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Cookie



Snow

- Education:
 - Ph.D. in Computer Science – University of Southern California (2010)
 - M.S. in Computer Science – University of Southern California (2004)
 - B.S. in Computer Engineering – Bogazici University – Turkey (1999)
- Research Interests:
 - Large-Scale Geospatial Data Management and Indexing
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- Courses at Washington State University
 - Software Engineering I
 - Programming Language Design
 - Introduction to Database Systems
 - Advanced Data Structures
 - Software Design Project I (Capstone)
 - Software Design Project II (Capstone)
 - Software Design

Higher Order Functions in Python

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Review

We previously learned about:

- Functions in Python
- Basic data structures in Python: lists, tuples, and dictionaries
- Classes in Python
- Testing Python programs
 - Unit testing
 - Writing unit tests

Designing Functions

- Why do we include functions in our programs?
- What are the qualities of good functions?
 - Each function should have exactly one job.
 - Functions should be defined broadly.

```
sorted('Python')
sorted([2,8,1,-1,7,6])
sorted([('d',1),('e',4),('a',3)])
sorted([('d',1),('e',4),('a',3)], reverse = True)
sorted([('d',1),('e',4),('a',3)], reverse = False)
sorted([('d',1),('e',4),('a',3)], reverse = False, key=lambda t: t[1])
```

DESIGNING FUNCTIONS

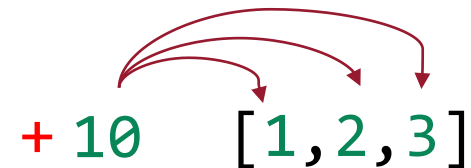
Generalization

- Generalizing functions with arguments
- Generalizing functions over computational processes

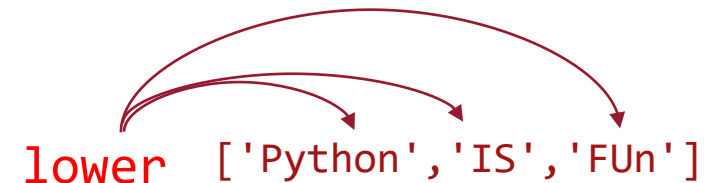
Generalizing over Computational Processes

- Common structure among problems – Example 1

```
>>> add_to_all([1,2,3],10)
"""Adds 10 to each numeric value in
given list."""
```



```
>>> lower_all(['Python','IS','FUn'])
"""Converts each string in given list to
lowercase."""
```



```
>>> length_of_all(['Python','IS','FUn'])
"""Calculates the length of each string in the
given list"""
```



— Demo!

Functions as Arguments

The diagram illustrates the concept of functions as arguments. It features two Python code snippets. The first snippet, `def apply_all(op, lst):`, is annotated with a green dashed box around the `op` parameter and a callout stating 'A function that takes another function as argument'. The second snippet, `def add_to_all (lst, val):`, contains a nested function `def add(item):` enclosed in a blue dashed box, with a callout stating 'A function defined in another function'. Both snippets are annotated with red arrows pointing to specific parts of the code, such as the `op` parameter, the `op(item)` call, and the `add` function, with callouts explaining their roles.

```
1  def apply_all(op, lst):
2      """Applies function 'op' to every item in list 'lst'."""
3
4      out = []
5      for item in lst:
6          out.append(op(item))
7      return out
8
9
10 def add_to_all (lst, val):
11     def add(item):
12         return item + val
13     return apply_all(add, lst)
```

A function that takes another function as argument

A parameter that will be bound to a function

The function bound to `op` is called here

A function defined in another function

Function `add` is substituted in place of `op`.

Python Functions

- In Python, functions that we define are just objects like anything else.

```
def meaningOfLife(x) :  
    return "happiness" if x else "success"  
  
type(meaningOfLife)
```

```
life = meaningOfLife  
  
life(True)  
  
d = {'mylife' : meaningOfLife}
```


Higher Order Functions

- In Python, functions are treated as *first-class values*.
 - Like any other value, functions can be passed as argument and returned as a result.
 - This provides a flexible way to compose programs.
- A function that **takes other functions as arguments** or **returns a function** is called a *higher order function*.

Built-in Higher Order Functions: map

- map takes a unary function f and an iterable input and applies f to every element in input. It returns result as a map object.
 - $\text{map}(f, [x_1, x_2, \dots, x_n]) \Rightarrow [f(x_1), f(x_2), \dots, f(x_n)]$

For example,

```
def pow2(x):  
    return x**2  
  
out = map(pow2, [1,2,3,4,5]) # returns a map object  
list(out)
```

- Python's built-in map function is more general and faster.

```
def add(x,y):  
    return x+y  
  
list(map (add, [1,2,3,4], [5,6,7,8]))  
returns ?
```

Checkpoint question?

- Are the following higher order functions?

(A)

```
def myFunction1(v,fn):  
    def helper(x):  
        return fn(v,x)  
    return helper
```

(B)

```
def myFunction2(x,y):  
    def helper(x):  
        return x*x  
    return helper(x)+helper(y)
```

(C)

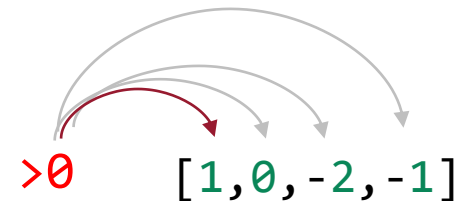
```
def myFunction3(f,y):  
    return f(y)
```

Google forms link
<https://tinyurl.com/gmlecture>

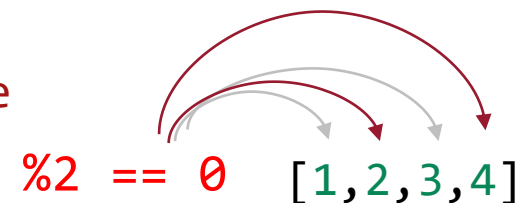
Generalizing over Computational Processes

- Common structure among problems – Example 2

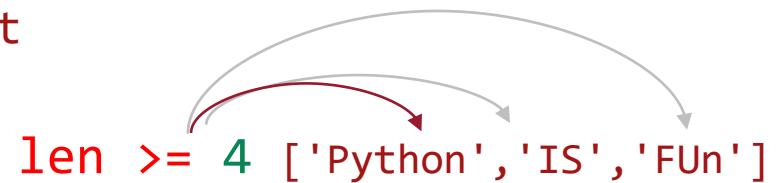
```
>>> get_positives([1,0,-2,-1])  
"""Filters out the negative values  
and zero from the given list."""
```



```
>>> get_evens([1,2,3,4,5,6])  
"""Filters out the odd values from the  
given list."""
```



```
>>> get_longer(['Python', 'IS', 'FUn'], 4)  
"""Filters out the words in the list  
shorter than the given length."""
```



— Demo!

Built-in Higher Order Functions: `filter`

`filter`

- `filter` takes a predicate function p (a unary function returning a `bool`) and an iterable `input`. It returns a filter object including the values from `input` for which p returns `True`.
 - $\text{filter}(p, [x_1, x_2, x_3, \dots, x_n]) \Rightarrow [x_2, \dots, x_k] \quad (k \leq n)$

For example:

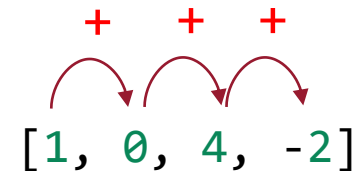
```
def is_positive(item):  
    return item > 0  
list(filter(is_positive, [-4, 3, 1, -2, 3, -5, 1, 9, 0]))
```

returns ?

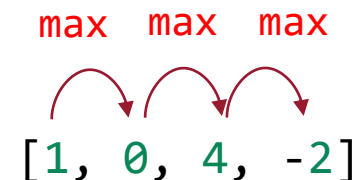
Generalizing over Computational Processes

- Common structure among problems – Example 3

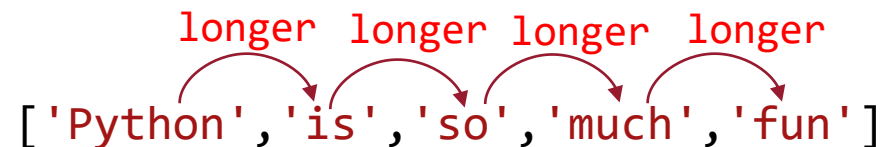
```
>>> sum_list([1, 0, 4, -2])  
"""Sums all values in the given list."""
```



```
>>> max_of_list([1, 0, 4, -2])  
"""Returns the maximum value from the  
given list."""
```



```
>>> longest(['Python', 'is', 'so', 'much', 'fun'])  
"""Returns the longest (leftmost) value  
from the given list."""
```



— Demo!

Built-in Higher Order Functions: reduce

reduce

- reduce takes a binary function f and an iterable input. It combines the values in input by applying f and returns a single value.
 - $\text{reduce}(f, [x_1, x_2, x_3, \dots, x_n]) \Rightarrow f(f(x_1, x_2), x_3 \dots)$

For example:

```
from functools import reduce  
reduce( max, [4,2,-3,8,6] )
```

- Unlike `map` and `filter` (which are defined and automatically imported from the `builtins` module) we must import `reduce` from the `functools` module explicitly.

Python Functions and Lambdas

- So far, each time we defined a new function, we gave it a name.
- Python provides a shortcut for quickly defining *anonymous* functions that define an expression and return it, called “*lambdas*”:

```
def add(x,y):  
    return (x+y)
```

```
lambda x , y : x + y  
# A function that takes x and y and returns (x+y)
```

```
def meaningOfLife(x) :  
    return "happiness" if x else "success"
```

```
meaningOfLife = lambda x: "happiness" if x else "success"  
meaningOfLife(3)
```


Built-in Higher Order Functions: reduce

- How to use reduce?
 - Without the (optional) `init` argument:

```
reduce(lambda x,y : x+y , [1,2,3,4,5,6]) #returns 21  
reduce(min, [4,2,3,8,6,1,1] ) #returns 1  
reduce(lambda x,y: x[1]+y[1], [('Feb',10),('Mar',15),('Apr',20)]) #??
```

won't work

- With the `init` argument:

```
reduce(lambda x,y : x+y, [1,2,3,4,5,6], 0) #returns 21  
reduce(min, [4,2,3,8,6,1,1], 0) #returns 0  
reduce(lambda x,y: x + y[1], [('Feb',10),('Mar',15),('Apr',20)], 0)
```

will return the sum of second values in tuples

Why are higher order functions useful?

- Enable code re-use.
- Help write precise, clean, and readable code.

FUNCTIONS AS RETURN VALUES

Functions as Return Values

- Consider the following function:

```
1  def make_multiplier(n):
2      def multiplier(x):
3          return x * n
4      return multiplier
5
6
7  # Multiplier of 5
8  timesby5 = make_multiplier(5)
9
10 # Multiplier of 10
11 timesby10 = make_multiplier(10)
12
13 timesby5(9) # returns ?
14
15 timesby10(3) # returns ?
```

1. Is `make_multiplier` a higher order function?
2. What will the following evaluate to ?
 timesby5(9)
 timesby10(3)

Functions as Return Values

```
1  def make_multiplier(n):  
2      def multiplier(x):  
3          return x * n  
4      return multiplier  
5  
6  # Multiplier of 5  
7  timesby5 = make_multiplier(5)  
8  
9  timesby5(9) # returns ?
```

A function that
returns a function

A function defined in
another function

Can refer to names in
the enclosing function

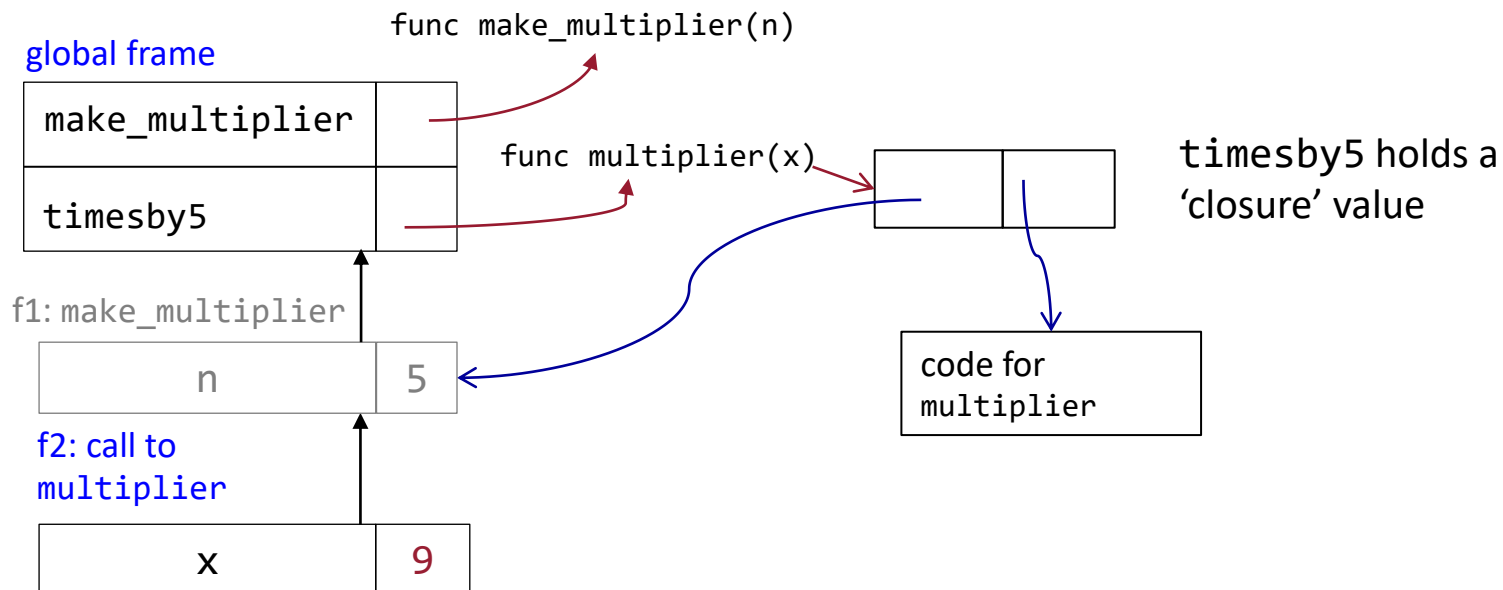
The name `timesby5`
is bound to a function

Python Tutor visualizer : <https://tinyurl.com/pythontutorlink>

Functions as Return Values

```
1 def make_multiplier(n):
2     def multiplier(x):
3         return x * n
4     return multiplier
5
6 # Multiplier of 5
7 timesby5 = make_multiplier(5)
8
9 timesby5(9) # returns ?
```

- A function value has two parts
 - the code (obviously)
 - environment that was current when the function was defined
- This pair is called a **function closure**



Questions?