§3 Object-oriented Programming in Python

Object-oriented programming (OOP) is a programming style that focuses on the data rather than the algorithm. Such programming approach is well-suited for programs that are large, complex, and actively updated. Simula is regarded as the first OOP language which was developed by the Norwegian computer scientists Ole-Johan Dahl and Kristen Nygaard in the 1960s. It introduced a number of key concepts of object-oriented programming that are now implemented in the most widely used programming languages such as C++, Java, and Python. In this chapter, we will discuss how to perform object-oriented programming in Python.

3.1 Basics of Object-oriented Programming

So far we have only worked on Python programs that are designed using a programming paradigm known as **procedural programming**. In this approach, a program is broken into small parts using code blocks and functions so that its structure likes a recipe providing a set of steps which are executed sequentially in order to complete a task. Procedural programming is simple, straight forward, and efficient. However, the maintenance of large and complex programs developed by this approach can be difficult and time consuming.

An alternative programming paradigm is object-oriented programming which is based on the concepts of **objects** that models real-world entities. An object is simply a collection of data and functions that act on those data. A **class** is a "blueprint" from which individual objects are made. It specifies the properties and behaviors that an object should have. Classes are defined with two types of **attributes**: **data attributes** and **methods**. Data attributes refer to data in classes while methods refer to functions in classes. We can create multiple objects from the same class. Each object is unique and it is an **instance** of a class. The process of creating an object from a class is called **instantiation**.

As we have already pointed out, everything in Python is an object. For example, a Python string is an instance of the **str** class. A **str** object possesses its own data (the sequence of characters making up the string) and provides a number of methods for manipulating those data. For instance, the **upper** method returns a new string object created from the original string by changing all letters to uppercase and the **split** method

returns a list of strings by splitting up the original string:

```
>>> x = "Hello, Peter, goodbye, Mary"
>>> x.upper()
'HELLO, PETER, GOODBYE, MARY'
>>> x.split()
['Hello,', 'Peter,', 'goodbye,', 'Mary']
Even indexing a string is actually a call to the method __getitem__:
>>> y = [2, 4, 6, 8, 10, 12]
>>> y.__getitem__(5)
12
```

In other words, y[5] is equivalent to $y_{-getitem_{-}}(5)$.

Part of the popularity of object-oriented programming, at least for larger projects, is due to the way helping us to conceptualize the problem that a program aims to solve. It is often possible to break a problem down into units of data and operations that are appropriate to carry out on that data. For example, a retail bank deals with people who have bank accounts. A natural object-oriented approach for managing a bank would be to define a BankAccount class with data such as an account number, balance, and owner and a Customer class with data such as a name, address, and date of birth. The BankAccount class might have methods for allowing or forbidding transactions depending on its balance and the Customer class might have methods for calculating the customer's age from their date of birth as shown in Figure 3.1.

BankAccount name balance account_num deposit(amount) withdraw(amount)



Figure 3.1: Classes representing a bank account and a customer.

An important aspect of object-oriented programming is **inheritance**. The idea behind inheritance is that a new class can be defined to take over the properties and behaviors from an existing class. The existing class is called a **superclass** or **base class** and the new class is called its **subclass** or **derived class**. Let's consider our bank example

again to illustrate how inheritance works. In a retail bank, there may be different kinds of bank accounts: savings accounts, current accounts, and so on. Each one is derived from a generic bank account which can be represented by a superclass that defines basic attributes such as a balance and an account number. The specialized bank accounts can be represented by subclasses that **inherit** the data attributes and methods of the superclass. These subclasses may also customize the superclass attributes by overriding the methods of the superclass as well as add their own data attributes and methods. Inheritance helps structure the program and encourages **code reuse**, e. g. there is no need to declare an account number separately for the specialized bank account classes since they all inherit one automatically from the superclass. If a superclass is not to be instantiated itself, but serves only as a template for the subclasses, then it is called an **abstract class**. Through inheritance, related classes can be put together in families so that each family can be viewed as one unit. A family of classes is known as a **class hierarchy**.

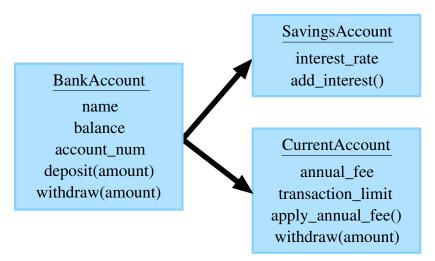


Figure 3.2: Two subclasses derived from an abstract superclass: SavingsAccount and CurrentAccount. They inherit data and methods from BankAccount but also customize and extend its functionality.

Figure 3.2 depicts the relationship between the superclass and two subclasses for our bank example. The superclass BankAccount defines some data attributes (account_number, balance, and customer) and methods (such as deposit and withdraw) which are common to all types of account, and these are inherited by the subclasses. The subclass SavingsAccount adds the attributes for handling interest payments on the account while the subclass CurrentAccount adds the attributes describing the annual account fee and transaction withdrawal limit as well as overrides the method withdraw defined in the superclass.

3.2 Creating Classes in Python

3.2.1 Class Definition

A Python class is defined using the **class** keyword and indenting the body of statements in a block following this declaration. The definition of a simple class looks like this:

where <ClassName> is the class name and <method1>, <method2>, ..., <methodN> are definitions of methods of the class. Like function definitions, class definitions must be executed before they have any effect. By convention, classes names are written in CamelCase, i. e. a compound word which uses capital letters to delimit the word parts. It's a good idea to follow the class statement by a docstring describing what does the class do. Methods are defined in a class using the def keyword in the way like a normal function definition. Each method has a first parameter named self which refers to the object on which the method is acting. Actually, we can use any name for this parameter. But the conventional name is self which will be always used here.

In Python, the data attributes defined within methods of a class are known as **instance** variables that are owned by instances of the class. Thus instance variables can take on different values for different instances of a class. Just like regular variables, instance variables are accessed by name. To access instance variables outside the class, we use the dot notation <code><object>.<ivar></code> where <code><object></code> is the name of the instance and <code><ivar></code> is the name of the instance variable. The power of instance variables is that we can use them to remember the state of a particular object of a class, and this information then gets passed around the program as part of the object. The values of instance variables can be referred to again in other methods or even in successive calls to the same method. This is different from regular local function variables, whose values disappear once the function terminates.

Some methods of Python classes have names starting and ending with a double underscore. These methods allow a special syntax in the program and are called **special** methods. The constructor __init__ is a typical example. Python calls this method to

create a new instance of a class. A call to a constructor is an expression that creates a brand new object. It has the general syntax

```
<ClassName>(<arg1>, <arg2>, ..., <argN>)
```

where *<ClassName>* is the name of the class from which a new instance is created and *<arg1>*, *<arg2>*, ..., *<argN>* are the arguments for initializing the data attributes of the instance. Note that the arguments are always passed on as parameters to the constructor __init__ after the self parameter. Inside the constructor, the argument self is a variable holding the new instance to be constructed. After the body of the constructor is executed, the self parameter is invisibly returned to the calling code. By convention, the constructor is used for initializing the instances variables in the class. To access instance variables inside the constructor, we use the dot notation self. *<ivar>* where *<ivar>* is the name of the instance variable.

Next we consider methods in Python classes apart from special methods. These methods are invoked using the dot notation as follows:

```
<object>.<methodname>(<arg1>, <arg2>, ..., <argN>)
```

where *<object>* is the name of the instance, *<methodname>* is the name of the method, and *<arg1>*, *<arg2>*, ..., *<argN>* are the arguments for the method call. Note that the self parameter is again dropped in the call of these methods. Just like that inside the constructor, we access an instance variable *<ivar>* inside these methods using the dot notation self. *<ivar>*.

To illustrate how a class works, let's consider the superclass BankAccount in our previous bank example. This class could be defined in the program bankaccount.py like this:

```
# backaccount.py
# This program defines the abstract superclass BankAccount which
# represents a generic bank account.
# Last Update on 19 Nov 2020 by F K Chow

class BankAccount:
    """ An abstract superclass representing a generic bank account """

def __init__(self, name, account_num, opening_balance=0):
    """ Initialize the bank account with a name, an account number, and an opening balance whose default is 0 """
```

```
self.name = name
    self.account_num = account_num
    self.balance = opening_balance
def deposit(self, amount):
    """ Deposit amount into the bank account """
    if amount > 0:
        self.balance += amount
    else:
        print("Invalid deposit amount:", amount)
def withdraw(self, amount):
    """ Withdraw amount from the bank account if there are
        sufficient funds """
    if amount <= 0:</pre>
        print("Invalid withdrawal amount:", amount)
    else:
        if amount > self.balance:
            print("Insufficient funds")
        else:
            self.balance -= amount
def print_balance(self):
    """ Print a statement of the account balance """
    print("The balance of account number {0:d} is ${1:.2f}."
          .format(self.account_num, self.balance))
```

To use this simple class, we import the program bankaccount.py into a new program or the interactive Python shell using the statement:

```
from bankaccount import BankAccount
```

This program can now create BankAccount objects and manipulate them by calling the methods described in the previous section.

The BankAccount class possesses three instance variables: name, account_num, and balance. These variables are all initialized in the constructor so that a BankAccount ob-

ject is created with the name of the owner, an account number, and an optional opening balance (which defaults to 0 if it's not provided) as follows:

```
>>> acc1 = BankAccount("Peter Jackson", 246810)
```

Recall that the self parameter is invisibly returned to the calling code. So Python automatically translates the right hand side of the above statement to

```
BankAccount.__init__(acc1, "Peter Jackson", 246810)
```

In addition to the constructor __init__, the BankAccount class defines three methods: deposit, withdraw, and print_balance. The first two methods are used for depositing a positive amount of money and for withdrawing money if the amount to be withdrawn is both positive and not greater than the account balance. And the third method is used for printing the balance of the account. Here are some examples for using these methods:

```
>>> acc2 = BankAccount("Julie Anderson", 135791, 80)
>>> acc2.name
'Julie Anderson'
>>> acc2.account_num
135791
>>> acc2.deposit(120)
>>> acc2.balance
200
>>> acc2.print_balance()
The balance of account number 135791 is $200.00.
```

We can also use classes to solve problems in mathematical and physical sciences. For example, consider the class **Projectile** which simulates a projectile moving near the Earth's surface under negligible air resistance. Below is the Python program **projectile.py** which contains the definition of this class.

```
# projectile.py
# This program defines the class Projectile which simulates a
# projectile moving near the Earth's surface under negligible air
# resistance.
# Last Update on 19 Nov 2020 by F K Chow

class Projectile:
```

```
""" A class simulating a projectile moving near the Earth's
    surface under negligible air resistance """
def __init__(self, theta, u, h):
    """ Initialize the projectile with the launching angle theta,
        the initial speed u, and the initial height h """
    import math
    self._xpos = 0
    self._ypos = h
    thetarad = math.radians(theta)
    self._xvel = u*math.cos(thetarad)
    self._yvel = u*math.sin(thetarad)
def _getX(self):
    """ Return the x position of the projectile """
    return self._xpos
def _getY(self):
    """ Return the y position of the projectile """
    return self._ypos
def _update(self, delt):
    """ Update the status of the projectile to move it delt
        seconds farther into its flight """
    self._xpos = self._xpos + self._xvel*delt
    self._ypos = self._ypos + self._yvel*delt - 4.90*delt**2
    self._yvel = self._yvel - 9.80*delt
def printrange(self, delt):
    """ Print the horizontal range and time of flight of the
        projectile """
    time = 0
    while self._getY() >= 0:
        self._update(delt)
        time = time + delt
```

The Projectile class has four data attributes: _xpos, _ypos, _xvel, and _yvel. They all start with an underscore to indicate that they should never be accessed outside the class. Unlike other languages, Python does not have special keywords that restrict access to any data attribute or method. All attributes in a Python class can be accessed outside the class environment. By convention, any name starting with an underscore in Python represents an attribute that should be used freely only inside the methods of the class. However, this convention does not change how the attribute can be accessed.

The Projectile class also defines five methods including the constructor $__init__$. The methods $_getX$ and $_getY$ give the current x and y positions of the projectile. And the method $_update$ updates the status of the projectile to account for the passage of the time interval delt. These three methods start with an underscore to indicate that they should never be called outside the class. On the other hand, printrange is a method that can be accessed outside the class. It prints the horizontal range and time of flight of the projectile. Here are the examples for working on this class:

```
>>> from projectile import Projectile
>>> ball = Projectile(30, 50, 100)
>>> ball.printrange(0.01)
Horizontal range of the projectile = 335.15 m
Time of flight of the projectile = 7.74 s
```

3.2.2 Special Methods

Besides the constructor __init__, Python also provides other special methods for calling instances as we call ordinary functions, performing arithmetic operations with instances, comparing instances with comparison operators, and so on. Here let us study these methods one by one in details.

Suppose a mathematical function y of time t is represented by the Python class Y. Moreover, it defines a method value so that writing y.value(t) gives the value of the function at time t for the instance y. If we could instead write y(t), the instance y would

look like an ordinary function. Such a syntax is indeed possible and offered by the special method named $_call_$. Writing y(t) implies a call

```
y.__call__(t)
```

if the method $_call__$ is defined in the corresponding class Y. For instance, the following code defines the class Y representing the mathematical function y(t) that gives the displacement of a free falling object.

class Y:

```
""" A class representing the mathematical function for the
    displacement of a free falling object """

def __init__(self, u):
    """ Initialize the function with the initial speed u and the
        acceleration due to gravity g """
    self.u = u
    self.g = 9.80

def __call__(self, t):
    """ Compute the displacement of the object at time t """
    return self.u*t - 0.5*self.g*t**2

def formula(self):
    """ Return the formula for the function """
    return "u*t - 0.5*g*t**2; u={:g}".format(self.u)
```

A good programming convention is to include a __call__ method in all classes that represent a mathematical function. Instances with __call__ methods are said to be callable objects, just as plain functions are callable objects as well. The call syntax for callable objects is the same, regardless of whether the object is a function or a class instance. Given an object a, the command

if callable(a)

tests whether **a** is callable, i. e. if **a** is a Python function or an instance with a __call__ method.

Another useful special method is __str__. It is called when a class instance needs to be converted to a string. This occurs when we print an instance. Python will then look

into this instance for a __str__ method, which is supposed to return a string. If such a special method is found, then the returned string is printed; otherwise just the name of the class is printed. Let's illustrate this feature with an example. First we try to print an instance y of class Y from freefall.py which does not have a __str_ method:

```
>>> print(y)
<-_main__.Y object at 0x000001C9FE3B0EF0>
```

The output means that y is an instance of class Y in the __main_ module (the main program or the interactive session). It also contains an address telling where the instance y is stored in the computer's memory.

If we want the command **print(y)** to print out the instance y, then we need to define the __str__ method in class Y:

```
class Y:
    def __str__(self):
        """ Return the output for printing out the function. """
        return "u*t - 0.5*g*t**2; u=\{:g\}".format(self.u)
```

Observe that __str__ replaces the formula method and __call__ replaces the value method. Python programmers with the experience that we now have gained will thus write class Y with special methods only:

```
class Y:
```

```
""" A class representing the mathematical function for the
    displacement of a free falling object """
def __init__(self, u):
    """ Initialize the function with the initial speed u and the
        acceleration due to gravity g """
    self.u = u
    self.g = 9.80
def __call__(self, t):
    """ Compute the displacement of the object at time t """
    return self.u*t - 0.5*self.g*t**2
def __str__(self):
```

```
""" Return the output for printing out the function """ return "u*t - 0.5*g*t**2; u=\{:g\}".format(self.u)
```

Let us see the class in action:

```
>>> y = Y(5)

>>> y(0.4)

1.2159999999999997

>>> print(y)

u*t - 0.5*g*t**2; u=5
```

What have we gained by using special methods? Of course, we can still simply evaluate the formula and write it out. But many users will claim that the use of special methods makes the syntax more attractive since y(t) in code means y(t) in mathematics and we can use **print(y)** to view the formula. The bottom line of using special methods is to achieve a more user-friendly syntax. The next example illustrate this point further.

Let **Person** be the Python class representing the personal data in a phone book. This class can be implemented as follows:

class Person:

```
def add_office_phone(self, number):
    """ Add office phone number to the record """
    self.office = number
def add_private_phone(self, number):
    """ Add private phone number to the record """
    self.private = number
def add_email(self, address):
    """ Add email address to the record """
    self.email = address
def __str__(self):
    """ Return the output for printing out the record """
    s = self.name + "\n"
    if self.mobile is not None:
        s += "mobile phone: {0:s}\n".format(self.mobile)
    if self.office is not None:
        s += "office phone: {0:s}\n".format(self.office)
    if self.private is not None:
        s += "private phone: {0:s}\n".format(self.private)
    if self.email is not None:
        s += "email address: {0:s}\n".format(self.email)
    return s
```

Storing the instances of class **Person** in a dictionary to form a phone book is straightforward. But we can make the dictionary a bit easier to use if we wrap a class around it. That is to say, we make a class **PhoneBook** which holds the dictionary as a data attribute. The complete code for this class looks as follows in Python.

```
class PhoneBook:
```

```
def __init__(self):
    """ Initialize the phone book with an empty dictionary of the
    instances of class Person """
```

```
self.contacts = {} # dict of Person instances
def add(self, name, mobile=None, office=None, private=None,
        email=None):
    """ Add a new person to the phone book """
    p = Person(name, mobile, office, private, email)
    self.contacts[name] = p
def __call__(self, name):
    """ Return the record of name in the phone book """
    return self.contacts[name]
def __str__(self):
    """ Return the output for printing out the phone book """
    s = ""
    for p in sorted(self.contacts):
        s += str(self.contacts[p]) + "\n"
    s = s[:-1] # Remove the trailing new line character
    return s
```

In this class, the add method is used to add a new person to the the phone book. Moreover, the special method __call__ retrieves a Person instance while the special method __str__ prints the phone book in alphabetic order. The only advantage of the __call__ method is simpler syntax. For a PhoneBook class instance pb, we can get data about name by calling pb("name") rather than accessing the internal dictionary pb.contact("name"). Below is a simple test for the PhoneBook class with three names:

```
>>> print(pb)
```

Hans Hanson

mobile phone: 995320221 office phone: 767828283

Ole Olsen

office phone: 767828292

email address: olsen@somemail.net

Per Person

mobile phone: 906849781

Suppose **a** and **b** are two instances of a given Python class. The standard binary arithmetic operations with **a** and **b** are defined by the special methods as shown in Table 3.1. For example, the special method _ _add_ _ can be defined in a class **C** like this:

```
class C:
     :
     def __add__(self, other):
          :
```

The __add__ method would add the instances self and other together and return the result as another instance of the class. Whenever Python encounters a + b where a and b are the instances of a class, it will check whether the class has an __add__ method. If the method is found, a + b will be interpreted as the call a.__add__(b); otherwise, a TypeError will be yielded.

Table 3.1: Special Methods of Python Classes for Arithmetic Operations

Method	Result	
aadd(b)	a + b	
asub(b)	a — b	
amul(b)	a*b	
atruediv(b)	a/b	
apow(b)	a**b	

To study how the special methods for arithmetic operations works, let us create a class Polynomial which represents polynomials. The coefficients in the polynomial is given to the constructor as a list where the index number i in this list represents the coefficients

of the x^i term in the polynomial. In other words, writing Polynomial([1, 0, -1, 2]) defines the polynomial

$$1 + 0 \cdot x - 1 \cdot x^2 + 2 \cdot x^3 = 1 - x^2 + 2x^3$$

Polynomials can be added (simply by adding the coefficients) and so our class may have an $_add_$ method. Besides, it's natural to use a $_call_$ method to evaluate the polynomial for a given value of x. Here is the complete implementation of class Polynomial:

```
class Polynomial:
    """ A class representing polynomials """
    def __init__(self, coefficients):
        """ Initialize the polynomial with its coefficients """
        self.coeff = coefficients
   def __call__(self, x):
        """ Evaluate the polynomial for a given value of x """
        s = 0
        for i in range(len(self.coeff)):
            s += self.coeff[i]*x**i
        return s
   def __add__(self, other):
        """ Return the sum of two polynomials as a Polynomial
            object """
        # Start with the longest list and add in the other
        if len(self.coeff) > len(other.coeff):
            result_coeff = self.coeff[:] # Copy!
            for i in range(len(other.coeff)):
                result_coeff[i] += other.coeff[i]
        else:
            result_coeff = other.coeff[:] # Copy!
            for i in range(len(self.coeff)):
```

result_coeff[i] += self.coeff[i]

return Polynomial(result_coeff)

Class Polynomial has only one data attribute: the list of coefficients in the polynomial. In the $_$ call $_$ method, the polynomial is evaluated by just summing up coefficient number i times x^i for i = 0 to the number of coefficients in the list.

The <code>__add__</code> method in class <code>Polynomial</code> looks more advanced. The idea is to add the two lists of coefficients. But it may happen that the lists have different length. We thus start with the longer list and add in the other list element by element. Observe that <code>result_coeff</code> starts out as a <code>copy</code> of <code>self.coeff</code>. Otherwise, <code>self</code> would be the sum of itself and the <code>other</code> instance. In such case, changes in <code>result_coeff</code> as we compute the sum will be reflected in <code>self.coeff</code>. That is to say, if <code>p1</code> and <code>p2</code> are instances of the class, evaluating the sum <code>p1 + p2</code> would change <code>p1</code>. Of course this is not what we want!

A subtraction method __sub__ can be implemented in the class Polynomial in the same way as __add__. But it is slightly more complicated and left as an exercise for you. A somewhat more complicated operation is the multiplication of two polynomials. Let $p(x) = \sum_{i=0}^{m} c_i x^i$ and $q(x) = \sum_{j=0}^{n} d_j x^j$ be two polynomials. Their product is given by

$$\left(\sum_{i=0}^{m} c_i x^i\right) \left(\sum_{j=0}^{n} d_j x^j\right) = \sum_{i=0}^{m} \sum_{j=0}^{n} c_i d_j x^{i+j}$$

The nested sum must be implemented as a double loop and the list for the resulting polynomial must be created with length m+n+1. So the implementation of the __mul__ method in class Polynomial becomes

```
def __mul__(self, other):
    """ Return the product of two polynomials as a Polynomial
        object """
    c = self.coeff
    d = other.coeff
    m = len(c) - 1
    n = len(d) - 1
    result_coeff = [0]*(m+n+1)
    for i in range(0, m+1):
        for j in range(0, n+1):
        result_coeff[i+j] += c[i]*d[j]
    return Polynomial(result_coeff)
```

To demonstrate the functionality of class Polynomial, we introduce two polynomials

$$p_1(x) = 1 + x,$$
 $p_2(x) = 2x + 3x^3 - x^4$

Below are some examples for working on these polynomials with this class:

```
>>> p1 = Polynomial([1, -2])
>>> p2 = Polynomial([0, 2, 0, 3, -5])
>>> p3 = p1 + p2
>>> print(p3.coeff)
[1, 0, 0, 3, -5]
>>> p4 = p1*p2
>>> print(p4.coeff)
[0, 2, -4, 3, -11, 10]
```

One way to verify the implementation is comparing p3 at x = 0.5 with $p_1(x) + p_2(x)$ as follows:

```
>>> x = 0.5
>>> p1_plus_p2_value = p1(x) + p2(x)
>>> p3_value = p3(x)
>>> print(p1_plus_p2_value - p3_value)
0.0
```

Beware that p1 + p2 is different from p1(x) + p2(x). In the former case, we add two instances of class **Polynomial**. But in the latter case we add two instances of class **float** as the __call__ method returns a **float** object.

We can also define a __str__ method for the Polynomial class to print the polynomial on the screen. A straight forward implementation could simply add up strings in the form of + self.coeff[i]*x^i:

```
class Polynomial:
    :
    def __str__(self):
        """ Return the output for printing out the polynomial """
        s = ""
        for i in range(0, len(self.coeff)):
              s += " + {0:g}*x^{1:d}".format(self.coeff[i], i)
        return s
```

However, this implementation gives rise to ugly output from a mathematical viewpoint. For example, an instance of Polynomial class with coefficients [1, 0, -2, 1, 5] would be printed as

```
+ 1*x^0 + 0*x^1 + -2*x^2 + 1*x^3 + 5*x^4
```

A more desired output would be

```
1 - 2*x^2 + x^3 + 5*x^4
```

It can be obtained by making the following adjustments to the previous output:

- 1. Terms with a zero coefficient is dropped.
- 2. A part "+ -" of the output string is replaced by "- ".
- 3. Unit coefficients is dropped, i. e. " 1*" is replaced by space " ".
- 4. Zero power is dropped and replaced by its coefficient.
- 5. Unit power is dropped by replacing "x^1" with "x".
- 6. Initial space is fixed.

These adjustments can be implemented using the replace method in string objects and by composing slices of the strings. The new version of the <code>__str__</code> method below contains the necessary adjustments.

```
class Polynomial:
    def __str__(self):
        """ Return the output for printing out the polynomial """
        s = ""
        for i in range(0, len(self.coeff)):
            if self.coeff[i] != 0:
                s += " + \{0:g\}*x^{1:d}".format(self.coeff[i], i)
        # Adjust the layout
        s = s.replace("+ -", "- ")
        s = s.replace(" 1*", " ")
        s = s.replace("x^0", "1")
        s = s.replace("*x^0", "")
        s = s.replace("x^1", "x")
        if s[0:3] == " + ": # Remove initial +
            s = s[3:]
        if s[0:3] == "-": # Fix spaces for initial -
            s = "-" + s[3:]
        return s
```

Here is an interactive Python session demonstrating the pretty print of Polynomial instances using the new __str__ method:

```
>>> p1 = Polynomial([1, -2])
>>> print(p1)
1 - 2*x
>>> p2 = Polynomial([0, 5, -1, 0, 3, -4])
>>> print(p2)
5*x - x^2 + 3*x^4 - 4*x^5
```

We can also implement the special methods of Python classes for comparing two instances of Polynomial class. Table 3.2 shows these special methods which are used in a similar manner as those for arithmetic operations. On the other hand, Python also provides some useful special methods for an instance of a class as shown in Table 3.3.

Table 3.2: Special Methods of Python Classes for Comparison Operations

Method	Result
aeq(b)	a == b
ane(b)	a != b
agt(b)	a > b
age(b)	a >= b
alt(b)	a < b
ale(b)	a <= b

Table 3.3: Some Useful Special Methods of Python Classes for a class instance

Method	Description
alen()	Return the length of a, i. e. len(a)
aabs()	Return the absolute value of a, i. e. abs(a)
aneg()	Return the negation of a
abool()	Evaluate a as a Boolean expression

Suppose the class MyClass is defined with a __str_ method like this:

```
class MyClass:
    def __init__(self):
        self.data = 2

    def __str__(self):
        return "In __str__: {0:s}".format(str(self.data))
```

Printing an instance a of this class leads to the following output:

```
>>> a = MyClass()
>>> print(a)
In __str__: 2
```

Obviously, the __str__ method is called when a is printed.

But what will happen if we write just a at the command prompt in an interactive Python shell?

```
>>> a
<__main__.MyClass object at 0x00000202C9C8F6D8>
```

When writing a in an interactive session, Python looks for a special method _repr_inal. This method is similar to _str_in that it turns the instance into a string. But there is a convention that _str_i is a pretty print of the instance contents while _repr_i is a complete representation of the contents of the instance. For a lot of Python classes, including int, float, complex, list, and tuple, these two methods give identical output. In our class MyClass, the _repr_ method is missing. And we need to add it if we want

```
>>> a
is actually a repr(a) call and
```

>>> **print**(a)

is actually a **print(str(a))** statement. A simple remedy in class MyClass is to define

```
class MyClass:
     :
     def __repr__(self):
        return self.__str__()
```

However, as we explain below, it is better to define the __repr__ in a different way.

Recall that the Python function **eval(e)** evaluates a valid Python expression contained in the string **e**. By convention, __repr__ returns a string such that **eval** applied to the string recreates the instance. For example, in case of our previous class Y, __repr__ should return "Y(10)" if the u variable has the value 10. Then **eval(**"Y(10)") will be the same as if we had coded Y(10) directly in the program or in an interactive session.

Below are the examples of __repr__ methods in classes Y, Polynomial, and MyClass: class Y:

```
idef __repr__(self):
    return "Y(u={0:s})".format(str(self.u))

class Polynomial:
    i:
    def __repr__(self):
        return "Polynomial(coefficients={0:s})".format(str(self.coeff))

class MyClass:
    i:
    def __repr__(self):
        return "MyClass()"
```

With the above definitions, eval(repr(x)) recreates the object x if it is of one of the three types above.

To summarize what we have learnt in this section, let us consider how to implement two-dimensional vectors as a Python class such that these vectors act as objects we can add, subtract, form scalar products with, and do other mathematical operations on. Vectors in the plane are described by a pair of real numbers (a, b). The mathematical rules for adding and subtracting vectors, multiplying two vectors (i. e. the dot product), the length of a vector, and multiplication by a scalar are:

$$(a,b) + (c,d) = (a+c,b+d)$$

$$(a,b) - (c,d) = (a-c,b-d)$$

$$(a,b) \cdot (c,d) = ac+bd$$

$$\|(a,b)\| = \sqrt{(a,b) \cdot (a,b)}$$

Moreover, two vectors (a, b) and (c, d) are equal if a = c and b = d.

We create a Python class Vec2D for plane vectors in which the above mathematical operations are implemented by special methods. The class must contain two data attributes, one for each component of the vector called **x** and **y**. We include special methods for addition, subtraction, the dot product (multiplication), the absolute value (length), comparison of two vectors (== and !=), as well as a method for printing out a vector. The complete code of this class is listed below.

```
# vec2d.py
# This program defines the class Vec2D representing plane vectors.
# Last Update on 19 Nov 2020 by F K Chow
import math
class Vec2D:
    """ A class representing plane vectors """
    def __init__(self, x, y):
        """ Initialize the vector with x and y components """
        self.x = x
        self.y = y
    def __add__(self, other):
        """ Return the sum of two vectors as a Vec2D object """
        return Vec2D(self.x + other.x, self.y + other.y)
    def __sub__(self, other):
        """ Return the difference of two vectors as a Vec2D object """
        return Vec2D(self.x - other.x, self.y - other.y)
    def __mul__(self, other):
        """ Return the dot product of two vectors """
        return self.x*other.x + self.y*other.y
    def __eq__(self, other):
        """ Check whether two vectors are equal """
        return self.x == other.x and self.y == other.y
    def __str__(self):
        """ Format the output for printing out the vector """
        return "({:g}, {:g})".format(self.x, self.y)
```

```
def __abs__(self):
    """ Return the length of the vector """
    return math.sqrt(self.x**2 + self.y**2)

def __ne__(self, other):
    """ Check whether two vectors are unequal """
    return not self.__eq__(other) # Reuse __eq__
```

The <code>__add__</code>, <code>__sub__</code>, <code>__mul__</code>, <code>__abs__</code>, and <code>__eq__</code> methods are quite easy to understand from the previous mathematical definitions of these operations. Notice that in the method <code>__ne__</code>, we simply reuse the equality operator <code>__eq__</code>, but precede it with a <code>not</code>. We can also implement this method as

```
def __ne__(self, other):
    """ Check whether two vectors are unequal. """
    return self.x != other.x or self.y != other.y
```

However, this implementation requires us to write more. It also has the danger of introducing an error in the logics of the boolean expressions. If we know that the __eq__ method works, then a more reliable approach is to reuse this method and observe that not == gives us the effect of !=.

Besides, we should beware of a problem for our implementation of the equality operator in class Vec2D. We have tested for equality by comparing both vector components. However, each component is a floating-point number which may be subject to round-off errors both in the representation on the computer and from previous (inexact) floating-point calculations. Two mathematically equal components may have different inexact representations on the computer. To resolve this problem, we should avoid testing for equality, but instead checking that the difference between the components is sufficiently small. The function isclose in the math module tells us whether two values are approximately equal or "close" to each other. It is a useful tool for comparing float objects. With this function, we replace if a == b by if math.isclose(a, b). A more reliable equality operator can now be implemented:

```
class Vec2D:
     :
     def __eq__(self, other):
        """ Check whether two vectors are equal """
```

```
return math.isclose(self.x, other.x) and \
    math.isclose(self.y, other.y)
```

As a rule of thumb, we should never apply the == test to two **float** objects.

In class Vec2D, the special method __len__ could be introduced as a synonym for __abs__. That is to say, for a Vec2D instance named v, len(v) is the same as abs(v) since the absolute value of a vector is mathematically the same as the length of the vector. However, if we implement

```
def __len__(self):
    """ Return the length of the vector """
    return self.__abs__() # Reuse __abs__
```

we will run into trouble as we compute **len(v)** whose answer is a **float** object. Python will then complain and tell us that **len(v)** must return an **int**. Thus **__len__** cannot be used as a synonym for the length of the vector in our application. On the other hand, we could let **len(v)** giving the number of components of the vector:

```
def __len__(self):
    """ Return the number of components of the vector. """
    return 2
```

This is not a very useful function as we already know that all our Vec2D vectors have just two components. Nevertheless, the $__len__$ method is useful for generalizations of the class to vectors with n components.

Below is an interactive Python session illustrating how to deal with Vec2D objects:

```
>>> u = Vec2D(0, 1)
>>> v = Vec2D(1, 0)
>>> w = Vec2D(1, 1)
>>> a = u + v
>>> print(a)
(1, 1)
>>> a == w
True
>>> a = u - v
>>> print(a)
(-1, 1)
>>> print(abs(u))
```

```
1.0
>>> u == v
False
>>> u != v
True
```

When you read through this interactive session, you should check that the calculation is mathematically correct, the resulting object type of a calculation is correct, and how each calculation is performed in the program. The latter topic is investigated by following the program flow through the methods of the class. You need this type of thorough understanding to find and correct any bugs in the class.

For real computations with vectors in the plane, you would probably just use a NumPy array of length 2. However, one thing such objects cannot do is evaluating u*v as a dot product since the multiplication operator for NumPy arrays is not defined as a dot product. Another difference between our Vec2D class and NumPy arrays is the abs function, which computes the length of the vector in class Vec2D, while it does something completely different with NumPy arrays.

3.2.3 Class Variables, Static Methods, and Class Methods

Up to now, we have only worked on instance variables — the data attributes owned by individual instances of a class. Sometimes it is natural to have data attributes that are shared among all instances. For example, we may have a data attribute that counts how many instances of a class have been made so far. Let us illustrate how to do this in a little class for points (x, y, z) in space:

```
class SpacePoint:
    counter = 0

def __init__(self, x, y, z):
    self.p = (x, y, z)
    SpacePoint.counter += 1
```

The counter attribute is initialized at the same indentation level as the methods in the class, and the attribute is not prefixed by self. Such attributes declared outside methods of a class are known as class variables that are shared among all instances of the class. To access class variables, we use the dot notation <ClassName>.<cvar> where <ClassName> is the class name and <cvar> is the name of the class variable. So we access the counter

attribute of SpacePoint class by using the notation SpacePoint.counter. We increase this common counter by 1 in the constructor of this class. That is to say, the counter is updated to keep track of the number of objects created so far each time when a new instance of SpacePoint class is made. For example,

The methods we have seen so far must be called through an instance, which is fed in as the self argument in the method. We can also define class methods and static methods which can be called without having any instances. Class methods are defined with a self-like parameter conventionally called cls that points to the class when the method is called. They cannot modify the state of individual instances of a class, but can still modify the state of a class that applies to all instances of the class. By contrast, static methods are defined without self arguments and they can neither modify the state of a class or the state of individual instances of a class. Just like class variables, we access both class methods and static methods using the dot notation <ClassName>.<methodname>
where <ClassName> is the class name and <methodname> is the name of the method. To illustrate the syntax for defining these methods, let us make a simple class Square with a class method unit_square and a static method area_formula:

```
class Square:
    """ A class representing squares """

def __init__(self, side):
    """ Initialize the side of the square """
    self.side = side

classmethod
    def unit_square(cls):
    """ Factory method creating a unit square """
```

```
return cls(1)

def area_formula():
    """ Print the area formula of a square """
print("Area of a square = side x side")
```

In class Square, the class method unit_square serves as a factory method which only creates unit squares. And the static method area_formula works like a plain Python function contained inside the class. These methods can be used without instantiating the class like this:

```
>>> us = Square.unit_square()
>>> us.side
1
>>> Square.area_formula()
Area of a square = side x side
```

We can also make an instance of class Square and call unit_square and area_formula through that instance:

```
>>> s = Square(2)
>>> s.area_formula()
Area of a square = side x side
>>> us = s.unit_square()
>>> us.side
1
```

Class methods are often used as factory methods that can create specific instances of a class. On the other hand, static methods are used when you want a global function, but find it natural to let the function belong to a class and be prefixed with the class name.

3.3 Class inheritance in Python

Suppose we have written a class for straight line functions $y = c_1 x + c_0$ as follows:

class Line:

```
""" A class representing straight line functions y = c1*x + c0 """

def __init__(self, c1, c0):
```

```
""" Initialize the coefficients in the straight line
        function """
    self.c1 = c1
    self.c0 = c0
def __call__(self, x):
    """ Evaluate the straight line function for a given value of
        x """
    return self.c1*x + self.c0
def table(self, L, R, n):
    """ Return a table with n points for L <= x <= R """
    s = ""
    import numpy as np
    for x in np.linspace(L, R, n):
        y = self(x)
        s += {\{0:10g\}} {\{1:10g\}} n".format(x, y)
    return s
```

A parabolic function $y = c_2x^2 + c_1x + c_0$ contains a straight line function as a special case with $c_2 = 0$. So the class for parabolic functions will be similar to a class for straight line functions. All we have do to is to add the new term c_2x^2 in the __call__ method and store c_2 in the constructor __init__:

class Parabola:

```
return self.c2*x**2 + self.c1*x + self.c0

def table(self, L, R, n):
    """ Return a table with n points for L <= x <= R """
    s = ""
    import numpy as np
    for x in np.linspace(L, R, n):
        y = self(x)
        s += "{0:10g} {1:10g}\n".format(x, y)
    return s</pre>
```

Observe that we can copy the table method from class Line without any modifications.

Python have a special construct so that class Parabola does not need to repeat the code that we have already written in class Line. We can specify that class Parabola *inherits* all code from class Line by adding "(Line)" in the class headline:

class Parabola(Line):

Class Parabola now automatically gets all the code from class Line. We say that class Parabola is *derived* from class Line. It means that class Parabola is a subclass of its superclass Line. In general, a Python subclass may be derived from one or more other superclasses using the syntax:

```
class <Subclass>(<Superclass1>, <Superclass2>, ..., <SuperclassN>)
```

where *<Subclass>* is the name of the subclass and *<Superclass1>*, *<Superclass2>*, ..., *<SuperclassN>* are the names of the superclasses. The subclass can be defined in the same file that defines the superclasses or in a different Python file which imports the superclasses.

Of course, the subclass Parabola should not be identical to the superclass Line. It needs to add data in the constructor for the new term and to modify the call operator to deal with the new term; but the table method can be inherited as it is. If we implement the constructor and the call operator in class Parabola, then these methods will *override* the inherited versions from class Line. On the other hand, if a table method is not implemented in class Parabola, then the one inherited from class Line would be available as if it were coded visibly in class Parabola.

When the methods __call__ and __init__ are implemented in subclass Parabola, they must first have the statements of the inherited methods from the superclass Line

and then include the additional code. An important principle in computer programming is to avoid duplicating code. We should thus call up functionality in class Line instead of copying statements from class Line methods to Parabola methods. Indeed, any method in a superclass can be called in its subclass using the syntax:

```
<Superclass>.<methodname>(self, <arg1>, <arg2>, ..., <argN>)
or
super(<Subclass>, self).<methodname>(<arg1>, <arg2>, ..., <argN>)
```

where *<Superclass>* is the name of the superclass, *<Subclass>* is the name of the subclass, *<methodname>* is the name of the method, and *<arg1>*, *<arg2>*,..., *<argN>* are the arguments of the method. Note that the latter construction works only if the superclass is derived from Python's general superclass **object**.

Therefore, we can write class Parabola as a subclass of class Line by simply implementing the new extra code that we want as shown below:

```
class Parabola(Line):
```

Such implementation of class Parabola provides exactly the same functionality as the previous version of class Parabola that did not inherit from class Line. Below is a quick demo of the new version of class Parabola in an interactive Python session:

```
>>> p = Parabola(1, -4, 3)
>>> p1 = p(2.0)
>>> print(p1)
-1.0
>>> print(p.table(0, 1, 5))
```

Observe that the statement p = Parabola(1, -4, 3) leads to a call to the constructor method in class Parabola. Inside the constructor in class Parabola, we call the constructor in class Line. In this latter method, we create two data attributes c0 and c1 in the self object. Back in class Parabola's constructor, we add a third data attribute c2 to the same self object. Finally, the self object is invisibly returned and referred to by p. The other statement p1 = p(2.0) has a similar program flow. First, the $_-call_-$ method in class Parabola is invoked. Then the program flow jumps to the $_-call_-$ method in class Line for evaluating the linear part $c_1x + c_0$ of the parabolic function. Lastly, the flow jumps back to the $_-call_-$ in class Parabola where we add the new quadratic term.

Python provides the function **isinstance(i, t)** for checking whether an instance **i** is of type **t**. For example,

```
>>> l = Line(2, -5)
>>> isinstance(1, Line)
True
>>> isinstance(1, Parabola)
False
```

We can see that a Line instance is not a Parabola instance. But is the reverse true?

```
>>> p = Parabola(3, 6, -9)
>>> isinstance(p, Parabola)
True
>>> isinstance(p, Line)
```

True

The answer is yes. From a class hierarchy perspective, an instance of the subclass Parabola is regarded as an instance of the superclass Line since it contains everything that a Line instance contains.

Every instance has an attribute __class__ that holds the type of class. If p is a Parabola instance, then

```
>>> p.__class__
```

```
<class 'parabola.Parabola'>
>>> p.__class__ == Parabola
True
>>> p.__class__._name__
'Parabola'
```

Beware that p.__class__ is a class object while p.__class__.__name__ is a string of the class name. These two variables can be used as an alternative test for the class type:

Nevertheless, it is not a recommended programming style to use **isinstance(p, Parabola)** for checking the type of an object.

In addition, Python provides the function **issubclass**(c1, c2) for checking whether a class c1 is a subclass of class c2. For example,

```
>>> issubclass(Parabola, Line)
True
>>> issubclass(Line, Parabola)
```

The superclasses of a class are stored as a tuple in the __bases__ attribute of the class object: If p is again a Parabola instance, then

```
>>> p.__class_.._bases__
(<class 'parabola.Line'>,)
>>> p.__class_.._bases__[0].__name__ # Extract name as string
'Line'
```

Rather than letting class Parabola inherit from class Line, we may let it *contain* a Line instance as a data attribute:

```
class Parabola:
```

False

```
""" A class representing parabolic functions y = c_2*x*x + c1*x + c0 """
```

```
def __init__(self, c2, c1, c0):
    """ Initialize the coefficients in the parabolic function """
    self.c2 = c2
    # Use a class Line instance store c1 and c0
    self.line = Line(c1, c0)

def __call__(self, x):
    """ Evaluate the parabolic function for a given value of x """
    return self.c2*x**2 + self.line(x)

def table(self, L, R, n):
    :
    :
```

Whether to use inheritance or an attribute depends on the problem being solved. If it is natural to say that a class A instance is a class B instance, we say that class A has an is-a relationship with class B. Alternatively, if it is natural to say that a class A instance has a class B instance, we say that class A has an has-a relationship with class B. In the current example, the is-a relationship is more natural since a special case of a parabola is a straight line.

However, from a mathematical viewpoint, many people will think that a line is a special case of a parabola instead of a parabola is a line. Adopting this reasoning reverses the dependency of the classes: now it is more natural to let Line be a subclass of Parabola (i. e. a Line instance is a Parabola instance). This is an easy task that can be done by implementing the classes as follows:

class Parabola:

```
""" Evaluate the parabolic function for a given value of x """
    return self.c2*x**2 + self.c1*x + self.c0

def table(self, L, R, n):
    :

class Line(Parabola):
    """ A class representing straight line functions y = c1*x + c0 """

def __init__(self, c1, c0):
    """ Initialize the coefficients in the straight line
        function """
    # Let class Parabola store c1 and c0
    Parabola.__init__(self, 0, c1, c0)
```

The __call__ and table methods can be inherited in class Line as they are defined in class Parabola. Notice that the inherited __call__ method from class Parabola will work since the coefficient c2 is zero.

In the above example, inheritance is used for *restricting* functionality instead of *extending* the functionality of the superclass. More importantly, it becomes clear that there is no unique way of arranging classes in hierarchies. Rather than starting with Line and introducing Parabola, Cubic, and perhaps eventually a general Polynomial class, we can start with a general Polynomial class and let Parabola be a subclass which restricts all coefficients except the first three to be zero. Class Line can then be a subclass of Parabola, restricting the value of one more coefficient.

How classes depend on each other is influenced by two factors: sharing of code and logical relations. From the sharing of code perspective, many people will say that class Parabola is naturally a subclass of class Line since the former adds code to the latter. On the other hand, Line is naturally a subclass of Parabola from the logical relations in mathematics. In fact, we can also consider the class dependency from the perspective of computational efficiency. When Line is a subclass of Parabola, we always evaluate the c_2x^2 term in the parabolic function although this term is zero. Nevertheless, when Parabola is a subclass of Line, we call Line.__call__ to evaluate the linear part of the parabolic function, and this call is costly in Python. From a pure efficiency point of view, we would reprogram the linear part in Parabola.__call__ (which is against the programming habit

we have been arguing for!). We should aware of the many different considerations that come into play when we establish class relationships.

As another example of inheritance, let us consider how to derive SavingsAccounts and CurrentAccount classes from BankAccount class as illustrated in Fig. 3.2. Below are the definitions of these two subclasses in the program specificaccounts.py:

```
# specificaccounts.py
# This program defines the classes SavingsAccount and CurrentAccount
# which represent a savings account and a current account,
# respecitvely. These classes are the subclass of BankAccount class.
# Last Update on 5 Jan 2022 by F K Chow
from bankaccount import BankAccount
class SavingsAccount(BankAccount):
    """ A class representing a savings account """
    def __init__(self, name, account_num, interest_rate,
                 opening_balance=0):
        """ Initialize the saving account with a name, an account
            number, an interest rate, and an opening balance whose
            default is 0 """
        self.interest_rate = interest_rate
        BankAccount.__init__(self, name, account_num,
                             opening_balance)
    def add_interest(self):
        """ Add interest to the account at the rate of
            self.interest_rate """
        self.balance *= (1.0 + self.interest_rate/100)
class CurrentAccount(BankAccount):
    """ A class representing a current account """
    def __init__(self, name, account_num, annual_fee,
```

```
transaction_limit, opening_balance=0):
    """ Initialize the current account with a name, an account
        number, an annual fee, a single transaction limit, and
        an opening balance whose default is 0 """
    self.annual_fee = annual_fee
    self.transaction_limit = transaction_limit
    BankAccount.__init__(self, name, account_num,
                         opening_balance)
def apply_annual_fee(self):
    """ Deduct the annual fee from the account balance """
    self.balance = max(0, self.balance - self.annual_fee)
def withdraw(self, amount):
    """ Withdraw amount from the bank account if there are
        sufficient funds and amount is less than the single
        transaction limit """
    if amount <= 0:</pre>
        print("Invalid withdrawal amount:", amount)
    else:
        if amount > self.balance:
            print("Insufficient funds")
        elif amount > self.transaction_limit:
            print("${0:.2f} exceeds the single transaction limit "
                  "of ${1:.2f}.".format(amount,
                                         self.transaction_limit))
        else:
            self.balance —= amount
```

We can observe that both these subclasses override the __init__ method in the superclass BankAccount to handle the new data attributes. Moreover, the withdraw method in the derived class CurrentAccount overrides that of the same name in the superclass BankAccount. As a result, if the withdraw is called on a CurrentAccount instance, then the one called is that of the CurrentAccount class.

Here is an interactive Python session demonstrating how to use these subclasses:

```
>>> savacc = SavingsAccount("Tom Hanks", 415228, 4.5, 1200)
>>> savacc.print_balance()
The balance of account number 415228 is $1200.00.
>>> savacc.add_interest()
>>> savacc.print_balance()
The balance of account number 415228 is $1254.00.
>>> curracc = CurrentAccount("Chris Evans", 783009, 15, 250)
>>> curracc.withdraw(300)
Insufficient funds
>>> curracc.deposit(900)
>>> curracc.print_balance()
The balance of account number 783009 is $900.00.
>>> curracc.withdraw(300)
$300.00 exceeds the single transaction limit of $250.00.
>>> curracc.withdraw(180)
>>> curracc.print_balance()
```

The balance of account number 783009 is \$720.00.