

CSE 503

Introduction to Computer Science for Non-Majors

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Day 31

Algorithms: Searching and Sorting

Algorithms

An algorithm is

*"a set of rules for solving a problem
in a finite number of steps"*

<https://www.dictionary.com/browse/algorithm>

Algorithms

Two common problems we might want to solve:

Searching (Finding a particular element in a collection)

Sorting (Rearranging a collection in a specific order)

Searching

How would we search for a particular item in a list (in Python)?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 2 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 3 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 5 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 8 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 14 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 15 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 23 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 56 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 59 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 64 == 64?

Linear Search

```
def linearSearch(list, item):  
    for x in list:  
        if x == item:  
            return True  
    return False
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 64 == 64?
Return True!

Searching

*What if we knew our list was sorted?
(how would you find a page in a book?)*

BinarySearch


```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

```
left = 0  
right = 15  
mid = 7
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

```
left = 0  
right = 15  
mid = 7
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----



Is 64 < 56?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

```
left = 0  
right = 15  
mid = 7
```

2	3	5	8	14	15	23	56	59	64	72	73	88	89	97
---	---	---	---	----	----	----	----	----	----	----	----	----	----	----

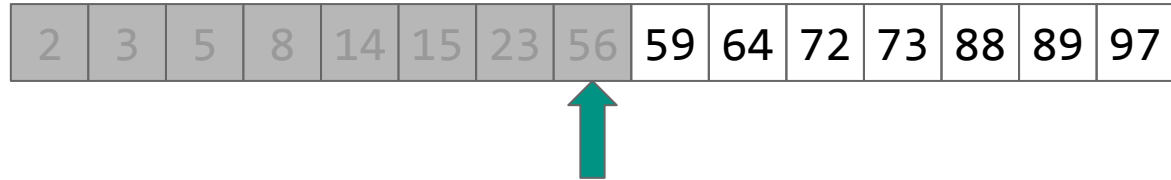


Is 64 > 56?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

```
left = 8  
right = 15  
mid = 7
```

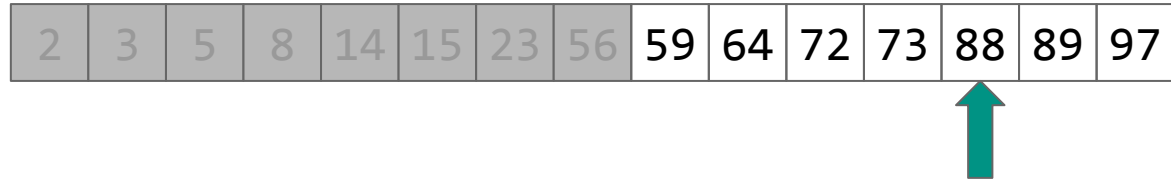


Is 64 > 56?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

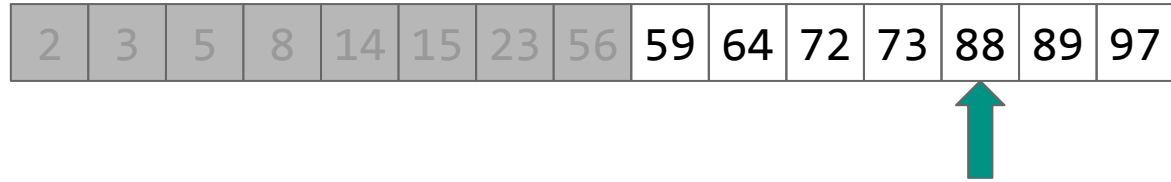
```
left = 8  
right = 15  
mid = 12
```



BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

```
left = 8  
right = 15  
mid = 12
```

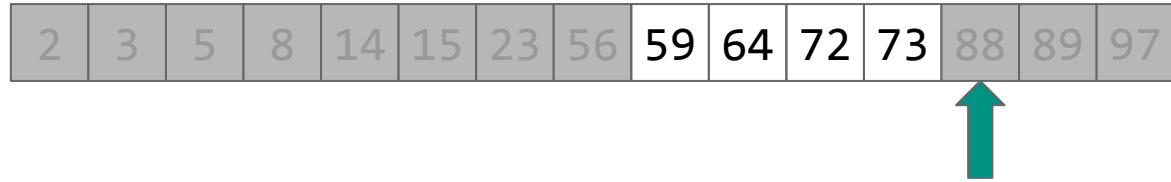


Is 64 < 88?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

left = 8
right = 12
mid = 12

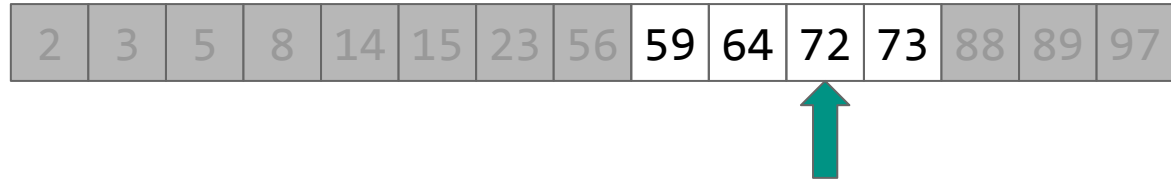


Is 64 < 88?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

```
left = 8  
right = 12  
mid = 10
```



BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

left = 8
right = 12
mid = 10

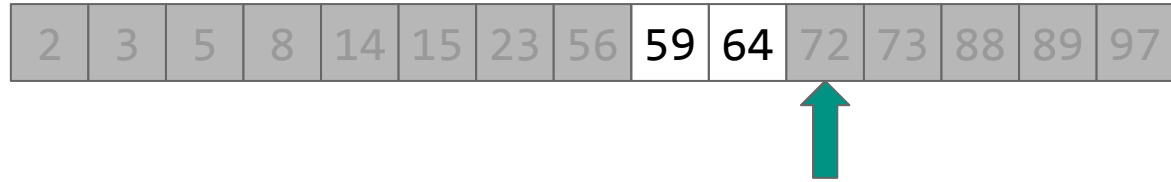


Is 64 < 72?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

left = 8
right = 10
mid = 10

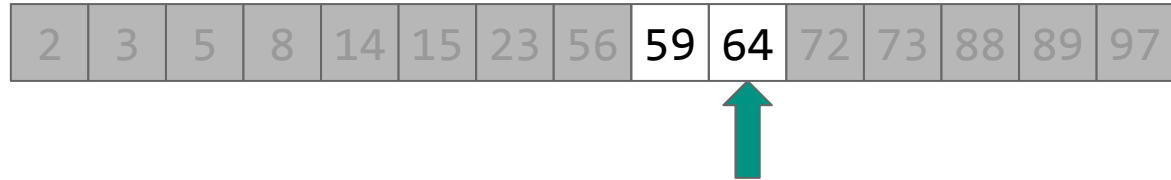


Is 64 < 72?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

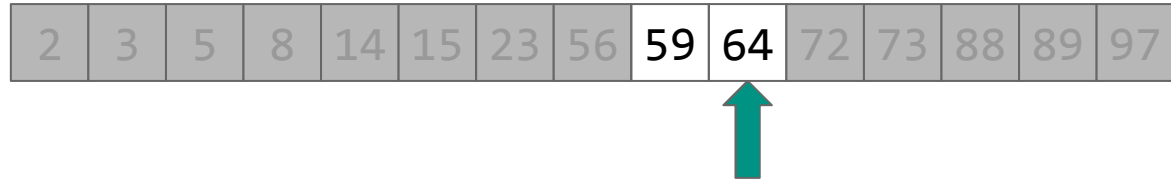
left = 8
right = 10
mid = 9



BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

left = 8
right = 10
mid = 9

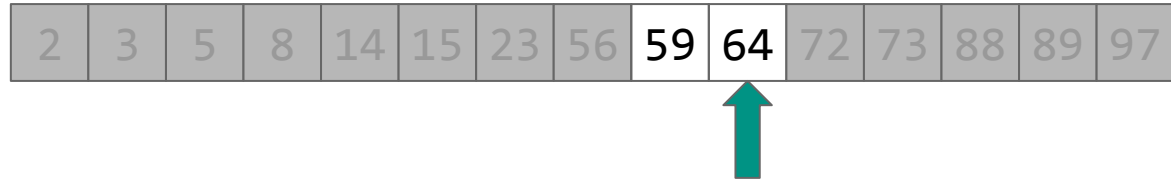


Is $64 < 64$?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

left = 8
right = 10
mid = 9

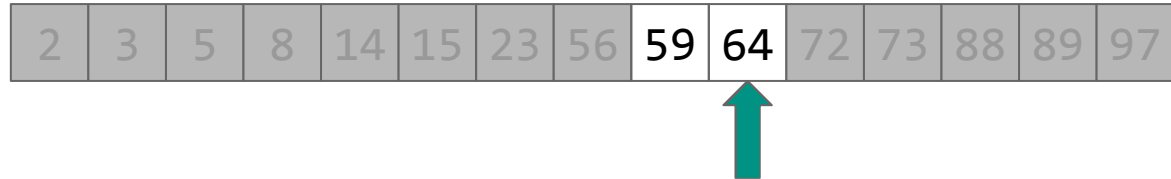


Is 64 > 64?

BinarySearch

```
def binarySearch(list, item):  
    left = 0  
    right = len(list)  
    while (right - left) > 0:  
        mid = (left + right)//2  
        if item < list[mid]:  
            right = mid  
        elif item > list[mid]:  
            left = mid+1  
        else:  
            return True  
    return False
```

left = 8
right = 10
mid = 9



Is 64 > 64?
Return True!

Linear Search vs Binary Search

Checking if $x == y$ eliminates one element from consideration

Linear Search vs Binary Search

Checking if $x == y$ eliminates one element from consideration

If our input list has **N** elements, then we may have to do up to **N** comparisons in the worst case

Linear Search vs Binary Search

Checking if $x == y$ eliminates one element from consideration

If our input list has **N** elements, then we may have to do up to **N** comparisons in the worst case

Checking if $x < y$, $x > y$ eliminates half of the list from consideration

Linear Search vs Binary Search

Checking if $x == y$ eliminates one element from consideration

If our input list has **N** elements, then we may have to do up to **N** comparisons in the worst case

Checking if $x < y$, $x > y$ eliminates half of the list from consideration

If our input list has **N** elements, how many comparisons would we need in the worst case?

Linear Search vs Binary Search

Checking if $x == y$ eliminates one element from consideration

If our input list has N elements, then we may have to do up to N comparisons in the worst case

Checking if $x < y$, $x > y$ eliminates half of the list from consideration

If our input list has N elements, how many comparisons would we need in the worst case?

$$\log_2(N)$$

Linear Search vs Binary Search

What if we want to search a list of twice the size?

Linear Search vs Binary Search

What if we want to search a list of twice the size?

If $N' = 2N$, how many
comparisons will we need to
Linear Search a list of size N' ?

Linear Search vs Binary Search

What if we want to search a list of twice the size?

If $N' = 2N$, how many comparisons will we need to Linear Search a list of size N' ?

$N' = 2N$ (twice as many...)

Linear Search vs Binary Search

What if we want to search a list of twice the size?

If $N' = 2N$, how many comparisons will we need to Linear Search a list of size N' ?

$N' = 2N$ (twice as many...)

If $N' = 2N$, how many comparisons will we need to Binary Search a list of size N' ?

Linear Search vs Binary Search

What if we want to search a list of twice the size?

If $N' = 2N$, how many comparisons will we need to Linear Search a list of size N' ?

$N' = 2N$ (twice as many...)

If $N' = 2N$, how many comparisons will we need to Binary Search a list of size N' ?

$\log_2(N') = \log_2(2N) = \log(N) + 1$
(just one more comparison...)

Sorting

Binary Search only works if our list is sorted...

So how do we sort a list?

Sorting

Goal: Given a sequence of values that can be ordered (list in Python, array in JS), rearrange the sequence so that the values go from smallest to larger (or largest to smallest).

Example:

[12, 56, 4, 8, 19, 16, 37, 23] → [4, 8, 12, 16, 19, 23, 37, 56]

Sorting in Python and JavaScript

Both Python and JavaScript have built-in sorting functions.

If `a` is a sequence:

```
a = [12, 56, 4, 8, 19, 16, 37, 23]
```

then `a.sort()` (in both Python and JavaScript) will sort `a`

```
[4, 8, 12, 16, 19, 23, 37, 56]
```

Sorting

How might we go about implementing sort?

(when you need to sort, just call sort...but it is useful to know how it might work)

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 4, 8, 19, 16, 37, 23]

Output List: []

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 4, 8, 19, 16, 37, 23]

Find the smallest element (4)

Output List: []

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 8, 19, 16, 37, 23]

Remove it from the input...

Output List: []

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 8, 19, 16, 37, 23]

Append it to the output

Output List: [4]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 8, 19, 16, 37, 23]

Find the smallest element (8)

Output List: [4]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 19, 16, 37, 23]

Remove it from the input

Output List: [4]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 19, 16, 37, 23]

Append it to the output

Output List: [4, 8]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 19, 16, 37, 23]

Repeat until sorted...

Output List: [4, 8]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [12, 56, 19, 16, 37, 23]

Repeat until sorted...

Output List: [4, 8]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 19, 16, 37, 23]

Repeat until sorted...

Output List: [4, 8, 12]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 19, 16, 37, 23]

Repeat until sorted...

Output List: [4, 8, 12]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 19, 37, 23]

Repeat until sorted...

Output List: [4, 8, 12, 16]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 19, 37, 23]

Repeat until sorted...

Output List: [4, 8, 12, 16]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 37, 23]

Repeat until sorted...

Output List: [4, 8, 12, 16, 19]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 37, 23]

Repeat until sorted...

Output List: [4, 8, 12, 16, 19]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 37]

Repeat until sorted...

Output List: [4, 8, 12, 16, 19, 23]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56, 37]

Repeat until sorted...

Output List: [4, 8, 12, 16, 19, 23]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56]

Repeat until sorted...

Output List: [4, 8, 12, 16, 19, 23, 37]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: [56]

Repeat until sorted...

Output List: [4, 8, 12, 16, 19, 23, 37]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: []

Repeat until sorted...

Output List: [4, 8, 12, 16, 19, 23, 37, 56]

Selection Sort

Selection Sort involves *selecting* the smallest element from the list, and appending it to your sorted list:

Input List: []

Output List: [4, 8, 12, 16, 19, 23, 37, 56]

Selection Sort

```
def selectionSort(unsorted):  
    sorted = []  
    while len(unsorted) > 0:  
        x = removeSmallest(unsorted)  
        sorted.append(x)  
    return sorted
```

```
def removeSmallest(aList):  
    smallest = aList[0]  
    for value in aList:  
        if value < smallest:  
            smallest = value  
    aList.remove(smallest)  
    return smallest
```

Selection Sort

```
def selectionSort(unsorted):  
    sorted = []  
    while len(unsorted) > 0:  
        x = removeSmallest(unsorted)  
        sorted.append(x)  
    return sorted
```

As long as our unsorted list still has elements, remove the smallest and append it to our sorted list

```
def removeSmallest(aList):  
    smallest = aList[0]  
    for value in aList:  
        if value < smallest:  
            smallest = value  
    aList.remove(smallest)  
    return smallest
```

Selection Sort

```
def selectionSort(unsorted):  
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    while len(unsorted) > 0:  
        x = removeSmallest(unsorted)  
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    return sorted
```

As long as our unsorted list still has elements, remove the smallest and append it to our sorted list

```
def removeSmallest(aList):  
    smallest = aList[0]  
    for value in aList:  
        if value < smallest:  
            smallest = value  
    aList.remove(smallest)  
    return smallest
```

Look through each value (linearly) in the list to find the smallest, then remove it

Selection Sort Analysis

*How many steps does our selection sort take with a list of size **N**?*

Selection Sort Analysis

How many steps does our selection sort take with a list of size N ?

Finding the smallest item uses a linear search

Selection Sort Analysis

How many steps does our selection sort take with a list of size N ?

Finding the smallest item uses a linear search: N steps

Selection Sort Analysis

How many steps does our selection sort take with a list of size N ?

Finding the smallest item uses a linear search: N steps

How many times do we have to find the smallest item?

Selection Sort Analysis

How many steps does our selection sort take with a list of size N ?

Finding the smallest item uses a linear search: N steps

How many times do we have to find the smallest item?

N times (once for each item in the list)

Selection Sort Analysis

How many steps does our selection sort take with a list of size N ?

Finding the smallest item uses a linear search: N steps

How many times do we have to find the smallest item?

N times (once for each item in the list)

Total number of steps: $N \times N = N^2$

Selection Sort Analysis

How many steps does our selection sort take with a list of size N ?

Finding the smallest item uses a linear search: N steps

How many times do we have to find the smallest item?

N times (once for each item in the list)

Total number of steps: $N \times N = N^2$

*This isn't...100% accurate, but intuitively it gets the point across
In reality, finding the smallest takes N steps, then $N-1$ steps, then $N-2$ steps...*

But $N + (N-1) + (N-2) + \dots + 2 + 1 = N^2$

Sorting

N^2 grows pretty fast...

If our list doubles in size, the sort will take **4 times as long!**

Can we do better?

Sorting

N^2 grows pretty fast...

If our list doubles in size, the sort will take **4 times as long!**

Can we do better? **YES!**