

Data Structures

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Abstract

This is a course taught by **Dr. Manoj Shakya**.

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Chapter 1

Introduction to Algorithms and Algorithm Analysis

Lecture 1: First Lecture

Note (Objectives). • Asymptotic analysis??

16 Apr. 09:39

1.1 Introduction to Algorithm

Definition 1.1.1 (Algorithm). An algorithm is a step-by-step procedure or set of rules designed to solve a problem or perform a task.

Algorithms are everywhere

- Sorting a list of names alphabetically.
- Searching for a word in a dictionary.

1.2 Components of Algorithm

- Problem
- Solution
- Steps
- characteristics

1.3 Characteristics of an Algorithm

Finiteness The algorithm should terminate.

Definiteness Every step should be well-defined (non-ambiguous)

Input and Input Size The no. of entities the algorithm handles. It is denoted by " n ".

Example. In a searching algorithm, the algorithm needs a sequence of entities and the entity to search.

Output The outcome of running the whole algorithm.

Effectiveness (not to be confused with efficient) Does the algorithm solve the problem it was meant to solve? [Section 1.2](#)

Efficiency Sometimes algorithms can be useless even if the algorithm is effective in real world scenarios.

Example. See the travelling salesman problem

Problem 1.3.1 (Travelling Salesman Problem).

1.4 Analysis of an Algorithm

Problem 1.4.1 (Why to Analyze Algorithm?). Some sorting algorithms are:

- Quick
- Merge
- Bubble
- Selection

How to know which sorting algorithm is fastest?

How to know which sorting algorithm takes the least amount of memory?

Answer. Analyze the algorithm!! for **Efficiency**

Basis of measuring efficiency:

1. Time Complexity
2. Space Complexity



1.5 Time Complexity

We evaluate the time complexity by calculating the number of operations in a algorithm denoted by "n".

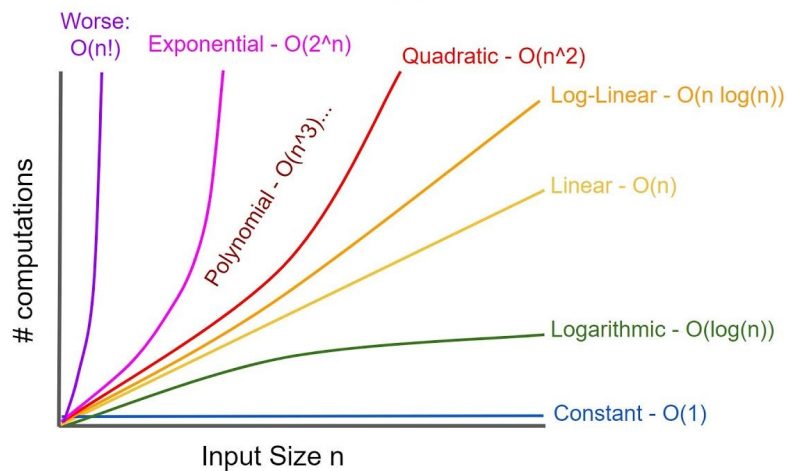


Figure 1.1: Time Complexity of Algorithms when $n \rightarrow \infty$

The time complexity of algorithms are measured in $O(\text{expression})$ big O notation, Ω notation and θ notation.

Notations	Case
Ω	Best
θ	Average
O	Worst

Table 1.1: Notations for time complexity

Chapter 2

Linear and Binary Search

2.1 Linear Search

Problem 2.1.1 (Linear Search). For a given list of items, find a target item and locate where it is.

Algorithm 2.1: Linear Search Algorithm

Data: arr: list of items

target: item to locate

Result: index of target if found (first instance) else -1

```
1 begin
2   for  $i = 0$  to  $\text{len}(\text{arr})$  do
3     if  $\text{arr}[i] == \text{target}$  then
4       return  $i$ 
5   return -1
```

2.1.1 Time Complexity of Linear Search

Notation	Complexity
Ω	1
O	n

Table 2.1: Time Complexity of Linear Search

2.2 Binary Search

```

1 def linear_search(arr, target):
2     """
3     returns index of target if target is found
4     returns -1 if target is not found
5     """
6     for i in range(len(arr)):
7         if arr[i]==target:
8             return i
9     return -1

```

Listing 2.1: Linear Search Implementation

Problem 2.2.1 (Binary Search). For a given list of sorted items, find a target item and locate where it is.

Algorithm 2.2: Binary Search Algorithm

Data: arr: list of items

target: item to locate

Result: index of target if found (first instance) else -1

```

1 begin
2     low, high ← 0, len(arr)-1;
3     mid ← (low+high)//2;
4     while low ≤ high do
5         if arr[mid]<target then
6             high = mid;
7             mid = (low+high)//2;
8         else if arr[mid]>target then
9             low = mid;
10            mid = (low+high)//2;
11        else
12            return mid;
13    return -1;

```

2.2.1 Time Complexity of Binary Search

Notation	Complexity
Ω	1
O	$\log_2 n$

Table 2.2: Time Complexity of Binary Search

```
1 def binary_search(arr, target):
2     """Searches for a target in a sorted list
3
4     :arr: sorted list of items
5     :target: target item to locate
6     :returns: index of target if found else -1
7
8     """
9     low, high = 0, len(arr)-1
10    mid = (low+high)//2
11    while low<=high:
12        if arr[mid]< target:
13            high = mid
14            mid = (low+high)//2
15
16        elif arr[mid]> target:
17            low = mid
18            mid = (low+high)//2
19        else
20            return mid
21    return -1
```

Listing 2.2: Binary Search Implementation

Chapter 3

Stack

3.1 Properties of stack

Stack is an **Abstract Data Type**.

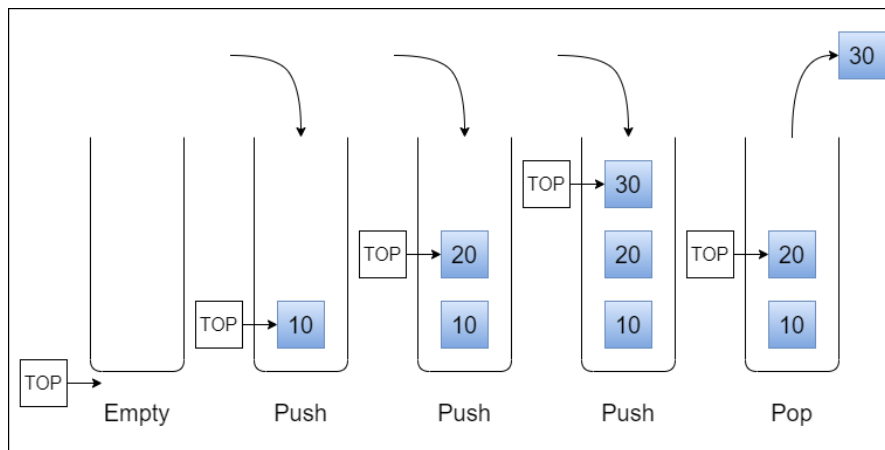


Figure 3.1: Visualization of Stack

3.2 Properties of Stack

1. **Last In First Out** → In the [Figure 3.1](#), recently added item is at the top of the stack and it is removed first.
2. One end of a stack- towards the top, is open.

3.3 Applications of Stack

1. Undo Operation in a word-processor

2. Checking if a number is palindrome
3. Reversing a sequence
4. Factorial
5. Recursion
6. Function Calls in Programming Languages

3.4 Operations of Stack

Push: New Item is added on top of the stack.

`push(item)`

Pop: The recently addeed item is removed from the stack.

`pop()->item`

Peek: See what is recently added.

`peek()->item`

Is Empty: Check if the stack has no element.

`isempty()->bool`

Is Full: (In term of Memory) has the stack used up all the allocoted memory to it?

`isfull()->bool`

Size: # of elements in the stack

`size()->int`

3.5 Stack Implementation

```
1 class Stack:
2     _s = []
3
4     def is_empty(self) -> bool:
5         return len(self._s) == 0
6
7     def push(self, item):
8         self._s.append(item)
9
10    def pop(self):
11        if self.is_empty():
12            raise IndexError("Pop from empty stack") # Underflow
13        return self._s.pop()
14
15    def peek(self):
16        if self.is_empty():
17            raise IndexError("Pop from empty stack") # Overflow
18        return self._s[-1]
19
20    def size(self) -> int:
21        return len(self._s)
22
23    def __str__(self) -> str:
24        return str(self._s)
```

Listing 3.1: Implementation of a stack

3.6 Application of Stack: Algebraic Expressions

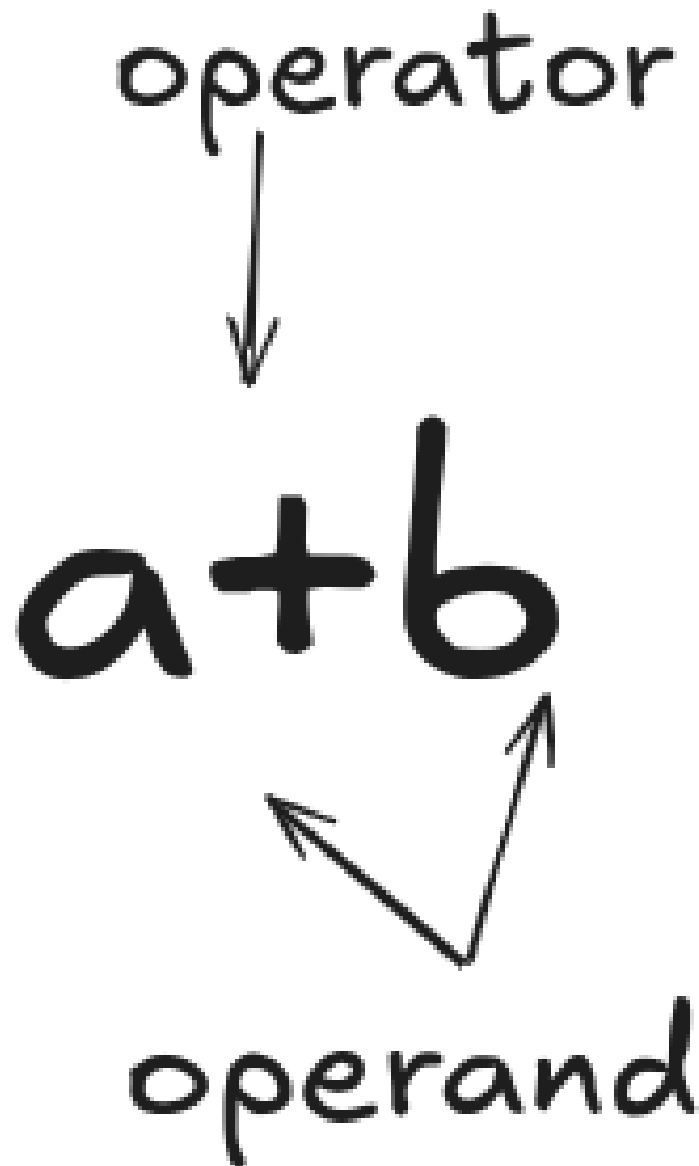


Figure 3.2: Operations: Operands and Operator

3.6.1 Postfix

Operands are written first then operator is written.

Example. $52+$

3.6.2 Prefix

Operator are written first then operands are written.

Example. $+52$

3.6.3 Infix

Example. $5 + 2$

Operator is written in between the operands.

3.6.4 Conversion

Take expression $a + b$. First step is to bracket the expression: $(a + b)$

Infix to Prefix We move the operator to before the bracket: $+ab$

Infix to Postfix We move the operator to after the bracket: $ab+$

Example $(a + b * c)$. Apply the BODMAS rule to put brackets:

$$(a + (b * c))$$

To prefix: $+a * bc$

To postfix: $abc * +$

Example $((a + b) * c - d + e)$. Apply the BODMAS rule to put brackets:

$$(((a + b) * c) - (d + e))$$

To prefix: $- * +abc + de$

To postfix: $ab + c * de + -$

Lecture 4: Fourth Lecture

Infix to Postfix Conversion Implementation

Consider the relative precedence of operations according to **BODMAS** rule.

1. **Initialize** an empty stack for operators, S , and an empty output string (or list) for the postfix expression, P .
2. **Scan** the infix expression E from left to right, one symbol at a time.
3. **For each symbol t in E :**
 - a) If t is an **operand** (letter or digit), append t to P .
 - b) If $t = ($, push t onto S .
 - c) If $t =)$, pop and append all operators from S to P until a left parenthesis $($ is encountered. Pop and discard the left parenthesis.
 - d) If t is an **operator** $(+, -, *, /, ^)$:
 - i) While S is not empty, and the operator at the top of S has greater or equal precedence than t (and is not a left parenthesis), pop from S and append to P .
 - ii) Push t onto S .
4. **After scanning** the entire infix expression, pop and append any remaining operators from S to P .
5. The output P is the postfix expression.

We define functions to handle precedence prehand and functions for handling expressions.

```
1 def operate(a, b, o):
2     if o == "+":
3         return a + b
4     if o == "-":
5         return a - b
6     if o == "*":
7         return a * b
8     if o == "/":
9         return a / b
10
11
12 def is_operator(char: str):
13     return char in "+-/*^"
14
15
16 def precedence(op):
17     if op in "+-":
18         return 1
19     if op in "*/":
20         return 2
21     if op == "^":
22         return 3
23     return 0
```

Listing 3.2: Expressions Handling

Algorithm 3.1: Infix to Postfix Conversion

Input: Infix expression E **Output:** Postfix expression P

```

1 Initialize an empty stack  $S$ ;
2 Initialize an empty output string  $P$ ;
3 for each token  $t$  in  $E$  (from left to right) do
4   if  $t$  is an operand then
5     Append  $t$  to  $P$ ;
6   else
7     if  $t = ($  then
8       Push  $t$  onto  $S$ ;
9     else
10      if  $t = )$  then
11        while top of  $S \neq ($  do
12          Pop from  $S$  and append to  $P$ ;
13        Pop  $($  from  $S$ ;
14      else
15        while  $S$  is not empty and  $\text{precedence}(t) \leq \text{precedence}(\text{top of } S)$  and
16          top of  $S \neq ($  do
17            Pop from  $S$  and append to  $P$ ;
18      Push  $t$  onto  $S$ ;
19 while  $S$  is not empty do
20   Pop from  $S$  and append to  $P$ ;
21 return  $P$ ;

```

```

1 from expressions import is_operator, precedence
2 from stack import Stack
3
4
5 def infix_to_postfix(exp):
6     stack = Stack()
7     output = ""
8
9     for char in exp:
10         if char.isalnum():
11             output += char
12         elif char == "(":
13             stack.push(char)
14         elif char == ")":
15             while not stack.is_empty() and stack.peek() != "(":
16                 output += stack.pop()
17             stack.pop()
18         elif is_operator(char):
19             while (
20                 not stack.is_empty()
21                 and stack.peek() != "("
22                 and precedence(char) <= precedence(stack.peek())
23             ):
24                 output += stack.pop()
25             stack.push(char)
26
27     while not stack.is_empty():
28         output += stack.pop()
29
30     return output

```

Listing 3.3: Infix to Postfix Conversion

3.6.5 Postfix Evaluation

1. Scan the expression from left to right until we encounter any operator.
2. Perform the operation
3. replace the expression with its computed value.
4. Repeat the steps from **1** to **3** until no more operators exist.

Example. Postfix Expression: $34 * 25 * +$

Algorithm 3.2: Postfix Evaluation**Data:** exp: Expression to evaluate**Result:** Result of evaluation of the expression

```

1 begin
2   stack ← empty stack;
3   for char in exp do
4     if char is operator then
5       a ← stack.pop();
6       b ← stack.pop();
7       o ← char;
8       push a operated(o) on b to stack;
9     else
10      push char to stack;
11  return pop stack

```

Input	Stack	Action
34 * 25 * +	empty	Push 3
4 * 25 * +	3	Push 4
*25 * +	3,4	Pop 3, 4. Perform 3 * 4. Push 12
25 * +	12	Push(2)
5 * +	12, 2	Push 5
*+	12, 2, 5	Pop 2, 5. Perform 2 * 5, Push 10
+	12, 10	Pop 12, 10. Perform 12 + 10, Push 22
	22	22 is the evaluation.

Postfix Evaluation Implementation

We have previously made a **Stack**. We have used the helper functions made previously. Then the function for evaluating postfix expression is defined.

```
1 from stack import Stack
2 from expressions import operate, is_operator
3
4
5 def eval_postfix(exp: str):
6     stack = Stack()
7     for char in exp:
8         if is_operator(char):
9             stack.push(operate(stack.pop(), stack.pop(), char))
10        else:
11            stack.push(int(char))
12    return stack.pop()
```

Listing 3.4: Postfix Evaluation

Chapter 4

Queue

4.1 Properties of queue

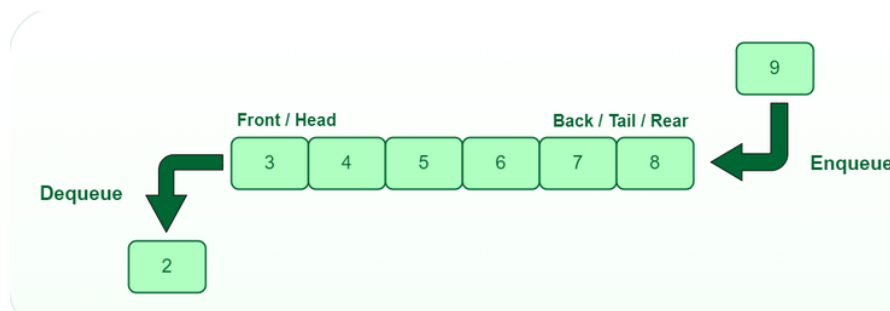


Figure 4.1: Queue Visualization

1. **First In First Out**
2. Both end of a queue is open.

4.2 Application of Queue

- Hospital, Canteen queue
- **CPU scheduling** for processes
- Railway System for simulating train.
- Simulation

4.3 Operations on Queue

- **deque**: Take out element which came first.

- **enqueue**: Insert element at the last of the queue.
- **isEmpty**: Check if the queue is empty.
- **isFull**: is the queue full in terms of memory.
- **peek**: See what element will be dequeued.

4.4 Queue Implementation

The following is the implementation of queue data structure in **Python**.

```

1 class Queue:
2     def __init__(self):
3         self.queue = []
4
5     def enqueue(self, element):
6         """Add an element to the end of the queue."""
7         self.queue.append(element)
8
9     def dequeue(self):
10        """Remove and return the front element of the queue.
11        Returns a message if the queue is empty."""
12        if self.isEmpty():
13            raise ValueError("Queue is empty")
14        return self.queue.pop(0)
15
16    def peek(self, end=False):
17        """Return the front element without removing it.
18        Returns a message if the queue is empty."""
19        if self.isEmpty():
20            raise ValueError("Queue is empty")
21        return self[0] if end else self[-1]
22
23    def isEmpty(self):
24        """Return True if the queue is empty, else False."""
25        return len(self.queue) == 0
26
27    def size(self):
28        """Return the number of elements in the queue."""
29        return len(self.queue)
30
31    def __getitem__(self, index: int):
32        return self.queue[index]

```

Listing 4.1: Queue Implementation

4.5 Circular Queue

A circular queue is an extended version of a standard queue where the last element is connected to the first, forming a circular structure. This design efficiently utilizes the queue's storage space by allowing elements to wrap around from the end to the beginning of the underlying array.

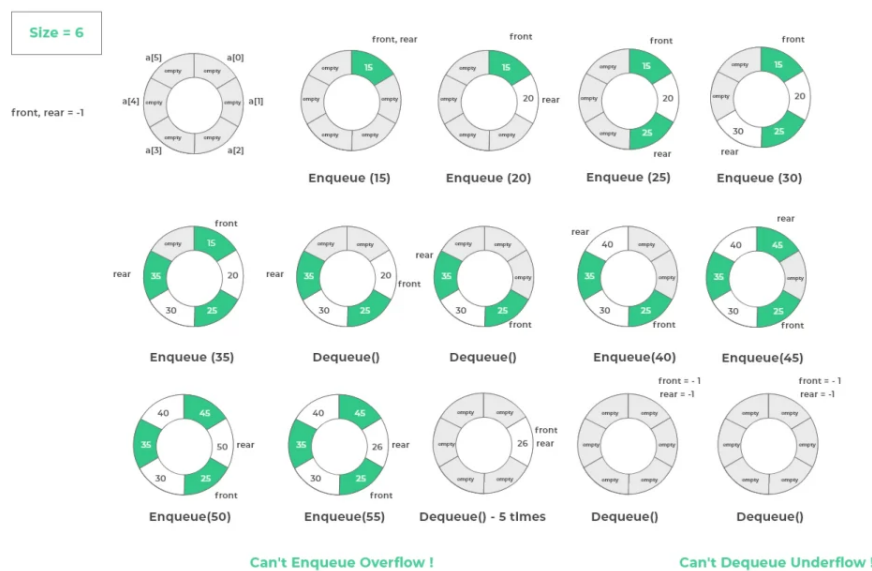


Figure 4.2: Circular Queue

4.5.1 Key Characteristics and Components

A circular queue typically uses:

- An underlying array (or list in Python) of a fixed size (**maxSize** or **k** or **capacity**) to store the queue elements.
- Two pointers:
 - **FRONT** (or **head**): Tracks the first element of the queue.
 - **REAR** (or **tail**): Tracks the last element of the queue.
- **Initialization**: Initially, both **FRONT** and **REAR** are often set to -1 to indicate an empty queue.

Operations

The primary operations of a circular queue include:

Enqueue (Adding an element)

Dequeue (Removing an element)

Front (Peek)

isFull

isEmpty

4.6 Priority Queue

Each element has different priority. The item with highest priority is dequeued first. Other than that, everything is same as queue.

Chapter 5

Deque

It's Just a list which can add elements to front and back.

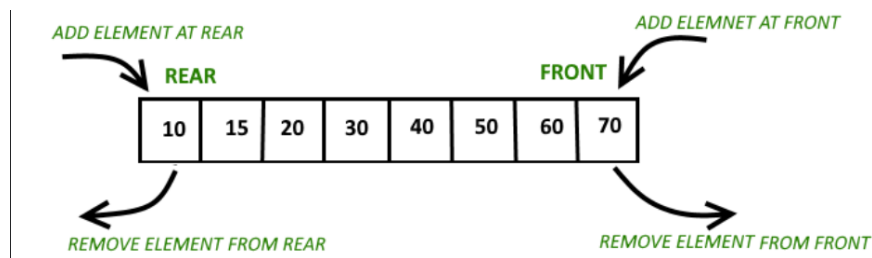


Figure 5.1: Deque Visualization

```
1 from collections import deque
2
3 a = deque()
4 a.appendleft(5)      # [5]
5 a.appendleft(3)      # [3, 5]
6 print(a.popleft())   # [5]
7 a.append(1)          # [5, 1]
8 a.append(2)          # [5, 1, 2]
9 print(a.pop())       # [5, 1]
```

Listing 5.1: Deque Implementation in Python

Chapter 6

Linked List

6.1 Introduction

6.2 Types of Linked List

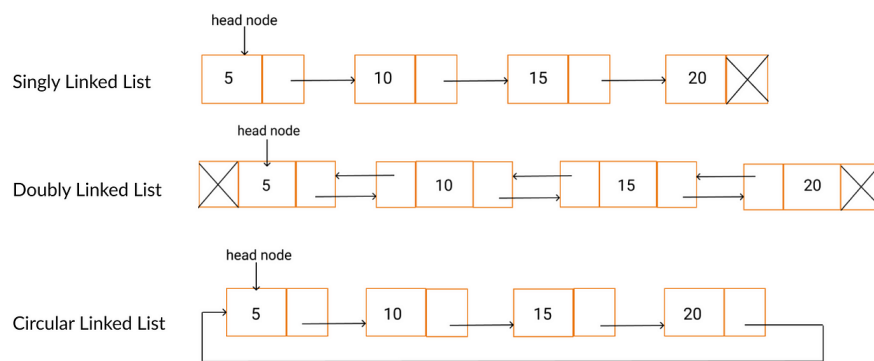


Figure 6.1: Different Types of Linked List

6.3 Singly Linked List

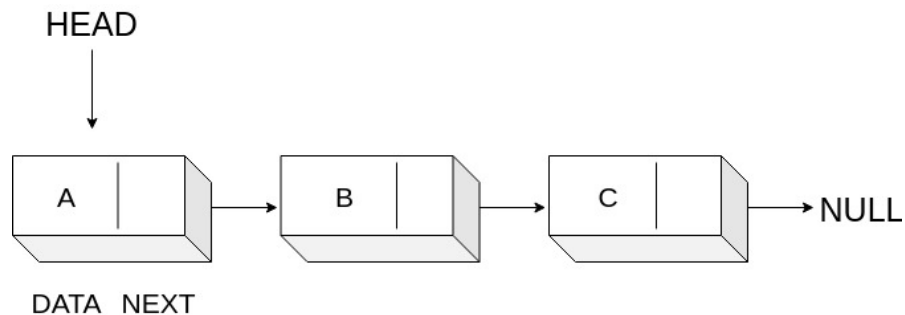


Figure 6.2: Singly Linked List Visualization

6.3.1 Implementation of Singly Linked List

```

1  from typing import Any, Iterable, Self
2
3
4  class Node:
5      value: Any
6      next: Self
7
8      def __init__(self, value, next=None) -> None:
9          self.value = value
10         self.next = None
11
12         def __str__(self) -> str:
13             return str(self.value)
14
15         def __repr__(self) -> str:
16             return self.value
17
18
19  class LinkedList:
20      current: Node
21      head: Node
22      length: int = 0
23      tail: Node
24
25      def __init__(self, lst: Iterable = []) -> None:
26          self.head = None
27          self.tail = None
28          for e in lst:
29              self.append(e)
30
31      def append(self, value):
  
```

```
32     node = Node(value)
33     if not self.head:
34         self.head = node
35         self.tail = self.head
36         self.length += 1
37         return
38     self.tail.next = node
39     self.tail = self.tail.next
40     self.length += 1
41
42     def __iter__(self):
43         self.current = self.head
44         return self
45
46     def __next__(self):
47         if not self.current:
48             raise StopIteration
49         value = self.current.value
50         self.current = self.current.next
51         return value
52
53     def __str__(self) -> str:
54         return " -> ".join([str(e) for e in self])
55
56     def __repr__(self) -> str:
57         return self.__str__()
58
59     def __getitem__(self, index: int):
60         curr = self.head
61         j = 0
62         while curr:
63             if index == j:
64                 return curr.value
65             curr = curr.next
66             raise IndexError("Out of Bounds")
67
68     def __len__(self):
69         return self.length
70
71
72 if __name__ == "__main__":
73     lst = LinkedList(["hello", "jello", "bello"])
74     print(lst)
```

Listing 6.1: Singly Linked List with Tail Implementation

6.4 Doubly Linked List

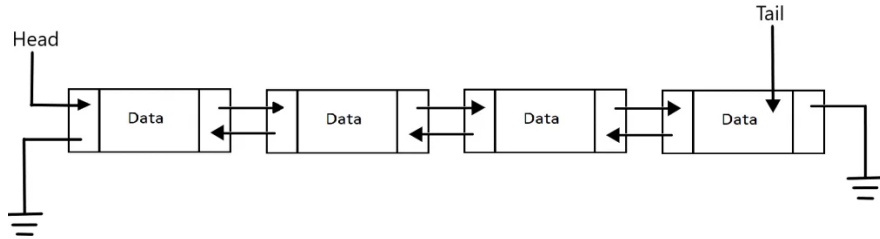


Figure 6.3: Doubly Linked List Visualization

6.4.1 Implementation of Doubly Linked List

```

1  from typing import Any, Iterable, Self
2
3
4  class Node:
5      value: Any
6      next: Self
7      prev: Self
8
9      def __init__(self, value, next=None, prev=None) -> None:
10         self.value = value
11         self.next = None
12         self.prev = prev
13
14     def __str__(self) -> str:
15         return str(self.value)
16
17     def __repr__(self) -> str:
18         return self.value
19
20
21
22  class LinkedList:
23      current: Node
24      head: Node
25      length: int = 0
26      tail: Node
27
28      def __init__(self, lst: Iterable = []) -> None:
29          self.head = None

```



```

30     self.tail = None
31     for e in lst:
32         self.append(e)
33
34     def append(self, value):
35         if not self.head:
36             self.head = Node(value)
37             self.tail = self.head
38             self.length += 1
39             return
40         self.tail.next = Node(value, prev=self.tail.prev)
41         self.tail = self.tail.next
42         self.length += 1
43
44     def insert_after(self, index, value):
45         if not self.head:
46             self.head = Node(value)
47             self.tail = self.head
48             self.length += 1
49             return
50         if self.length == index+1:
51             self.append(value)
52             return
53         node = Node(value)
54         a = self[index]
55         node.next = a.next
56         node.prev = a
57         self[index].next = node
58         self.length += 1
59
60     def delete(self, index):
61         a = self[index]
62         print(a.prev)
63         a.prev.next = a.next
64         return a
65
66     def __iter__(self):
67         self.current = self.head
68         return self
69
70     def __next__(self):
71         if not self.current:
72             raise StopIteration
73         value = self.current.value
74         self.current = self.current.next
75         return value
76
77     def __str__(self) -> str:
78         elements = []
79         for e in self:

```

```

80         elements.append(str(e))
81     return " -> ".join(elements)
82
83     def __repr__(self) -> str:
84         return self.__str__()
85
86     def __getitem__(self, index: int):
87         curr = self.head
88         for i in range(index):
89             curr = curr.next
90         return curr
91
92     def __len__(self):
93         return self.length
94
95
96 lst = LinkedList([1, 2, 3, 4, 5])
97 print(lst[2].prev)

```

Listing 6.2: Doubly Linked List with Tail Implementation

6.5 Circular Linked List



Figure 6.4: Circular Linked List Visualization

Chapter 7

Tree

Appendix