



# Computational Structures in Data Science

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## Lecture #7: Higher Order Functions & Environments



# Announcements!

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- **Late Adds:**
  - **If you filled out the form on Piazza you'll hear from us soon.**
  - **If you're coming from 61A, you can copy over Labs and HW 0-2**
    - **The roster is delayed ☹️, so please send us an email so we can add you**
    - **If you want E.C. for lab practice questions you'll need to turn in lab 2 – you'll get an extension to turn in lab since you cannot try the practice until we add you.**
- **No Class Monday, please attend any lab Tues!**



# Computational Concepts Toolbox

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- **Data type: values, literals, operations,**
  - e.g., int, float, string
- **Expressions, Call expression**
- **Variables**
- **Assignment Statement**
- **Sequences: list**
- **Data structures**
- **Call Expressions**
- **Function Definition Statement**
- **Conditional Statement**
- **Iteration:**
  - data-driven (list comprehension)
  - control-driven (for statement)
  - while statement





# Computational Concepts today

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- **Higher Order Functions**
  - Functions as Values
  - Functions with functions as argument
  - **Functions that *return* a function**
- **"Environments"**
  - **These are a tools to help us understand what variables or parameters are accessible in which functions.**



# Three super important HOFs

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\* For the builtin filter/map, you need to then call list on it to get a list.

If we define our own, we do not need to call list

```
list(map(function_to_apply, list_of_inputs))
```

Applies function to each element of the list

```
list(filter(condition, list_of_inputs))
```

Returns a list of elements for which the condition is true

```
reduce(function, list_of_inputs)
```

Applies the function, combining items of the list into a "single" value.



# Today's Task: Acronym

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Input: "The University of California at Berkeley"

Output: "UCB"

```
def acronym(sentence):  
    """YOUR CODE HERE"""
```

P.S. Pedantry alert: This is really an *initialism* but that's rather annoying to say and type. 😊 (However, the code we write is the same, the difference is in how you pronounce the result.) The more you know!



# MAP

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```
list(map(function_to_apply, list_of_inputs))
```

Transform each of items by a function.

e.g. `square()`

Inputs (Domain):

- Function
- Sequence

Output (Range):

- A sequence

```
def map(function, sequence):  
    return [ function(item) for item in sequence ]
```



# FILTER

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```
list(filter(function, list_of_inputs))
```

**\*Keeps\*** each of item where the function is true.

Inputs (Domain):

- Function
- Sequence

Output (Range):

- A sequence

```
def filter(function, sequence):  
    return [ item for item in sequence  
             if function(item) == True ]
```





# Higher Order Functions

- Functions that operate on functions
- A function

```
def odd(x):  
    return x%2==1  
  
odd(3)  
True
```

Why is this not 'odd' ?

- A function that takes a function arg

```
def filter(fun, s):  
    return [x for x in s if fun(x)]  
  
filter(odd, [0,1,2,3,4,5,6,7])  
[1, 3, 5, 7]
```



# What does this do?

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```
list(filter(return_false,  
          range(100)  
))
```

Assume `return_false(42) == False`

- A) `range(0, 100)` # A standard range object
- B) `[0, 1, 2, ... 96, 97, 98, 99]`
- C) `[]`
- D) Error
- E) I'm lost.



# REDUCE

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`reduce(function, list_of_inputs)`

Successively **combine** items of our sequence

- function: `add()`, takes 2 inputs gives us 1 value.

Inputs (Domain):

- Function, with 2 inputs
- Sequence

Output (Range):

- An item, specifically, the output of our function.

```
def reduce(function, sequence):  
    result = function(sequence[0], sequence[1])  
    for index in range(2, len(sequence)):  
        result = function(result, sequence[index])  
    return result
```

Note: This reduce is slightly different than the homework one....



# Question: Inputs to our reducer?

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`reduce(sub, range(5))`  
`reduce(add, range(5))`  
`reduce(REDUCER, range(5))`

How many inputs should our reducer accept?

- A) 0
- B) 1
- C) 2
- D) Unlimited
- E) I'm lost.



# Question: What's the output?

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`reduce(add, range(5))`

What is the value of this expression?

- A) 0
- B) 9
- C) 10
- D) 15
- E) Error



## Question: What's the output?

---

`reduce(sub, range(5))`

What is the value of this expression?

- A) 0
- B) - 5
- C) -10
- D) -15
- E) Error



# Map, Filter, Reduce

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Each takes in a function and a sequence

- Function – what this does depends on your goal!
  - Map: Returns a new value
  - Filter: Returns a boolean value
  - Reduce: Takes in 2 values, "combines" them
- Sequence

## **Always consider your output!**

- Am I returning a new list of different items?
- Am I excluding items from my list?
- Do I need a list as my result?



# Returning a New Function

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- **A function that returns (makes) a function**

```
def leq_maker(c):  
    def leq(val):  
        return val <= c  
    return leq
```

```
>>> leq_maker(3)  
<function leq_maker.<locals>.leq at 0x1019d8c80>
```

```
>>> leq_maker(3)(4)  
False
```

```
>>> filter(leq_maker(3), [0, 1, 2, 3, 4, 5, 6, 7])  
[0, 1, 2, 3]
```



# Environment Diagrams aka what python tutor makes



Environment Diagrams are organizational tools that help you understand code

## Terminology:

- **Frame:** keeps track of variable-to-value bindings, each function call has a frame
- **Global Frame:** global for short, the starting frame of all python programs, doesn't correspond to a specific function
- **Parent Frame:** The frame of where a function is defined (default parent frame is global)
- **Frame number:** What we use to keep track of frames, f1, f2, f3, etc
- **Variable vs Value:**  $x = 1$ .  $x$  is the **variable**, 1 is the **value**

## Steps:

- 1 Draw the global frame
- 2 When evaluating assignments (lines with single equal), **always** evaluate right side first
- 3 When you **call** a function **MAKE A NEW FRAME!**
- 4 When assigning a primitive expression (number, boolean, string) right the value in the box
- 5 When assigning anything else, **draw an arrow** to the value
- 6 When calling a function, name the frame with the intrinsic name – the name of the function that variable points to
- 7 The parent frame of a function is the frame in which it was defined in (default parent frame is global)
- 8 If the value isn't in the current frame, search in the parent frame

**NEVER EVER EVER** draw an arrow from one variable to another.

Source:



# Another example

- **Higher Order Functions**

```
http://pythontutor.com/composingprograms.html#code=def%20square%28x%29%3A%0A%20%20%20%20return%20x%20*%20x%0A%20%20%20%20%0A%20s%20%3D%20square%0Ax%20%3D%20s%283%29%0A%0Adef%20make_adder%28n%29%3A%0A%20%20%20%20def%20adder%28k%29%3A%0A%20%20%20%20%20%20%20%20return%20k%20%2B%20n%0A%20%20%20%20return%20adder%0A%20%20%20%20%0Aadd_2%20%3D%20make_adder%282%29%0Aadd_3%20%3D%20make_adder%283%29%0Ax%20%3D%20add_2%28x%29%0A%0Adef%20compose%28f,%20g%29%3A%0A%20%20%20%20def%20h%28x%29%3A%0A%20%20%20%20%20%20%20return%20f%28g%28x%29%29%0A%20%20%20%20return%20h%0A%0Aadd_5%20%3D%20compose%28add_2,%20add_3%29%0Ay%20%3D%20add_5%28x%29%0Az%20%3D%20compose%28square,%20make_adder%282%29%29%283%29&cumulative=true&mode=edit&origin=composingprograms.js&py=3&rawInputLstJSON=%5B%5D
```



# Computational Concepts today

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- Higher Order Functions
- Functions as Values
- Functions with functions as argument
- Functions with functions as return values
- Environment Diagrams



Big Idea: Software Design Patterns