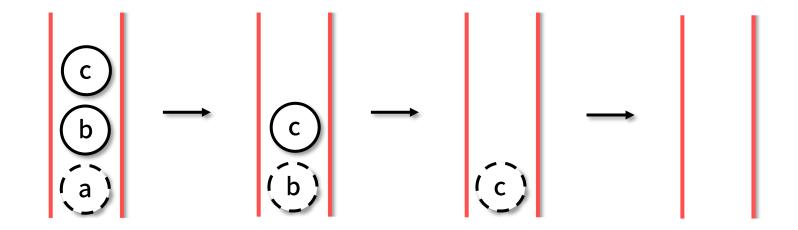












Initialization

```
class LinkedQueue(Iterable):
  def __init__(self):
    self.n: int = 0
    self.first: Optional[Node] = None
    self.last: Optional[Node] = None
  def __iter__(self) -> Iterator[LinkedQueue]: ...
  def __len__(self) -> int: ...
  def __str__(self) -> str: ...
  def is empty(self) -> bool: ...
                                               check if the Queue is empty
                                                  check first inserted item
  def peek(self) -> Any: ...
  def dequeue(self) -> Any: ··· remove and return the first inserted item
  def enqueue(self, item: Any) -> None: ...
                                                               insert item
```

```
n = 0
first → nullptr
last → nullptr
```

Insert (1)

Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)

if self.is_empty():
   self.first = node
   else:
    self.last.next_node = node
   self.last = node
   self.n += 1
   return
```

Command

```
queue = LinkedQueue()
queue.enqueue('a')
```

```
n = 0

first → nullptr
last → nullptr

node a → nullptr

item = a
```

Insert (2)

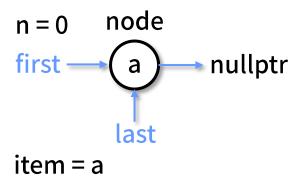
Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
     self.first = node
   else:
     self.last.next_node = node
   self.last = node
   self.n += 1
   return
```

Insert (3)

Insert

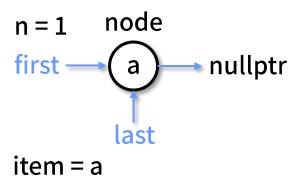
```
def enqueue(self, item: Any) -> None:
  node = Node(item)
  if self.is_empty():
    self.first = node
  else:
    self.last.next_node = node
  self.last = node
  self.n += 1
  return
```



Insert (4)

Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
      self.first = node
   else:
      self.last.next_node = node
   self.last = node
   self.n += 1
   return
```



Insert (5)

Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)

if self.is_empty():
   self.first = node
   else:
    self.last.next_node = node
   self.last = node
   self.n += 1
   return
```

Command

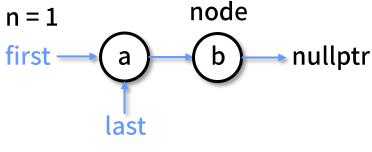
```
queue.enqueue('b')
```

Insert (6)

Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
       self.first = node
   else:
       self.last.next_node = node
   self.last = node
   self.n += 1
   return
```

Visualization



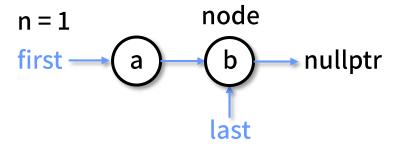
item = b

Insert (7)

Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
      self.first = node
   else:
      self.last.next_node = node
   self.last = node
   self.n += 1
   return
```

Visualization



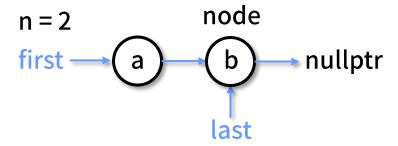
item = b

Insert (8)

Insert

```
def enqueue(self, item: Any) -> None:
   node = Node(item)
   if self.is_empty():
       self.first = node
   else:
       self.last.next_node = node
       self.last = node
       self.n += 1
       return
```

Visualization



item = b

Remove (1)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item
   self.first = self.first.next_node
   self.n -= 1
   if self.n == 0:
        self.last = None
   return item
```

Command

queue.dequeue()

Visualization

item = a

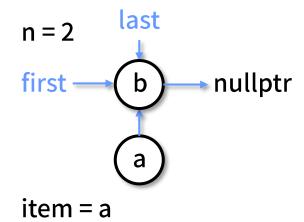
Remove (2)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item

   self.first = self.first.next_node

   self.n -= 1
   if self.n == 0:
        self.last = None
        return item
```



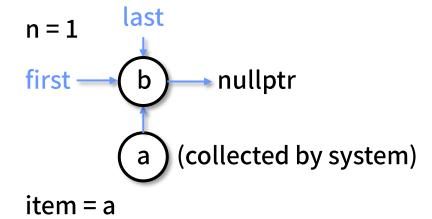
Remove (3)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item
   self.first = self.first.next_node

self.n -= 1

if self.n == 0:
   self.last = None
   return item
```



Remove (4)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item
   self.first = self.first.next_node
   self.n -= 1
   if self.n == 0:
        self.last = None
   return item
```

Command

```
queue.dequeue()
```

$$n = 1$$

first b nullptr

item = b

Remove (5)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item
   self.first = self.first.next_node
   self.n -= 1
   if self.n == 0:
        self.last = None
   return item
```

```
n = 1

first → nullptr

last → b → nullptr

item = b
```

Remove (6)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item
   self.first = self.first.next_node

self.n -= 1
   if self.n == 0:
       self.last = None
   return item
```

Remove (7)

Remove

```
def dequeue(self) -> Any:
   item = self.first.item
   self.first = self.first.next_node
   self.n -= 1
   if self.n == 0:
        self.last = None
   return item
```

```
n = 0

first → nullptr

last → nullptr

item = b
```

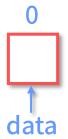
Queue (using Array)

Initialization

```
class Queue(Iterable):
  def __init__(self):
    self.n: int = 0
    self.first: int = 0
    self.last: int = -1
    self.data: Array = Array(1)
  def __len__(self) -> int: ...
  def __str__(self) -> str: ...
  def __iter__(self) -> Iterator[Queue]: ...
                                             check if the Queue is empty
  def is_empty(self) -> bool: ...
                                                check first inserted item
  def peek(self) -> Any: ...
  def dequeue(self) -> Any: ... remove and return the first inserted item
  def enqueue(self, item: Any) -> None: ...
                                                              insert item
```

Visualization

$$n = 0$$
 first = 0 last = -1



Queue (using Array) Insert (1)

Insert

```
def enqueue(self, item: Any) -> None:
   if self.n == len(self.data):
        self.data.resize(2 * self.n)

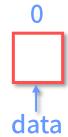
   self.last += 1

   self.data[self.last] = item
   self.n += 1
   return
```

Command

```
queue = Queue()
queue.enqueue('a')
```

$$n = 0$$
 first $= 0$ last $= 0$



Queue (using Array) Insert (2)

Insert

```
def enqueue(self, item: Any) -> None:
    if self.n == len(self.data):
        self.data.resize(2 * self.n)
        self.last += 1
        self.data[self.last] = item
        self.n += 1
        return
```

$$n = 0$$
 first = 0 last = 0



Queue (using Array) Insert (3)

Insert

```
def enqueue(self, item: Any) -> None:
    if self.n == len(self.data):
        self.data.resize(2 * self.n)
        self.last += 1
        self.data[self.last] = item
        self.n += 1
        return
```

Visualization (w/o Resize)

$$n=1$$
 first = 0 last = 0



item = a

Queue (using Array) Insert (4)

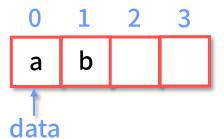
Insert

```
def enqueue(self, item: Any) -> None:
    if self.n == len(self.data):
        self.data.resize(2 * self.n)
    self.last += 1
    self.data[self.last] = item
    self.n += 1
    return
```

Command

```
queue.enqueue('b')
queue.enqueue('c')
```

$$n=2$$
 first = 0 last = 1

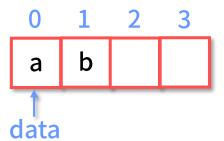


Queue (using Array) Insert (5)

Insert

```
def enqueue(self, item: Any) -> None:
    if self.n == len(self.data):
        self.data.resize(2 * self.n)
    self.last += 1
    self.data[self.last] = item
    self.n += 1
    return
```

$$n=2$$
 first = 0 last = 2



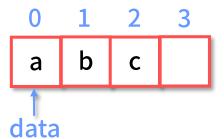
$$item = c$$

Queue (using Array) Insert (6)

Insert

```
def enqueue(self, item: Any) -> None:
    if self.n == len(self.data):
        self.data.resize(2 * self.n)
        self.last += 1
        self.data[self.last] = item
        self.n += 1
        return
```

$$n = 2$$
 first = 0 last = 2



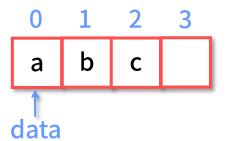
$$item = c$$

Queue (using Array) Insert (7)

Insert

```
def enqueue(self, item: Any) -> None:
    if self.n == len(self.data):
        self.data.resize(2 * self.n)
        self.last += 1
        self.data[self.last] = item
        self.n += 1
        return
```

$$n=3$$
 first = 0 last = 2



$$item = c$$

Queue (using Array) Insert (8)

Insert

```
def enqueue(self, item: Any) -> None:
   if self.n == len(self.data):
        self.data.resize(2 * self.n)
        self.last += 1
        self.data[self.last] = item
        self.n += 1
        return
```

Command

```
queue.enqueue('d')
```

```
n = 4 first = 0 last = 3

0 1 2 3

a b c d

data
```

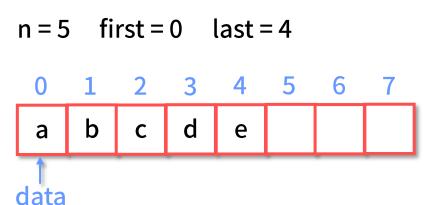
Queue (using Array) Insert (9)

Insert

```
def enqueue(self, item: Any) -> None:
   if self.n == len(self.data):
       self.data.resize(2 * self.n)
   self.last += 1
   self.data[self.last] = item
   self.n += 1
   return
```

Command

```
queue.enqueue('e')
```



Queue (using Array)

Remove (1)

Remove

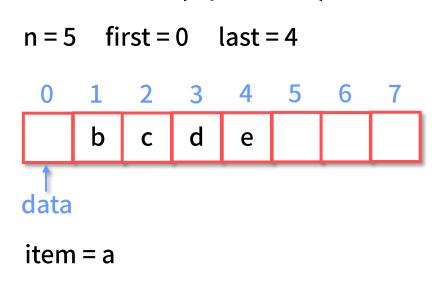
```
def dequeue(self) -> Any:
 item = self.data[self.first]
  self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
   self.last = self.n - 1
 if self.n == 0:
   self.first = 0
   self.last = -1
 return item
```

queue.dequeue()

Queue (using Array) Remove (2)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
   self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```



Queue (using Array) Remove (3)

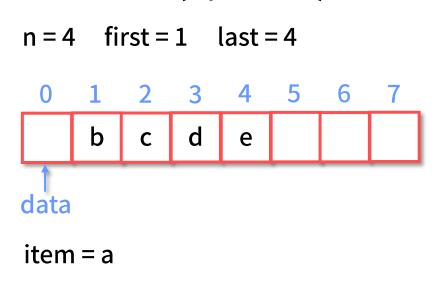
Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
    self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```

Queue (using Array) Remove (4)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
  self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
    self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```

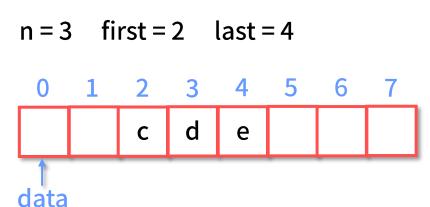


Queue (using Array) Remove(5)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
    self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```

queue.dequeue()

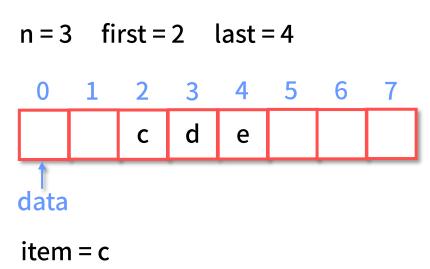


Queue (using Array) Remove (6)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
  self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
   self.last = self.n - 1
 if self.n == 0:
   self.first = 0
   self.last = -1
 return item
```

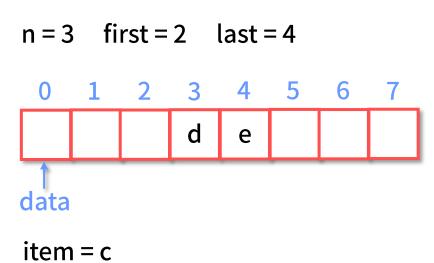
queue.dequeue()



Queue (using Array) Remove (7)

Remove

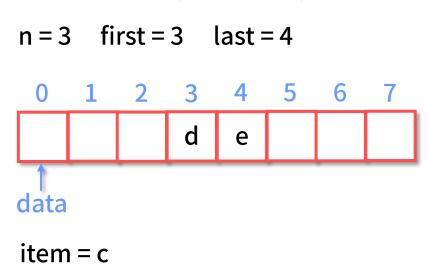
```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
   self.last = self.n - 1
 if self.n == 0:
   self.first = 0
   self.last = -1
 return item
```



Queue (using Array) Remove (8)

Remove

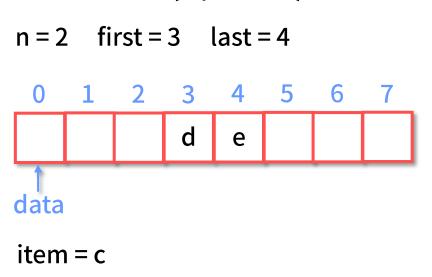
```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
    self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```



Queue (using Array) Remove (9)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
   self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```



Queue (using Array) Remove (10)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
   self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
   self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```

```
n = 2 first = 3 last = 4

0 1 2 3

d e

data

item = c
```

Queue (using Array) Remove (11)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
    self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```

```
n = 2 first = 0 last = 4

0 1 2 3

d e

data

item = c
```

Queue (using Array) Remove (12)

Remove

```
def dequeue(self) -> Any:
 item = self.data[self.first]
 self.data[self.first] = None
 self.first += 1
 self.n -= 1
 if self.n > 0 and self.n == len(self.data) // 4:
    self.data.resize(len(self.data) // 2, self.first)
   self.first = 0
    self.last = self.n - 1
 if self.n == 0:
    self.first = 0
   self.last = -1
 return item
```

```
n = 2 first = 0 last = 1

0 1 2 3

d e

data

item = c
```

Queue (Practice)

- 1. Time Needed to Buy Tickets (Leetcode Problem 2073)
- 2. Number of Recent Calls (Leetcode Problem 933)

Queue Summary

Time Complexity

	Linked-list	Array
Initialization	O(1)	O(1)
Push	O(1)	O(1)*
Pop	O(1)	O(1)*
Peek	O(1)	O(1)

^{*}amortized time complexity