Module 12: Object-Oriented Programming

March 23, 2022

Last time we discussed regular expressions, which can be extremely useful for string processing and manipulation (not only in Python programs).

Today we will dive deeper into objects and object-oriented programming (**OOP**) in Python. We will see how to create own classes, discuss the concept of inheritance, and have a quick look at UML class diagrams. Furthermore, we will briefly talk about higher-order functions, which exploit that in Python also functions are objects.

Objects and Styles of Programming

First of all it is important to realize that we have worked with objects all the time, even though we were not so explicit about it until now. In Python anything used in a program is considered an object. Numbers, strings, complex data structures, functions, etc. They are all objects! In that sense, Python is a strongly object-oriented language.

Nevertheless we have followed a more procedure-oriented way of programming so far. That is, we used functions and modules to organize our different pieces of functionality that manipulate data. This style of programming works fine for small- to medium-size data analysis applications

When writing larger, more complex programs, however, it can be advantageous to follow an object-oriented programming style. Essentially, the idea is to define own, application-specific data types to represent the relevant data, and implement the corresponding functionality along with them rather than in stand-alone functions. This development style is also supported by Python.

OOP Terminology

Let's introduce some terminology before we look at concrete examples:

- Classes are basically pieces of code that represent entities of a domain. For example, if
 our application domain is university lectures, we might have classes to represent
 courses, lectures, students, teachers, etc. And all these classes have certain properties
 and behavior. Classes are templates for objects.
- **Objects** are *instances of classes*. That might sound abstract, but we have seen that many times before. For example, when we define an integer variable n=2, we technically create an instance of class integer (with assigned value 2), so we have an integer object afterwards. As another example, when we create an empty set s = set(), technically we create an instance of class Set, so we have a set object afterwards. Analogously, we saw how to create an instance of class BeautifulSoup to have a BeautifulSoup object as basis for scraping a web page.
- Fields are variables that belong to a class or object. They can belong to the class in

general (then they are called class variables) or to individual instances of the class (then called instance variables).

- Methods are functions that belong to a class or object.
- Attributes are fields and methods together.

For example, in the university domain, a Student class could be used to represent students. An instance of the Student class would be an **object**, and it would represent a specific student. A student's name or ID would be stored as a **field**, and a function to list all of the courses a student is enrolled in would be a **method**.

We will see concrete examples of all this in the following.

Creating Classes in Python

In Python classes can simply be created with the class statement. Here an example with a class Course that does nothing (yet):

```
In [1]:
    class Course:
        pass #does nothing

pc = Course()
    print(pc)
```

< main .Course object at 0x7fbbc0a7ea30>

The first line defines the new class. Below this class statement follows an indented block of statement that is the implementation of the class, which is basically empty in this example. Then a new instance of the class is created by using the name of the class and a pair of parentheses. The printout shows us that we have created an object of type Course; the number is its address in memory.

Attributes

Like the functions we have worked with before, methods for classes are defined with the def keyword. For example:

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There is one difference, though: the self parameter that is used in both methods, but that is apparently not set by the calling code. self is a special kind of parameter, which is needed as first parameter for all methods defined by a class. As its name suggests, it refers

to the object itself, and essentially it is technically needed by the Python interpreter to associate the method call to the right object at runtime.

There are a couple of predefined method names that have a specific meaning within Python classes (https://docs.python.org/3/reference/datamodel.html#special-method-names contains the full list). An important one is the instantiation method <code>__init__</code>, which is executed when an instance of the object is created. In the example above, we did not define an <code>__init__</code> method, so the default implementation was used, which creates a plain instance of the class. If we want to do something extra during instantiation, we can define an alternative <code>__init__</code> method; this is also called "overloading". For example:

```
In [3]:
         class Course:
             def init (self, code, name):
                 self.course code = code
                 self.course name = name
             def printCourseName(self):
                 print(self.course_name)
             def getCourseCode(self):
                 return self.course code
         pc = Course("INFOMCTH and INFOB2PWD and BETA-B1PYT",
                     "Computational Thinking and Programming with Python")
         pc.printCourseName()
         print(pc.getCourseCode())
         mc = Course("INFOMSO",
                     "Modelleren en Systeemontwikkeling")
         mc.printCourseName()
         print(mc.getCourseCode())
```

Computational Thinking and Programming with Python INFOMCTH and INFOB2PWD and BETA-B1PYT Modelleren en Systeemontwikkeling INFOMSO

The __init__ method now has to be called with two additional arguments for setting the course code and name. They are then assigned to the instance variables course_code and course_name, which are used by the class methods too. Now the Course class can be used for basically any course, not only for CoTaPP.

Instance variables are owned by each individual instance of the class (i.e., each *object*). In the example above, pc and mc both have their own code and name. The code and name for one object are not related to the values in the other object. This strong connection to the instance is made clear by using self when referring to the instance variables.

In the following extension of the example we also introduce a class variable:

```
In [4]:
         class Course:
             all courses = set()
             def __init__(self,code,name):
                 self.course code = code
                 self.course name = name
                 Course.all_courses.add(self)
             def printCourseName(self):
                 print(self.course name)
             def getCourseCode(self):
                 return self.course_code
             @classmethod
             def printAllCourses(cls):
                 for course in cls.all courses:
                     course.printCourseName()
         print("Current courses:")
         Course.printAllCourses()
         print()
         pc = Course("INFOMCTH and INFOB2PWD and BETA-B1PYT",
                     "Computational Thinking and Programming with Python")
         print("Current courses:")
         Course.printAllCourses()
         print()
         mc = Course("INFOMSO",
                     "Modelleren en Systeemontwikkeling")
         print("Current courses:")
         Course.printAllCourses()
        Current courses:
```

Current courses:

Computational Thinking and Programming with Python

Current courses:

Computational Thinking and Programming with Python

Modelleren en Systeemontwikkeling

The field all_courses is now a class variable that gets instantiated with an empty set. There is only one copy of this variable, shared by all instances of the class. That means that when one object changes all_courses, the change is visible to all other instances of the class, too. In this example, every time an instance of the class is created, the __init__ method adds the new instance to the set. In contrast to the instance variables, which are accessed via self, the class variable is accessed using Course, that is, the class name.

Furthermore, the example program now defines a class method printAllCourses, which belongs to the class and not to its individual instances. The @classmethod decorator in the line just before the method definition makes this clear. Similar to the self parameter for the instance methods, this method has a parameter cls, which is technically needed to tell

the interpreter how to call it, but that is not passed as an argument by the calling code.

Another option for non-instance methods in classes are static methods. They can be used whenever it is not relevant to which class a method belongs. For example, we could add a static method getYear to the Course class, that happens to be part of the class, but is actually independent from all its fields and could from that perspective as well be part of another class, or simply a function in a module:

```
In [5]:
         from datetime import date
         class Course:
             all courses = set()
             def __init__(self,code,name):
                 self.course code = code
                 self.course name = name
                 Course.all courses.add(self)
             def printCourseName(self):
                 print(self.course_name)
             def getCourseCode(self):
                 return self.course_code
             @classmethod
             def printAllCourses(cls):
                 for course in cls.all courses:
                     course.printCourseName()
             @staticmethod
             def getYear():
                 return date.today().year
         print(Course.getYear())
```

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When you look at the documentation of the different libraries we have been using so far, you will notice that all these kinds of methods are used in practice.

Inheritance

With the concept of inheritance, object-oriented programming offers another elegant way of reusing code. The idea is basically to establish and exploit a type-subtype relationship between classes. To give a real-world example: trees, flowers and vegetables are all plants. That is, they have things in common (e.g. they have roots and leaves, they grow) and things that are different (e.g. trees have trunks, flowers have pretty blossoms, and vegetables can be used as food).

In this example, plant is the *base type* or *base class*, and trees, flowers and vegetables are its *subtypes* or *subclasses*. Conversely, we can also say that plant is the *superclass* of the classes tree, flower and vegetable. Also, the latter might have further subclasses, for different kinds of trees, flowers, and vegetables. A class *inherits* the attributes of its superclass, that is,

everything that holds for the superclass will also hold for the class itself. In terms of Python classes, it means that the fields and methods defined for a class will also be available for all of its subclasses, which might however define further attributes.

In [6]: class Tree: def init (self, kind, height, trunk diameter): self.kind = kind self.height = height self.trunk diameter = trunk diameter def printKind(self): print(f"This is a {self.kind}.") def printDetails(self): print(f"This {self.kind} has a height of {self.height} " f"and a trunk diameter of {self.trunk diameter}.") class Flower: def init (self, kind, color, number of blossoms): self.kind = kind self.color = color self.number of blossoms = number of blossoms def printKind(self): print(f"This is a {self.kind}.") def printDetails(self): print(f"This {self.kind} is of color {self.color} and " f"has {self.number of blossoms} blossom(s).") class Vegetable: def __init__(self, kind, season): self.kind = kind self.season = season def printKind(self): print(f"This is a {self.kind}.") def printDetails(self): print(f"This {self.kind} grows in {self.season}.") elm = Tree("elm", height=10, trunk diameter=0.75) tulip = Flower("tulip", "yellow", number_of_blossoms=1) tomato = Vegetable("tomato", "summer") elm.printKind() elm.printDetails() tulip.printKind() tulip.printDetails() tomato.printKind() tomato.printDetails()

This is a elm.

This elm has a height of 10 and a trunk diameter of 0.75.

This is a tulip.

This tulip is of color yellow and has 1 blossom(s).

This is a tomato.

This tomato grows in summer.

There is quite some redundancy in this implementation, because for example all classes define the instance variable kind and the methods printKind and printDetails. While kind and printKind are exactly the same, printDetails is at least also very similar between all the classes. This is a common case where the implementation can be simplified by introducing a common superclass that contains what is the same. We can introduce a superclass Plant as follows:

```
In [7]:
         class Plant:
             def init (self, kind):
                 self.kind = kind
             def printKind(self):
                 print(f"This is a {self.kind}.")
         class Tree(Plant):
             def __init__(self, kind, height, trunk_diameter):
                 Plant.__init__(self, kind)
                 self.height = height
                 self.trunk_diameter = trunk_diameter
             def printDetails(self):
                 # Note how self.kind is a reference to the parent class
                 print(f"This {self.kind} has a height of {self.height} and "
                       f"a trunk diameter of {self.trunk diameter}.")
         class Flower(Plant):
                  __init__(self, kind, color, number_of_blossoms):
                 Plant. init (self, kind)
                 self.color = color
                 self.number of blossoms = number of blossoms
             def printDetails(self):
                 print(f"This {self.kind} is of color {self.color} and has "
                       f"{self.number of blossoms} blossom(s).")
         class Vegetable(Plant):
             def __init__(self, kind, season):
                 Plant. init (self, kind)
                 self.season = season
             def printDetails(self):
                 print(f"This {self.kind} grows in {self.season}.")
         elm = Tree("elm", height=10, trunk_diameter=0.75)
         tulip = Flower("tulip", "yellow", number_of_blossoms=1)
         tomato = Vegetable("tomato", "summer")
         elm.printKind()
         elm.printDetails()
         tulip.printKind()
         tulip.printDetails()
         tomato.printKind()
         tomato.printDetails()
        This is a elm.
        This elm has a height of 10 and a trunk diameter of 0.75.
        This is a tulip.
```

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This tulip is of color yellow and has 1 blossom(s).

This is a tomato.

This tomato grows in summer.

Obviously, this leads to the same object instantiation and output as above.

The new Plant class defines the joint __init__ and printKind methods. By adding (Plant) to the definition of the other three classes, we make them inherit from Plant , which thus becomes their superclass. Without defining kind and printKind again, the attributes are available for the Tree , Flower and Vegetable objects. We don't inherit the __init__ method, however, because we define new ones for all classes. Thus we have to call the __init__ method of the superclass ourselves if we want to use it. Note that in this example, the printDetails method exists in all classes, but is not part of the superclass, so if we defined a new subclass of Plant , it would not automatically support this method. If desired, we could make it a method of the superclass, of course. That's a design choice that needs to be made.

The advantage of this design is now that with less redundant code, it will be easier to define new classes, and also making changes in case we want to, e.g., change the printout text of the printKind function.

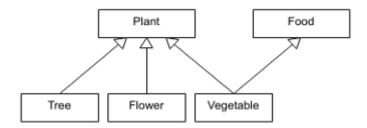
A class can also inherit from multiple superclasses. As an extension of the example above, we could have multiple inheritance for the class Vegetable, which inherits from the Plant and Food superclasses:

```
In [8]:
         class Plant:
             def init (self, kind):
                 self.kind = kind
             def printKind(self):
                 print(f"This plant is a {self.kind}.")
         class Food:
             def init (self, name):
                 self.name = name
             def printName(self):
                 print(f"This food is a {self.name}.")
         class Vegetable(Plant, Food):
             def init (self, kind, season):
                 Plant.__init__(self, kind)
                 Food.__init__(self, kind)
                 self.season = season
             def printDetails(self):
                 print(f"This {self.kind} grows in {self.season}.")
         tomato = Vegetable("tomato", "summer")
         tomato.printKind()
         tomato.printName()
         tomato.printDetails()
```

This plant is a tomato. This food is a tomato. This tomato grows in summer.

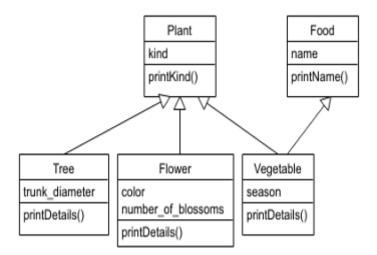
By the way: Class Diagrams

In the beginning of the course we used UML Activity Diagrams to describe the control-flow structure of processes. UML actually comprises several other kinds of diagrams. One of them, the so-called Class Diagrams, have been designed as a means for representing the relationship of classes in object-oriented programs. For the example from above, a simple and basic UML Class Diagram looks like this:



The rectangular boxes represent the different classes, and the arrows represent the inheritance relationships. For example, Flower inherits from Plant, or also "Flower is a Plant" in a more natural formulation.

It is also possible to include information about the classes' attributes in a class diagram. For the same example, a more detailed diagram could look like this:



The inheritance relationships are exactly the same as before, but now each box gives information about the classes' fields and methods. We can see, for example, that Plant has a field kind, and that Flower has a field number_of_blossoms. The __init__ methods are not included here (can be done if desired, though), and input parameters of methods are not shown. Based on the definition of inheritance, we also know that the attributes of the superclasses are available in their subclasses, too.

When OO programs get more complex, it can be very helpful to visualize the class relationships with the help of Class Diagrams to keep track of what is going on.

Higher-Order Functions

The fact that in Python also functions are objects has some interesting further implications. In

particular, it is possible to pass functions as arguments to other functions, and functions can return functions as a result. Functions that do at least one of these two things are called *higher-order functions*.

One of the built-in higher order functions in Python is map (https://docs.python.org/3/library /functions.html#map), which takes a function and an iterable object as input, and applies the function to all objects in the iterable. It returns an iterable map object, which can simply be casted to a list. See the following example:

```
In [9]:
    def celsius2fahrenheit(temp):
        return (9/5) * temp + 32

    temps = [34.5, 23.6, 78.7, 34.3, 99.9, 23.7, 42.6]
    temps_f = map(celsius2fahrenheit,temps)
    print(temps_f)
    print(list(temps_f))
```

```
<map object at 0x7fbbc0245820>
[94.1, 74.48, 173.66, 93.74, 211.820000000002, 74.66, 108.68]
```

We define a function celsius2fahrenheit as we have seen before. Then we create a list of temperatures to be converted. However, instead of iterating over the list and calling the function for each item in it, we now call the map function with the celsius2fahrenheit function and the list as parameters. The result is a map object, which we cast to a list object to be able to easily print its content.

For simple functions like this, *lambda functions* can be used instead of conventionally defined functions. Lambda functions are anonymous, that is, they don't have a name and are just usable at the point in the program where they have been created. Here is the above example implemented with a lambda function:

```
In [10]:
    temps = [34.5, 23.6, 78.7, 34.3, 99.9, 23.7, 42.6]
    temps_f = map(lambda x: (9/5) * x + 32, temps)
    print(temps_f)
    print(list(temps_f))
```

<map object at 0x7fbbc021a640>
[94.1, 74.48, 173.66, 93.74, 211.8200000000002, 74.66, 108.68]
Lambda functions have the following generic form:

lambda argument_list: expression

That is, the keyword lambda is followed by a comma-separated list of input arguments, followed by a : and then an expression that uses the arguments and produces a result. Lambda functions don't have a name themselves, but they can be assigned to a variable and used in functions like map:

```
In [11]:
    c2f = lambda x: (9/5) * x + 32
    temps = [34.5, 23.6, 78.7, 34.3, 99.9, 23.7, 42.6]
    temps_f = map(c2f, temps)
    print(temps_f)
    print(list(temps_f))
```

```
<map object at 0x7fbbc01e8610>
  [94.1, 74.48, 173.66, 93.74, 211.8200000000002, 74.66, 108.68]
Similar to map, the function filter (see https://docs.python.org/3/library
/functions.html#filter) can be used to apply a function to a sequence of objects to discard those for which the function returns False. Hence, the function used as parameter for filter needs to return a Boolean value. The following example shows how this can be used to obtain all temperatures above 50 degrees Celsius from a list of temperatures:
```

```
In [12]:
    temps = [34.5, 23.6, 78.7, 34.3, 99.9, 23.7, 42.6]
    temps_50plus = filter(lambda x: x>=50, temps)
    print(temps_50plus)
    print(list(temps_50plus))
```

```
<filter object at 0x7fbbc0245fd0>
[78.7, 99.9]
```

Note that historically, lambda functions as well as map and filter have been included in Python as a result of lobbying from Lisp programmers. They have remained in it until now and are still quite frequently used in practice, but some Python developers actually prefer to use a technique called "list comprehension" (https://docs.python.org/3/tutorial /datastructures.html#list-comprehensions). With list comprehension, the Celsius-to-Fahrenheit conversion example from above could be implemented as follows:

```
In [13]:
    temps = [34.5, 23.6, 78.7, 34.3, 99.9, 23.7, 42.6]
    temps_f = [ (9/5) * x + 32 for x in temps ]
    print(temps_f)

[94.1, 74.48, 173.66, 93.74, 211.8200000000002, 74.66, 108.68]
```

[94.1, 74.48, 173.66, 93.74, 211.8200000000000, 74.66, 108.68] The filter example could become:

```
In [14]: temps_50plus = [ x for x in temps if x >= 50 ]
    print(temps_50plus)
```

[78.7, 99.9]

List comprehensions have the following basic form:

```
[ expression for var in iterable ]
```

Additionally, if statements can be included to express further constraints. The result is a list with the results from evaluating the expression in the context of the for and if clauses in the comprehension statement.

Some people prefer lambda expressions with map and filter, while others find list comprehension easier to use. It seems to be a matter of personal preference in the first place, so feel free to use the one that you find more intuitive. A somewhat elaborate discussion of the topic can be found at https://towardsdatascience.com/understanding-the-use-of-lambda-expressions-map-and-filter-in-python-5e03e4b18d09.

Next time

Next time we will look at building graphical user interfaces and executables with Python, as a

third way of deploying Python programs (next to sharing code and notebooks as we did so far).

Exercises

Please use Quarterfall to submit and check your answers.

1. Room Occupancy Revisited (★★★★☆)

In one of the exercises for Module 7 (Data Structures) you wrote a small program to manage the room occupancy of a small hotel. Back then you used dictionaries for keeping the data, which is a fair approach, but actually it is better style to define purpose-specific classes. Here is a slight variant of the exercise, following an object-oriented programming paradigm:

Imagine a small hostel with four rooms (with the arbitrarily chosen numbers 101, 102, 201, and 202). You want to write a little program for the hostel staff to help them keep track of the room occupancy and checking guests in and out. The code for the user interaction already exists (see below), but you still need to implement the class Room and its attributes:

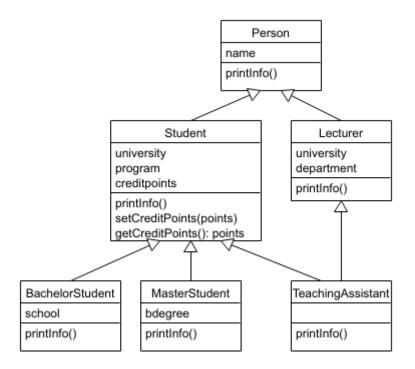
- A class variable all rooms that keeps track of all rooms created.
- An __init__ method that creates a new room (with an empty list of guests) given a room number and maximum number of guests.
- A class method printOccupancy that prints out all rooms and the guests that are currently checked in.
- A class method getRoom that returns the corresponding Room object (if it exists).
- An instance method checkIn to check in a guest to the room. If the chosen room is already full, a corresponding message should be printed. It is allowed to have multiple guests with the same name in one room.
- An instance method checkOut to check out a guest from the room. If the guest is not checked into the room, a corresponding message should be printed.

The following code shows how the class Room is used. You can also use it to test your implementation:

```
In [15]:
          ################
          # Main program #
          ################
          # create some rooms
          Room(101, 4)
          Room(102, 2)
          Room(201, 3)
          Room(202, 2)
          # do things with the rooms
          while True:
              print("These are your options:")
              print("1 - View current room occupancy.")
              print("2 - Check guest in.")
              print("3 - Check guest out.")
              print("4 - Exit program.")
              choice = input("Please choose what you want to do: ")
              if choice == "1":
                  Room.printOccupancy()
              elif choice == "2":
                  guest = input("Enter name of guest: ")
                  number = int(input("Enter room number: "))
                  room = Room.getRoom(number)
                  if room != None:
                      room.checkIn(guest)
                  else:
                      print("Not a valid room number.")
              elif choice == "3":
                  guest = input("Enter name of guest: ")
                  number = int(input("Enter room number: "))
                  room = Room.getRoom(number)
                  if room != None:
                      room.checkOut(quest)
                  else:
                      print("Not a valid room number.")
              elif choice == "4":
                  print("Goodbye!")
                  break
                  print("Invalid input, try again.")
```

2. People at the University (★★★☆)

Define and implement a set of classes for representing people at a university according to the UML Class Diagram below.



The base class Person provides a field name and a function to print information about the person (i.e., the name). The classes Student and Lecturer are derived from Person . A Student is a Person that in addition has a university , a study program and a number of creditpoints . The class Student also has a printInfo function, which displays information about the university and program in addition to the student's name. With the functions setCreditPoints and getCreditPoints the credit points of the student can be set and retrieved. BachelorStudent and MasterStudent are subclasses of Student . Bachelor students have additional information about the place where they went to school before university. Master students have information about their Bachelor's degree (field bdegree). Lecturers are affiliated with a department at a university. Their printInfo function includes this information, too. Finally, TeachingAssistants are both Students and Lecturers , and thus have the attributes of both superclasses.

The real person models in UU's IT systems are of course more involved, but this gives you an idea of the things to think about when designing such systems. :)

You can use the following code to test your classes:

```
In []:
    student1 = BachelorStudent("Alice", "UU", "Biology", "Amsterdam")
    student2 = MasterStudent("Bob", "UU", "Chemistry", "Biophysics")
    lecturer = Lecturer("Cindy","UU","Information and Computing Sciences")
    ta = TeachingAssistant("Dennis", "UU", "Computer Science", "Information and
    student1.printInfo()
    student1.setCreditPoints(150)
    print(f"{student1.name} has {student1.getCreditPoints()} points.")
    student2.printInfo()
    student2.setCreditPoints(45)
    print(f"{student2.name} has {student2.getCreditPoints()} points.")
    lecturer.printInfo()
    ta.printInfo()
    print(f"{ta.name} has {ta.getCreditPoints()} points.")
```

The output should be something like:

```
I am a student at UU. I study Biology.
I went to school in Amsterdam.
Alice has 150 credit points.
I am Bob.
I am a student at UU. I study Chemistry.
I have a Bachelor's degree in Biophysics.
Bob has 45 credit points.
I am Cindy.
I am a lecturer at UU, Information and Computing Sciences.
I am Dennis.
I am a lecturer at UU, Information and Computing Sciences.
I am a lecturer at UU, Information and Computing Sciences.
Dennis has None points.
```

3. Text Analysis with Higher-Order Functions ($\star \star \star \star \star \Rightarrow$)

Take the following code (already used on Worksheet 3) as start of a Python program:

```
In []:
    # input text
    text = "Lorem ipsum dolor sit amet, consectetur adipiscing elit, sed do \
    eiusmod tempor incididunt ut labore et dolore magna aliqua. Ut enim ad \
    minim veniam, quis nostrud exercitation ullamco laboris nisi ut aliquip ex
    ea commodo consequat. Duis aute irure dolor in reprehenderit in voluptate velit esse cillum dolore eu fugiat nulla pariatur. Excepteur sint occaecat cupidatat non proident, sunt in culpa qui officia deserunt mollit anim id est laborum."

# split text into words
words = text.split()
```

Continue the program as follows: Use map to strip the remaining "," and "." characters from the words. Create a list of the lengths of all words in the text. Implement this functionality in three different ways:

- 1. using a for-loop,
- 2. using map,
- 3. using list comprehension.

Use filter to get the words with 10 characters or more from the list. Print out the results of each step. The output should be something like:

```
Strip words:
['Lorem', 'ipsum', 'dolor', 'sit', 'amet', 'consectetur',
'adipiscing', 'elit', 'sed', 'do', 'eiusmod', 'tempor',
'incididunt', 'ut', 'labore', 'et', 'dolore', 'magna',
'aliqua', 'Ut', 'enim', 'ad', 'minim', 'veniam', 'quis',
'nostrud', 'exercitation', 'ullamco', 'laboris', 'nisi',
'ut', 'aliquip', 'ex', 'ea', 'commodo', 'consequat', 'Duis',
'aute', 'irure', 'dolor', 'in', 'reprehenderit', 'in',
'voluptate', 'velit', 'esse', 'cillum', 'dolore', 'eu',
'fugiat', 'nulla', 'pariatur', 'Excepteur', 'sint',
```

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'occaecat', 'cupidatat', 'non', 'proident', 'sunt', 'in',
'culpa', 'qui', 'officia', 'deserunt', 'mollit', 'anim',
'id', 'est', 'laborum']
Get word lengths with for-loop:
[5, 5, 5, 3, 4, 11, 10, 4, 3, 2, 7, 6, 10, 2, 6, 2, 6, 5, 6,
2, 4, 2, 5, 6, 4, 7, 12, 7, 7, 4, 2, 7, 2, 2, 7, 9, 4, 4, 5,
5, 2, 13, 2, 9, 5, 4, 6, 6, 2, 6, 5, 8, 9, 4, 8, 9, 3, 8, 4,
2, 5, 3, 7, 8, 6, 4, 2, 3, 7]
Get word lengths with map:
[5, 5, 5, 3, 4, 11, 10, 4, 3, 2, 7, 6, 10, 2, 6, 2, 6, 5, 6,
2, 4, 2, 5, 6, 4, 7, 12, 7, 7, 4, 2, 7, 2, 2, 7, 9, 4, 4, 5,
5, 2, 13, 2, 9, 5, 4, 6, 6, 2, 6, 5, 8, 9, 4, 8, 9, 3, 8, 4,
2, 5, 3, 7, 8, 6, 4, 2, 3, 7]
Get word lengths with list comprehension:
[5, 5, 5, 3, 4, 11, 10, 4, 3, 2, 7, 6, 10, 2, 6, 2, 6, 5, 6,
2, 4, 2, 5, 6, 4, 7, 12, 7, 7, 4, 2, 7, 2, 2, 7, 9, 4, 4, 5,
5, 2, 13, 2, 9, 5, 4, 6, 6, 2, 6, 5, 8, 9, 4, 8, 9, 3, 8, 4,
2, 5, 3, 7, 8, 6, 4, 2, 3, 7]
Longest words:
['consectetur', 'adipiscing', 'incididunt', 'exercitation',
'reprehenderit']
```

Extras

We discussed in the lecture that in Python everything is an object, and that also functions are objects that can be assigned to variables and used with higher-order functions (remember lambda, map, filter, ...). All this is a bit different than "normal", procedural Python, and has in fact been inspired by a programming paradigm that is called "functional programming". If you want to read up a bit more on this programming style and how it is supported in Python, have a look at https://kite.com/blog/python/functional-programming.

```
In [ ]:
```