Algorithm - Search and Sort (1)

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Review

- Class vs. Class object
- Method vs. Function
- Object-oriented programming
 - Encapsulation
 - Abstraction
 - Inheritance
 - Polymorphism
 - This is a CS course dedicated for OOP...



Why Search?

- Searching is a fundamental part of programming, especially in data science
- There are massive amount of data in the world and you want to find data you are interested
- You should find data that you want, efficiently



- Find if a target value exists in a list
- To do this, search from the first item to the last item sequentially (linear search)
- If the target value exists, return the index where the value <u>first occurs</u>
- Otherwise, return -1



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index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3



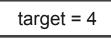
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target = 4





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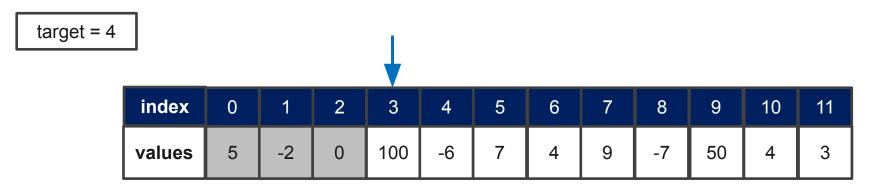


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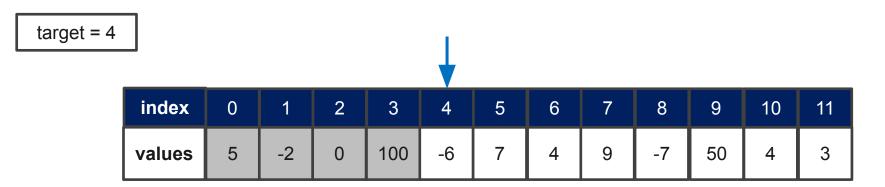


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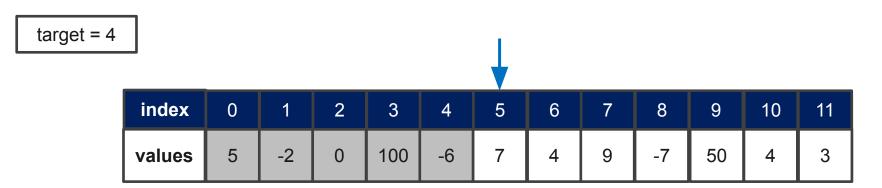


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Ignored...



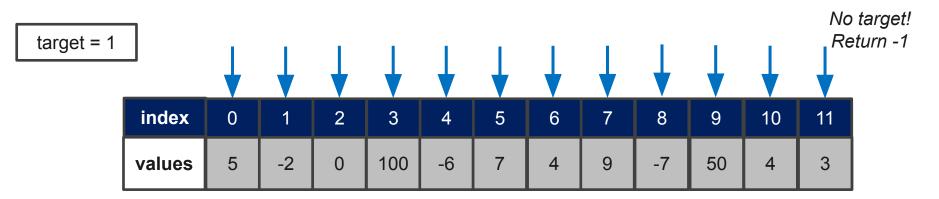
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target = 1

index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3



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Algorithm vs. Programming

Algorithm: A recipe for computers to follow (logical steps)

Program: An instruction set in programming languages for a computer to

understand and put an algorithm to practice

There can be **many different** ways to implement (program) a **single** algorithm!



Linear Search - Impl (1): While Loop

```
def linear_search_while(L: list, value: Any) -> int:
        i = 0
        while i < len(L) and L[i] != value:
            i = i + 1
        if i == len(L):
            return -1
        else:
            return i</pre>
```



Linear Search - Impl (2): While Loop with Sentinel

- The while loop version needs to do (i < len(L)) every time
 - Because we need to know when the loop reaches the end of the list
- How can we remove this? by using sentinel at the end of the list!





Linear Search - Impl (2): While Loop with Sentinel

- def linear_search_sentinel(L: list, value: Any) -> int:
- L.append(value) # Add the sentinel



- i = 0
- while L[i] != value: # This condition is enough!
- i = i + 1
- L.pop()

Remove the sentinel



- return -1
- else:
- return i



Caveat

Some people do not like modifying the input list because it could be dangerous and possibly incur errors



Linear Search - Impl (3): For Loop

```
    def linear_search_for(L: list, value: Any) -> int:
    for i in range(len(L)):
    if L[i] == value:
    return i
```

- Simple code, no complex conditions
- But some people dislike returning in the middle of a loop
- We have learnt three types of linear search, among which you can choose according to your taste \odot



Linear Search – Time Complexity

- How to measure time spent for an algorithm?
 - import time
 - o t_start = time.perf_counter()
 - <<Your Algorithm>>
 - o t_end = time.perf_counter()
 - return (t_end t_start) * 1000.0 # the unit becomes milliseconds



Linear Search – Time Complexity (10 M items)

- When the value is located at the end of the list, it takes more time (**linear increase**)
 - This is why the algorithm is called linear search!
- Built-in list.index is the fastest
 - Python program is notoriously slow since every line of code needs to pass through the
 Python interpreter at run time

Case	while	sentinel	for	list.index		
First	0.01	0.01	0.01	0.01		
Middle	1261	697	515	106		
Last	2673	1394	1029	212		



What if the list is **sorted**? Can we do anything better?

index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3



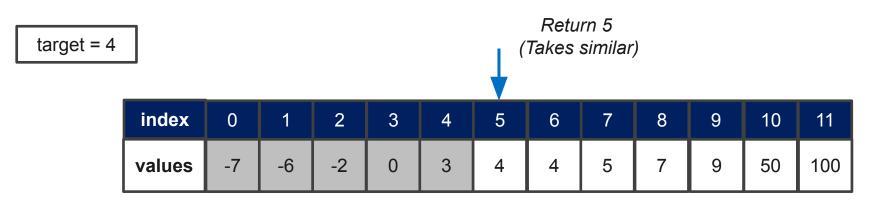
What if the list is **sorted**? Can we do anything better?

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-6	-2	0	3	4	4	5	7	9	50	100



Binary Search – Motivation

 Linear search does work for a sorted list, but does NOT take advantage of the fact that it is sorted





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 Linear search does work for a sorted list, but does NOT take advantage of the fact that it is sorted





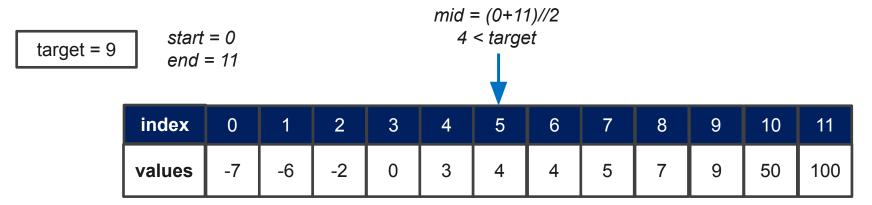
Binary Search - Idea

- Idea: Evaluate the middle of the sorted list and removes half of candidate entries
- Linear search: one evaluation removes **one** candidate entry
- Binary search: one evaluation removes half of candidate entries

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-6	-2	0	3	4	4	5	7	9	50	100

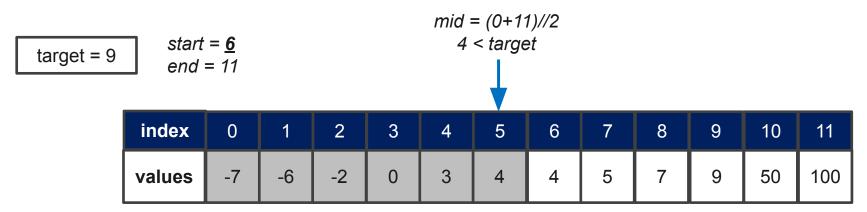


- Idea: Evaluate the middle of the sorted list and removes half of candidate entries
- Linear search: one evaluation removes one candidate entry
- Binary search: one evaluation removes half of candidate entries





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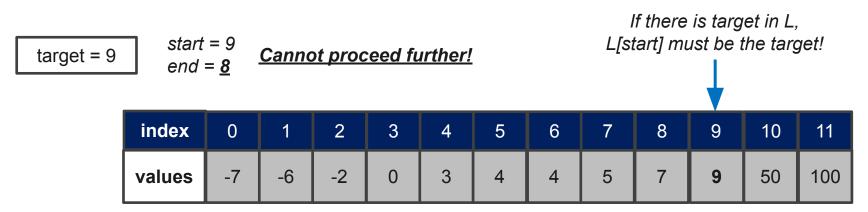


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Binary Search - Code

```
def binary_search(L: list, v: Any) -> int:
       start, end = 0, len(L) – 1
        while start != end + 1:
              mid = (start+end) // 2
              if L[mid] < v:
                    start = mid + 1
              else:
                    end = mid - 1
        if start < len(L) and L[start] == v:
               return start
        else:
               return -1
```



Binary Search – Time Complexity (10 M items)

- Linear search
 - Time delay is proportional to len(L)
- Binary search
 - $_{\circ}$ Time delay is proportional to $log_{\,2}^{\,len(L)}$
- A good example why <u>sorting</u> is useful!
 - But remember that sorting is NOT free either. It also takes non-negligible time...

Case	list.index	binary_search
First	0.007	0.02
Middle	105	0.02
Last	211	0.02 (WoW!)



Summary

- Linear search
 - Evaluate the first item and cut the one evaluated item
 - Time proportional to len(L)
 - Applicable to any list
- Binary search
 - Evaluate the middle item and cut the half
 - \circ Time proportional to $log_2^{len(L)}$
 - Applicable to a <u>sorted</u> list



Let's move onto sorting



Why Sorting?

- People often want to see numerous items sorted!
 - Midterm score, sports...
 - Dictionary
- Sorting helps searching
 - Binary search





Then, how can we sort a list?

index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3



Selection Sort - Idea

index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3



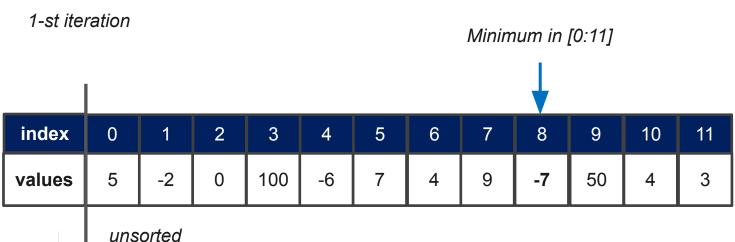
Find the minimum value of the unsorted list and swap it with the leftmost entry

1-st iteration

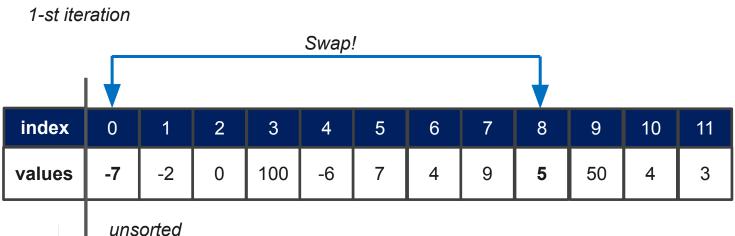
index	0	1	2	3	4	5	6	7	8	9	10	11
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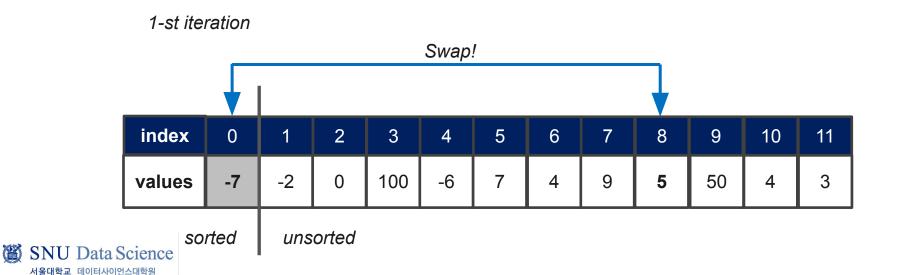


unsorted









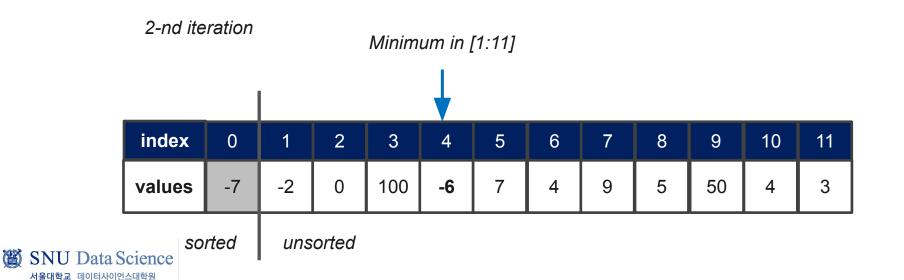
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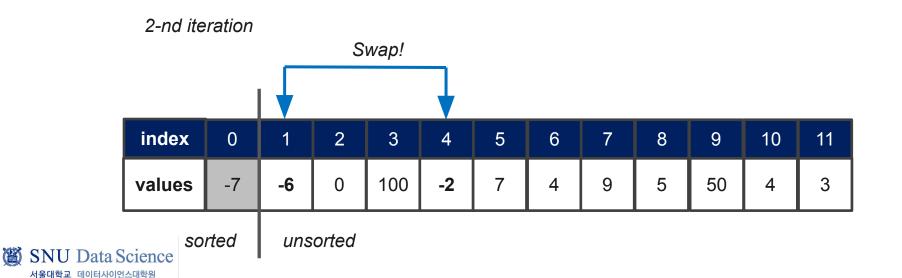
2-nd iteration

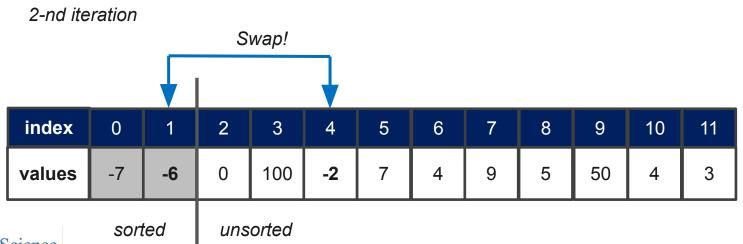
index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-2	0	100	-6	7	4	9	5	50	4	3



unsorte









Find the minimum value of the unsorted list and swap it with the leftmost entry

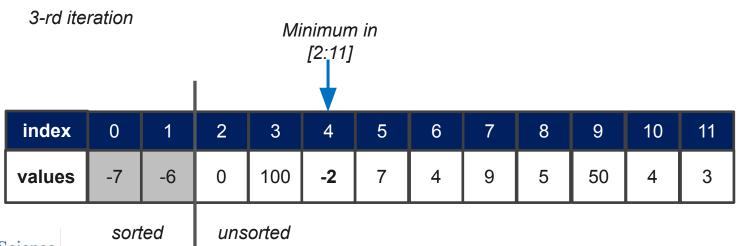
3-rd iteration

sorted

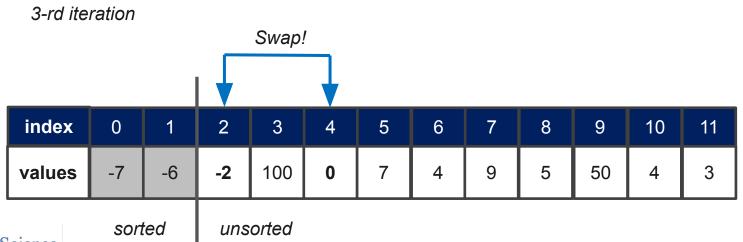
unsorted

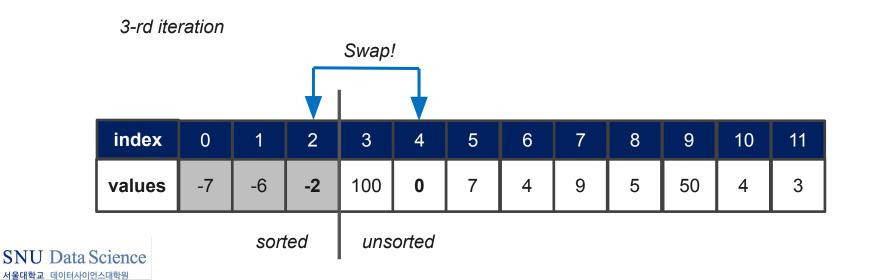
index	0	1	2	3	4	5	6	7	8	9	10	11
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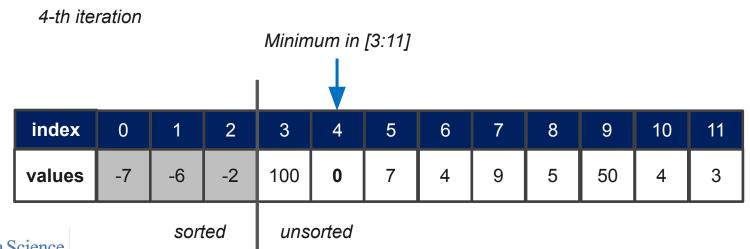


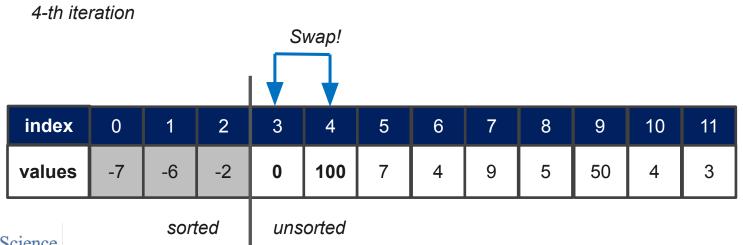


Find the minimum value of the unsorted list and swap it with the leftmost entry

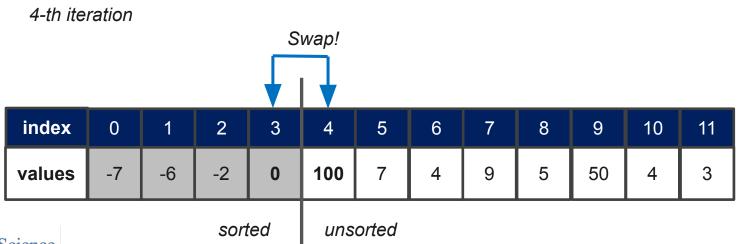
4-th iteration

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-6	-2	100	0	7	4	9	5	50	4	3
~ .		son	ted	unsorted					<u> </u>		·	









sorted

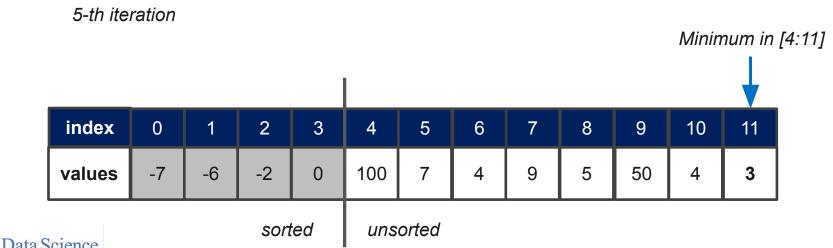
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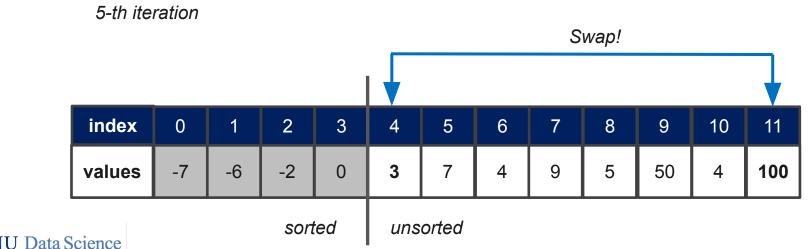
5-th iteration

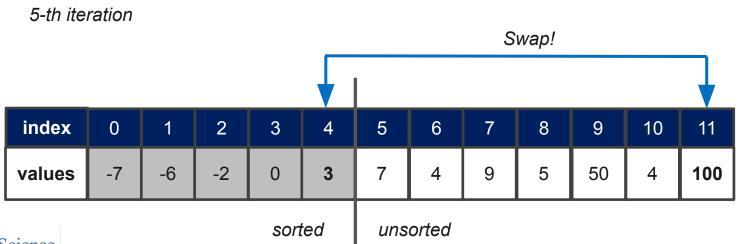
index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-6	-2	0	100	7	4	9	5	50	4	3

unsorted











Find the minimum value of the unsorted list and swap it with the leftmost entry

Repeat the procedure 12 times!

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-6	-2	0	3	7	4	9	5	50	4	100



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index	0	1	2	3	4	5	6	7	8	9	10	11
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sorted



Selection Sort - Code

- def selection_sort(L: list) -> None:
- for i in range(len(L)):
- # Find the index of the smallest item in L[i:]: smallest
- L[i], L[smallest] = L[smallest], L[i] # swap



Selection Sort - Code

- def selection_sort(L: list) -> None:
- for i in range(len(L)):
- smallest = find_min(L, i)
- L[i], L[smallest] = L[smallest], L[i] # swap



Selection Sort - Code



Selection Sort - Code (in one function)

```
    def selection_sort(L: list) -> None:
    for i in range(len(L)):
    smallest = i
    for j in range(i+1, len(L)):
    if L[j] < L[smallest]:</li>
    smallest = j
    L[i], L[smallest] = L[smallest], L[i] # swap
```



Selection Sort - Time Complexity

- At i-th iteration, its inner loop (func find_min) needs to look up (N+1-i) items
 - When N = len(L)
- N + (N-1) + (N-2) + ... + 1 = N(N+1)/2



Let's see another sorting algorithm called Insertion Sort



Insertion Sort – Idea

Insert the leftmost item of the unsorted list to the proper location of the sorted list

index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3



Insertion Sort – Algorithm

Insert the leftmost item of the unsorted list to the proper location of the sorted list

1-st iteration

	_											
index	0	1	2	3	4	5	6	7	8	9	10	11
values	5	-2	0	100	-6	7	4	9	-7	50	4	3

SNU Data Science

unsortea

unsorted

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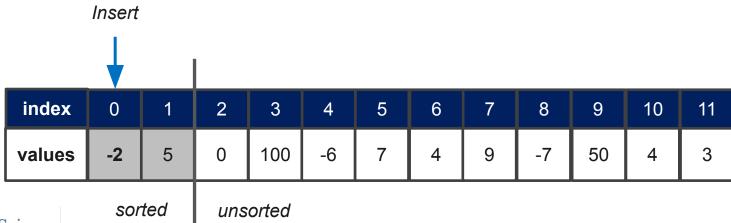


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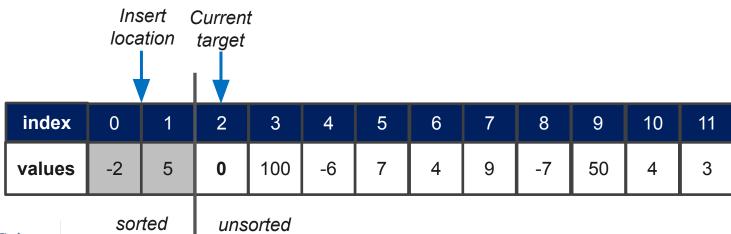




Insert the leftmost item of the unsorted list to the proper location of the sorted list

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-2	5	0	100	-6	7	4	9	-7	50	4	3
	uns	orted										

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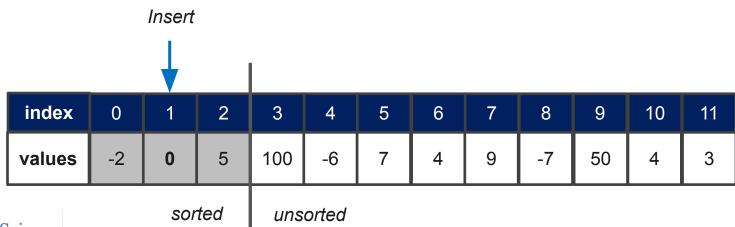




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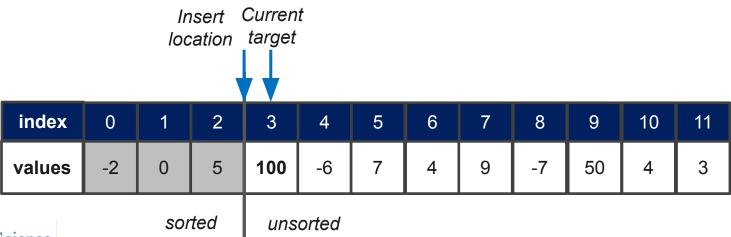




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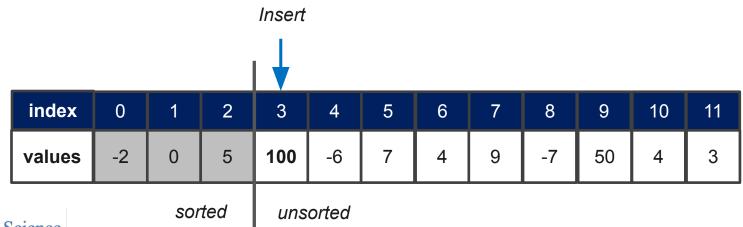
index	0	1	2	3	4	5	6	7	8	9	10	11
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		sor	ted	uns	orted							

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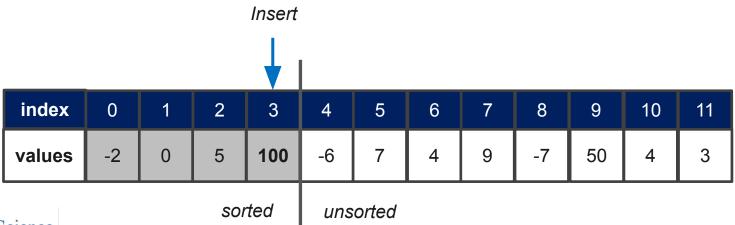




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Insert the leftmost item of the unsorted list to the proper location of the sorted list





Insert the leftmost item of the unsorted list to the proper location of the sorted list

4-th iteration

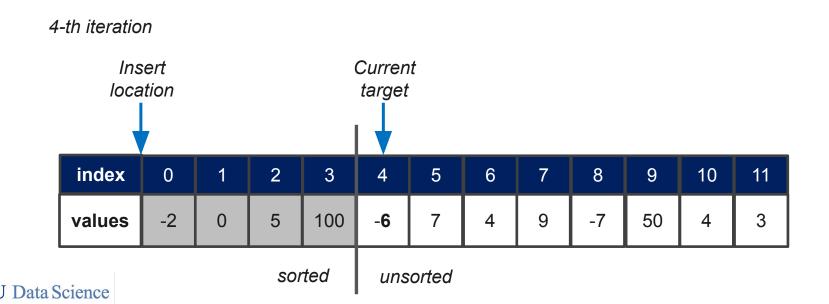
index	0	1	2	3	4	5	6	7	8	9	10	11
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sorted

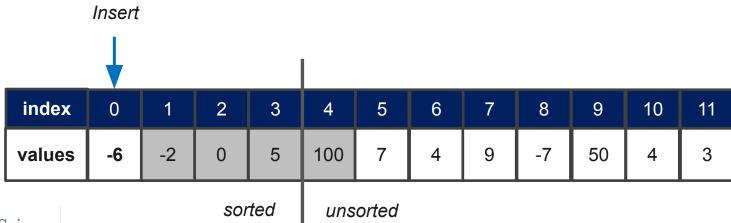


서울대학교 데이터사이언스대학원

Insert the leftmost item of the unsorted list to the proper location of the sorted list

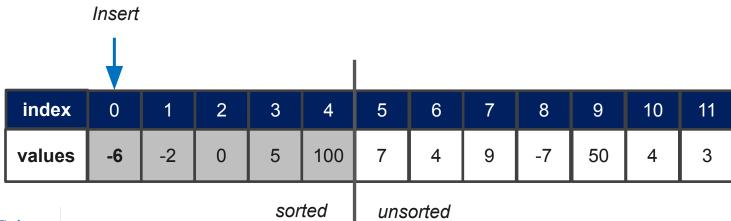


Insert the leftmost item of the unsorted list to the proper location of the sorted list





Insert the leftmost item of the unsorted list to the proper location of the sorted list





• Insert the leftmost item of the unsorted list to the proper location of the sorted list

5-th iteration

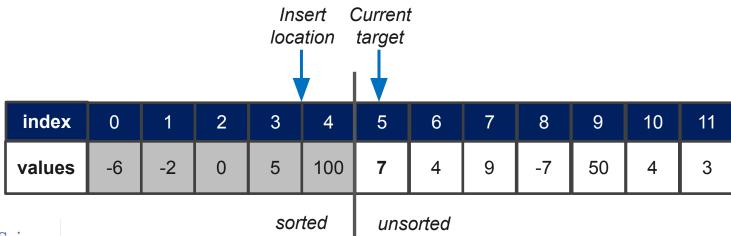
index	0	1	2	3	4	5	6	7	8	9	10	11
values	-6	-2	0	5	100	7	4	9	-7	50	4	3

unsorted

sorted

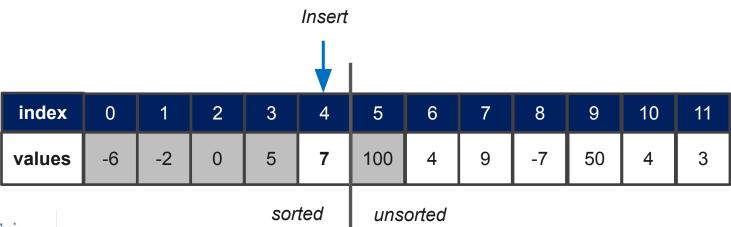


Insert the leftmost item of the unsorted list to the proper location of the sorted list



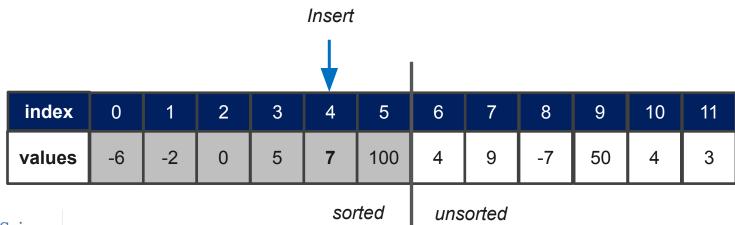


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Repeat the procedure 11 times!

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-6	-2	0	5	7	100	4	9	-7	50	4	3
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Repeat the procedure 11 times!

index	0	1	2	3	4	5	6	7	8	9	10	11
values	-7	-6	-2	0	3	4	4	5	7	9	50	100

sorted



Insertion Sort - Code

- def insertion_sort(L: list) -> None:
- for i in range(1, len(L)):
- # insert L[i] to the proper location of L[:i]

- def insertion_sort(L: list) -> None:
- for i in range(1, len(L)):
- insert(L, i)



Insertion Sort - Code

```
def insert(L: list, last_idx: int) -> None:
    for i in range(last_idx,0,-1): # (1) Go backwards
        if L[i-1] > L[i]: # (2) Check stopping condition
            L[i-1], L[i] = L[i], L[i-1] # (3) Swap
        else:
            break
```



Insertion Sort - Code

```
def insertion_sort(L: list) -> None:
    for i in range(1, len(L)):
        for j in range(i,0,-1): # (1) Go backwards
        if L[j-1] > L[j]: # (2) Check stopping condition
        L[j-1], L[j] = L[j], L[j-1] # (3) Swap
        else:
        break
```



Insertion Sort – Time Complexity

 At i-th iteration, its inner loop (func insert) needs to look up (i+1)/2 items and swap i/2 times on average

```
○ Look up: 1 + 1.5 + 2 + 2.5 + ... + (N-1)/2 + N/2 (When N = len(L))

■ = (1 + 2 + 3 + ... + (N-1) + N)/2 - \frac{1}{2} = N(N+1)/4 - \frac{1}{2}

○ Swap: 0.5 + 1 + 1.5 + ... + (N-1)/2

■ = (1 + 2 + 3 + ... + (N-1))/2 = (N-1)N/4
```

- A bit slower than Selection sort
 - o find_min() needs to look up the whole list
 - Insert() needs to look up only half on average but also need to swap!
- When a list is almost sorted, insertion sort needs to look up only kN items



Yes, there are better sorting algorithms, which you will see next time ^0^



Thanks!

