

UC Berkeley EECS  
Adj. Ass. Prof.  
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# Computational Structures in Data Science

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## Lecture 6: Environment Diagrams, Recursion Review, Midterm Review



# On Computer Science Exams

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In computer science exams, we try to assess the student's understanding of concepts and his or her ability to practically apply these.

- In CS, we do not:
  - require extensive memorization (e.g. we allow cheat sheet)
  - require a lot of reading
  - require essay writing skills

In CS, we do:

- require the ability to translate a given textual problem into programming code
- require you to be able to read other people's code
- value solutions that are almost right over no solution
- accept solutions we did not think about if they work
- prioritize math (logic) and science (experiment) over opinion or authority



# How to prepare for a CS exam

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- Explain the content of the computational concepts toolbox to somebody else
  - Describe the concept
  - What is an example of using it?
  - When does it not work? Corner cases?
  - Why does it exist?
- Practice programming:
  - Play around with the examples from lecture, lab, homework
  - Think about your own similar examples
- In the exam:
  - Make sure you understand the question: What is the given input? What is the required output?
  - Think of easy cases first (e.g.  $n=1$ ?).
  - What is the iteration/recursion doing (e.g.  $i=i+1$ )?
  - What are corner cases that need explicit handling (e.g. division by zero, negative numbers, empty list)?



# Computational Concepts Toolbox

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- **Data type: values, literals, operations,**
  - e.g., int, float, string
- **Expressions, Call expression**
- **Variables**
- **Assignment Statement**
- **Sequences: tuple, list**
  - indexing
- **Data structures**
- **Tuple assignment**
- **Call Expressions**
- **Iteration:**
  - data-driven (list comprehension)
  - control-driven (for statement)
  - while statement
- **Higher Order Functions**
  - Functions as Values
  - Functions with functions as argument
  - Assignment of function values
- **Recursion**
- **Environment Diagrams**



**Function Definition Statement**

**Conditional Statement**



# Recursion Key concepts – by example

1. Test for simple “base” case

2. Solution in simple “base” case

```
def sum_of_squares(n):  
    if n < 1:  
        return 0  
    else:  
        return sum_of_squares(n-1) + n**2
```

3. Assume recursive solution to simpler problem

4. Transform soln of simpler problem into full soln



## In words

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- The sum of no numbers is zero
- The sum of  $1^2$  through  $n^2$  is the
  - sum of  $1^2$  through  $(n-1)^2$
  - plus  $n^2$

```
def sum_of_squares(n):  
    if n < 1:  
        return 0  
    else:  
        return sum_of_squares(n-1) + n**2
```



# How does it work?

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- **Each recursive call gets its own local variables**
  - Just like any other function call
- **Computes its result (possibly using additional calls)**
  - Just like any other function call
- **Returns its result and returns control to its caller**
  - Just like any other function call
- **The function that is called happens to be itself**
  - Called on a simpler problem
  - Eventually bottoms out on the simple base case
- **Reason about correctness “by induction”**
  - Solve a base case
  - Assuming a solution to a smaller problem, extend it



# Local variables

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```
def sum_of_squares(n):  
    n_squared = n**2  
    if n < 1:  
        return 0  
    else:  
        return n_squared + sum_of_squares(n-1)
```

- Each call has its own “frame” of local variables
- What about globals?
- Let’s see the environment diagrams

<https://goo.gl/CiFaUJ>





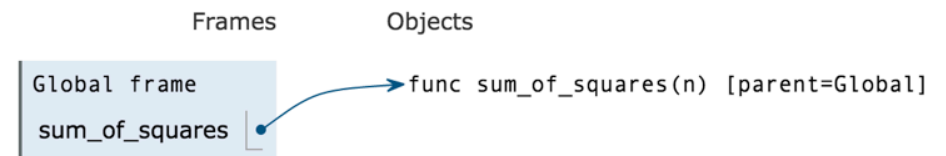
# Environments Example

Python 3.3

```
→ 1 def sum_of_squares(n):
  2     n_squared = n**2
  3     if n == 1:
  4         return 1
  5     else:
  6         return n_squared + sum_of_squares(n-1)
  7
→ 8 sum_of_squares(3)
```

[Edit code](#)

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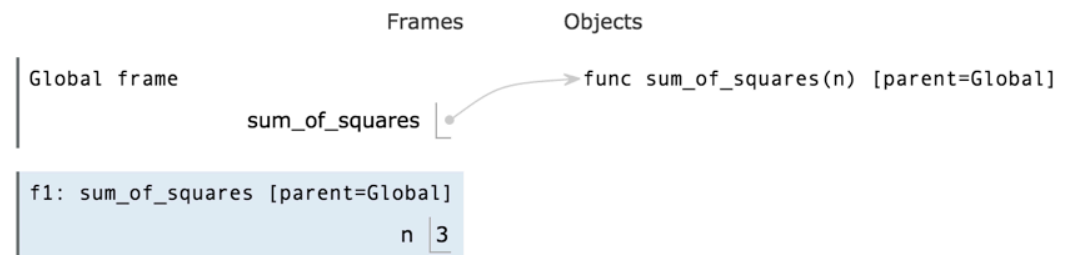


Python 3.3

```
→ 1 def sum_of_squares(n):
  2     n_squared = n**2
  3     if n == 1:
  4         return 1
  5     else:
  6         return n_squared + sum_of_squares(n-1)
  7
→ 8 sum_of_squares(3)
```

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<< First < Back Step 3 of 17 Forward > Last >>



[pythontutor.com](http://pythontutor.com)

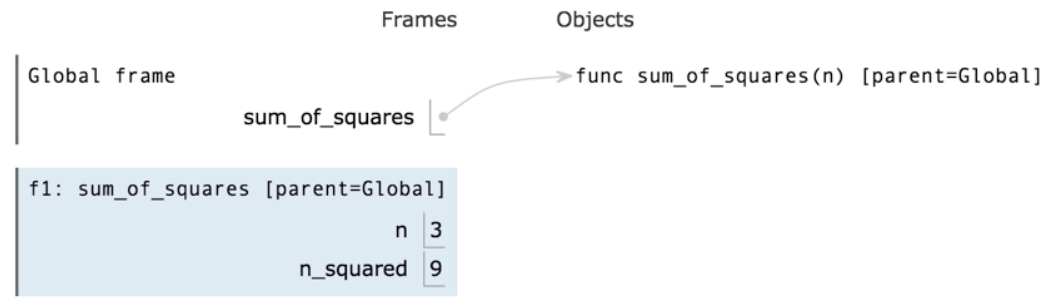


# Environments Example

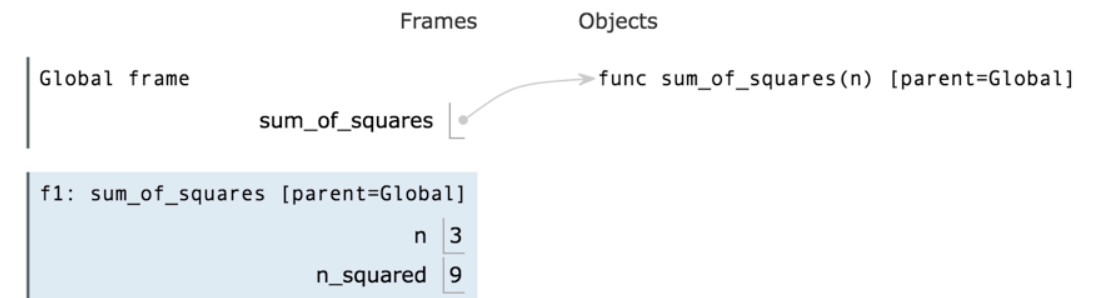
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3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

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<< First < Back Step 5 of 17 Forward > Last >>



```
Python 3.3
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```





# Environments Example

Python 3.3

```
→ 1 def sum_of_squares(n):  
  2     n_squared = n**2  
  3     if n == 1:  
  4         return 1  
  5     else:  
→ 6         return n_squared + sum_of_squares(n-1)  
  7  
  8 sum_of_squares(3)
```

[Edit code](#)

Python 3.3

```
1 def sum_of_squares(n):  
→ 2     n_squared = n**2  
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  4         return 1  
  5     else:  
  6         return n_squared + sum_of_squares(n-1)  
  7  
  8 sum_of_squares(3)
```

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<< First < Back Step 9 of 17 Forward > Last >>

Frames

Objects

Global frame

sum\_of\_squares

func sum\_of\_squares(n) [parent=Global]

f1: sum\_of\_squares [parent=Global]

n 3

n\_squared 9

f2: sum\_of\_squares [parent=Global]

n 2

Frames

Objects

Global frame

sum\_of\_squares

func sum\_of\_squares(n) [parent=Global]

f1: sum\_of\_squares [parent=Global]

n 3

n\_squared 9

f2: sum\_of\_squares [parent=Global]

n 2

n\_squared 4



# Environments Example

```
Python 3.3
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

[Edit code](#)

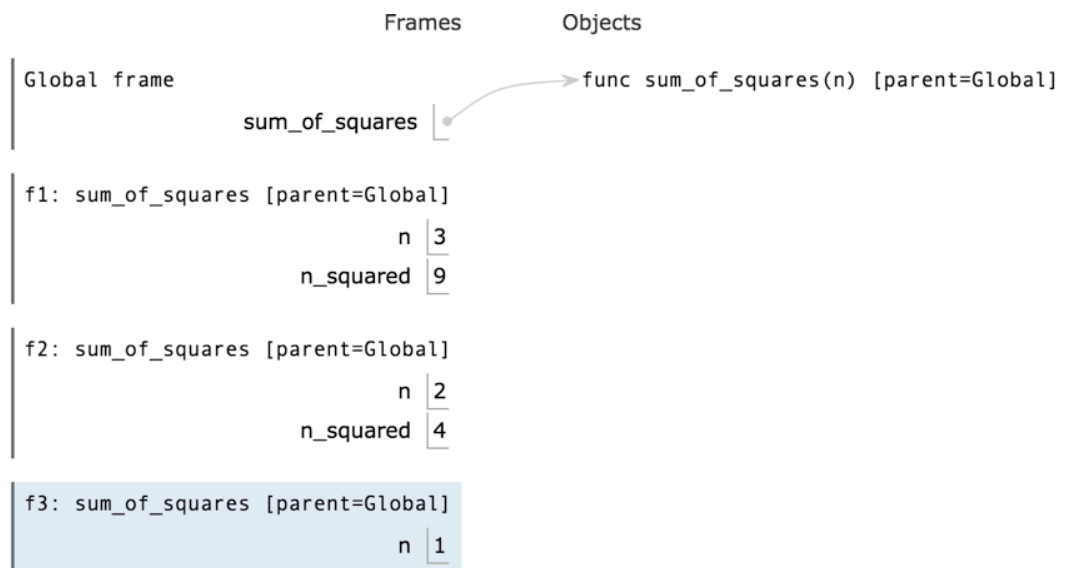
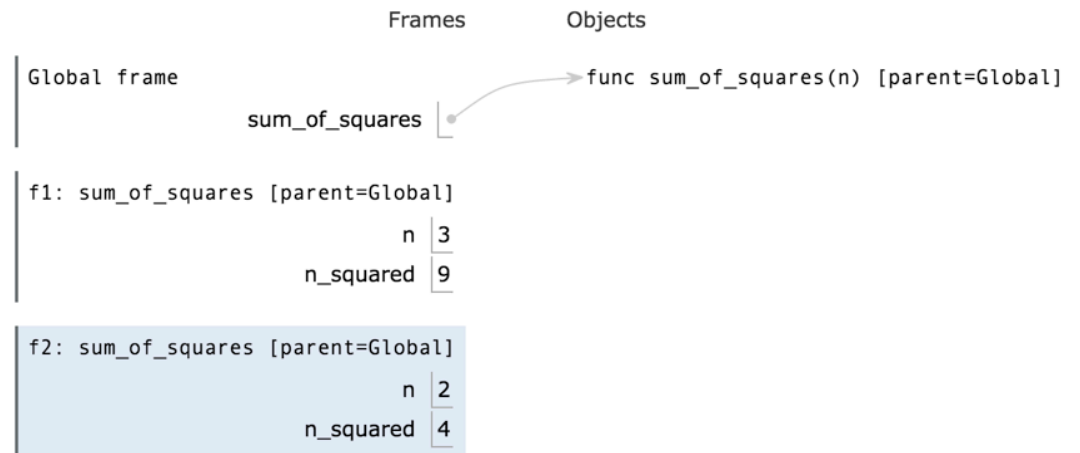
<< First < Back Step 10 of 17 Forward > Last >>

```
Python 3.3
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

[Edit code](#)

<< First < Back Step 11 of 17 Forward > Last >>

that has just executed  
: line to execute





# Environments Example

Python 3.3

```
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

[Edit code](#)

<< First < Back Step 13 of 17 Forward > Last >>

that has just executed  
t line to execute

Python 3.3

```
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

[Edit code](#)

<< First < Back Step 14 of 17 Forward > Last >>

that has just executed  
t line to execute

Frames

Objects

Global frame

sum\_of\_squares

func sum\_of\_squares(n) [parent=Global]

f1: sum\_of\_squares [parent=Global]

n | 3

n\_squared | 9

f2: sum\_of\_squares [parent=Global]

n | 2

n\_squared | 4

f3: sum\_of\_squares [parent=Global]

n | 1

n\_squared | 1

Frames

Objects

Global frame

sum\_of\_squares

func sum\_of\_squares(n) [parent=Global]

f1: sum\_of\_squares [parent=Global]

n | 3

n\_squared | 9

f2: sum\_of\_squares [parent=Global]

n | 2

n\_squared | 4

f3: sum\_of\_squares [parent=Global]

n | 1

n\_squared | 1



# Environments Example

Python 3.3

```
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

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e that has just executed  
xt line to execute

Frames

Objects

Global frame

sum\_of\_squares

func sum\_of\_squares(n) [parent=Global]

f1: sum\_of\_squares [parent=Global]

n 3

n\_squared 9

f2: sum\_of\_squares [parent=Global]

n 2

n\_squared 4

f3: sum\_of\_squares [parent=Global]

n 1

n\_squared 1

Return  
value 1



# Environments Example

Python 3.3

```
1 def sum_of_squares(n):
2     n_squared = n**2
3     if n == 1:
4         return 1
5     else:
6         return n_squared + sum_of_squares(n-1)
7
8 sum_of_squares(3)
```

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that has just executed  
t line to execute





# Environments Example

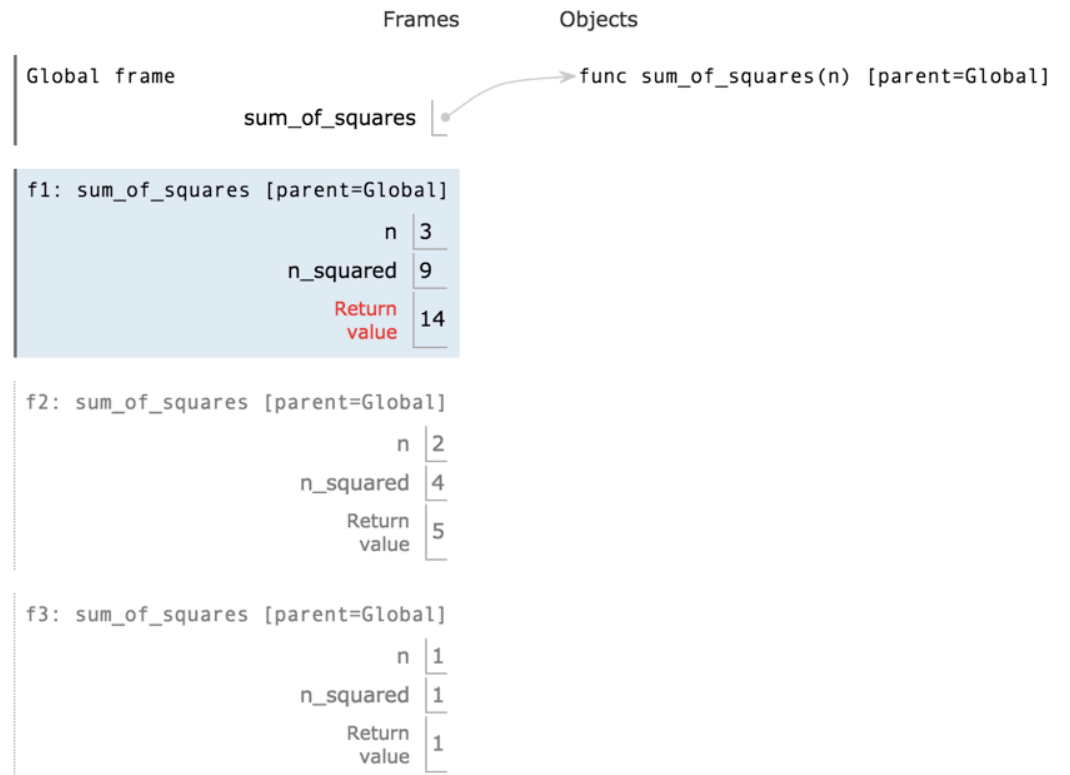
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7
8 sum_of_squares(3)
```

[Edit code](#)

<< First < Back Step 17 of 17 Forward > Last >>

» that has just executed  
« line to execute







# How much ???

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- Time is required to compute `sum_of_squares(n)`?
  - Recursively?
  - Iteratively ?
- Space is required to compute `sum_of_squares(n)`?
  - Recursively?
  - Iteratively ?
- Count the frames...
- Recursive is linear, iterative is constant!

Linear  
proportional to  $n$   
 $cn$  for some  $c$



# Tail Recursion

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- All the work happens on the way down the recursion
- On the way back up, just return

```
def sum_up_squares(i, n, accum):  
    """Sum the squares from i to n in incr. order"""  
    if i > n:  
        Base Case  
    else:  
        Tail Recursive Case  
  
>>> sum_up_squares(1, 3, 0)  
14
```



# Tree Recursion

- Break the problem into multiple smaller sub-problems, and Solve them recursively

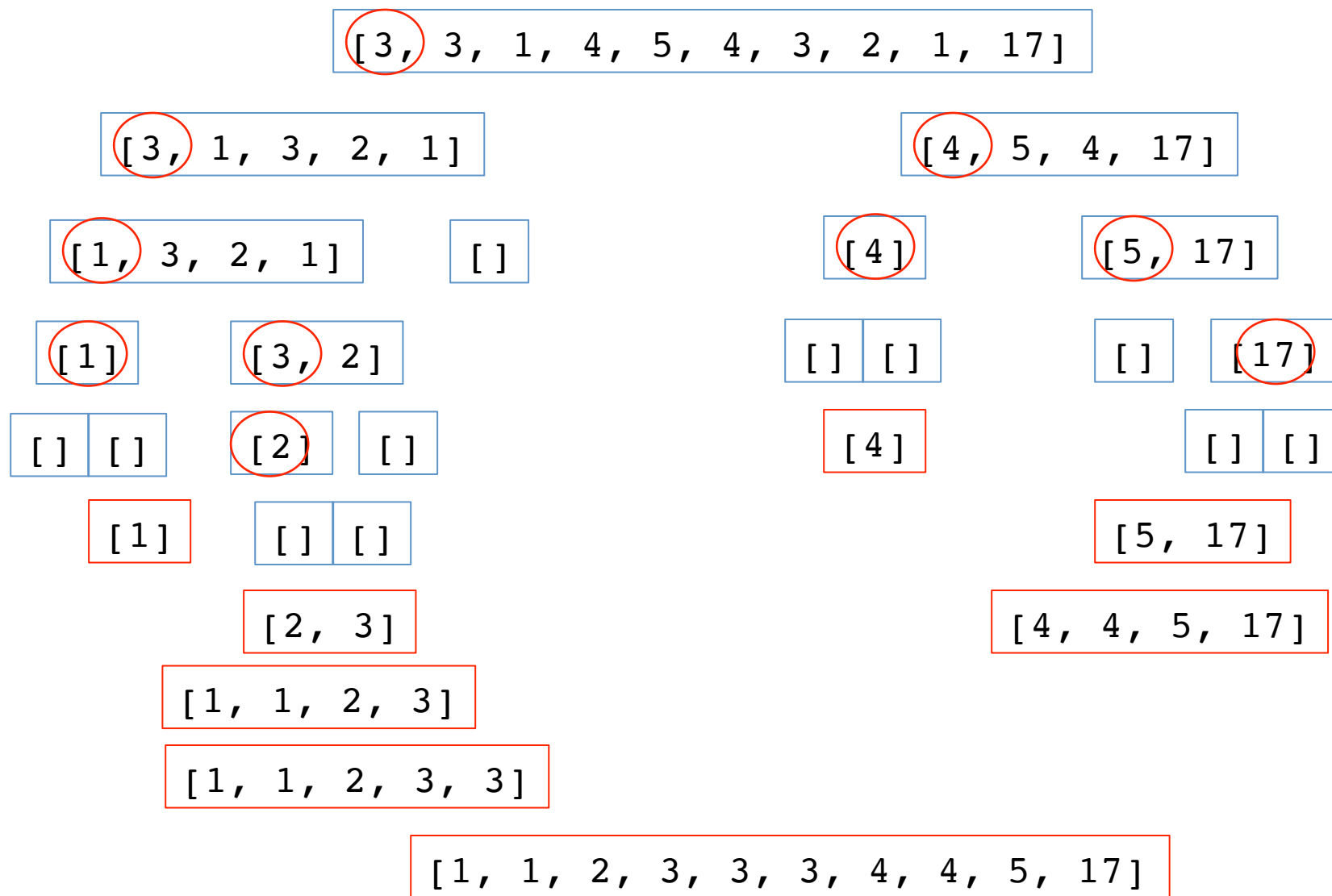
```
def split(x, s):
    return [i for i in s if i <= x], [i for i in s if i > x]

def qsort(s):
    """Sort a sequence - split it by the first element,
    sort both parts and put them back together."""
    if not s:
        return []
    else:
        pivot = first(s)
        lessor, more = split(pivot, rest(s))
        return qsort(lessor) + [pivot] + qsort(more)

>>> qsort([3,3,1,4,5,4,3,2,1,17])
[1, 1, 2, 3, 3, 3, 4, 4, 5, 17]
```



# QuickSort Example





# Tree Recursion with HOF

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```
def qsort(s):
    """Sort a sequence - split it by the first element,
    sort both parts and put them back together."""

    if not s:
        return []
    else:
        pivot = first(s)
        lessor, more = split_fun(leq_maker(pivot), rest(s))
        return qsort(lessor) + [pivot] + qsort(more)

>>> qsort([3,3,1,4,5,4,3,2,1,17])
[1, 1, 2, 3, 3, 3, 4, 4, 5, 17]
```



# Computational Concepts Toolbox

---

- **Data type: values, literals, operations,**
  - e.g., int, float, string
- **Expressions, Call expression**
- **Variables**
- **Assignment Statement**
- **Sequences: tuple, list**
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**Function Definition Statement**

**Conditional Statement**



# Answers for the Wandering Mind

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The computer chooses a random element  $x$  of the list generated by `range(0,n)`. What is the smallest amount of iteration/recursion steps the best algorithm needs to guess  $x$ ?

$\log_2 n$

**How would the algorithm look like?**

Guess the binary digits of  $x$  starting with the highest significant digit. This is, ask questions of the form  
“smaller than  $2^{n-1}$ ?” (yes  $\Rightarrow$  0...),  
“smaller than  $2^{n-2}$ ?” (no  $\Rightarrow$  0 1...),  
“smaller than  $2^{n-2}+2^{n-3}$ ?”, ...

This method is also called: binary search

Quantum physics: Allow less than  $\log_2 n$  guesses.