

Algorithm design and analysis

Recursion – Two pointer

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CONTENT

- (1) Brute Force Exhaustive
- (2) Recursion
- (3) Two Pointer



- A straightforward approach usually based on problem statement and definitions
- > The simplest to apply
- > General approach: applicable to a very wide variety of problems
- > No limitation on instance size
- Acceptable speed
- Useful for solving small-size instances of a problem



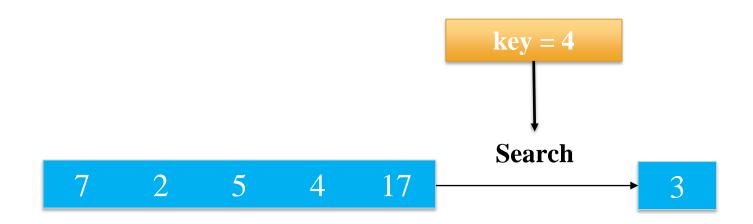
- A straightforward approach usually based on problem statement and definitions
- > Example:
 - Computing a^n (a, b > 0, n integer)
 - Computing n!
 - Multiple two b by b matrices
 - Sequential search
 - Selection Sort



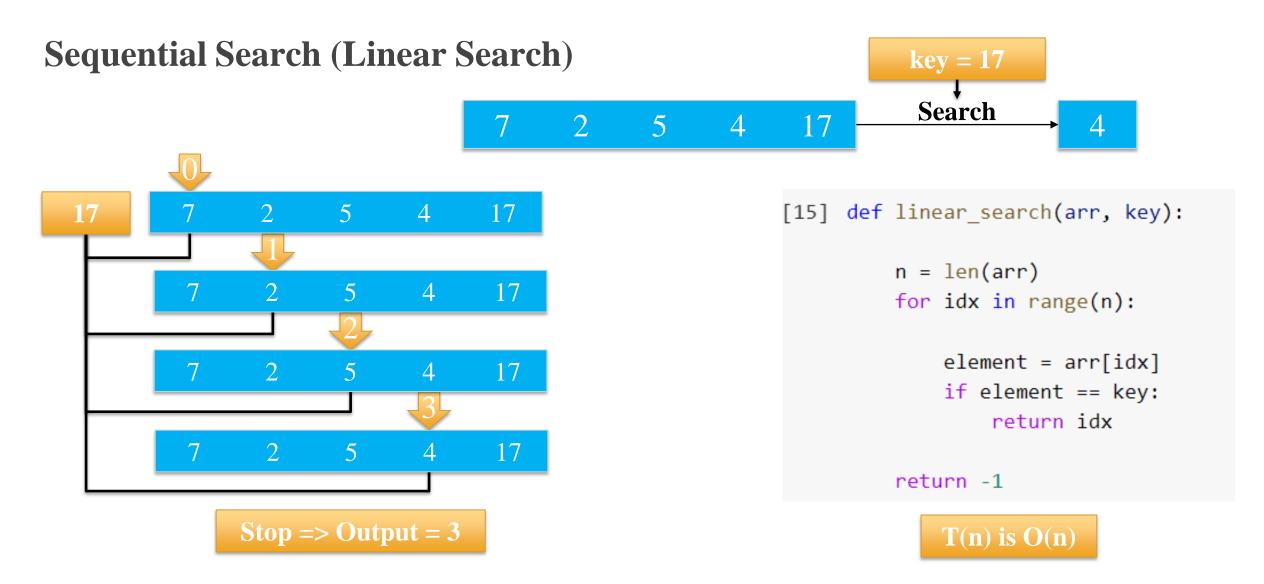
Sequential Search (Linear Search)

Input: a sequence of n number $\langle a_1, a_2, ..., a_n \rangle$ and key

Output: index of key in the sequence if exist, -1 if not exist









Selection Sort

Input: a sequence of n number $\langle a_1, a_2, ..., a_n \rangle$ and key

Output: a permutation (reordering) <a'_1, a'_2,..., a'_n>

such that
$$a'_1 \le a'_2 \le ... \le a'_n$$





Selection Sort

Input: a sequence of n number $\langle a_1, a_2, ..., a_n \rangle$ and key

Output: a permutation (reordering) <a'_1, a'_2,..., a'_n>

such that
$$a'_1 \le a'_2 \le ... \le a'_n$$

- > Select the smallest element from an unsorted list in each iteration
- > Place that element at the beginning of the unsorted list



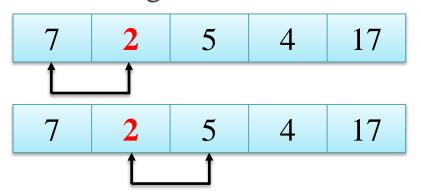


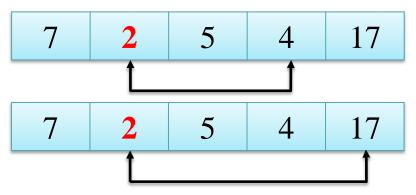
Selection Sort

> Set the first element as minimum



Compare minimum with the other element. If the other element is smaller than minimum, assign the second element as minimum.





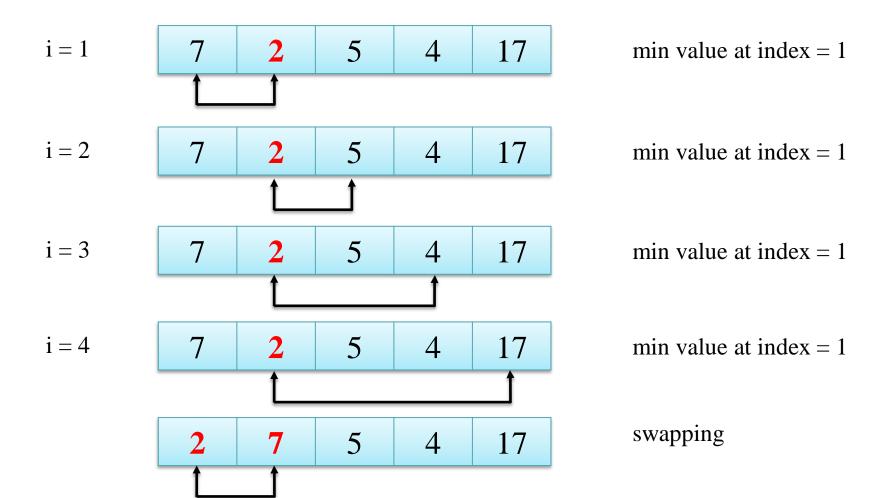
After each iteration, minimum is placed in the front of the unsorted list





Selection Sort

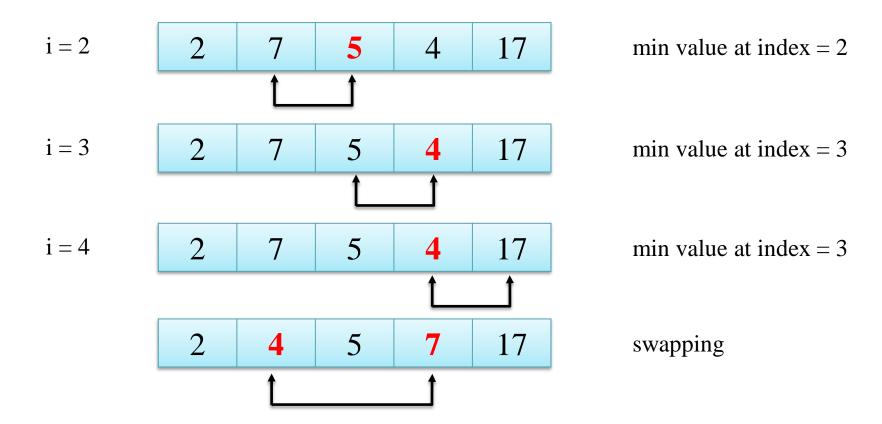
Step 0





Selection Sort

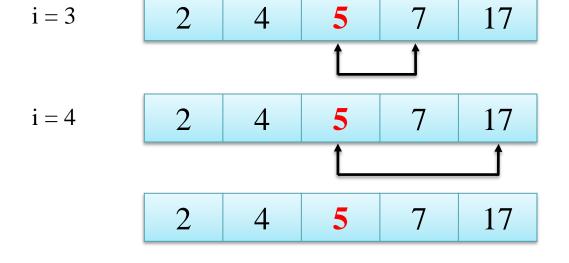
Step 1





Selection Sort

Step 2



min value at index = 2

min value at index = 2

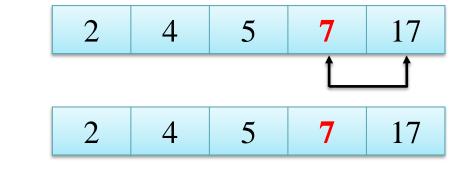
already in place



Selection Sort

i = 4

Step 3



min value at index = 3

already in place

Step 4

min value at index = 4

already in place



Selection Sort

```
[3] def selection_sort(array):
         n = len(array)
         for step in range(n):
             min_idx = step
             for i in range(step + 1, n):
                 if array[i] < array[min_idx]:</pre>
                     min_idx = i
             array[step], array[min_idx] = array[min_idx], array[step]
         return array
    arr = [7, 2, 5, 4, 17]
    selection_sort(arr)
    [2, 4, 5, 7, 17]
```



Selection Sort

```
[3] def selection_sort(array):
         n = len(array)
         for step in range(n):
             min_idx = step
            for i in range(step + 1, n):
                 if array[i] < array[min_idx]:</pre>
                     min_idx = i
             array[step], array[min_idx] = array[min_idx], array[step]
         return array
     arr = [7, 2, 5, 4, 17]
     selection_sort(arr)
    [2, 4, 5, 7, 17]
```

T(n) is $O(n^2)$

Worst case
Best case
Average case

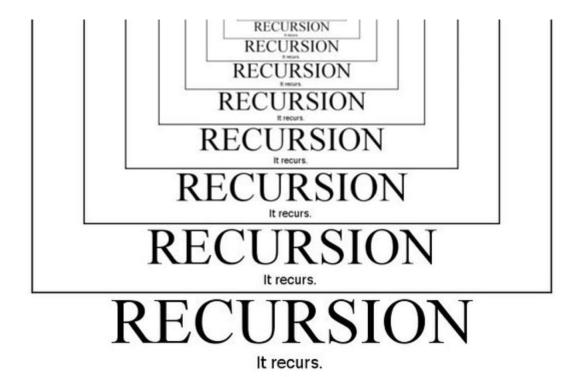


Summary

- Scanning all element (objective)
- Each element: check with the condition
 - If yes, stop
 - If no, continue
- Simple
- Not optimized
- The first problem solving model to think for every problem



- > Recursion: a function makes one or more calls to itself during execution
- Powerful for performing repetitive tasks
- > Example:
 - Factorial Function
 - Binary Search
 - Fibonacci Number





Factorial Function

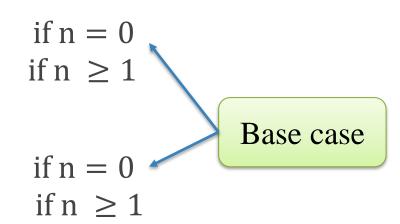
For any integer $n \ge 0$

$$n! = \begin{cases} 1 \\ n * (n-1) * (n-2) * \cdots * 2 * 1 \end{cases}$$

Recursive definition:

$$n! = \begin{cases} 1 \\ n*(n-1)! \end{cases}$$

- Input: integer $n \ge 0$
- Output: value of n!





Factorial Function

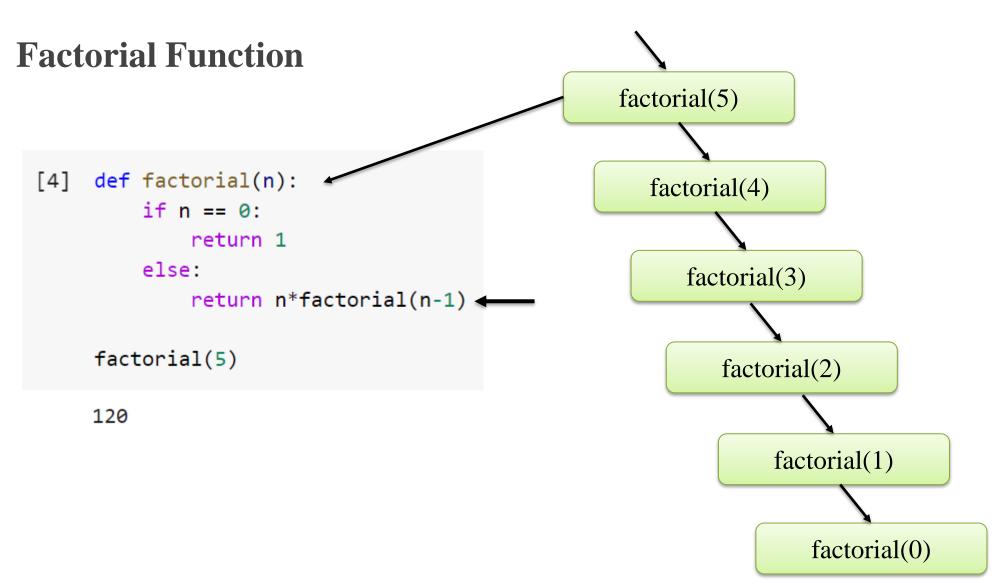
Recursive definition:

$$n! = \begin{cases} 1 \\ n*(n-1)! \end{cases}$$

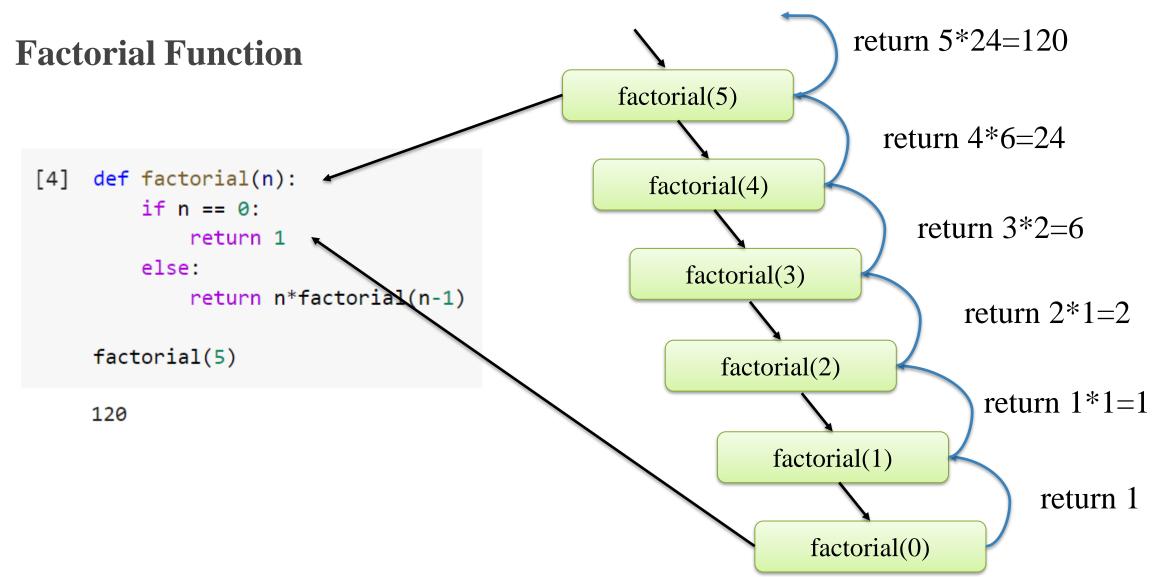
```
if n = 0
if n \ge 1
```

```
[4] def factorial(n):
    if n == 0:
        return 1
    else:
        return n*factorial(n-1)
```









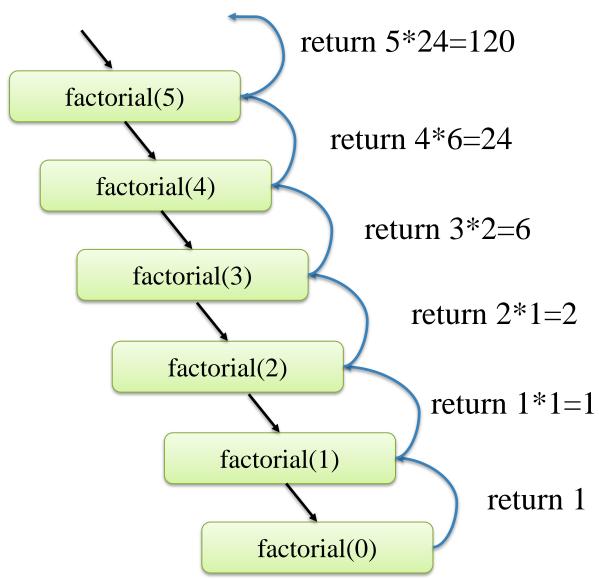


Factorial Function

```
[4] def factorial(n):
    if n == 0:
        return 1
    else:
        return n*factorial(n-1)

factorial(5)
```

The number of recursive call



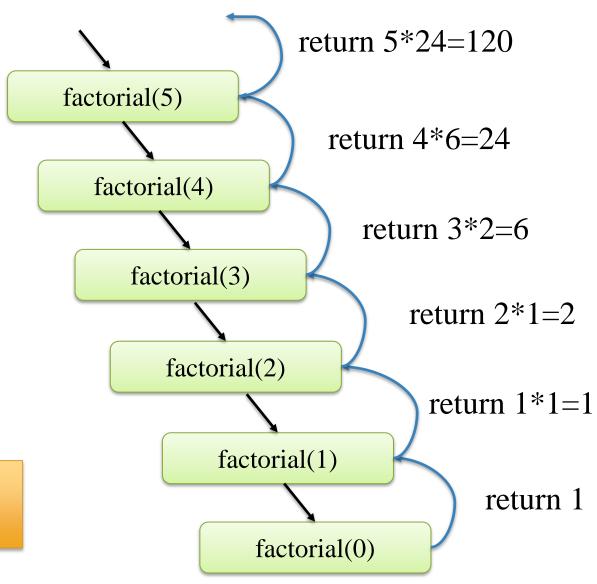


Factorial Function

```
[4] def factorial(n):
    if n == 0:
        return 1
    else:
        return n*factorial(n-1)

factorial(5)
```

The number of recursive call is n+ 1 T(n) is O(n)





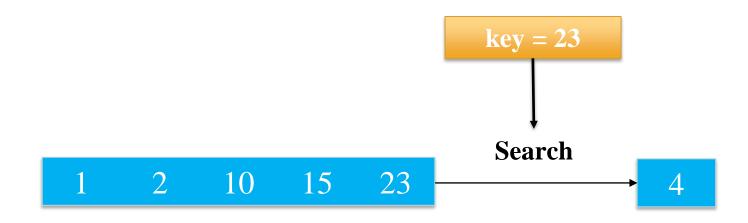
Binary Search

Searching problem

Input: a sorted sequence of n number $\langle a_1, a_2, ..., a_n \rangle$, key

Output: index of key in the sequence if exist, -1 if not exist

=> Always searched in the middle of a portion of a sequence





Binary Search

Initially, low = 0, high = len(arr) - 1

Always searched in the middle of a portion of a sequence $mid = \lfloor (low + high)/2 \rfloor$

Consider three case:

- key = arr[mid] => search successfully => return mid
- key < arr[mid] => find key in arr[low, mid-1]
- key > arr[mid] => find key in arr[mid+1, high]



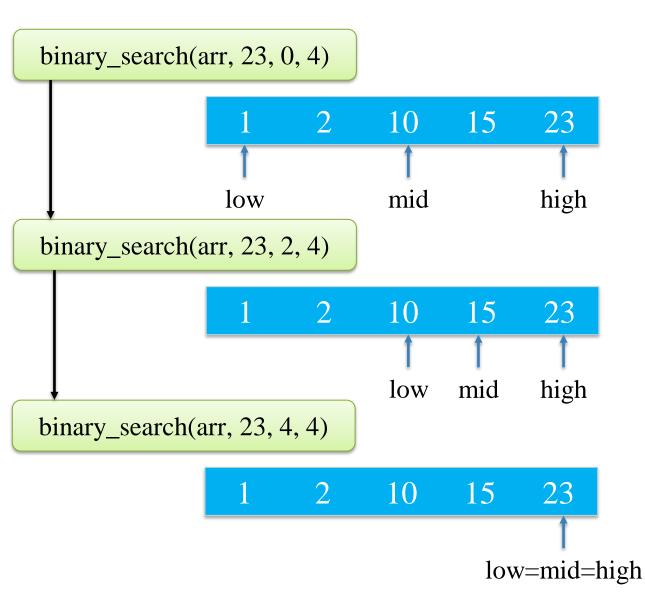
Binary Search

```
def binary_search(array, key, low, high):
    if high >= low:
        mid = low + (high - low)//2
        if array[mid] == key:
            return mid
        elif array[mid] > key:
            return binary_search(array, key, low, mid-1)
        else:
            return binary_search(array, key, mid + 1, high)
    else:
        return -1
arr = [1, 2, 10, 15, 23]
key = 23
low = 0
high = len(arr) - 1
binary_search(arr, key, low, high)
```



Binary Search

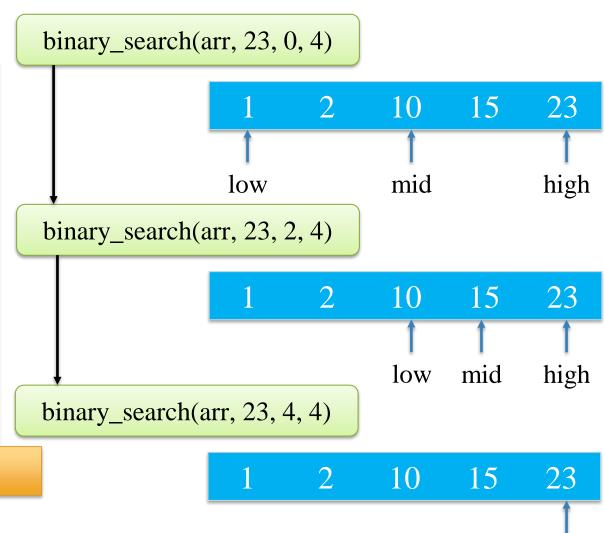
```
def binary_search(array, key, low, high):
    if high >= low:
        mid = low + (high - low)//2
        if array[mid] == key:
            return mid
        elif array[mid] > key:
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        else:
            return binary_search(array, key, mid + 1, high)
    else:
        return -1
arr = [1, 2, 10, 15, 23]
key = 23
low = 0
high = len(arr) - 1
binary_search(arr, key, low, high)
```





Binary Search

```
def binary_search(array, key, low, high):
    if high >= low:
        mid = low + (high - low)//2
        if array[mid] == key:
            return mid
        elif array[mid] > key:
            return binary_search(array, key, low, mid-1)
        else:
            return binary_search(array, key, mid + 1, high)
    else:
        return -1
arr = [1, 2, 10, 15, 23]
key = 23
low = 0
high = len(arr) - 1
binary_search(arr, key, low, high)
```



low=mid=high

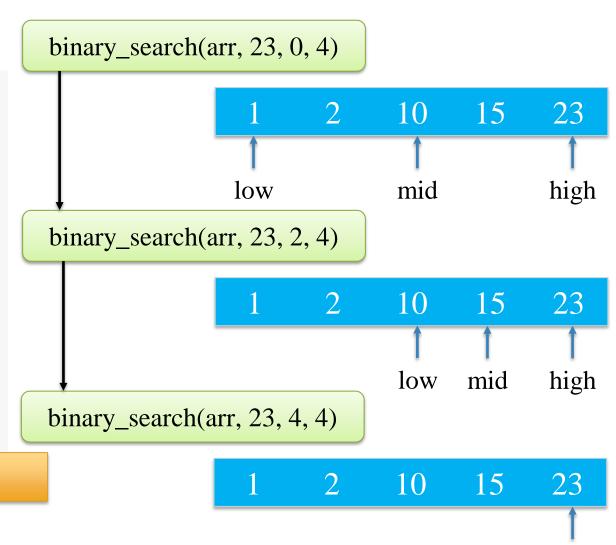
The number of recursive call?



Binary Search

```
def binary_search(array, key, low, high):
    if high >= low:
        mid = low + (high - low)//2
        if array[mid] == key:
            return mid
        elif array[mid] > key:
            return binary_search(array, key, low, mid-1)
        else:
            return binary_search(array, key, mid + 1, high)
    else:
        return -1
arr = [1, 2, 10, 15, 23]
key = 23
low = 0
high = len(arr) - 1
binary_search(arr, key, low, high)
```

T(n) is O(logn)



low=mid=high



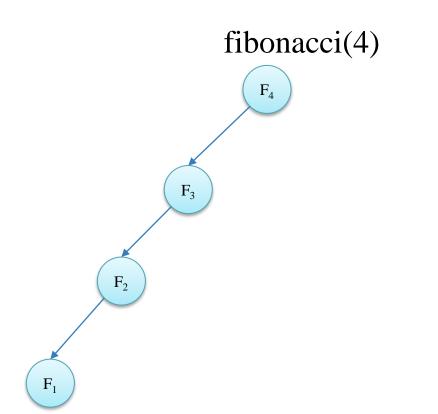
Fibonacci Number [509] Leetcode

```
F_0 = 0
F_1 = 1
F_n = F_{n-2} + F_{n-1} \quad \text{for } n > 1
```

```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)
```

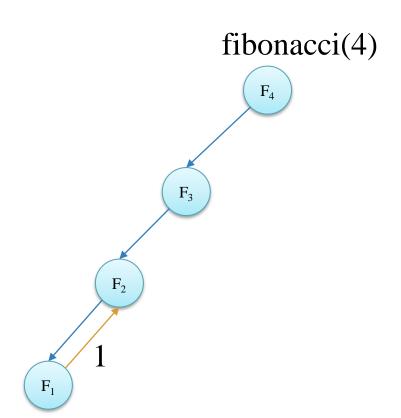
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```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)
    fibonacci(4)
```

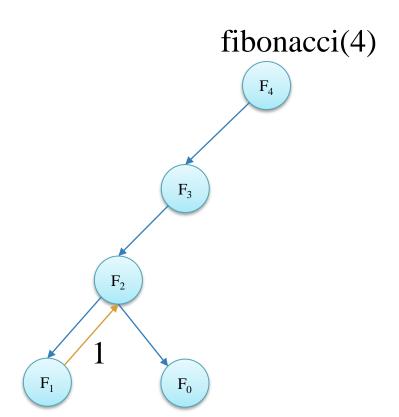




```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)

fibonacci(4)
```

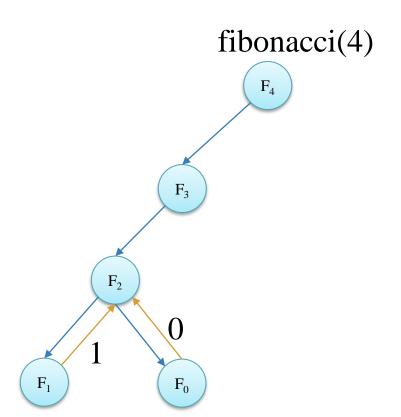




```
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    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)

fibonacci(4)
```

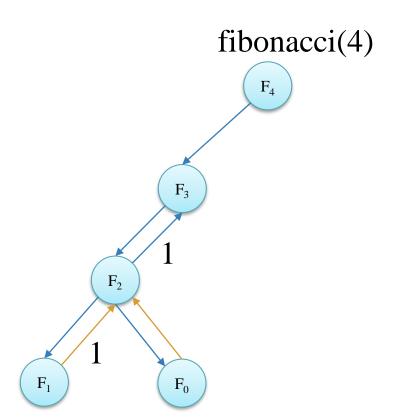




```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)

fibonacci(4)
```

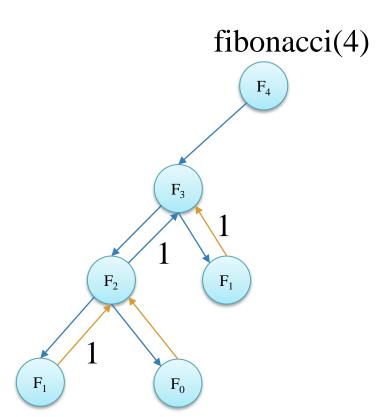




```
def fibonacci(n):
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    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)

fibonacci(4)
```



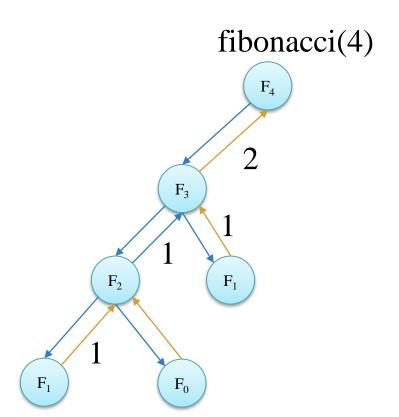


```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)

fibonacci(4)
```



Fibonacci Number

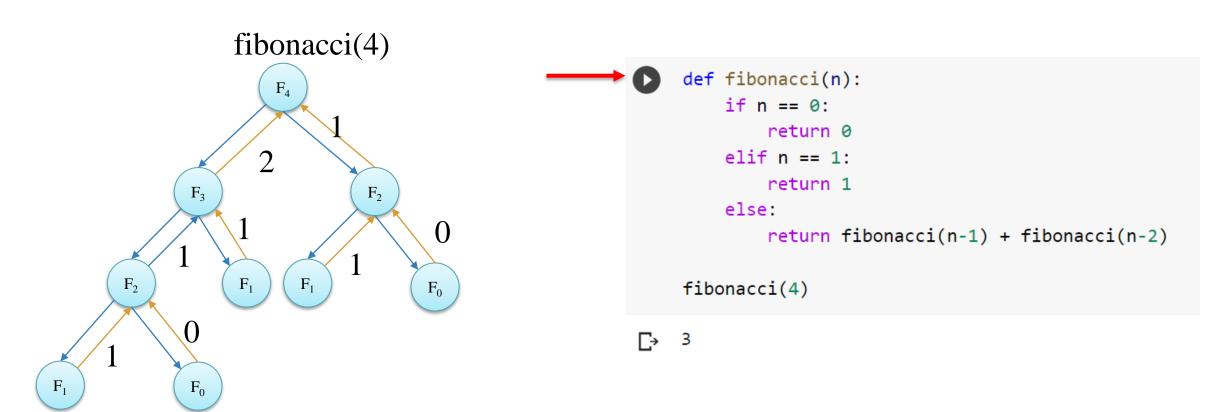


```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)

fibonacci(4)
```



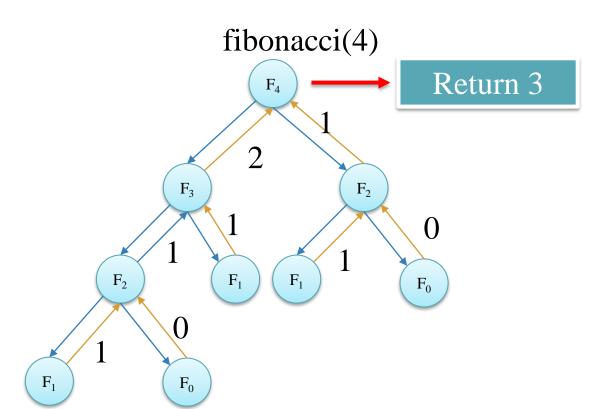
Fibonacci Number





[→ 3

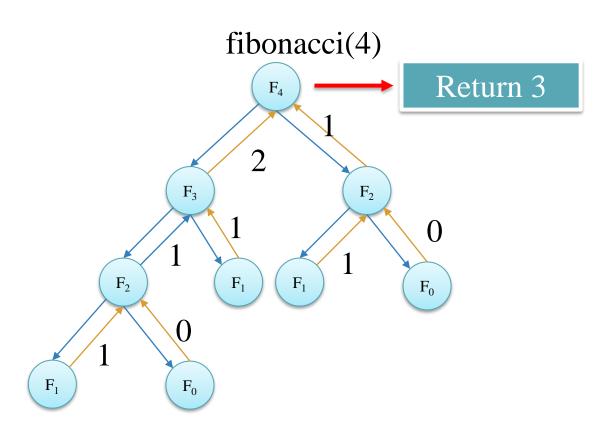
Fibonacci Number



```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)
```



Fibonacci Number



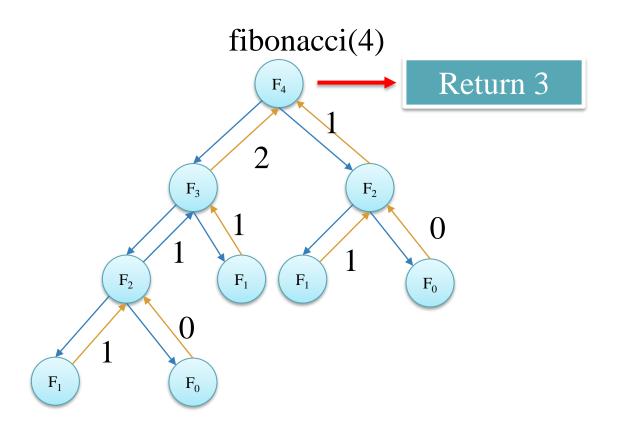
```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)
```

[→ 3

The number of recursive call is?



Fibonacci Number



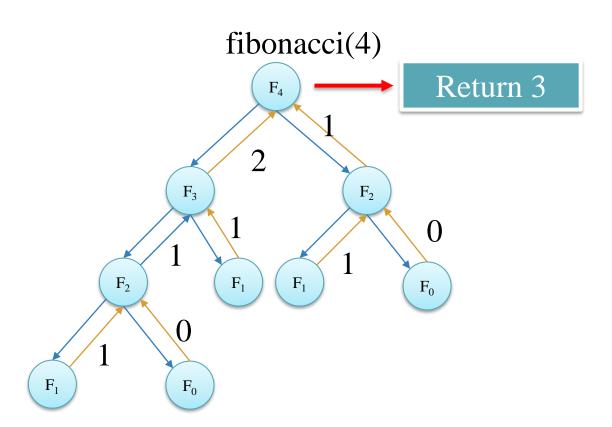
```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)
```

[→ 3

T(n) is $O(2^n)$



Fibonacci Number



```
def fibonacci(n):
    if n == 0:
        return 0
    elif n == 1:
        return 1
    else:
        return fibonacci(n-1) + fibonacci(n-2)
```

[→ 3

T(n) is $O(2^n)$

T(n) is **O**(n) ???



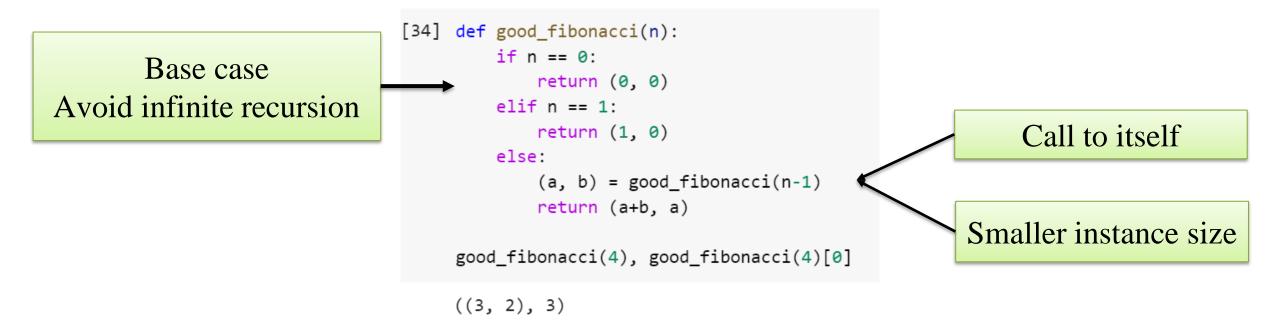
Fibonacci Number

Efficient recursion with O(n)

```
[34] def good_fibonacci(n):
         if n == 0:
             return (0, 0)
         elif n == 1:
             return (1, 0)
         else:
             (a, b) = good_fibonacci(n-1)
             return (a+b, a)
     good_fibonacci(4), good_fibonacci(4)[0]
     ((3, 2), 3)
```



SUMMAR





Reverse String [344] Leetcode

Example 1:

```
Input: s = ["h","e","l","l","o"]
Output: ["o","l","l","e","h"]
```

Example 2:

```
Input: s = ["H","a","n","n","a","h"]
Output: ["h","a","n","n","a","H"]
```

Constraints:

- 1 <= s.length <= 10⁵
- s[i] is a printable ascii character.



Reverse String

Using for loop

```
[68] def reverse_str_1(s):
          tg_s = ''
          for i in range(len(s)-1, -1, -1):
                tg_s += s[i]
          return tg_s

s = 'abcde'
    reverse_str_1(s)
```

'edcba'



Reverse String

Using recursion

'edcba'



Reverse String

Using two pointer

Convert string to list



Init two pointer: i: index of first element, j: index of last element



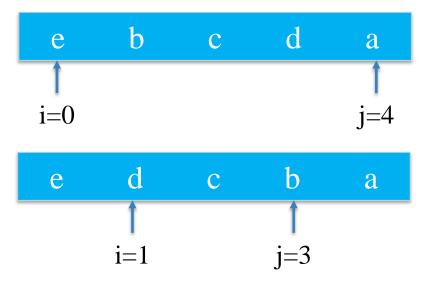
While loop with $i \le j$. swapping value of i and j, add i and 1. sub j and 1

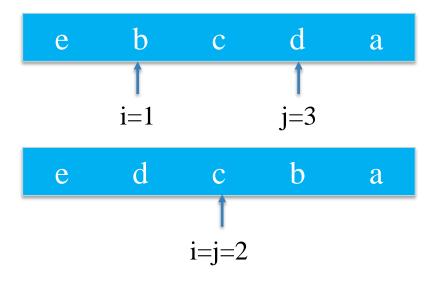


Reverse String

Using two pointer

While loop with $i \le j$. swapping value of i and j, add i and 1. sub j and 1





Convert list to string

e d c b a "edcba"

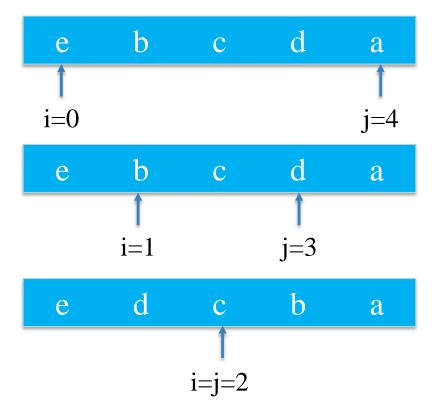


Reverse String

Using two pointer

```
def reverse_str_3(s):
    i = 0
    j = len(s) - 1
    while i <= j:
        s[i], s[j] = s[j], s[i]
        i = i + 1
        j = j - 1
    return "".join(s)</pre>
s = 'abcde'
s = list(s)
reverse_str_3(s)
```

C→ 'edcba'





Find Subarray with Given Sum [560] Leetcode

Given an array of integers nums and an integer k, return the total number of subarrays whose sum equals to k.

A subarray is a contiguous non-empty sequence of elements within an array.

Example 1:

Input: nums = [1,1,1], k = 2

Output: 2

Example 2:

Input: nums = [1,2,3], k = 3

Output: 2

Constraints:

- 1 <= nums.length <= 2 * 10⁴
- -1000 <= nums[i] <= 1000
- $-10^7 <= k <= 10^7$



Find Subarray with Given Sum

Simple solution

3 5 6

T(n) is ?

```
def subarray_sum(nums, key):
        n = len(nums)
        count = 0
        for i in range(n):
            total = 0
            for j in range(i, n):
                total += nums[j]
                if total == key:
                    count += 1
        return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum(nums, key)
```



Find Subarray with Given Sum

Simple solution

3 5 6

T(n) is $O(n^2)$

```
def subarray_sum(nums, key):
        n = len(nums)
        count = 0
        for i in range(n):
            total = 0
            for j in range(i, n):
                total += nums[j]
                if total == key:
                    count += 1
        return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum(nums, key)
```



Find Subarray with Given Sum

Using two pointer

3 5 6

```
stop condition?
```

```
def subarray_sum(nums, key):
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nums = [1, 2, 3, 5, 6]
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```



Find Subarray with Given Sum

Using two pointer

3 5 6

```
stop condition?
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        return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum(nums, key)
```



Find Subarray with Given Sum

Using two pointer

3 5 6

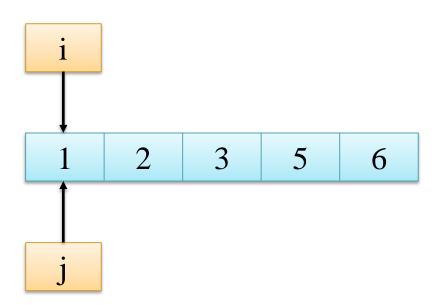
```
stop condition?
total: current subarray sum
count: number of subarray
```

```
def subarray_sum(nums, key):
        n = len(nums)
        count = 0
        for i in range(n):
            total = 0
            for j in range(i, n):
                total += nums[j]
                if total == key:
                    count += 1
        return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum(nums, key)
```



Find Subarray with Given Sum

Using two pointer



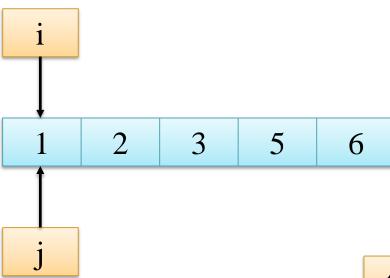
total: 0

$$total + array[i] = 0 + 1 = 1 < 5$$



Find Subarray with Given Sum

Using two pointer



total: 0

$$total = total + array[i] = 0 + 1 = 1$$

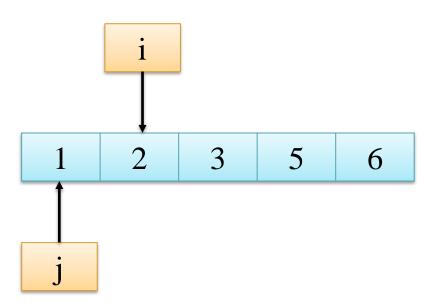
$$total + array[i] = 0 + 1 = 1 < 5$$

$$i = i + 1 = 0 + 1 = 1$$



Find Subarray with Given Sum

Using two pointer

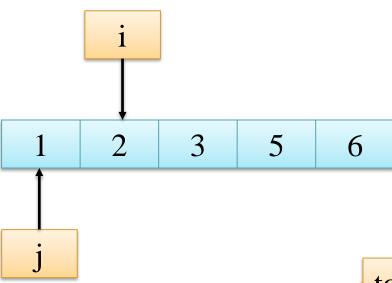


total: 1



Find Subarray with Given Sum

Using two pointer



total: 1

$$total = total + array[i] = 1 + 2 = 3$$

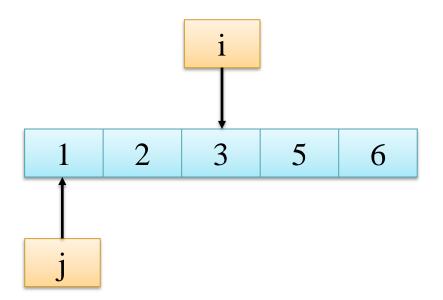
$$total + array[i] = 1 + 2 = 3 < 5$$

$$i = i + 1 = 1 + 1 = 2$$



Find Subarray with Given Sum

Using two pointer

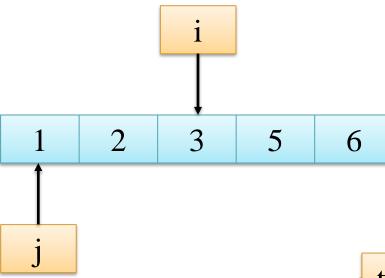


total: 3



Find Subarray with Given Sum

Using two pointer



total: 3

total = total - array
$$[j] = 3 - 1 = 2$$

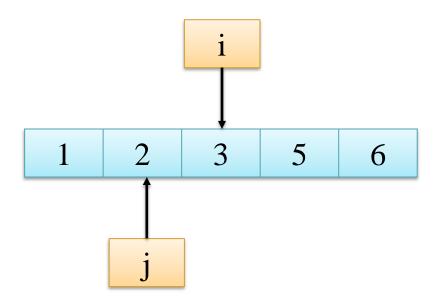
$$total + array[i] = 3 + 3 = 6 > 5$$

$$j = j + 1 = 0 + 1 = 1$$



Find Subarray with Given Sum

Using two pointer

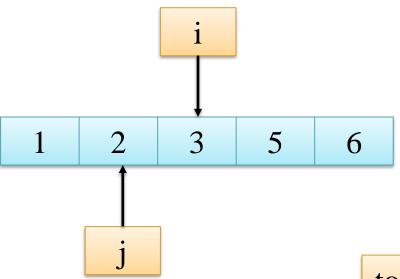


total: 2



Find Subarray with Given Sum

Using two pointer



total: 2

$$total = total + array[i] = 2 + 3 = 5$$

$$total + array[i] = 2 + 3 = 5 = 5$$

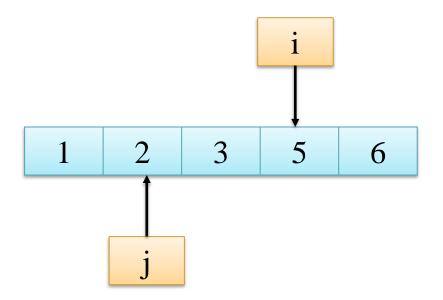
$$count = count + 1 = 0 + 1 = 1$$

$$i = i + 1 = 2 + 1 = 3$$



Find Subarray with Given Sum

Using two pointer

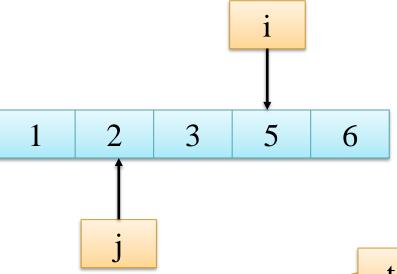


total: 5



Find Subarray with Given Sum

Using two pointer



total: 5

total = total - array
$$[i] = 5 - 2 = 3$$

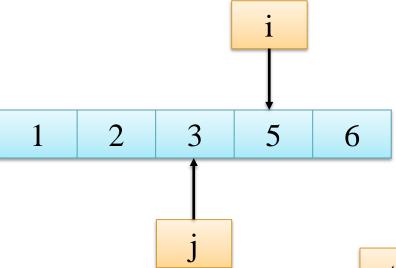
$$total + array[i] = 5 + 5 = 10 > 5$$

$$j = j + 1 = 1 + 1 = 2$$



Find Subarray with Given Sum

Using two pointer



total: 3

total = total - array[i] =
$$3 - 3 = 0$$

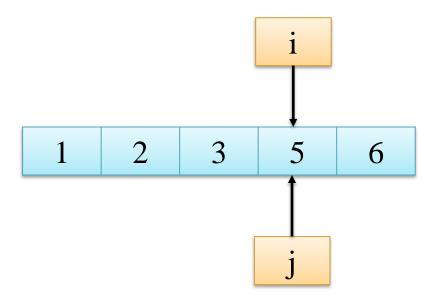
$$total + array[i] = 3 + 5 = 8 > 5$$

$$j = j + 1 = 2 + 1 = 3$$



Find Subarray with Given Sum

Using two pointer



total: 0



Find Subarray with Given Sum

Using two pointer



$$total = total + array[i] = 0 + 5 = 5$$

$$total + array[i] = 0 + 5 = 5 = 5$$

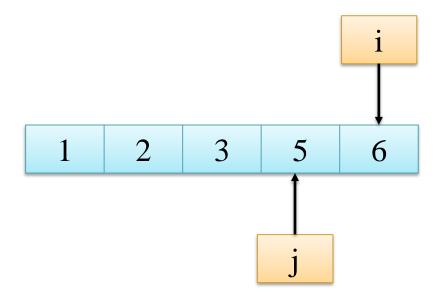
$$count = count + 1 = 1 + 1 = 2$$

$$i = i + 1 = 3 + 1 = 4$$



Find Subarray with Given Sum

Using two pointer

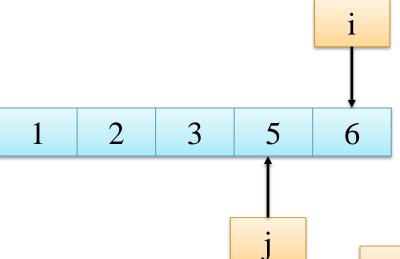


total: 5



Find Subarray with Given Sum

Using two pointer



total: 5

total = total - array
$$[j] = 5 - 5 = 0$$

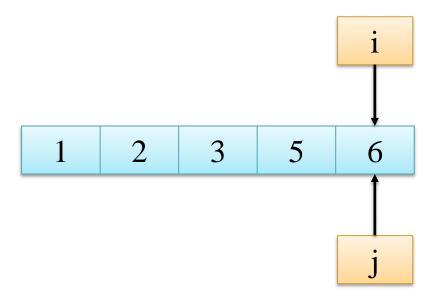
$$total + array[i] = 5 + 6 = 11 > 5$$

$$j = j + 1 = 3 + 1 = 4$$



Find Subarray with Given Sum

Using two pointer

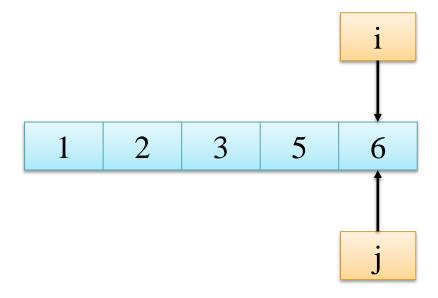


total: 0



Find Subarray with Given Sum

Using two pointer



total: 0

count: 2

total + array[i] =
$$0 + 6 = 6 > 5$$

Stop loop



Find Subarray with Given Sum

Using two pointer

```
def subarray_sum_two_pointer(nums, key):
    i = 0
    j = 0
    count = 0
    total = 0
    while i < len(nums):
        if total + nums[i] < key:</pre>
            total += nums[i]
            i += 1
        elif total + nums[i] > key:
            total -= nums[j]
            j += 1
        else:
            count += 1
            total += nums[i]
            i += 1
    return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum two pointer(nums, key)
```



Find Subarray with Given Sum

Using two pointer

T(n) is ?

```
def subarray_sum_two_pointer(nums, key):
    i = 0
    j = 0
    count = 0
    total = 0
    while i < len(nums):
        if total + nums[i] < key:</pre>
            total += nums[i]
            i += 1
        elif total + nums[i] > key:
            total -= nums[j]
            j += 1
        else:
            count += 1
            total += nums[i]
            i += 1
    return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum two pointer(nums, key)
```



Find Subarray with Given Sum

Using two pointer

T(n) is O(n)

```
def subarray_sum_two_pointer(nums, key):
    i = 0
    j = 0
    count = 0
    total = 0
    while i < len(nums):
        if total + nums[i] < key:</pre>
            total += nums[i]
            i += 1
        elif total + nums[i] > key:
            total -= nums[j]
            j += 1
        else:
            count += 1
            total += nums[i]
            i += 1
    return count
nums = [1, 2, 3, 5, 6]
key = 5
subarray sum two pointer(nums, key)
```



SUMMARY

- (1) Brute Force Exhaustive Sequential Search Selection Sort (Optional) Bubble Sort
- (2) Recursion Factorial Function Fibonacci Number
- (3) Two Pointer Reverse String Find Subarray With Given Sum



- Leetcode [1] Two Sum
- Leetcode [15] 3Sum
- > Leetcode [16] 3Sum Closet
- > Leetcode [867] Transpose Matrix



Fibonacci Word

$$F(0) = A$$

$$F(1) = B$$

$$F(n) = F(n-1) + F(n-2)$$

EX:
$$F(2) = F(1) + F(0) = BA => len(F(n)) = 2$$

$$F(3) = F(2) + F(1) = BAB \Rightarrow len(F(n)) = 3$$

Given a integer *target*. Returns the value indexed at (*target* - 1) in the string F(n) found, such that the longest length of string F(n) is closest to *target*.



Fibonacci Word

$$F(0) = A$$

$$F(1) = B$$

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$$EX: F(2) = F(1) + F(0) = BA \Rightarrow len(F(n)) = 2$$

$$F(3) = F(2) + F(1) = BAB \Rightarrow len(F(n)) = 3$$

Given a integer *target*. Returns the value indexed at (*target* - 1) in the string F(n) found, such that the longest length of string F(n) is closest to *target*.



> Fibonacci Word

Input: target = 2

Output: A

Explanation: target = $2 \Rightarrow n = 2$ because F(2) = BA, $len(F(2) = 2 \Rightarrow target = F(2)[target-1) = F(2)[1] = A$

Input: target = 4

Output: B

Explanation: target = $4 \Rightarrow n = 4$ because F(4) = BABBA, $len(F(4) = 5 \Rightarrow target = F(4)[target-1) = F(4)[3] = B$



> Fibonacci Word

Input: target = 5

Output: A

Explanation: target = $5 \Rightarrow n = 4$ because F(4) = BABBA, $len(F(4) = 5 \Rightarrow target = 5)$

F(4)[target-1) = F(4)[4] = A

Input: target = 7

Output: A

Input: target = 1000000000

Output: A



Thanks! Any questions?