## Data Science and Advanced Programming — Lecture 4 Python Fundamentals II

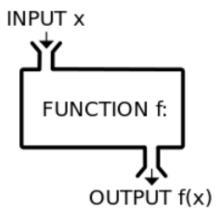
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October 6th, 2025 | 12:30 - 16:00 | Internef 263

## Roadmap

- 1. Functions
- 2. Lists, Tuples, Dictionaries
- 3. Recursions

#### 1. Functions



#### How we learned to code so far

#### ► Until now:

- ► We have covered language mechanisms.
- ► We know how to write different files for each computation.
- ▶ We consider each file to be some piece of code.
- We assume that each code is a sequence of instructions.

#### ► Problems with this approach:

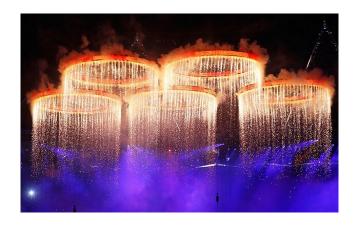
- ► It is easy for small-scale problems.
- ► However, it's messy for larger problems.
- ► It's hard to keep track of details.
- ► How do you know the right info is supplied to the right part of code?

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#### Good programming practice

- ► More code is not necessarily a good thing.
- ► Measure good programmers by the **amount of functionality** 
  - ightharpoonup ightharpoonup Introduce functions.
  - ► → Mechanism to achieve decomposition and abstraction.
  - ► → Recycling.

## Decomposition (generating a joint output)



#### **Functions**

- ▶ In programming, it is useful to divide the code into modules that
  - are self-contained
  - ▶ used to break up code
  - ▶ intended to be reusable
  - keep code organized
  - ► keep code **coherent**
- ► Today: in this lecture, achieve decomposition with functions
- ► Later: achieve decomposition also with classes

#### Functions $\rightarrow$ Abstractions

- ► In programming, think of a piece of code as a black box.
- ► do not (always) need to see details.
- ► do not (always) want to see details.
- hide tedious coding details.
  - → achieve abstraction with function specifications or docstrings.

#### The Purpose of Functions

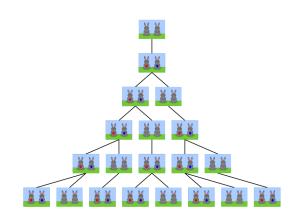
- ▶ write reusable pieces/chunks of code, called functions.
- ► functions are not run in a program until they are "called" or "invoked" in a program.
- ► function characteristics:
  - ▶ has a name
  - ► has parameters (0 or more)
  - ► has a **docstring** (optional but recommended → allows re-use)
  - ► has a body
  - returns something

#### Example: Fibonacci Sequence

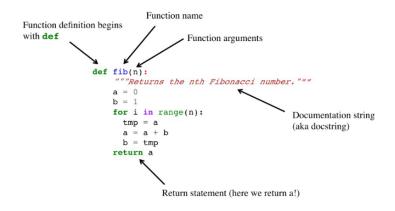
https://en.wikipedia.org/wiki/Fibonacci\_number

$$F_0 = 0, F_1 = 1,$$
  
 $F_n = F_{n-1} + F_{n-2},$   
for  $n > 1$ 

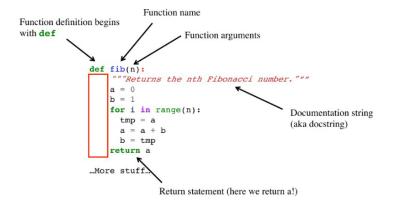
One has  $F_2 = 1$ 



#### Functions: Definition I



#### Functions: Definition II



## How to call Functions (from Terminal)

```
>>> import example_1
('fib(5) =', 5)
>>> example_1.fib(3)
2
```

#### How to call Functions

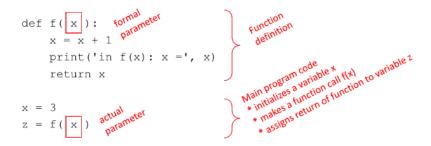
```
def fib(n):
    """Returns the nth Fibonacci number."""
    a = 0
    b = 1
   for i in range(n):
     tmp = a
     a = a + b
      b = tmp
    return a
print("function call from the original Function -- fib(7) =",fib(7))
print(fib(10))
print(fib(20))
```

#### How to call Functions from another File

```
#import the function to be present
 import example_1 as ex
 #call the function
 print("Function call from another code: fib(5) =", ex.fib(5))
                 In [1]: import example 1
                 ('function call from the original Function -- fib(5) =', 5)
                 [n [2]: help(example_1.fib)
                       Help on function fib in module example 1:
                       fib(n)
Or: import in Terminal
                          Returns the nth Fibonacci number.
and call help
                       (END)
```

#### Variable Scope

- ► **formal parameter** gets bound to the value of **actual parameter** when function is called
- ▶ new scope/frame/environment created when enter a function
- ► scope is mapping of names to objects



## Variable Scope II

See https://www.manning.com/books/get-programming

```
def f(x):
    x = x + 1
    print('in f(x): x =', x)
    return x
x = 3
z = f(x)
```





## Variable Scope III

See https://www.manning.com/books/get-programming

```
def f(x):
    x = x + 1
    print('in f(x): x =', x)
    return x

x = 3
z = f(x)
```

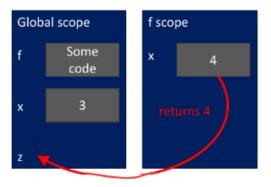




#### Variable Scope IV

See https://www.manning.com/books/get-programming

```
def f(x):
    x = x + 1
    print('in f(x): x =', x)
    return x
x = 3
z = f(x)
```



## Variable Scope V

```
def f(x):
    x = x + 1
    print('in f(x): x =', x)
    return x
x = 3
z = f(x)
```



# More Scope Examples — shows accessing variables outside scope

```
def f(y):
    x = 1
   x += 1
    print(x)
x = 5
f(x)
def g(y):
   print(x)
    print(x+1)
x = 5
g(x)
def h(y):
    pass
    #x += 1 #leads to an error without line `global x` inside h
x = 5
h(x)
```

## More on Scope

```
def g(x):
    def h():
        x = 'abc'
        print(x)
    x = x + 1
    print('in g(x): x =', x)
    h()
    return x
x = 3
z = g(x)
```

#### If still uncertain...

#### !!!Go to Python Tutor!!!

http://www.pythontutor.com/

#### More Notes on Functions

- ► Functions always have a return value
  - ► Without a return statement the value is simply None
- ► Functions are objects
  - ► Can be used like any other object (list of functions, ...)
- ► Function arguments are passed by **assignment** 
  - ► More precisely call by object reference
- ► No function overloading
  - ► Functions can't have the same name (even if the number of arguments differ)
- ► Operator overloading works, later...

#### Once more: NO return STATEMENT

```
def is_even_without_return( i ):
    """
    Input: i, a positive int
    Does not return anything
    """
    print('without return')
    remainder = i % 2

is_even_without_return(3)
```

- ▶ Python returns the value None, if no return given
- represents the absence of a value

#### Once more: NO return STATEMENT

```
def is_even_with_return( i ):
    """
    Input: i, a positive int
    Returns True if i is even, otherwise False
    """
    print('with return')
    remainder = i % 2
    return remainder == 0

is_even_with_return(3)
print(is_even_with_return(4) )
```

- ▶ Python returns the value None, if no return given
- represents the absence of a value

#### Recycling helps — short Code

```
# Simple is_even function definition
def is_even( i ):
    11 11 11
    Input: i, a positive int
    Returns True if i is even, otherwise False
    11 11 11
    remainder = i % 2
    return remainder == 0
# Use the is_even function later on in the code
print("All numbers between 0 and 20: even or not")
for i in range(20):
    if is_even(i):
        print(i, "even")
    else:
        print(i, "odd")
```

#### return vs print

#### return

- return only has meaning inside a function
- only one return executed inside a function
- code inside function but after return statement not executed
- ▶ has a value associated with it, given to function caller

#### print

- ▶ print can be used outside functions
- ► can execute many print statements inside a function
- code inside function can be executed after a print statement
- has a value associated with it, outputted to the console

#### Functions: arguments such as functions

demo/example\_4.py

```
def func_a():
    print('inside func_a')
def func_b(y):
    print('inside func_b')
    return y
def func_c(z):
    print('inside func_c')
    return z()
print(func_a())
print(5+func_b(2))
print(func_c(func_a))
```

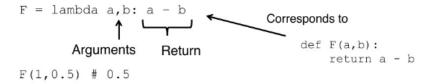
Arguments can take on any type, even functions

#### Functions: lambda expressions

- ► Small anonymous functions can be created with the lambda keyword
- ► Example:

```
def apply(func,x):
    return func(x)
apply(lambda z: z ** 2)
```

Convenient to define small functions



#### Lambda Expressions

```
def apply(func,x):
    return func(x)

x = apply(lambda z: z**2,2.)
print(x)
```

#### Recall: Coding

#### Some very important conventions/rules:

- ► Use **4-space** indentation
- ► Wrap lines so that they don't exceed 79 characters
- Use blank lines to separate functions and classes, and larger blocks code inside functions
- ► Use docstrings: documentation
- No fancy encodings, even in comments!
- ► PEP8: https://www.python.org/dev/peps/pep-0008/
- ► Read it carefully...

#### 2. Lists, Tuples, Dictionaries



#### Compound data types

- ► So far, we have seen variable types: int, float, bool, string.
- We want now to introduce new compound data types (data types that are made up of other data types)
  - ► Tuples (similar to strings sequences of something)
  - ► Lists (similar to strings sequences of something)
- idea of aliasing
- ▶ idea of mutability
- ▶ idea of cloning

#### Mutable vs. Immutable types

#### ► Mutable types

- ► Can change their contents / members
- ► lists, dicts, user-defined types

#### ► Immutable types

- ► Cannot change their contents / members
- ▶ most built-in types (int, float, bool, str, tuple)

#### Lists

- ► Is an ordered sequence of information, accessible by index
- ► a list is denoted by **square brackets**, []
- ▶ a list contains elements
- ► usually homogeneous (i.e., all integers)
- ► can contain mixed types (not common)
- ▶ list elements can be changed → list is mutable

### How to Use Lists

demo/example\_9.py

```
# list is built-in
x = [0, 1, 2, 3, 3]
x[2] == 2 # access via [] index operator
x.insert(0, 5) # index, value
\# x == [5, 0, 1, 2, 3, 3]
# remove by index - returns value
x.pop(0) # returns 5
\# x == [0, 1, 2, 3, 3]
x = [0, 1, 2, 'three'] # can contain arbitrary types!
# access from the back with negative indices
x[-2] == 2
```

### More on Lists

```
# adding lists concatenates them
x += [4, 5, 6] # x == [0, 1, 2, 'three', 4, 5, 6]

# slicing [start:end + 1]
x[1:4] == [1, 2, 'three']

# slicing with a stride [start:end + 1:step]
x[0:7:2] == x[::2] == [0, 2, 4, 6]

# reverse slicing
x[-1:0:-2] == [6, 4, 2]
x[::-2] == [6, 4, 2, 0]
```

### Add Elements to a List

- ► add elements to end of list with L.append(element)
- mutates the list!

```
>>> L = [2, 1, 3]
>>> L.append(5)
>>> L
[2, 1, 3, 5]
```

- ▶ what is the dot?
  - ► lists are Python objects, everything in Python is an object
  - objects have data
  - objects have methods and functions

```
access this information by object_name.do_something()
```

▶ will learn more about these later very soon!

### Add Two or More Lists

demo/example\_15a.py

- to combine lists together use concatenation, + operator, to give you a new list
- mutate list with L.extend(some\_list)

```
L1 = [2,1,3]

L2 = [4,5,6]

L3 = L1 + L2  # L3 is [2,1,3,4,5,6], L1, L2 unchanged

L1.extend([0,6])  # mutated L1 to [2,1,3,0,6]
```

### Remove Elements from a List

demo/example\_15.py

- ▶ delete element at a specific index with del(L[index])
- ► remove a specific element with L.remove(element)
- ▶ looks for the element and removes it
- ▶ if element occurs multiple times, removes first occurrence
- ▶ if element not in list, gives an error

```
L = [2,1,3,6,3,7,0] # do below in order

L.remove(2) # mutates L = [1,3,6,3,7,0]

L.remove(3) # mutates L = [1,6,3,7,0]

del(L[1]) # mutates L = [1,3,7,0]
```

## Lists in the Memory

- ► Recall: lists are mutable
- ► They behave differently than immutable types
- ► is an object in memory
- variable name points to object
- ► any variable pointing to that object is affected

## How to Change Elements in a List

- ► Recall that lists are mutable!
- ► Assigning to an element at an index changes the value:

$$L = [2, 1, 3]$$
  
 $L[1] = 5$ 

► L is now [2,5,3], note this is the same object L

### Iterating over a List

- ► compute the sum of elements of a list
- ► common pattern, iterate over list elements

```
total = 0
for i in range(len(L)):
    total+=L[i]
    print(total)
```

```
total = 0
for i in L:
    total+=i
    print(total)
```

- ▶ Please note:
  - ightharpoonup dist elements are indexed 0 to len (L) 1
  - ightharpoonup ightharpoonup range(n) goes from 0 to n-1

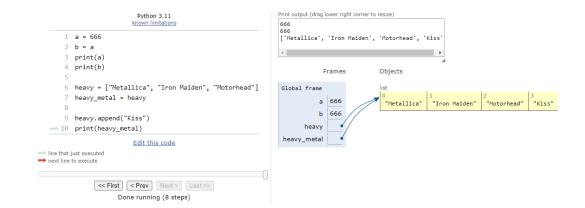
### Iterate over Lists

demo/example\_14.py

```
def sum_elem_method1(L):
  total = 0
  for i in range(len(L)):
      total += L[i]
  return total
def sum_elem_method2(L):
    total = 0
    for i in L:
       total += i
    return total
print(sum_elem_method1([1,2,3,4,5,6,7]))
print(sum_elem_method2([1,2,3,4]))
```

## http://www.pythontutor.com/

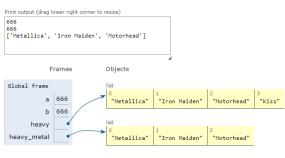
demo/example\_16.py



## Cloning a List

demo/example\_16.py





## Cast Strings to Lists

demo/example\_17.py

```
s = "I<3 cs"
print(list(s))
print(s.split('<'))
L = ['a', 'b', 'c']
print(''.join(L))
print('_'.join(L))</pre>
```

### Sort Lists

demo/example\_18.py

L=[9,6,0,3] print(sorted(L))

### More on Assignments

demo/example8.py

#### Be careful!

```
x = [0,1,2]
y = x
y[2] = 666
print(x) # [0, 1, 666]
print(y) # [0, 1, 666]
import copy
                           Copy module for clean copies!
x = [0, 1, 2]
y = copy.copy(x)
y[2] = 666
print(x) # [0, 1, 2]
print(y) # [0, 1, 666]
x = [0,1,[2,3]]
y = copy.copy(x)
                           Shallow copy
v[2][0] = 666
print(x) # [0, 1, [666, 3]]
print(y) # 10, 1, 1666, 311
x = [0,1,[2,3]]
y = copy.deepcopy(x)
                           Deep copy (usually what you want!)
v[2][0] = 666
print(x) # [0, 1, 12 , 311
print(y) # [0, 1, [666, 3]]
```

## Passing Function Arguments — no return in function

▶ Consider

```
def incr(x):
    x += 1

x = 0
incr(x)
print(x)
```

▶ and

```
def incr_first(x):
    x[0] += 1
x = [0, 1, 2]
incr_first(x)
print(x)
```

- ▶ 0 looks like pass by copy
- ► [1,1,2] looks like pass by reference

## Passing Function Arguments — no return in function

▶ Consider

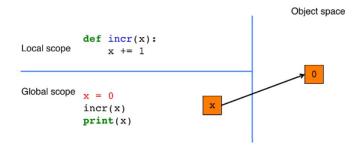
```
def incr(x):
    x += 1
x = 0
incr(x)
print(x)
```

▶ and

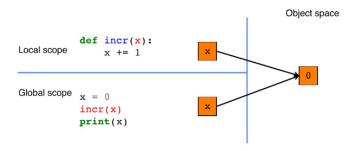
```
def incr_first(x):
    x[0] += 1
x = [0, 1, 2]
incr_first(x)
print(x)
```

- ▶ 0 looks like pass by copy
- ► [1,1,2] looks like pass by reference

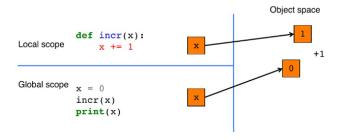
- ► Variables are just names (labels)
- ▶ Names "bind" to an object when assigned to
- ► Assignment does not copy data



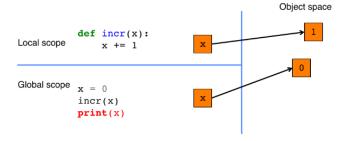
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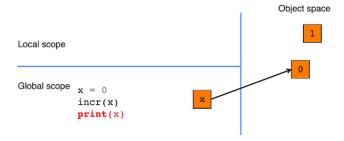
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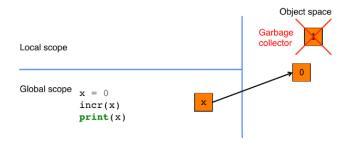
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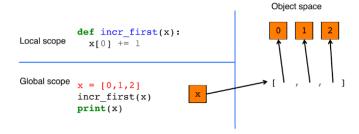
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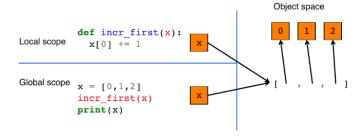
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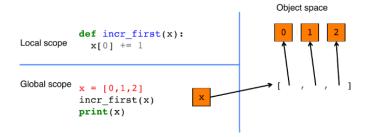
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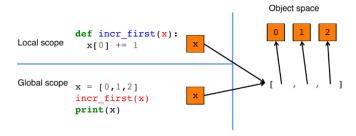
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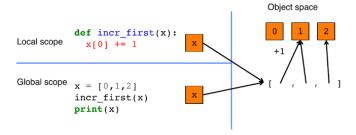
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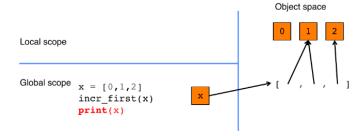
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# Passing function arguments: pass by assignment — the code

demo/example\_7.py

```
def incr(x):
    x += 1
x = 0
incr(x)
print(x)
def incr_first(x):
    x[0] += 1
x = [0,1,2]
incr_first(x)
print(x)
```

## More Built-in types: Tuples

- ► Tuples are more or less like a list but cannot be changed (i.e., are immutable)
- ► Use parentheses instead of brackets
- ► Support similar operations as lists

### **Tuples**

demo/example\_10.py

Tuples are an ordered sequence of elements, can mix element types

```
# empty tuple
te = ()

t = (2,"HEC",3)
print(t[0])  #evaluates to 2

a=(2,"HEC",3) + (5,6) # evaluates to (2,"HEC",3,5,6)
b = t[1:2]  # slice tuple, evaluates to ("HEC",)
#Note: the extra comma means a tuple with 1 element
c = t[1:3]  #slice tuple, evaluates to ("HEC",3)
print(len(t)) #evaluates to 3
t[1] = 4  #gives an error, cannot modify object
```

## Potential usage of Tuples

```
demo/example_11.py
```

Conveniently used to swap more variables (first examples does not work, the second works):

```
temp = x \\ x = y \\ y = temp
```

```
(y, x) = (x, y)
```

Used to return more than one value from a function:

```
def quotient_and_remainder(x, y):
    q = x // y #integer division
    r = x % y
    return (q, r)
(quot, rem) = quotient_and_remainder(7,6)
```

## Iterate over Tuples

demo/example\_13.py

```
>>> x = [(1,2), (3,4), (5,6)]
>>> for item in x:
... print "A tuple", item
A tuple (1, 2)
A tuple (3, 4)
A tuple (5, 6)
>>> for a, b in x:
... print "First", a, "then", b
First 1 then 2
First 3 then 4
First 5 then 6
```

## More Built-in types: Dictionaries

► If we want to manage a data collection of students, we can store information so far e.g., using separate lists for every info:

```
names = ['Tom', 'Keith', 'Marry', 'Megan']
grade = [6.0, ' 4.5,5.2,4.9]
course = ['Programming', 'Physics', 'Econometrics', 'Economics']
```

- ► A separate list for each item
- ► Each list must have the same length
- ► info stored across lists at same index, each index refers to info for a different person

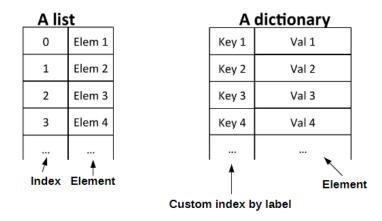
## Multiple Lists

```
def get_grade(student, name_list, grade_list, course_list):
    i = name_list.index(student)
    grade = grade_list[i]
    course = course_list[i]
    return (course, grade)
```

- ▶ Messy if have a lot of different info to keep track of
- ► Must maintain many lists and pass them as arguments
- Must always index using integers
- Must remember to change multiple lists

## Basic functionality of Dictionaries

- ► Nice to index item of interest directly (not always int)
- ► Nice to use one data structure, no separate lists



# A Dictionary in practice

- ► Store pairs of data
  - ► Key
  - ► Value
- ▶ similar to indexing into a list, looks up the key 'Keith'
- ► returns the value associated with Keith
- ▶ If key isn't found, you get an error

# Some operations on Dictionaries

demo/example\_24.py

- ► Add an entry
  - ► grades['Freddy'] = 4.9
- ► Test if key in dictionary
  - ightharpoonup 'Tom' in grades ightharpoonup returns True
  - ightharpoonup 'Daniel' in grades ightarrow returns False
- **▶ Delete** an entry
  - ► del (grade ['Mary'])

# Some operations on Dictionaries

demo/example\_24.py

- ► Get an iterable that acts like a tuple of all keys
- ▶ grades.keys()  $\rightarrow$  returns ['Mickey', 'Keith', 'Megan', 'Tom']
- ► Get an iterable that acts like a tuple of all values
- ightharpoonup grades.values()  $\rightarrow$  returns [5.0, 4.5, 4.9, 6.0]
- ► Order is not guaranteed

## Dict — example

demo/example\_19.py

```
x = dict(a=1, b=2, c='three')
x = {'a': 1, 'b': 2, 'c': 'three'}
# access via [7
x['a'] == 1
# creating new entries
# any hashable type can be a key
x[1] = 4
# accessing keys, values or both
# order is not preserved
x.keys() # ['a', 'c', 1, 'b']
x.values() # [1, 'three', 4, 2]
x.items() # [('a', 1), (c, 'three'), (1, 4), ('b', 2)]
```

# Dictionary keys and values

demo/example\_24.py

#### Values

- ► Any type (immutable and mutable)
- ► Can be duplicates
- ▶ Dictionary values can be lists, even other dictionaries!

### ► Keys

- ► Must be unique
- ▶ Immutable type (int, float, string, tuple, bool)
- actually need an object that is hash-table, but think of as immutable as all immutable types are hash-table
- ► Be careful with float type as a key
- no order to keys or values!

```
d={4:{1: 0},(1,3): "twelve", 'const':[3.14,2.7,8.44]}
```

### list versus dict

#### list

- ► ordered sequence of elements
- ► look up elements by an integer index
- ▶ indices have an order
- ▶ index is an integer

#### dict

- ► matches "keys" to "values"
- ▶ look up one item by another item
- ▶ no order is guaranteed
- ► key can be any **immutable** type

### Dictionaries — summary

```
x = dict(a=1, b=2, c='three')
x = {'a': 1, 'b': 2, 'c': 'three'}
# access via []
x['a'] == 1
# creating new entries
# any hashable type can be a key
x[1] = 4
# accessing keys, values or both
# order is not preserved
x.keys() # ['a', 'c', 1, 'b']
x.values() # [1, 'three', 4, 2]
x.items() # [('a', 1), (c, 'three'), (1, 4), ('b', 2)]
```

# 3. Recursion



### Recursion

- ► Algorithmically: a way to design solutions to problems by divide-and-conquer or decrease-and-conquer
  - ► Reduce a problem to simpler versions of the same problem.
- ► Semantically: a programming technique where a function calls itself
  - ► In programming, the goal is to NOT have infinite recursion
    - ► Must have 1 or more base cases that are easy to solve
    - Must solve the same problem on some other input with the goal of simplifying the larger problem input.

# Iterative algorithms (for loops)

demo/example\_20.py

- ► Looping constructs (while and for loops) lead to iterative algorithms.
- ► Can capture computation in a set of state variables that update on each iteration through loop.

```
def mult_a(a, b):
    result = 0
    while b > 0:
        result += a
        b -= 1
    return result

print(mult_a(2,10))
```

"multiply a\*b" is equivalent to "add a to itself b times"

$$\rightarrow a + a + a + a + \dots + a$$

# The alternative — a recursive way

#### demo/example\_21.py

demo/example\_22.py

The recursive step: Think how to reduce the problem to a simpler/smaller version of same problem

- Base case
- Keep reducing the problem until we reach a simple case that can be solved directly
- $\blacktriangleright$  when b = 1, a \* b = a

```
def factorial(n):
    if n == 1:
        return 1
    else:
        return n*factorial(n-1)
print(factorial(10))
```

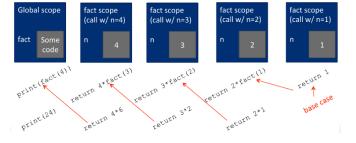
```
a*b=a+a+a+a+\ldots+a (n times)a
= a+a+a+a+\ldots+a (1+ n-1 times)a
= a+a*(b-1) recursive reduction
```

```
def mult_iter(a, b):
    if b == 1:
        return a
    else:
        return a + mult_iter(a, b-1)
print mult_iter(1,10)
```

## What's going on in factorial?

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

print(fact(4))
```



### Iteration versus Recursion

```
def factorial_iter(n) :
    prod = 1
    for i in range(1, n+1):
        prod *= i
    return prod
```

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

- ► recursion may be simpler, more intuitive
- ► recursion may be efficient from programmer's point of view
- ► recursion may not be efficient from a computer point of view

# A famous Example: The Fibonacci sequence

- ▶ Leonardo of Pisa (aka Fibonacci) modeled the following challenge.
- ▶ Newborn pairs of rabbits (one female, one male) are put in a pen.
- ► Rabbits mate at the age of one month.
- Rabbits have a one-month gestation period.
- Assume rabbits never die, and that female always produces one new pair (one male, one female) every month from its second month on.
- ► → How many female rabbits are there at the end of one year?

# Fibonacci Sequence — the code

https://en.wikipedia.org/wiki/Fibonacci\_number

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

$$F_n = \begin{cases} 0 & \text{if } n = 0 \\ 1 & \text{if } n = 1 \\ F_{n-1} + F_{n-2} & \text{if } n > 1 \end{cases}$$

```
startNumber = int(input("Enter the start number here "))
endNumber = int(input("Enter the end number here "))
```

# Questions?

