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# Algorithm Analysis & Data Structures

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# What is an Algorithm?

- Any guess(es)?

# What is an Algorithm?

## Techincally speaking...

An algorithm is a well-defined procedure that takes a set of values as input and produces set of values as output.

## Simply speaking...

An algorithm is just a recipe/guide/manual of simple steps to follow in order to achieve some goal.

## Essentially,

An algorithm is a tool to solve a well defined (*computational*) problem.

# What is an Algorithm?

## In terms of computer science...

An algorithm is a set of steps a program takes to finish a task.

# Time for an example – Algorithm in real life...

Goal: To bake a simple cake!

Algorithm/Steps:

- Preheat the oven.
- Gather the ingredients.
- Measure out the ingredients.
- Mix together the ingredients to form a batter.
- Grease/oil a pan.
- Pour the prepared batter into the pan.
- Put the pan into an oven.
- Set the timer.
- When timer rings, take the pan out of the oven.
- Enjoy! *(Not really a part of the algorithm :P)*

# A few other examples – Algorithm in real life...

## Daily activities such as:

- Driving to a particular destination.
- Doing Laundry.
- Preparing coffee.
- Reaching to office/university.
- Working and completing the assignments.
- 
- 
-

# Have I ever seen/written an Algorithm?

## Coming back to the definition of algorithm – computer science...

An algorithm is a set of steps a program takes to finish a task.

What if my goal was just to display “Hello World”?

```
1 print("Hello World")
```

Hello World

Congrats!

# Why should we study about algorithms?

A simple toy example:

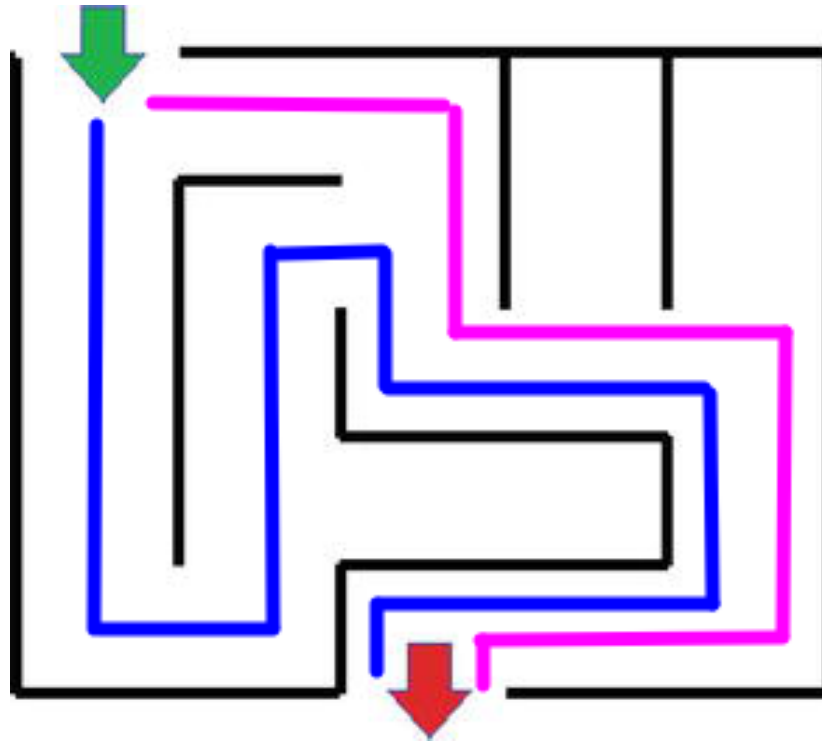


Figure 1: Solving a simple maze [1]

[1] <https://www.intechopen.com/chapters/65828>



# Comparing Algorithms – with example

Suppose ...



Figure 2: You have a book to read [2]

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[2] [https://www.goodreads.com/user\\_status/show/286383699](https://www.goodreads.com/user_status/show/286383699)

# Comparing Algorithms – with example

And ...



Figure 3: You have to open a target page [3]

[3] <https://www.wattpad.com/959498332-origami-a-draco-malfoy-fan-fiction-chapter-1-page>

# Comparing Algorithms

Keeping it really simple –

1	2	3	4	5	6	7	8	9	10
---	---	---	---	---	---	---	---	---	----

Let's say our book only has 10 pages!

As depicted above.

And, there are **only** two ways to achieve our goal:

1. Simply turn one page at a time sequentially.
2. Dividing the book into half recursively and until we reach our target page.

# Comparing Algorithms

Keeping it really simple –

1<sup>st</sup> Approach.

Target page: 3

1	2	3	4	5	6	7	8	9	10
---	---	---	---	---	---	---	---	---	----

Required steps – 3

# Comparing Algorithms

Keeping it really simple –

2<sup>nd</sup> Approach.

Target page: 3

1	2	3	4	5	6	7	8	9	10
---	---	---	---	---	---	---	---	---	----

Required steps – 3

# Comparing Algorithms

Keeping it really simple –

1<sup>st</sup> Approach.

Target page: 10

1	2	3	4	5	6	7	8	9	10
---	---	---	---	---	---	---	---	---	----

Required steps – 10

# Comparing Algorithms

Keeping it really simple –

2<sup>nd</sup> Approach.

Target page: 10

1	2	3	4	5	6	7	8	9	10
---	---	---	---	---	---	---	---	---	----

Required steps – 4

# Comparing Algorithms

Keeping it really simple –

1<sup>st</sup> Approach.

Target page: 100

1	2	3	...	50	...	97	98	99	100
---	---	---	-----	----	-----	----	----	----	-----

Required steps – ?



# Comparing Algorithms

Keeping it really simple –

2<sup>nd</sup> Approach.

Target page: 100

1	...	50	...	75	...	88	...	94	...	98	99	100
---	-----	----	-----	----	-----	----	-----	----	-----	----	----	-----

Required steps – 7

# Comparing Algorithms

What did we just perform?

→ Algorithm analysis

Comparisons of algorithms are usually done on the basis of:

Two important factors:

1. Time complexity
2. Space complexity

Ways to evaluate efficiency of an algorithm

Three important cases:

1. Worst case -  $O$  (called as Big Oh)
2. Best case -  $\Omega$  (called as Big Omega)
3. Average case -  $\Theta$  (called as Big Theta)

# Worst Case – Approach 1

Keeping it really simple –

1<sup>st</sup> Approach.

Input size (n) : 100

Target page : 100

Required steps : 100

Time complexity:  $O(?)$

# Worst Case – Approach 1

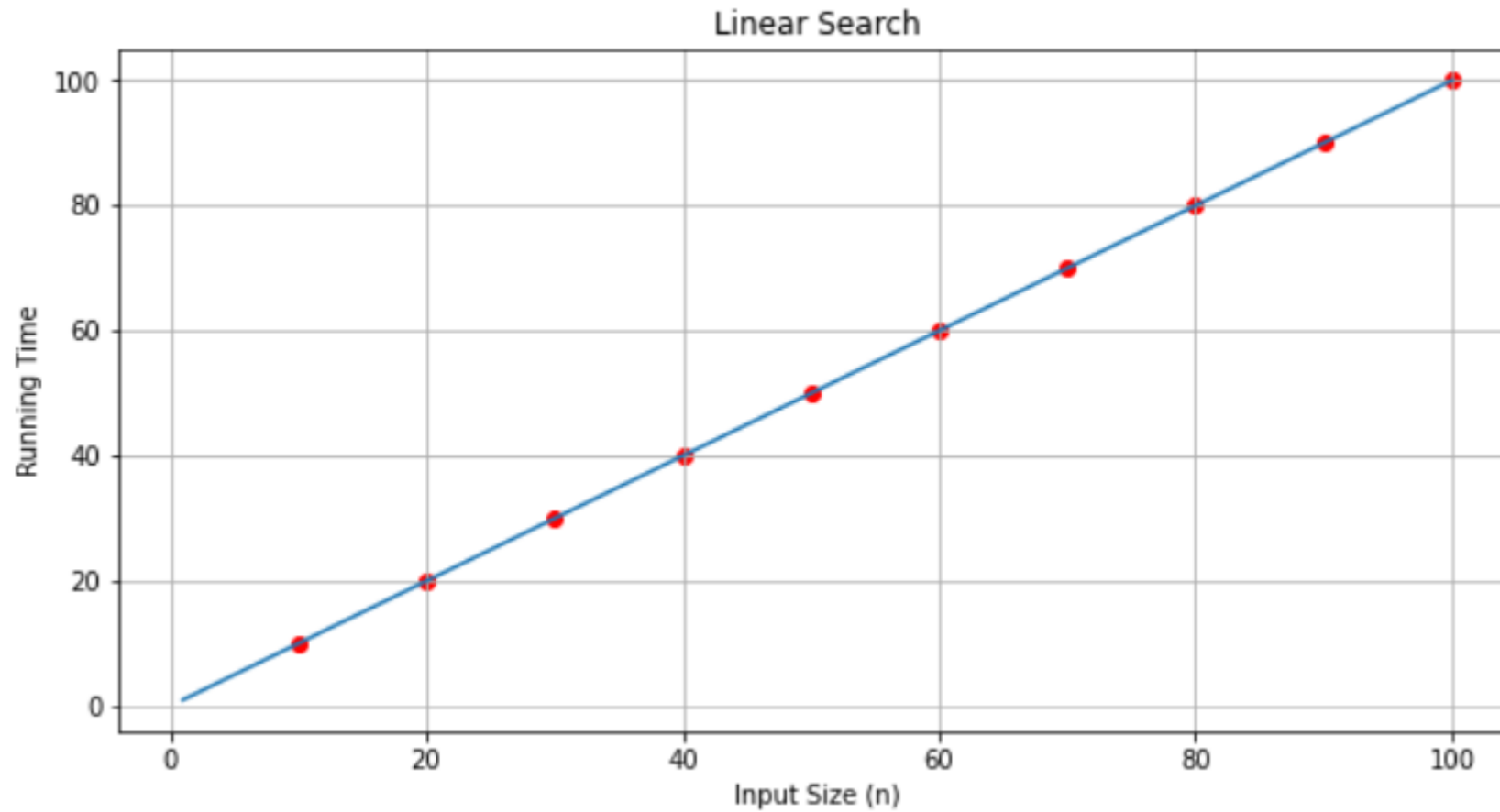


Figure 4: Run time complexity for linear search

# Worst Case – Approach 1

Keeping it really simple –

1<sup>st</sup> Approach.

Input size (n) : 100

Target page : 100

Required steps : 100

Time complexity:  $O(n)$

# Worst Case – Approach 2

Keeping it really simple –

2<sup>nd</sup> Approach.

Input size (n) : 100  
Target page : 100

Required steps : 7

Time complexity:  $O(?)$

# Worst Case – Approach 2

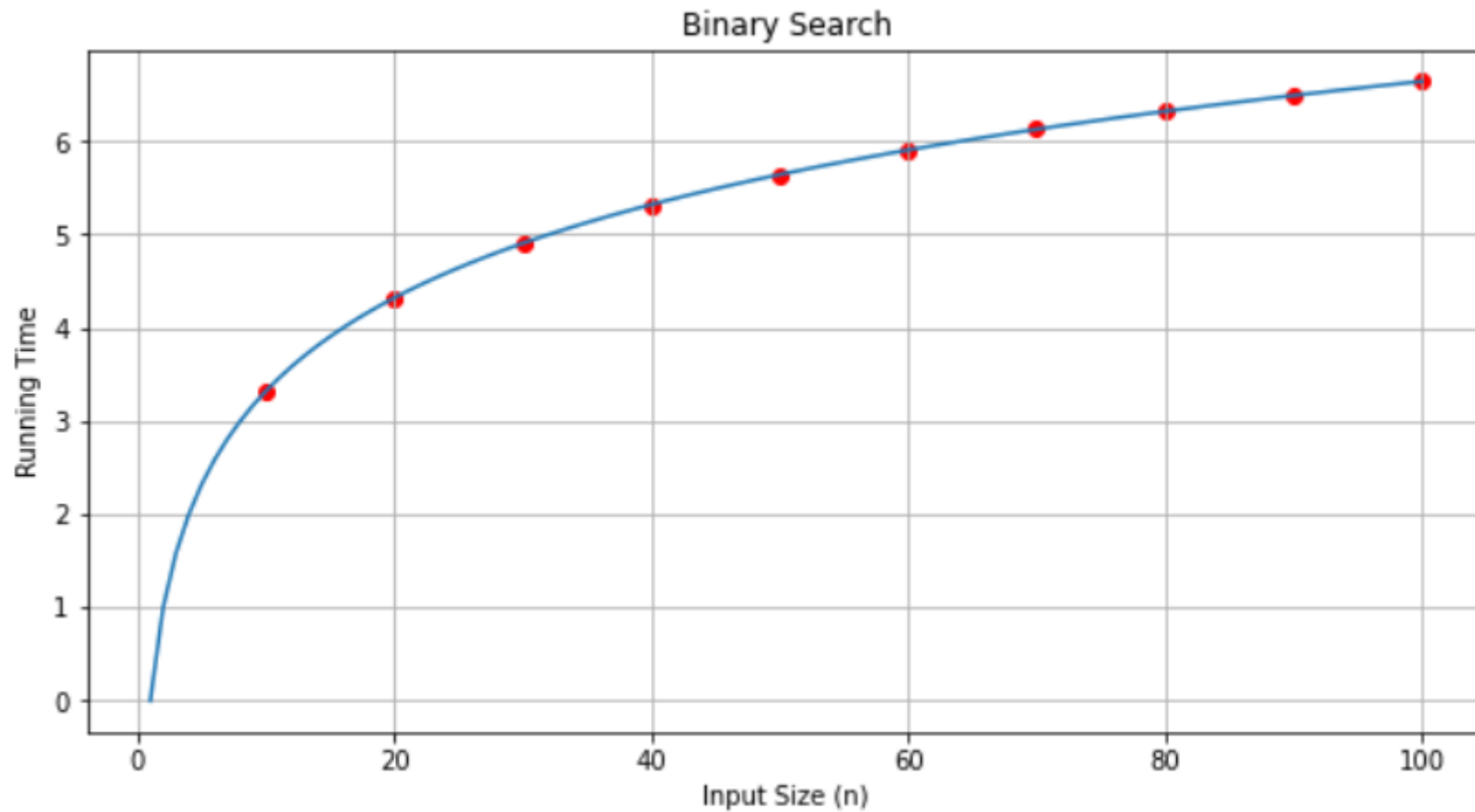


Figure 5: Run time complexity for binary search

# Worst Case – Approach 2

Keeping it really simple –

2<sup>nd</sup> Approach.

Input size ( $n$ ) : 100  
Target page : 100

Required steps : 7

Time complexity:  $O(\log_2(n) + 1)$

**Time complexity:  $O(\log_2(n))$**



# Some common time complexities

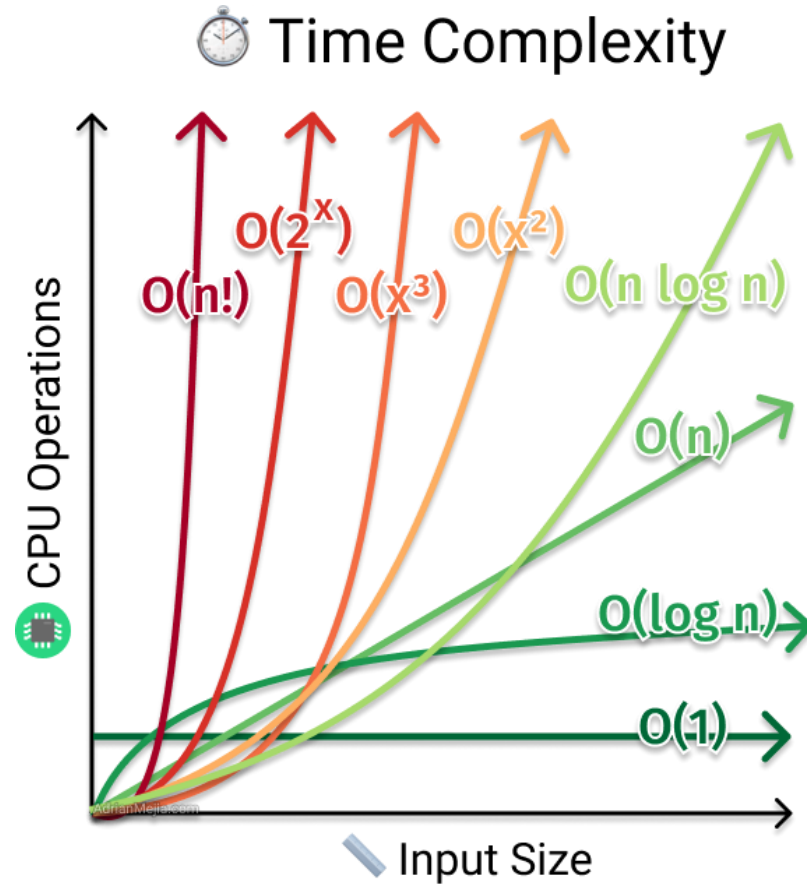


Figure 6: Comparing run-time complexity [4]

[4] <https://www.joyk.com/dig/detail/1608665582509127>

# Taking a step back... to think

How are we storing the data now?

Both the approaches currently use a common way to store data.

A python List (few other languages may refer it as “array”)

But, is the only way to store and access data in our programs?

# Ways to store data...

- List
- Tuple
- Set
- Dictionary
- Linked Lists
- Stacks
- Queues
- ⋮

# A Short Detour

- 3 properties of a python object
- Mutable vs immutable objects
- “is” operator vs “==” operator
- Container objects
- Hashable objects

# Properties of a python object

- Identity (ID) of an object
  - Memory address
- Type
  - Data type (*int, list, set, etc. or user-defined class*)
- Value
  - The actual data/value held by the object

# Mutable vs Immutable Objects

- **Mutable Objects**

- Allow changing of values held by the object.
- Example: set, user-defined classes, lists, etc.

- **Immutable Objects**

- Do not allow changing of values held by the object.
- Example: tuple, int, string, etc.

# “is” operator vs “==” operator

- **“is” operator**
  - Compares identity of two objects.
- **“==” operator**
  - Compares the values of two objects.

# Container Objects

- Objects containing another objects or reference to other objects.
- Example: list, dictionary, tuples, etc.
- **Note:** An immutable container's value which is referencing to a mutable object can be changed if that mutable object is changed.



# Hashable Objects

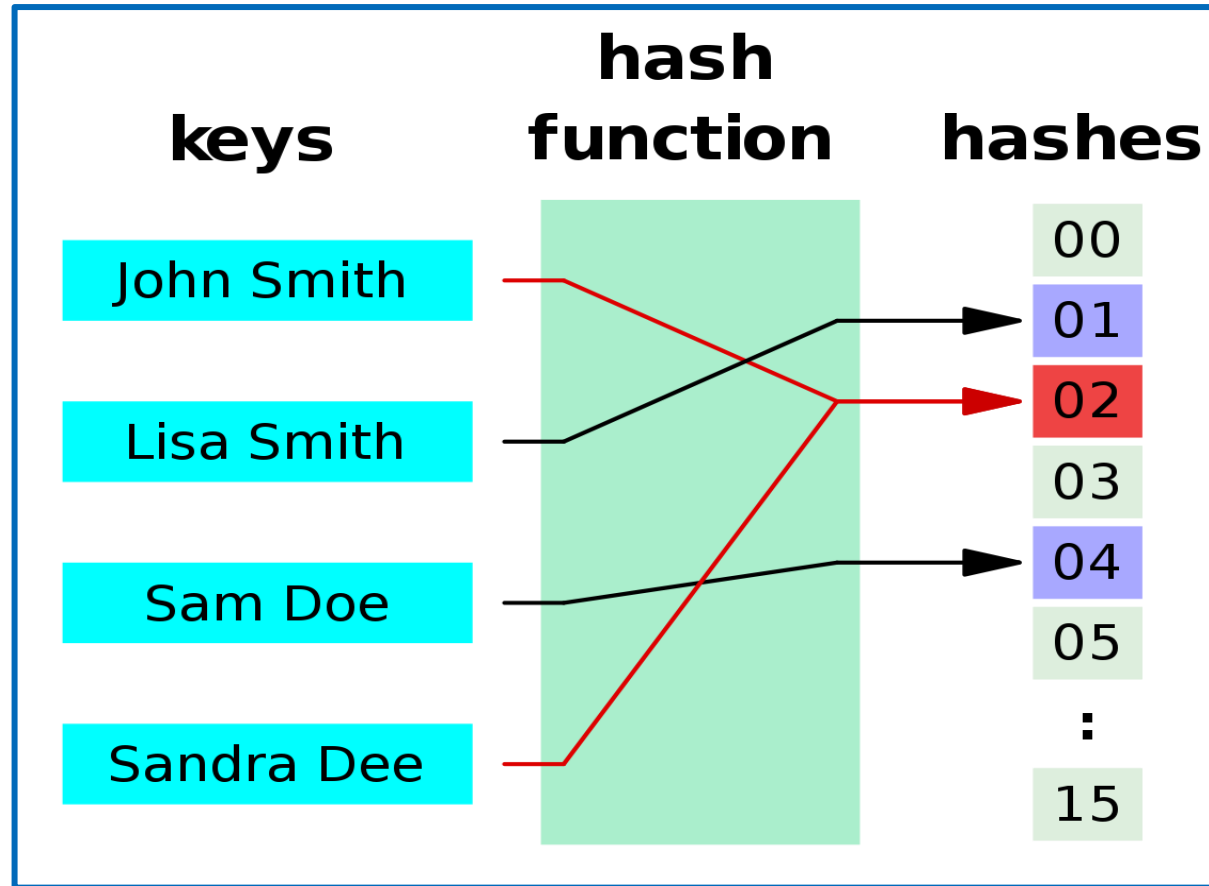


Figure 7: Dictionary as a map [5]

[5] [https://en.wikipedia.org/wiki/Hash\\_function](https://en.wikipedia.org/wiki/Hash_function)

# Hashable Objects

- The main idea is that, you can reduce a complex object to an index in an array.
- Example: Used in implementing dictionary, set, etc. data-structures.
- Hashable data types: int, float, str, tuple, NoneType, and user-defined classes.
- Unhashable data types: dict, list, and set.

# Going back to – Data Structures in Python

- List
- Tuple
- Set
- Dictionary
- Linked Lists
- Stacks
- Queues
- ⋮

# List (Array)

Value	1	2	3	4	5	6	7	8	9	10
Index	0	1	2	3	4	5	6	7	8	9

- Stores duplicate data
- Items are ordered
- Mutable object
- Can have items of different types

# List (Array)

Operation	Time Complexity (worst Case)
Append	$O(1)$
Pop	$O(1)$
Insert	$O(n)$
Delete	$O(n)$
Setting value at particular index	$O(1)$
Getting value from particular index	$O(1)$
Get length	$O(1)$
Finding/searching an element in List	$O(n)$

# Tuple

```
1 simple_spells = ("Expelliarmus", "Riddikulus", "Alohamora")
2 spells = list(simple_spells)
3 spells.append("Wingardium Leviosaa")
4 simple_spells.append("Wingardium Leviosaa")
```

```
-----
AttributeError                                Traceback (most recent call last)
<ipython-input-69-0ed7f4ddeee7> in <module>
      2 spells = list(simple_spells)
      3 spells.append("Wingardium Leviosaa")
----> 4 simple_spells.append("Wingardium Leviosaa")

AttributeError: 'tuple' object has no attribute 'append'
```

- Stores duplicate data
- Items are ordered
- Immutable object
- Can have items of different types

# Set

```
1 unforgivable_curses = ['Avada Kedavra', 'Crucio', 'Imperio', "Crucio", "Imperio", "Imperio"]
2 print(f"List: {unforgivable_curses}")
3 print("="*30)
4 print(f"Set :{set(unforgivable_curses)}")
```

```
List: ['Avada Kedavra', 'Crucio', 'Imperio', 'Crucio', 'Imperio', 'Imperio']
=====
Set :{'Crucio', 'Imperio', 'Avada Kedavra'}
```

- Does not store duplicate data
- Items are unordered
- Mutable object
- Can have items of different types

# Set

Operation	Time Complexity (worst case)
Finding element in set	$O(1)$
Intersection of two sets	$O(\min[\text{len}(\text{set1}), \text{len}(\text{set2})])$
Inserting an element	$O(1)$
Delete an element	$O(1)$
Iterating all elements in a set	$O(n)$
Get length	$O(1)$



# Dictionary (hash-tables)

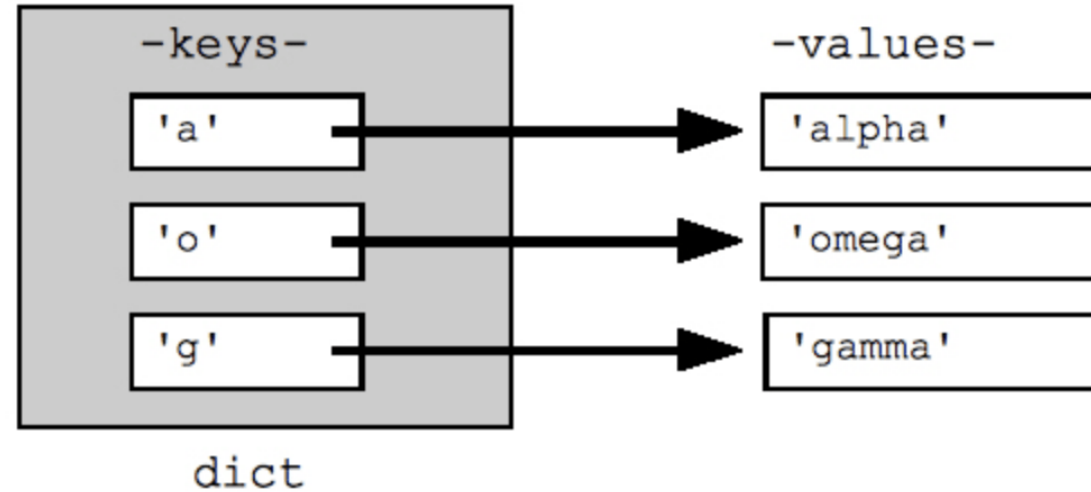


Figure 8: Dictionary as a map [6]

- Does not store duplicate keys
- Mutable object
- Keys should be hashable.

[6] <https://www.datacamp.com/community/tutorials/python-dictionaries>

# Dictionary

Operation	Time Complexity (worst case)
Finding an element	$O(1)$
Copying the dictionary	$O(n)$
Inserting an element	$O(1)$
Get value from key	$O(1)$
Deleting an element	$O(1)$
Iterating all elements in a set	$O(n)$
Get length	$O(1)$

# Linked Lists

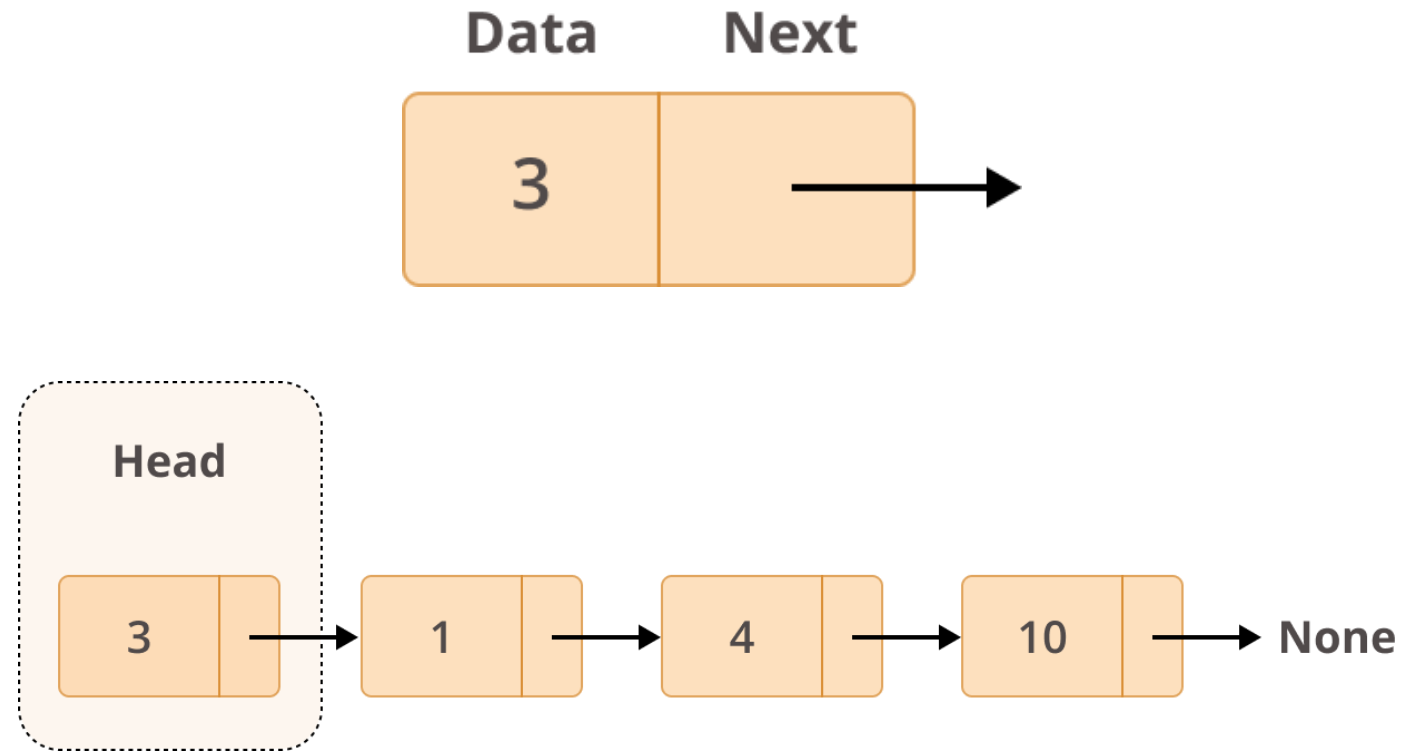


Figure 9: Node of a linked lists, example of singly linked list [7]

[7] <https://realpython.com/linked-lists-python/>

# Linked Lists

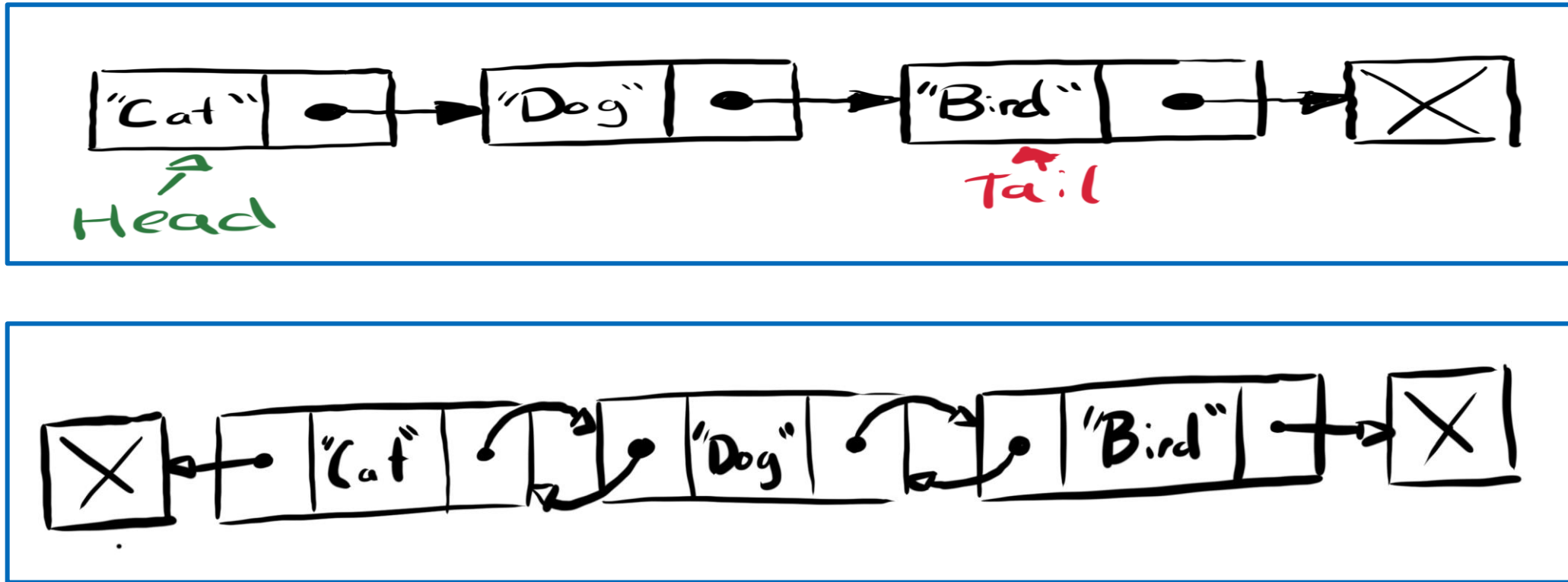


Figure 10: Singly and doubly linked lists [8]

[8] <https://www.mongodb.com/developer/how-to/introduction-to-linked-lists-and-mongodb/>

# Linked Lists

- Similar to lists (arrays) – the name has “List” in it, it was obvious!
- Memory allocation:
  - Lists have sequential memory allocation
  - Linked lists are stored in memory dynamically
- Insertion and deletion at beginning:
  - In Lists, it difficult and is usually  $O(n)$
  - In Linked List, it is very fast – usually  $O(1)$

# Stacks

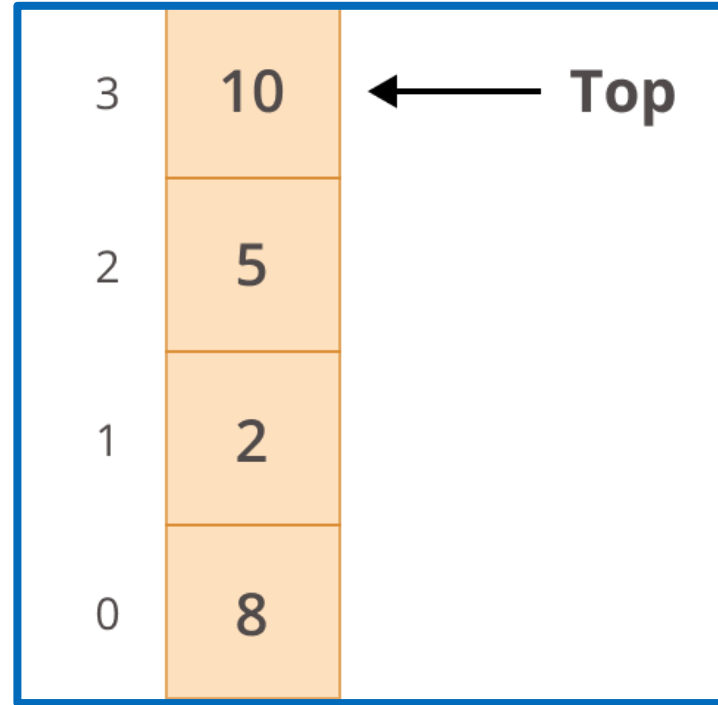


Figure 11: Linked lists as stack [7]

[7] <https://realpython.com/linked-lists-python/>

# Stacks

- Adding and deleting items only to and from one end!
- Follows the principle of LIFO (Last In First Out).
- “Top” always points to the topmost element of the stack.
- Basic stack operations:
  - Push (insertion)
  - Pop (deletion)
  - Top (returns topmost element)
  - IsEmpty (which returns TRUE if stack is empty)

# Queues

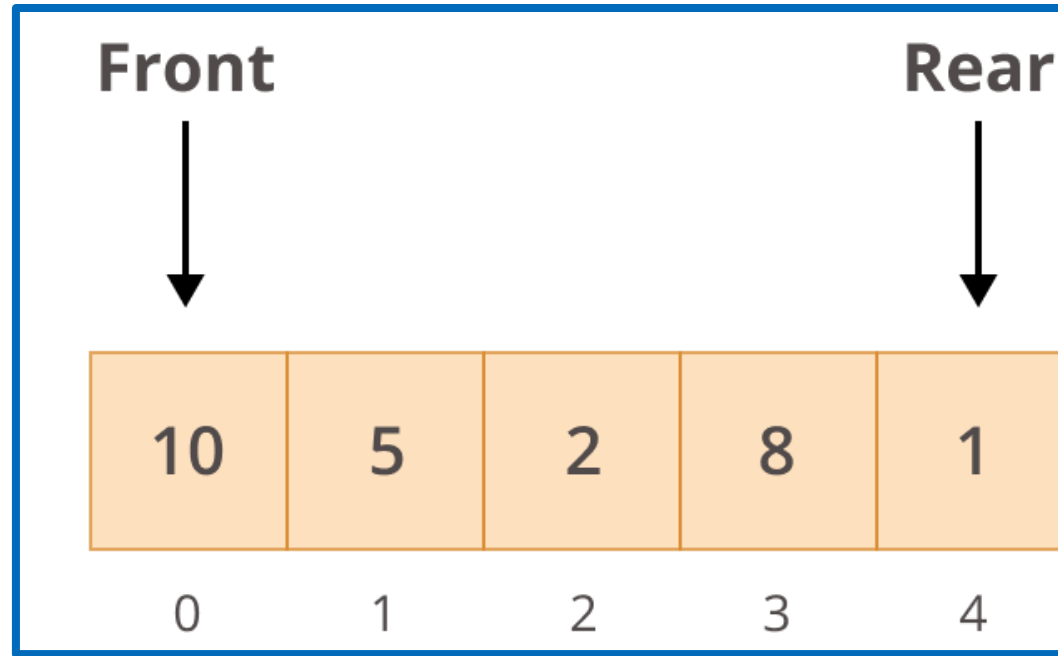


Figure 12: Linked lists as queue [7]

[7] <https://realpython.com/linked-lists-python/>



# Queues

- The 1<sup>st</sup> element is inserted from one end called the REAR (*also called tail*), and the removal of existing element takes place from the other end called as FRONT(*also called head*)!
- Follows the principle of FIFO (First In First Out).
- “FRONT” always points to the first element of the queue.  
“TAIL” always points to the last element in the queue.

# Queues

- Basic queue operations:
  - Push (Insertion) (enqueue)
  - PopLeft (Deletion) (dequeue)
  - Peek (returns the first element of queue without popping it)
  - IsEmpty (which returns TRUE if queue is empty)

# Linked Lists, Stacks, and Queues

Operation	Time Complexity (worst case)
Finding an element (linked list)	$O(n)$
Copying the data-structure	$O(n)$
Appending (queue – enqueue)	$O(1)$
Append left (pushing into stack)	$O(1)$
Pop (stack)	$O(1)$
Pop left (queue – dequeue)	$O(1)$
Deleting an element (linked list)	$O(n)$
Iterating all elements in a linked list	$O(n)$

# References (1/2)

[1] <https://www.intechopen.com/chapters/65828>

[2] [https://www.goodreads.com/user\\_status/show/286383699](https://www.goodreads.com/user_status/show/286383699)

[3] <https://www.wattpad.com/959498332-origami-a-draco-malfoy-fan-fiction-chapter-1-page>

[4] <https://www.joyk.com/dig/detail/1608665582509127>

# References (2/2)

[5] [https://en.wikipedia.org/wiki/Hash\\_function](https://en.wikipedia.org/wiki/Hash_function)

[6] <https://www.datacamp.com/community/tutorials/python-dictionaries>

[7] <https://realpython.com/linked-lists-python/>

[8] <https://www.mongodb.com/developer/how-to/introduction-to-linked-lists-and-mongodb/>

# Further Reading(s)

