ETH zürich

Programming and Problem-Solving **Binary Search an Recursion** Dennis Komm

Spring 2021 - April 29, 2021

Searching Linear Search

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Time complexity in $\mathcal{O}(n)$

```
def linsearch(data, searched):
    index = 0
    while index < len(data):
        if data[index] == searched:
            return index
        index += 1
    return -1
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    else:
        return False
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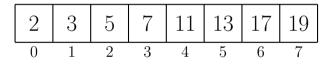
Searching Binary Search



Given a list with the first 8 prime numbers, find the position of 17

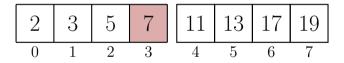


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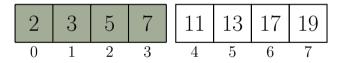


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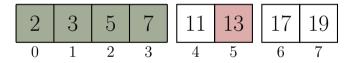


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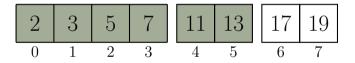
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- \Rightarrow left = current + 1
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$$\Rightarrow$$
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THE CLASSIC WORK NEWLY UPDATED AND REVISED

The Art of Computer Programming

VOLUME 3 Sorting and Searching Second Edition

DONALD E. KNUTH

Binary Search

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The first binary search was published in 1946 (and the principle was known long before), but the first version that works correctly for all n only appeared 14 years later



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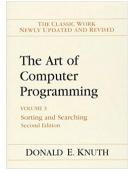
Binary Search

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The first binary search was published in 1946 (and the principle was known long before), but the first version that works correctly for all n only appeared 14 years later

"Although the basic idea of binary search is comparatively straightforward, the details can be surprisingly tricky..."

-Donald Knuth



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Exercise – Binary Search

Implement binary search

- as Python function
- using three "pointers" left, right, and current
- Initially, set left = 0 and right = len(data) - 1
- In every step, shrink search space as described
- If element is found, its position is returned
- Otherwise, -1 is returned

Spring 2021



Binary Search

```
def binsearch(data, searched):
    left = 0
    right = len(data) - 1
    while left <= right:
        current = (left + right) // 2
        if data[current] == searched:
            return current
        elif data[current] > searched:
            right = current - 1
        else:
            left = current + 1
        return -1
```

Searching Complexity of Binary Search

• At first, there are n elements

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After how many iterations x does there remain only one element?

$$n/2^x = 1 \iff n = 2^x \iff x = \log_2 n$$

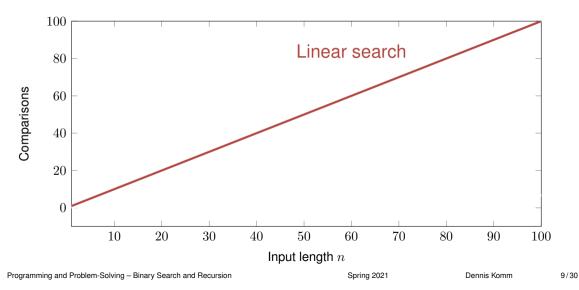
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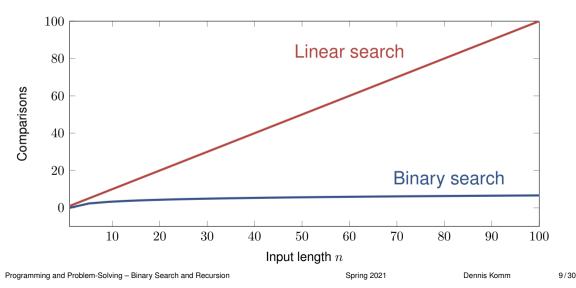
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Time complexity in $\mathcal{O}(\log_2 n)$





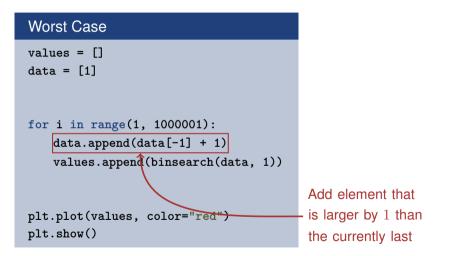
- We again use a variable counter to count the comparisons
- \blacksquare Algorithm is executed on sorted lists with values $1 \mbox{ to } n$
- The value of n grows by 1 with every iteration
- Initially, n is 1, at the end $1\,000\,000$
- The first element 1 is always sought
- Results are stored in a list and plotted using matplotlib

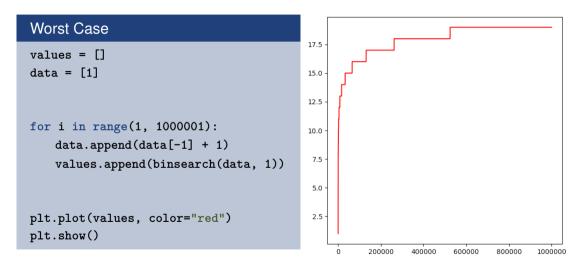
Worst Case

values = [] data = [1]

```
for i in range(1, 1000001):
    data.append(data[-1] + 1)
    values.append(binsearch(data, 1))
```

```
plt.plot(values, color="red")
plt.show()
```





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When does sorting pay off? If more than $\log_2 n$ searches are made

def f(): \iff Python "learns" new word f

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From Merriam-Webster dictionary

re.frig.er.a.tor

A room or appliance for keeping food or other items cool

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- Such functions are called recursive functions

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Not from Merriam-Webster dictionary

re-frig-er-a-tor A refrigerator

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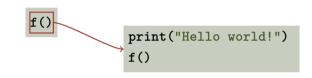
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```
def f():
    print("Hello world!")
    f()
```

f()

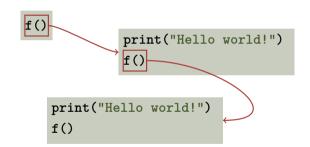
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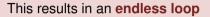
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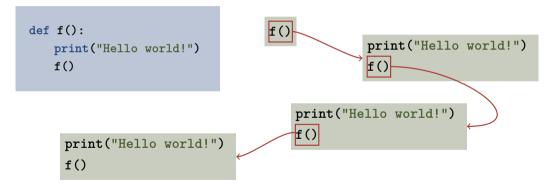


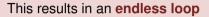
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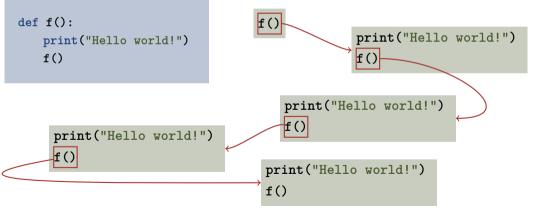




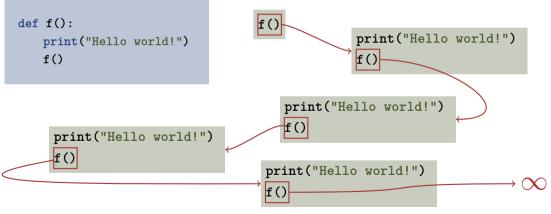








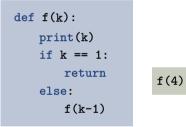
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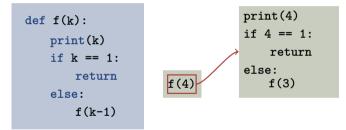


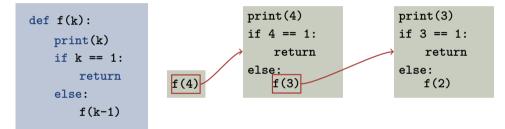
We use parameters to end after a finite number of calls

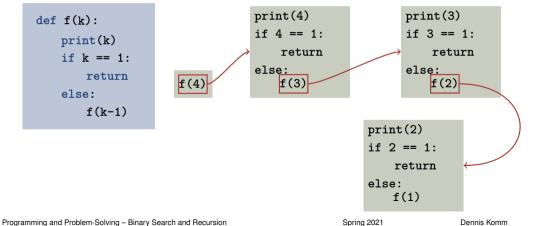
def f(k):
 print(k)
 if k == 1:
 return
 else:
 f(k-1)

We use parameters to end after a finite number of calls def f(k) print(k) if k == 1: return else: f(k-1) Parameter (or any local variable) is newly created for every function call

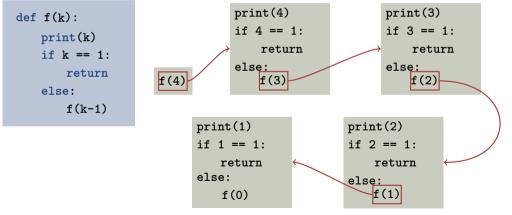








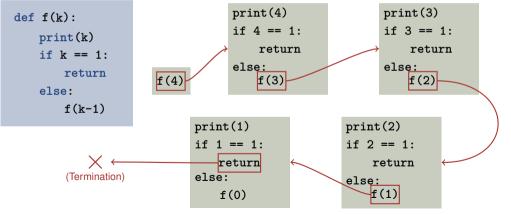
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Factorial and Sum

Computing the Factorial Recursively

\blacksquare Factorial of a natural number n is defined by

$$fact(n) = n! = n \cdot (n-1) \cdot (n-2) \cdot \dots \cdot 2 \cdot 1$$

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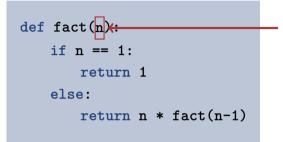
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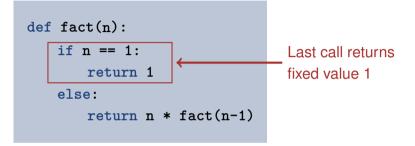
Function can be computed recursively by

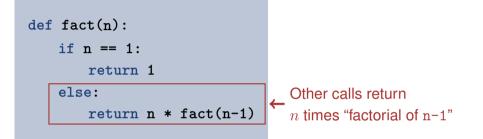
$$fact(1) = 1$$
 and $fact(n) = n \cdot fact(n-1)$

```
def fact(n):
    if n == 1:
        return 1
    else:
        return n * fact(n-1)
```



As before, parameter is newly created for every function call



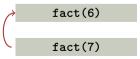


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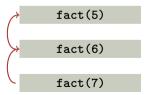
Call Stack

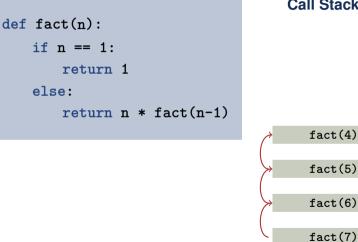
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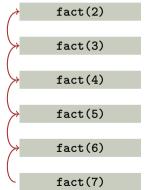




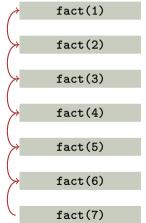
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Call Stack

fact(4)fact(5)fact(6)fact(7)

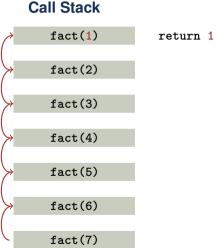
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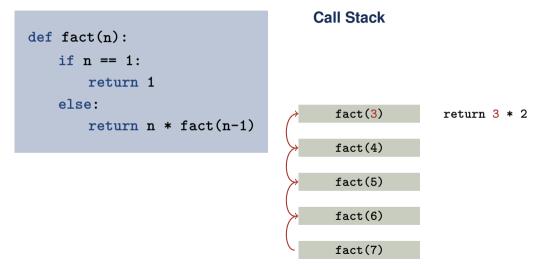


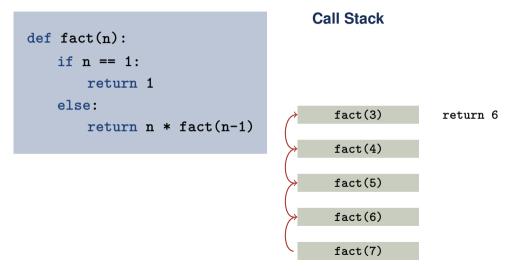
Call Stack def fact(n): if n == 1: fact(2)return 2 * 1return 1 else: fact(3)return n * fact(n-1)fact(4)fact(5)fact(6)

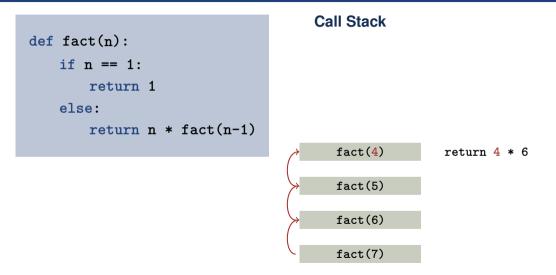
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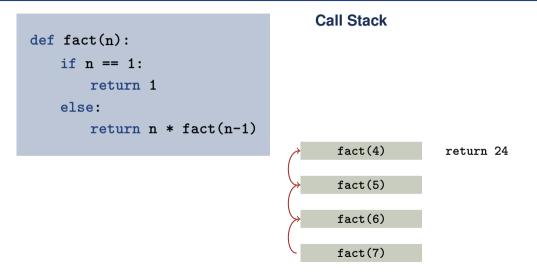
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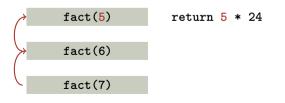




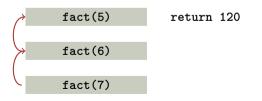




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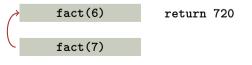
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Call Stack

fact(7)

return 7 * 720

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def fact(n):
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```

Call Stack

fact(7)

return 5040

Exercise – Computing a Sum Recursively

Implement a recursive function that

- takes a parameter n
- and returns the sum of the first n natural numbers



Exercise – Computing a Sum Recursively

Both recursive functions can be implemented with the same idea

```
def fact(n):
    if n == 1:
        return 1
    else:
        return n * fact(n-1)
```

```
def thesum(n):
    if n == 1:
        return 1
    else:
        return n + thesum(n-1)
```

There are alternatives using loops

```
def fact(n):
    i = 1
    result = 1
    while i < n:
        i += 1
        result *= i
    return result
```

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    return result
```

For the sum, there is also a closed form (from the Bubblesort analysis)

def thesum(n):
 return n * (n+1) / 2

If repeated statements are implemented using loops, we speak of iterative programming

For all problems, there exist both iterative and recursive solutions

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- The recursive solution can often be viewed as more "elegant"
- The implementation using recursion is often shorter (more concise) to write
- ... but almost never faster to execute
- What should be used, depends on multiple factors

Euclid's Algorithm

- Input: integers a > 0, b > 0
- Output: gcd of a and b

```
def euclid(a, b):
    while b != 0:
        if a > b:
            a = a - b
        else:
            b = b - a
    return a
```

Euclid's Algorithm

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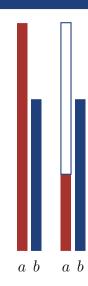
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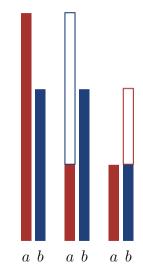
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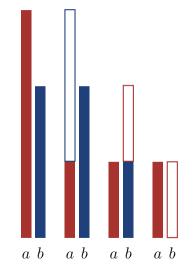
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    return a
```



Exercise – Computing the GCD Recursively

Implement Euclid's Algorithm

- as a recursive Python function
- that takes two parameters a and b

```
def euclid(a, b):
    while b != 0:
        if a > b:
            a = a - b
        else:
            b = b - a
    return a
```



```
def euclid(a, b):
    if b == 0:
        return a
    else:
        if a > b:
            return euclid(a - b, b)
        else:
            return euclid(a, b - a)
```

def euclid(a, b):
 if b == 0:
 return a
 else:
 if a > b:
 return euclid(a - b, b)
 else:
 return euclid(a, b - a)

def euclid(a, b):
 while b != 0:
 if a > b:
 a = a - b
 else:
 b = b - a
 return a

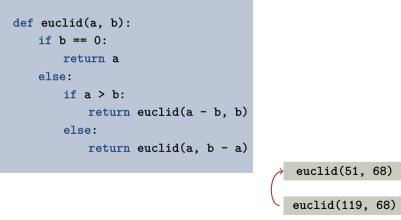
```
def euclid(a, b):
    if b == 0:
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    else:
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Call Stack return value is passed through

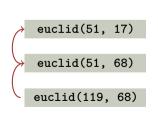
euclid(119, 68)

Call Stack return value is passed through



return value is passed through

Call Stack



def euclid(a, b):
 if b == 0:
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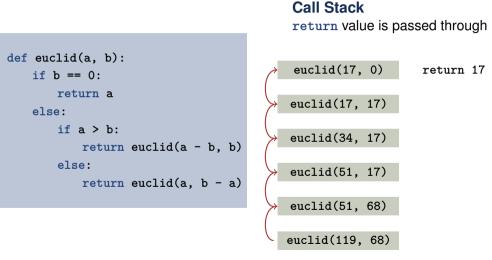
def euclid(a, b): if b == 0: return a else: if a > b: return euclid(a - b, b) else: return euclid(a, b - a)

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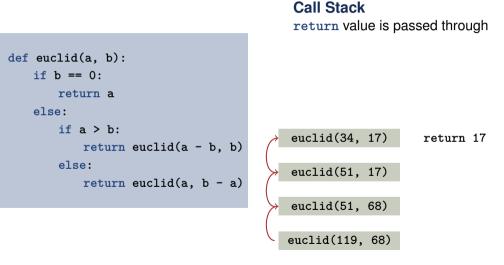
euclid(17, 0)euclid(17, 17) euclid(34, 17)euclid(51, 17)euclid(51, 68) euclid(119, 68)

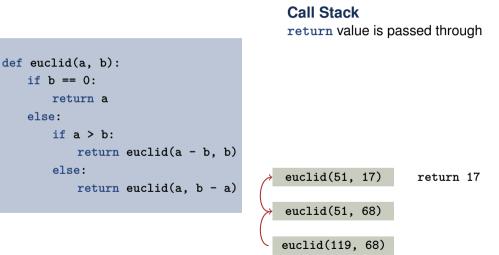


def euclid(a, b): if b == 0: return a euclid(17, 17) return 17 else: if a > b: euclid(34, 17)return euclid(a - b, b) else: euclid(51, 17)return euclid(a, b - a) euclid(51, 68) euclid(119, 68)

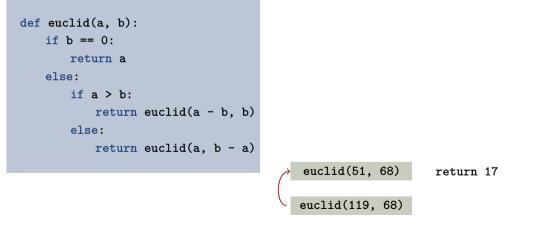
Call Stack

return value is passed through





Call Stack return value is passed through



def euclid(a, b):
 if b == 0:
 return a
 else:
 if a > b:
 return euclid(a - b, b)
 else:
 return euclid(a, b - a)

Call Stack return value is passed through

euclid(119, 68) return 17

Recursive Sorting and Searching Binary Search

Iterative Binary Search

```
def binsearch(data, searched):
    left = 0
    right = len(data) - 1
    while left <= right:
        current = (left + right) // 2
        if data[current] == searched:
            return current
        elif data[current] > searched:
            right = current - 1
        else:
            left = current + 1
        return -1
```

Recursive Implementation

Function again takes parameters data and for the given list and the searched element

Recursive Implementation

- Function again takes parameters data and for the given list and the searched element
- Two parameters left and right define the current search space
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- ⇒ No loop

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- Again consider position data[current]

Recursive Implementation

- Function again takes parameters data and for the given list and the searched element
- Two parameters left and right define the current search space
- In a single call, left and right are not changed
- ⇒ No loop
- current is again computed as (left + right) // 2
- Again consider position data[current]
- If searched is not found, call the function recursively and either adjust left or right accordingly

Exercise – Recursive Binary Search

Implement binary search

- as a recursive Python function
- with four parameters data, left, right, and searched
- Follow the ideas of the iterative variant

```
def binsearch(data, searched):
    left = 0
    right = len(data) - 1
    while left <= right:
        current = (left + right) // 2
        if data[current] == searched:
            return current
        elif data[current] > searched:
            right = current - 1
        else:
            left = current + 1
        return -1
```



```
def binsearch(data, left, right, searched):
   if left <= right:</pre>
       current = (left + right) // 2
       if data[current] == searched:
           return current
       elif data[current] > searched:
           return binsearch(data, left, current-1, searched)
       else:
           return binsearch(data, current+1, right, searched)
   else:
       return -1
```

```
def binsearch(data, left, right, searched):
   if left <= right:</pre>
       current = (left + right) // 2
       if data[current] == searched:
           return current
       elif data[current] > searched:
           return binsearch(data, left, current-1, searched)
       else:
           return binsearch(data, current+1, right, searched)
   else:
       return -1
```

```
def binsearch(data, searched):
   left = 0
   right = len(data) - 1
   while left <= right:</pre>
       current = (left + right) // 2
       if data[current] == searched:
           return current
       elif data[current] > searched:
         right = current - 1
       else:
          left = current + 1
   return -1
```

Call Stack

Call Stack

binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],0,12,45)

Programming and Problem-Solving - Binary Search and Recursion

Spring 2021

Call Stack

Programming and Problem-Solving - Binary Search and Recursion

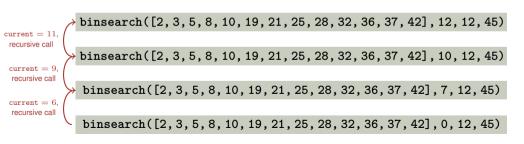
Call Stack

	binsearch([2, 3, 5, 8, 10, 19, 21, 25, 28, 32, 36, 37, 42], 10, 12, 45)
current = 9,	
recursive call	<pre>binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],7,12,45)</pre>
current = 6, recursive call	
	binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],0,12,45)

Programming and Problem-Solving - Binary Search and Recursion

Spring 2021

Call Stack



Call Stack

	binsearch([2, 3, 5, 8, 10, 19, 21, 25, 28, 32, 36, 37, 42], 13, 12, 45)
current = 12, recursive call	
	<pre>binsearch([2, 3, 5, 8, 10, 19, 21, 25, 28, 32, 36, 37, 42], 12, 12, 45)</pre>
current = 11, recursive call	
	<pre>binsearch([2, 3, 5, 8, 10, 19, 21, 25, 28, 32, 36, 37, 42], 10, 12, 45)</pre>
current = 9, recursive call	
	<pre>binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],7,12,45)</pre>
current = 6, recursive call	
	binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],0,12,45)

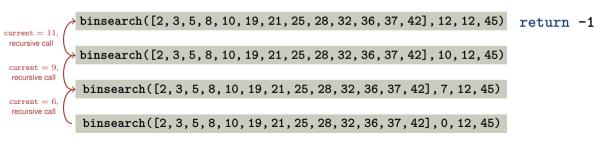
Programming and Problem-Solving - Binary Search and Recursion

Call Stack

. 10	ð	binsearc	h([2,	З,	5,8	3,10,	19,	21,	25,	28,	32,	36,	37,	42],	13,	12,	45)	return	-1
current = 12, recursive call	(
	\succ	binsearc	h([2,	З,	5,8	3,10,	19,	21,	25,	28,	32,	36,	37,	42],	12,	12,	45)		
current = 11, recursive call	(
	\succ	binsearc	h([2,	З,	5,8	3,10,	19,	21,	25,	28,	32,	36,	37,	42],	10,	12,	45)		
current = 9, recursive call	(
	\succ	binsearc	h([2,	,з,	5,	8,10	, 19	, 21,	, 25,	, 28	32,	,36,	, 37	, 42]	,7,	12,	45)		
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Programming and Problem-Solving - Binary Search and Recursion

Call Stack



Programming and Problem-Solving - Binary Search and Recursion

Spring 2021

Call Stack

	binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],10,12,45) r	eturn -1
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current = 6,		
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	binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],0,12,45)	

Programming and Problem-Solving - Binary Search and Recursion

Call Stack

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Call Stack

binsearch([2,3,5,8,10,19,21,25,28,32,36,37,42],0,12,45) return -1

Programming and Problem-Solving - Binary Search and Recursion

Thanks for your attention

