

DS-GA 1007 | Lecture 1

Programming for Data Science

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Week 1

1. Course Information
2. Introduction to Programming in Python

Course Information

DS-GA 1007 Instructional Team

Instructor:

- ▶ Dr. Jeremy Curuksu, jeremy.cur@nyu.edu

Section Leaders and Graders:

- ▶ Jiayue (Hailey) He, jh8530@nyu.edu
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- ▶ Anudeep Tubati, at5373@nyu.edu

DS-GA 1007 Schedule

DS-GA 1007.001 Lecture:

- ▶ Mondays from 6:45pm-8:30pm EST
- ▶ Location: 12 Waverly Place, Room Go8

DS-GA 1007.002 Lab:

- ▶ Wednesdays from 7:10pm-8:00pm EST
- ▶ Location: 19 University Place, Room 102

DS-GA 1007 Curriculum

Programming for Data Science:

- ▶ Introduction to Programming in Python
- ▶ Best Practice Programming and Software Engineering
- ▶ Program Efficiency
- ▶ Interacting with Programs
- ▶ NumPy: Array Manipulation for Scientific Computing
- ▶ Matplotlib: Data Visualization
- ▶ Pandas: Advanced Data Objects ($\times 4$)
- ▶ Git: Environment for Collaborative Programming
- ▶ Industrial Applications

DS-GA 1007 Resources

- ▶ **Lecture and lab practice code + lecture slides**
- ▶ **Python Data Science Handbook** (2017) by Jake VanderPlas
- ▶ ***The Carpentries* intro labs on Python, Linux and Git**
(software-carpentry.org/lessons/index.html)
- ▶ Python for Data Science (2022) by Yuli Vasiliev
- ▶ The Linux Command Line (2019) by William Shotts
- ▶ Python packages used in this course have online concise high-quality doc: NumPy, Pandas, Matplotlib

Advices to Succeed in this Course

- ▶ **Attend both lectures and labs.** Lectures and labs complement each other to set you up for success
- ▶ **Practice, practice, practice.** Programming is a skillset, everyone has a unique approach, find your own!
- ▶ **Before writing a program,** define its goal and data flows
- ▶ **Break up problems into sub-problems.** Break your program up into modules that can be tested individually
- ▶ **Document your programs.** We all forget important details
- ▶ **Ask questions!**

Introduction to Programming in Python

Introduction to Programming in Python

Today topics:

- ▶ What is Programming?
- ▶ Why Programming in Data Science?
- ▶ Primitive Data Types
- ▶ Control Flow
- ▶ Compound Data Types: Tuples, Lists, Dictionaries, ...
- ▶ Manipulating Compound Data Types
- ▶ Reading/Writing Files and Examples

What is Programming?

What do Computers do?

What do Computers do?

- ▶ **Perform calculations**
 - ▶ Fixed program computers
 - ▶ Stored program computers

What do Computers do?

- ▶ **Perform calculations**

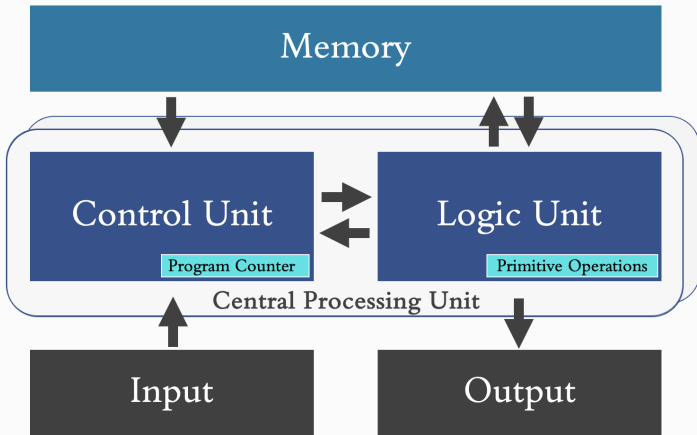
- ▶ Fixed program computers
- ▶ Stored program computers

- ▶ **Store knowledge**

- ▶ Declarative knowledge (statements of facts)
- ▶ Imperative knowledge (programs)

What do Computers do?

Architecture of *stored program* computers



What is a Program?

- ▶ **Represent knowledge with data structures:**

1. Primitive data types
2. Compound data types

- ▶ **Encode an algorithm:**

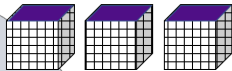
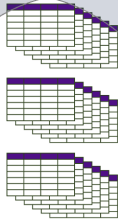
1. Instructions = Sequence of simple steps (commands)
2. Flow of control = Specifies when each step executed
3. Termination condition = Determine when to stop

Why Programming for Data Science?

Feature Engineering



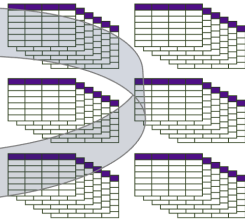
Data Manipulation



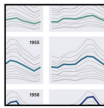
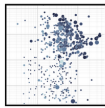
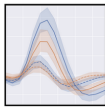
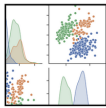
Model Learning

$$h_{\theta}(X) \mapsto Y$$

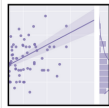
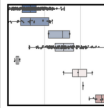
Scientific Computing



Data Analysis



Data Visualization



Creating a Program

- ▶ **All instructions in a program are built from a set of primitive instructions**
 - ▶ Arithmetic and logic operations
 - ▶ Tests to change flow of control
 - ▶ Data transfers
- ▶ **A programming language offers a set of primitives**

Anything computable in one language is computable in any other programming language
- ▶ **A special program '*interpreter*' executes instructions**

Creating a Program *in Python*

- ▶ **Data structure definition:** Evaluated by interpreter
- ▶ **Command:** Instruct the interpreter to do something
- ▶ **Data & commands can be typed interactively** into a console, or stored to file to be read later in batch
- ▶ Example:

```
# Define the data
data = "DS-GA 1007"
# Print the data
print("Welcome to " + data)
```

Syntax and Semantics of Languages

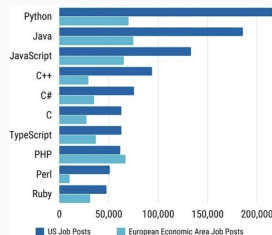
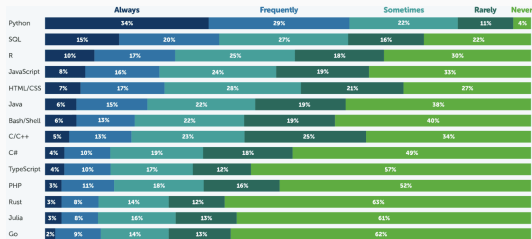
	In English (Natural Language)	In Python (Programming Language)
Primitives	Words	Numbers, Strings, Operators
Syntax	<i>Valid:</i> She likes running <i>Invalid:</i> She running likes	<i>Valid:</i> $5 + 10$ <i>Invalid:</i> $5 = 10$
Static-Semantics	<i>Valid:</i> I like pizzas <i>Invalid:</i> Pizzas like me	<i>Valid:</i> <code>"hi " + "5"</code> <i>Invalid:</i> <code>"hi " + 5</code>
Semantics	He likes her	$x = -9 \times x + 50$

Syntax and Semantics of Languages

- ▶ **Syntax errors:** Common and easily caught by editor and interpreter
- ▶ **Static Semantic errors:** Often but not always caught by the interpreter, can cause unpredictable behavior
- ▶ **Semantic errors:** Frequent source of problem: program crashes, runs forever, or gives an answer but different than expected

Primitive Data Types in Python

Why Python?

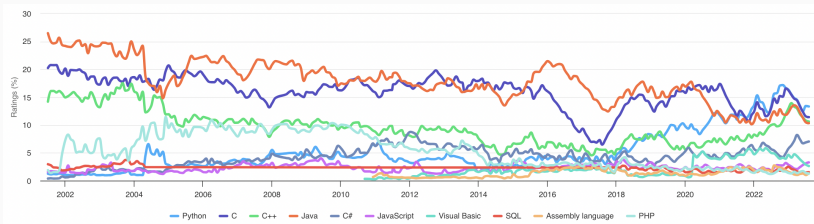


Poll on 4,200 data scientists from 140 countries

Source (2021): anaconda.com

Language shown on LinkedIn postings

Source (2022): codingnomads.co



TIobe popularity index. Source (2023): tiobe.com

Python Primitive Data Types

- ▶ Programs manipulate data **objects**
- ▶ An object has a **type**: defines what the program can do to it

Primitive Python Objects

Int	Integer Numbers	Ex: 1, 2, 3...
Float	Real Numbers	Ex: 3.14
String	Text Contents	Ex: "Hello World!"
Bool	Boolean Values	<i>True , False</i>
NoneType	Special Type	<i>None</i>

Expressions and Operators

- ▶ **Expressions:** Combinations of objects and **operators**. An expression has a value. A value has a type...
- ▶ *"Everything in Python is an object"*

Primitive Python Operators

Arithmetic		Comparison		Boolean	
=	Assignment	==	Equality	not	Negation
+	Sum	!=	Inequality	and	Conjunction
-	Difference	>	More than	or	Disjunction
*	Product	>=	More or Equal		(inclusive)
/	Division	<	Less than		
%	Remainder	<=	Less or Equal		
**	Power				

Variables and Assignments

- ▶ An **assignment** binds a value to a **variable** name:

```
pi = 3.14
```

- ▶ The value is then **stored in memory**. It can be retrieved by invoking the variable name:

```
print(pi)
```

- ▶ A subsequent assignment **re-binds** the variable to a new value:

```
pi = 3.14159
```

- ▶ A variable can be re-bound to expressions operating on itself:

```
r = 10  
area = pi * (r**2)  
ncircles = 5  
area = area * ncircles
```

Variables and Assignments

- **Abstraction of Expressions:** A variable name assigned to the value of an expression can be used instead of the value itself to write an algorithm *as a function of* input parameters
-

```
import sys
from sklearn.metrics import confusion_matrix
actuals, predictions = sys.argv[1]
m = confusion_matrix(actuals, predictions)
TP = m[1,1]
FN = m[1,0]
TP = TP / (TP + FN) # Proportion
TP = int(TP * 100) # Percentage
print("The recall is {}".format(TP))
```

Control Flow in Python

Control Flow: Branching, Iteration

► Evaluate a block of code if a condition is True.

<condition> evaluates to a Boolean (True or False)

Branching

```
if <condition>:  
    <expressions>
```

```
if <condition>:  
    ...  
elif <condition>:  
    ...  
else:  
    ...
```

Iteration

```
while <condition>:  
    <expressions>
```

Evaluation repeats until the condition becomes False

```
for <variable> in <>:  
    ...
```

Evaluation repeats for each value taken by the variable

Control Flow: Example of Branching

► Indentation defines blocks of code in Python

```
if y > 0 and x > 0:
    print("x and y are positive numbers")
if x == y:
    print("x and y are equal")
elif x < y:
    print("x is smaller than y")
else:
    print("x is larger than y")

print("What else do you want to know?")
```

Control Flow: Example of Iteration

- Execute block of code until condition is false

```
while x != y:
    if x < y:
        x = x + 1
    else:
        x = x - 1
print("Now x and y are equal")
```

Control Flow: Example of Iteration

- Execute block of code until condition is false

```
while x != y:
    if x < y:
        x = x + 1
    else:
        x = x - 1
print("Now x and y are equal")    ...or are they?
```


Control Flow: Example of Iteration

- ▶ Iterate through a preset sequence of objects

- ▶ With a **While** loop

```
n = 0
while n < 10:
    print(n)
    n = n + 1
```

- ▶ Shortcut: The **For** loop

```
for n in range(10):
    print(n)
```

Creating loops with *range*

- ▶ **Create an iterable with *range* (start, stop, step)**

- ▶ Loop until value is *stop* - 1
- ▶ start and step are optional
- ▶ Default values are *start* = 0 and *step* = 1

```
for n in range(10):  
    <expressions>
```

```
for n in range(5, 10):  
    <expressions>
```

```
for n in range(5, 10, 2):  
    <expressions>
```

Breaking loops with *break*

- ▶ Exit a loop immediately with **break**

- ▶ Skips remaining expressions in code block
- ▶ Exits only the current "innermost" loop

```
while x != y:
    if x < y:
        x = x + 1
    else:
        x = x - 1
    if abs(x - y) < 1:
        break
print("Now x and y are equal")
```

Compound Data Types

Compound Data Types: Tuples

- ▶ **Tuple** = Ordered sequence of information accessible by index
- ▶ Types of elements can be mixed
- ▶ A tuple is **immutable**: Values cannot be changed
- ▶ A tuple is represented with **parentheses**

```
t = ()           # Create an empty tuple
t = ("NYU",1,2,3) # Create tuple of four elements
len(t)          # Evaluates to 4 (number of elements)
t[0]             # Evaluates to "NYU"
t[1:3]          # Slice tuple, evaluates to (1,2)
t[1] = 4        # Syntax error
```

Compound Data Types: Lists

- ▶ **List** = Ordered sequence of information accessible by index
- ▶ Types of elements can be mixed
- ▶ A list is **mutable**: Values can be changed
- ▶ A list is represented with **square brackets**

```
l = []           # Create an empty list
l = ["NYU",1,2,3] # Create list of four elements
len(l)          # Evaluates to 4 (number of elements)
l[0]             # Evaluates to "NYU"
l[1:3]           # Slice list, evaluates to [1,2]
l[1] = 4         # l is now ["NYU",4,2,3]
```

Compound Data Types: Dictionaries

- ▶ **A Dictionary** stores information accessible by keys
- ▶ **Keys & values are custom data**, not ordered, type can be mixed
- ▶ **Values** can be duplicate and of any type
- ▶ **Keys** must be unique and of immutable type
- ▶ A dictionary is represented with **curly braces**

```
d = {}                                # Create an empty dictionary
rates = {'Movie 1': 'A+', 'Movie 2': 'B', 'Song 1': 10}
rates['Movie 1']    # Evaluates to 'A+'
rates['Song 2']     # Key Error
rates['B']          # Key Error
rates['Movie 2'] = 'A+'
```

Tuple and List vs. Dictionary

Tuples and Lists

- ▶ Sequence of elements
- ▶ Look up elements by an index
- ▶ Indices have an intrinsic order
- ▶ The index is an integer

Dictionaries

- ▶ Pairs of values and keys
- ▶ Look up items (values) by other items (keys)
- ▶ Keys and values are not ordered
- ▶ The key can be any immutable type

Array and Data Frame

Arrays

Lecture 5: Array Manipulation and Scientific Computing

- ▶ Fixed-typed elements
- ▶ Look up elements by integer indexing
- ▶ Scale to large dense multidimensional data
- ▶ Fast vectorized operations

Data Frames

Lectures 7 to 10: Advanced Data Objects

- ▶ Multidimensional array with heterogeneous column types
- ▶ Missing data (NaNs)
- ▶ Labels attached to rows and columns

Manipulating Compound Data Types

Manipulating *Objects* in Python

Objects have "methods"

- ▶ **Everything in Python is an object:** Lists are objects, Strings are objects, Dictionaries are objects, Arrays are objects, ...
- ▶ Objects have data and methods (covered in Lecture 2)
- ▶ Methods are invoked by the dot notation: *object.method()*

- ▶ Examples:

```
l.append(x)           # Mutates list l by appending x
l.extend([x,y])       # Extends list l with x and y
l.pop()               # Deletes last element of list l
```

- ▶ Other functions also apply to an object depending on its type
- ▶ Examples:

```
len(l)                # Returns number of elements in list l
del(l[0])              # Deletes first element of list l
```

Operations on Strings

A string is a special type of tuple

► Appending characters and concatenating strings

```
request = "Give me a"  
goal = "Hi" + "5"  
question = request + " " + goal
```

► Indexing characters: Starts at 0. Last element is at index -1

```
s = "abcd"  
len(s)           # Evaluates to 4 (number of characters)  
s[0]             # Evaluates to "a"  
s[-1]            # Evaluates to "d"  
s[-4]            # Evaluates to "a"  
s[1:4]           # Slice string, evaluates to "bcd"  
s[1] = "e"       # Syntax error
```

Operations on Strings

Slicing

- ▶ A string can be **sliced** using [start:stop:step]
- ▶ Giving only two numbers means [start:stop]
- ▶ Default step = 1
- ▶ Fine control possible by keeping colons and omitting numbers

```
s = "abcde"
s[1:4]      # Evaluates to "bcd"
s[0:5:2]    # Evaluates to "ace"
s[5:1:-2]   # Evaluates to "ec"
s[:]        # Same as s[0:len(s):1]
s[::-1]     # Same as s[-1:-(len(s)+1):-1]
```

Operations on String

A string can be converted into a list

- ▶ **list(s)** returns a list where every character is an element

```
list("abcde")      # Returns ["a", "b", "c", "d", "e"]
```

- ▶ **s.split()** splits a string s on a character parameter. It splits on spaces if called without a parameter

```
l="Cook or Paint".split(" or ") # Returns ["Cook", "Paint"]  
l.append("Dance") # Operate on list (covered next slide)
```

- ▶ **Lists can be converted back to strings**

s.join(l) turns a list l into a string of characters. Characters in s are added between elements of the list, but s can be empty

```
" or ".join(l)  # Returns "Cook or Paint or Dance"
```

Operations on Lists

Lists are mutable and can be nested

► Appending elements and concatenating lists

```
l = ["Cook", "Paint"]; p = ["Run", "Swim"]
lp = l + p           # lp: ["Cook", "Paint", "Run", "Swim"]
p.append("Dance")    # p: ["Run", "Swim", "Dance"]
p.extend(l)          # p: ["Run", "Swim", "Dance", "Cook", "Paint"]
```

► Indexing and slicing

```
l[0] = "UberEat"    # l mutated: ["UberEat", "Paint"]
lp[1:4]              # ["Paint", "Run", "Swim"]
lp[::-1]             # ["Swim", "Run", "Paint", "Cook"]
l.append(p[:2])      # l: ["UberEat", "Paint", ["Run", "Swim"]]
l[2]                 # ["Run", "Swim"]
p[1] = "tv"          # l: ["UberEat", "Paint", ["Run", "tv"]]
```

Operations on Lists

Aliasing

- **Aliasing lists** (=) side effect: changing one changes the other!

```
warm = ["red", "yellow", "orange"]
```

```
hot = warm
```

```
hot.append("pink")
```

```
print(hot)
```

Output: ["red", "yellow", "orange", "pink"]

```
print(warm)
```

Output: ["red", "yellow", "orange", "pink"]

Operations on Lists

Cloning

- **Cloning lists** creates a new list and copies every element

```
warm = ["red", "yellow", "orange"]
```

```
hot = warm[:]
```

```
hot.append("pink")
```

```
print(hot)
```

Output: ["red", "yellow", "orange", "pink"]

```
print(warm)
```

Output: ["red", "yellow", "orange"]

Operations on Lists

Sorting lists

- ▶ **sorted** does not mutate list, must assign to variable

```
warm = ["red", "yellow", "orange"]  
sortedwarm = sorted(warm)
```

```
print(warm)
```

Output: ["red", "yellow", "orange"]

```
print(sortedwarm)
```

Output: ["orange", "red", "yellow"]

- ▶ **sort()** mutates the list, returns nothing

```
sortedwarm = warm.sort()
```

```
print(warm)
```

Output: ["orange", "red", "yellow"]

```
print(sortedwarm)
```

Output: None

Operations on Dictionaries

Dictionaries are mutable and can be nested

► Adding, testing and deleting entries

```
rates = {'Movie 1': 'A', 'Movie 2': 'B'}  
rates['Movie 3'] = 'A' # Add new entry, key must be unique  
'Movie 3' in rates    # Returns True  
'Movie 4' in rates    # Returns False  
len(rates)            # Returns 3 (number of entries)  
del(rates['Movie 3']) # {'Movie 1': 'A', 'Movie 2': 'B'}
```

► Extracting Keys and Values

```
rates.keys() # Returns iterable ('Movie 1', 'Movie 2')  
rates.values() # Returns iterable ('A', 'B')  
rates.items() # Returns (('Movie 1', 'A'), ('Movie 2', 'B'))
```

Iterating over string, list, dictionary

The Pythonic way...

► Strings

```
s = 'abcde'
for i in s:    # for i in range(len(s)):
    print(i)  #    print(s(i))
```

► Lists

```
l = [1,2,3,4,5]
for i in l:    # for i in range(len(l)):
    print(i)  #    print(l(i))
```

► Dictionaries

```
d = {1:'a',2:'b',3:'c',4:'b',5:'a'}
for k in d.keys():
    print(d[k])
```

Example with string, list, dictionary

Find frequency of each word in a song:

```
lyrics = "I heard there was ... Hallelujah".split()
d = {}
for word in lyrics:
    if word in d:
        d[word] += 1
    else:
        d[word] = 1

print(d['Hallelujah'])
```

Example with string, list, dictionary

Find frequency of each word in a song:

```
lyrics = "I heard there was ... Hallelujah".split()
d = {}
for word in lyrics:
    if word in d:
        d[word] += 1
    else:
        d[word] = 1

print(d['Hallelujah'])
```

Output: 25

Read Input

- ▶ **Prompt user for input.** Binds entry to variable

```
song = input("Write a song")
```

```
word = input("Type a word")
```

Read Input and Print Output

► Open file, read file, print to file

```
infile = open("input.dat", "r")
outfile = open("output.dat", "w")

lines = infile.readlines()
print(lines[-1]) # Print last line of input file

print("Occurrences of Hallelujah:", file=outfile)

for line in infile:
    if("Hallelujah" in line): outfile.write(line)
```


Read Input and Print Output

► Read dictionary input files

```
import json  
dictcontents = json.load(open('dictfile.json'))
```

► Format string output

```
s = input("Type a sentence: ")  
l = s.split()  
n = len(l)  
print('Count{0:>8}\n First{1:>8}'.format(n,l[0]))
```

Execute and Interface with Program

► Demo this code:

```
song = open("lyrics.txt", "r")
word = input("Type a word: ")
d = {word: 0}
for line in song:
    if word in line:
        d[word] += 1
print('The word {} appears {} times in this song'
      .format(word, d[word]))
```

Execute and Interface with Program

► Demo this code:

```
song = open("lyrics.txt", "r")
word = input("Type a word: ")
d = {word: 0}
for line in song:
    if word in line:
        d[word] += line.count(word)
print('The word {} appears {} times in this song'
      .format(word, d[word]))
```

Thank you!