

Custom-Defined Functions ¹

Overview

In this handout, we will explore custom-defined functions. You will learn how to define functions using the `def` keyword, understand the importance of return statements, and utilize parameters, including positional, keyword, and default parameters. We will also cover advanced topics such as `lambda` functions. By the end of this handout, you will be able to create and use your functions.

1 Introduction

So far, you have used built-in Python functions such as `len()`, `min()`, `print()` and `id()`. In this section, we will learn how to define and use our own functions. Defining functions makes reading and maintaining a program significantly easier. A function is a group of statements that perform a specific task. Once defined, a function can be called and used in different parts of a program. The concept of a function in programming is similar to a function in mathematics. It usually accepts inputs (arguments), performs specific tasks, and returns outputs.

2 Definition

The following is the template for defining a function:

```
def function_name(parameters):    # a function is defined using the def keyword
    statement(s)                  # tasks to be performed
    ...
    return expression            # return output(s), if any
```

A Python function is defined using the keyword `def`, followed by the function name (which must be a valid identifier), a set of parentheses with possible parameters inside, and a colon `:`. Parameters are separated by commas `,`. The lines after the colon constitute the function block and must be indented. A function does not have to return an output; if it does, the output is specified using the `return` keyword.

Example: Defining the `max_value` function

```
def max_value(num_1, num_2):
    """This function accepts two numbers and returns their maximum"""
    if num_1 < num_2:
        return num_2
```

¹These notes and examples adapt the references listed at the end. They are compiled to fit the scope of this specific course.

```
    else:  
        return num_1
```

This defines a function named `max_value`. This function takes two arguments, `num_1` and `num_2`. The function returns the maximum of the two input parameters.

So far, you've defined (declared) a function. Now, it's time to execute (call) it. You can call a function by typing its name and passing the necessary arguments, like this:

Calling the `max_value` function

```
max_value(2, 5)
```

When you run this line, Python assigns 2 to `num_1` and 5 to `num_2`, and returns 5. As you can see, when arguments are not explicitly named, Python assigns them in the order they are provided to `num_1` and `num_2`. Alternatively, you can call the function like:

```
max_value(num_1 = 2, num_2 = 5) or  
max_value(num_2 = 5, num_1 = 2),
```

where you explicitly specify which argument corresponds to `num_1` and `num_2`.

Function Definition Template

To define a function, use the `def` keyword followed by the function name and parentheses. Inside the parentheses, specify any parameters. Use the `return` statement to send back a value from the function.

```
def function_name(parameters):  
    Function body  
    return value
```

3 Function docstring

In the above example, the string inside triple quotes `"""..."""` in the first line of the function definition is a `docstring`. This is the recommended way to document the purpose of a function. The *Style Guide for Python Code* (<https://www.python.org/dev/peps/pep-0257/>) states that each function should contain a `docstring` that explains its purpose and details. When you call a function, you can access its `docstring` using one of the following methods:

3.1 Displaying docstring in Jupyter

In **JupyterLab** or **Jupyter Notebook**, use one of the following methods:

Method 1: Type a `?` following the function name (without parentheses) and run it. This will provide information about the function, including its `docstring`.

Method 2: Type `??` following the function name (without parentheses) and run it. This will also give you the function's source code (if available).

Method 3: Type the function's name (without parentheses) and press `Shift-Tab`. Once you read the `docstring`, press `Esc` to close the menu.

You can also apply the above methods to get information about Python's built-in functions such as `len()`, `print()`, etc.

3.2 Displaying docstring in PyCharm

In **PyCharm**, by typing the function's name (without parentheses) and pressing `Ctrl+Q`, you can get the function's `docstring`. Alternatively, you can choose *Quick Documentation* from the `View` menu.

Docstring

A **docstring** is a special type of comment used to describe what a function does. It is written as the first statement in the function and is enclosed in triple quotes. Docstrings help improve code readability and can be accessed using the `help()` function.

3.3 Variable Scope

A variable's scope is where you can access it. Consider the following snippet returning the sum of two numbers, `x` and `y`:

Defining the `calc_sum` Function

```
def calc_sum(x, y):
    """Calculates sum of two numbers"""
    result = x + y
    return result
```

The variable `result` is created inside the function and can be accessed only within the function. Trying to access it outside the function block results in an error. Here is an example:

Attempting to Access a Local Variable Outside Its Scope

```
def calc_sum(x, y):
    """Calculates sum of two numbers"""
    result = x + y
    return result

print(result)
```

This yields an error:

```
NameError: name 'result' is not defined
```

In other words, the variable `result` is local to the function `calc_sum`.

4 Default Parameter Values in Function Definitions

You can assign default values to function parameters. This means that if the user does not provide a value for a parameter, the function will use the `default` value.

Here is an example showing how to define a function with default parameter values:

Function with Default Parameter Values

```
def calculate_total(price, tax_rate = 0.08):
    """Calculates the total cost including tax for a given price."""
    return price * (1+ tax_rate)
```

In this example, the `calculate_total` function has two parameters: `price` and `tax_rate`. The `tax_rate` parameter has a default value of 0.08.

You can call it with both arguments, as shown in the code below:

Calling the Function with Both Arguments

```
print(calculate_total(100, 0.1))
```

The output will be:

110.0

You can also call the same function by providing only the price, as shown in the line below:

Calling the Function with Default Parameter

```
print(calculate_total(100))
```

The output will be:

108.0

5 Understanding Positional and Keyword Arguments

Before we proceed, it's important to briefly explain the difference between *positional* and *keyword* arguments.

5.1 Positional arguments

Positional arguments are arguments that are passed to a function in order without specifying the parameter names. The function assigns each value to the corresponding parameter based on its position (order).

Here is an example:

Defining a Function with Positional Arguments

```
def send_message(arg_1, arg_2):
    """This function sends a message"""
    return f"{arg_1}, {arg_2}!"
```

Let's call this function:

Calling send_message with Positional Arguments

```
print(send_message("BARM", "The Best"))
```

The output will be:

BARM is The Best!

But if you call it with reversed order of the arguments, such as:

Calling send_message with Reversed Positional Arguments

```
print(send_message("The Best", "BARM"))
```

The output will be:

The Best is BARM!

As you can see, the order we feed the arguments matters because `arg_1` and `arg_2` are positional arguments, meaning they are assigned values based on their position in the function call.

5.2 Keyword arguments

Keyword arguments are arguments that are passed to a function by explicitly specifying the parameter names along with their values. This allows us to provide arguments in any order, enhancing both flexibility and readability of the code.

For example, we can call the same function using keyword arguments:

Calling send_message with Keyword Arguments

```
print(send_message(arg_2="The Best", arg_1="BARM"))
```

The output will be:

BARM is The Best!

In this example, we used the parameter names `arg_1` and `arg_2` when calling the function. Because the arguments are passed by name, the order of the arguments no longer matters.

Using keyword arguments improves clarity, especially in functions with many parameters, making the code more understandable and less prone to errors related to argument order.

Now, let's explore how this connects to `*args` and `**kwargs`, which allow even more flexibility when working with both positional and keyword arguments.

Positional and Keyword Arguments

Positional arguments are the most common way to pass values to a function. They are assigned to parameters based on their position in the function call.

Keyword arguments allow you to specify which parameter you are passing a value to by using the parameter name. This makes the code more readable and allows you to skip optional parameters.

6 A Function with an Arbitrary Number of Arguments

6.1 *args as a Function Argument

We are often unaware of the number of arguments the user will feed into our custom-defined function. In this case, we can use `*args` to signal Python that the user may enter an arbitrary number of arguments. The `*args` collects all the arguments passed to the function into a tuple named `args`.

The following snippet defines a function that accepts an arbitrary number of parameters and calculates their average:

Defining `calc_avg` with Arbitrary Arguments

```
def calc_avg(*args):
    """Calculates the average of given numbers"""
    if len(args) == 0:
        return 'You need to input at least one number'
    else:
        average = sum(args) / len(args)
        return average
```

Here, `*args` allows the function to accept any number of arguments, the values are passed based on their position. Each value can be of any type (string, integer, list, etc.). These values are stored in a tuple named `args`. You can then use the `args` tuple inside the function block.

Now, you can call this function with as many input arguments as you wish:

Calling `calc_avg` with Different Numbers of Arguments

```
print(f'Average of no number: {calc_avg()}')
print(f'Average of one number: {calc_avg(20)}')
print(f'Average of three numbers: {calc_avg(14, 2, 8)}')
print(f'Average of five numbers: {calc_avg(2.5, 3, 0.4, 30, 1)}')
```

This yields:

```
Average of no number: You need to input at least one number
Average of one number: 20.0
Average of three numbers: 8.0
Average of five numbers: 7.18
```

Note: The word `args` is just a convention, and you can use any name of your choice. In the above example, `calc_avg(*numbers)` would have worked and would have stored all input arguments in a tuple named `numbers`.

*args

The `*args` syntax in a function definition allows you to pass a variable number of positional arguments to the function. It collects extra positional arguments into a tuple, enabling the function to handle more inputs than the number of parameters defined.

6.2 **kwargs as a Function Argument

In the previous example, `*args` collects all the positional arguments into a tuple. However, sometimes we may want to accept arguments that are provided with a name. In this case, we can use `**kwargs` to allow the function to accept any number of keyword arguments. The `**kwargs` collects these keyword arguments into a dictionary named `kwargs`.

Here is an example:

Defining a Function with **kwargs

```
def order_summary(**kwargs):
    """Displays a summary of a food order with details."""
    print("Order Summary:")
    for key, value in kwargs.items():
        print(f"{key.capitalize()}: {value}")
```

Now, you can call this function with any number of keyword arguments, allowing for flexible input based on the details of the order:

Calling `order_summary` with Keyword Arguments

```
order_summary(item="Burger", quantity=2, extras="Cheese", side="Fries", drink="Cola")
```

This will output:

```
Order Summary:
Item: Burger
Quantity: 2
Extras: Cheese
Side: Fries
Drink: Cola
```

In this example, `**kwargs` allows us to pass in any number of keyword arguments in the form of key-

value pairs. These arguments can vary depending on what kind of details we want to include. The keys represent different attributes of the order (such as `item`, `quantity`, `extras`), and the values represent their corresponding details (like "Burger", 2, "Cheese").

When you use `**` before a parameter name in a function definition, it collects all keyword arguments into a dictionary. This allows your function to accept any number of keyword arguments, which can be very useful when you do not know beforehand which arguments will be passed.

Similar to `*args`, the name `kwargs` is a convention; you can use any name you like, such as `**data`.

Let's create a function that summarizes personal information:

Defining `summarize_info` with `**kwargs`

```
def summarize_info(**data):
    """Summarizes personal information"""
    summary = "Summary of Information:\n"
    for key, value in data.items():
        summary += f"- {key.capitalize()}: {value}\n"
    return summary
```

Now, you can call this function:

Using `summarize_info`

```
info = summarize_info(name="Johny", age=25, profession="Sr. Business Analyst")
print(info)
```

This will output:

```
Summary of Information:
- Name: Johny
- Age: 25
- Profession: Sr. Business Analyst
```

While it is difficult to provide a precise template for using `**kwargs` in function definitions, the following structure is common in many practical applications:

```
def function_name(**kwargs):
    """Process key-value pairs.
    This processing is done using
    - kwargs.keys()
    - kwargs.values()
    - or kwargs.items()
    Similar to what you see below"""

    for key, value in kwargs.items():
        # Process each key-value pair.
```

```
# Below line simply prints them
print(f"[key]: {value}")
```

A common structure for passing key-value pairs to this function is in the form of:

```
function_name(key1 = value1, key2 = value2, key3 = value3, ...)
```

In this template, `key1`, `key2`, and `key3` must be valid Python identifiers (strings without quotes). You should not use quotations like `', "`, or `"""` around `key1`, `key2`, or `key3` in the function call. Python will automatically treat these as strings and convert them into the appropriate keys for the `kwargs` dictionary. `value1`, `value2`, `value3` could be any type (`string`, `integer`, `list`, etc.).

Understanding the difference between positional and keyword arguments helps us to use `*args` and `**kwargs` effectively in our functions. While `*args` allows us to pass a variable number of positional arguments, `**kwargs` lets us pass a variable number of keyword arguments, giving our functions greater flexibility.

You can also define functions that accept arbitrary positional and keyword arguments. I encourage you to explore this on your own.

`**kwargs`

The `**kwargs` syntax in a function definition allows you to pass a variable number of keyword arguments to the function. It collects extra keyword arguments into a dictionary.

7 Return Multiple Values from a Function

When writing a function that returns multiple values, we can use different data structures like `tuple`, `list`, and `dictionary`. Here's an example function that accepts four numbers and returns the minimum, maximum, and average using each of these structures.

A tuple is useful when you want to return a fixed set of values. In this case, it returns the minimum, maximum, and average of the numbers.

Returning Multiple Values Using a tuple

```
def stats_tuple(a, b, c, d):
    """Returns min, max, and average as a tuple"""
    minimum = min(a, b, c, d)
    maximum = max(a, b, c, d)
    average = (a + b + c + d) / 4
    return minimum, maximum, average
```

Calling this function:

Calling the function

```
min_val, max_val, avg = stats_tuple(5, 8, 2, 10)
print(f"Min: {min_val}, Max: {max_val}, Average: {avg}")
```

This will output:

```
Min: 2, Max: 10, Average: 6.25
```

A `list` is ideal when you need a sequence of values that can be modified. Here, we return the same statistics in a `list`.

Returning Multiple Values Using a list

```
def stats_list(a, b, c, d):
    """Returns min, max, and average as a list"""
    minimum = min(a, b, c, d)
    maximum = max(a, b, c, d)
    average = (a + b + c + d) / 4
    return [minimum, maximum, average]
```

Calling this function:

Calling the function

```
result_list = stats_list(5, 8, 2, 10)
print(result_list)
```

This will return:

```
[2, 10, 6.25]
```

A `dictionary` is perfect when you want to label the values you're returning, making it clearer what each value represents.

Returning Multiple Values Using a dictionary

```
def stats_dict(a, b, c, d):
    """Returns min, max, and average as a dictionary"""
    minimum = min(a, b, c, d)
    maximum = max(a, b, c, d)
    average = (a + b + c + d) / 4
    return {"min": minimum, "max": maximum, "average": average}
```

Calling this function:

Calling the function

```
result_dict = stats_dict(5, 8, 2, 10)
print(result_dict)
```

This will return:

```
'min': 2, 'max': 10, 'average': 6.25
```

Returning Multiple Values

You can return multiple values from a function using a tuple, list, or dictionary. This allows you to pass back more than one value in a single `return` statement.

8 return or No return?

8.1 Is There a Difference?

So far, we have used the `return` keyword to specify the output of a function. You might wonder if the same result can be achieved with the `print()` function. Let me be clear: **Don't do it!**

Let's see a few simple examples:

Defining add_numbers Function

```
def add_numbers(x, y):
    """This function returns the sum of two numbers"""
    return x + y
```

Now, if you try:

Calling add_numbers

```
c = add_numbers(3, 4)
print(f'sum is: {c}')
print(f'type of output: {type(c)}')
```

The output would be:

```
sum is: 7
type of output: <class 'int'>
```

There is no surprise here. Now, let's try something that, on the surface, looks identical:

Defining add_numbers_revised Function

```
def add_numbers_revised(x, y):
    """This function prints the sum of two numbers"""
    print(x + y)
```

By calling the same set of commands:

Calling add_numbers_revised

```
c = add_numbers_revised(3, 4)
print(f'sum is: {c}')
print(f'type of output: {type(c)}')
```

The output would be:

```
7
sum is: None
type of output: <class 'NoneType'>
```

That's not what you expected, is it? You probably expected to see:

```
7
7
<class 'int'>
```

Why did this happen? Keep reading...

8.2 Importance of return Keyword in Function Definition

A function is a block of code that accepts some input and returns a result. Inputs are optional, but from Python's internal perspective, a return value is not. If you write a function without a `return` statement, like the above `add_numbers_revised()` function, Python will still return **something**. If your function does not have a `return` statement, Python will automatically return `None`².

In the case of the `add_numbers_revised` function, Python returns `None` because there is no `return` statement. This can cause problems when you're testing or debugging your code. Imagine you expect the function to return a number, like 7, but instead it returns `None`. You might not immediately realize what went wrong, making it harder to figure out the issue. When a function silently returns `None` instead of a useful value, it can make it difficult to trace bugs or understand why the function isn't working as expected.

For these reasons, we will have this firm rule in this class and moving forward:

Every function must return a useful value

Even if you are writing a function that doesn't seem to need a return value, always make it a habit to return `True`, `False`, or a meaningful message. The worst thing you can do is omit the `return` statement from a function.

Importance of the `return` Statement

The `return` statement is essential in a function as it allows the function to send back a value to the user, enabling further processing and enhancing code reusability. Without it, a function will return `None` by default, limiting its usefulness.

²We have introduced the concept of `None` in the previous handout.

9 Argument Validation (Sanity Check)

Consider the following simple function:

Defining add_numbers Function

```
def add_numbers(x, y):
    """This function returns the sum of two numbers"""
    return x + y
```

Now, if you try:

Calling add_numbers with Invalid Arguments

```
add_numbers(3, 'testing')
```

Since it is not possible to add an `int` and a `str`, you will understandably get an `error`:

```
TypeError: unsupported operand type(s) for +: 'int' and 'str'
```

The input argument was invalid; hence, we got an `error`.

When writing functions, it's important to ensure that the input arguments are valid to prevent errors and unexpected behavior. One common issue is attempting operations between incompatible data types, which can lead to runtime errors. To avoid this, we can implement argument validation to check the input before performing any operations. There are two standard methods for argument validation:

1. Using the `isinstance` built-in function.
2. Using the `try...except...` statement.

9.1 Using isinstance for Argument Validation

`isinstance` is a built-in function used to determine whether an object is of a particular type. This function returns `True` or `False`.

Here is an example:

Using isinstance

```
x = 10
isinstance(x, int)
```

returns

```
True
```

and trying:

Checking Type with `isinstance`

```
str_1 = 'Carey'  
isinstance(str_1, float)
```

returns

False

Here is another example:

Using `isinstance` with Multiple Types

```
z = (1, 2, 3)  
isinstance(z, (float, int, str, list, dict))
```

Checks if (1, 2, 3) is one of the types mentioned in (float, int, str, list, dict) and returns:

False

Because z is a tuple and tuple is not listed inside isinstance function.

`isinstance` can be used for argument validation.

Here is one example:

Argument Validation Using `isinstance`

```
def add_numbers(x, y):  
    """This function returns the sum of two numbers if both are valid."""  
    if isinstance(x, (int, float)) and isinstance(y, (int, float)):  
        return x + y  
    else:  
        return 'Error: please enter valid numbers!'
```

If both x and y are numerical types (int or float), the add_numbers() function returns the sum of its arguments. Otherwise, the function will return 'Error: please enter valid numbers!'.

9.1.1 `isinstance` vs. `type` vs. `is`

When checking the type of an object in Python, you might consider using `isinstance`, `type()`, or the `is` operator. While all of these can check types, they work differently. Let's look at the key differences.

- `isinstance()`: This checks if an object belongs to a specific class. It returns `True` if the object is of the given class and `False` otherwise. It's useful when you need to verify that an object is of the expected type before performing certain operations.
- `type()`: This function returns the exact type of an object. It checks whether the object is of the specified type by comparing the type directly. This is helpful when you need to know the precise class of an object, but it's more strict and less flexible than `isinstance()` for type checking.

- `is`: This checks whether two objects are the exact same object in memory. It doesn't just compare values but checks if both variables point to the same memory location. Use this when you need to know if two variables refer to the same object, not just equal values.

Let's see a few examples:

Using `isinstance()` with Multiple Types

```
z = (1, 2, 3)
isinstance(z, (float, int, str, list, dict))
```

False

In this example, `isinstance` checks if `z` is any of the types listed (`float`, `int`, `str`, `list`, `dict`). The result is `False` because `z` is a `tuple`, which is not in the list of types.

Using `type()` to Check Exact Type

```
x = [1, 2, 3]
print(type(x) == list) # True, because x is exactly a list
```

True

Here, `type(x)` returns the exact type of `x`, which is `list`. This will return `True` if `x` is a `list`.

Using `is`

```
a = [1, 2, 3]
b = [1, 2, 3]

if a is b:
    print('a and b point to the same object in memory')
else:
    print('a and b are different objects in memory') # This will be printed
```

a and b are different objects in memory

Although `a` and `b` contain the same values, they are different objects in memory, so `a is b` returns `False`³. The `is` operator checks if two variables point to the exact same object, not just if they have the same value.

Let's see a practical example of how to validate the types of arguments passed to a function.

Here is a simple example

³Alternatively, you can check this using the `id()` function.

Argument Validation Using `isinstance`

```
def add_numbers(x, y):
    """This function returns the sum of two numbers if both are valid."""
    if isinstance(x, (int, float)) and isinstance(y, (int, float)):
        return x + y
    else:
        return 'Error: please enter valid numbers!'
```

Here, `isinstance()` is used to check if both `x` and `y` are either integers or floats. If they are, the function returns their sum; otherwise, it returns an error message.

Calling this function:

Calling the function with Invalid Arguments

```
add_numbers(3, '5')
```

returns

Error: please enter valid numbers!

This example shows how `isinstance` helps ensure that only valid types are passed to the function.

Alternatively, let's use `type()` for the same function:

Argument Validation Using `type()`

```
def add_numbers(x, y):
    """This function returns the sum of two numbers using type()."""
    if type(x) in [int, float] and type(y) in [int, float]:
        return x + y
    else:
        return 'Error: please enter valid numbers!'
```

Calling this function:

Calling the function with Invalid Arguments

```
add_numbers(3, '5')
```

Error: please enter valid numbers!

Expectation in this course: We recommend using the `isinstance` function for type checking as it is more flexible and supports checking multiple types easily.

9.2 Using try...except... Statement

The `try...except...` statement is widely used for error handling. Discussing `try...except...` statements can be very elaborate; interested readers can consult the Python documentation at <https://docs.python.org/3/tutorial/errors.html>. Here, we will provide a simple example showing a generic use of `try...except....` For most applications, this structure is a good starting point.

When defining a function using `try...except....`, you need to embed the function logic under the `try` block and use the `except` block for handling possible errors.

Here is the previous example with the `try...except...` statement:

Argument Validation Using try...except...

```
def add_numbers(x, y):
    """This function returns the sum of two numbers"""
    try:
        return x + y
    except Exception as e:
        return e
```

Trying:

Calling add_numbers with Valid Arguments

```
add_numbers(2, 3)
```

Yields:

```
5
```

Whereas:

Calling add_numbers with Invalid Arguments

```
add_numbers(2, '3')
```

Yields:

```
TypeError("unsupported operand type(s) for +: 'int' and 'str'")
```

`try...except...` blocks can also utilize `raise`, `else`, and `finally` clauses. Details of error handling are outside the scope of this course.

Sanity Checks: `isinstance` and `try . . . except`

Sanity checks help ensure that inputs to functions are valid. Two common methods are:

- `isinstance`: Checks the type of a variable. This helps confirm that the input is of the expected type.
- `try . . . except`: Catches exceptions that occur during execution, allowing the program to handle errors more strategically.

10 A Few Hints About Writing Good Functions

Defining good functions dramatically improves the readability and maintainability of your code. On the other hand, having a few poorly written functions may cause headaches for you and anyone else who reads or uses your code.

Here are some rules of thumb for writing good functions in Python:

- **A Good Function Name:** Writing a good function starts with a sensible and clear name. Clear, long names are always better than short, unclear ones! Try to use **full English words** instead of abbreviations and acronyms.
 - Avoid using names like `get_something` or `do_something`. Avoid referring to the input type in the function's name. Terms such as `get_something_from_list` and `do_something_with_dictionary` can be reduced to `something`. All other details, such as input data type, can be elaborated in the `doc string`.
- **Clear docstring:** Include a `docstring` in every function you write, no matter how short or simple. Use complete sentences and proper grammar and punctuation to describe the purpose of the function, explain the input arguments, and discuss the return value.
- **Proper Length:** The rule of thumb is to keep function length under 20–30 lines. If your function definition exceeds this limit, you can most likely break it into several smaller functions. Multiple smaller functions are much better than one very long function. Longer functions are much harder to debug and understand.
- **return Statement:** Any well-written function must have a `return` statement, and it must return something useful; no exceptions.
- **Function Specialization:** A well-written function does one thing and does it well. Do not try to accomplish too much with just one function! There is no shame in defining multiple functions that perform different tasks.

Remember:

A small, single-purpose function is a good function

11 lambda Functions

Functions improve code organization and code reusability. Earlier, we saw that the general syntax of a function definition is:

```
def function_name(parameter_list):
    <function block>
```

```
return expression
```

Sometimes, a function has such a simple definition that instead of formally defining it, we can define it *on the go* without a name. A `lambda` function (expression), or simply a `lambda`, is a small anonymous (no name) function that can take any number of arguments but can only have one expression. In other words, `lambda` functions are small anonymous one-line functions. `lambda` functions in Python have their roots in *Lambda Calculus* (https://en.wikipedia.org/wiki/Lambda_calculus).

A `lambda` has a very concise syntax beginning with the `lambda` keyword followed by a comma-separated parameter list, a colon `:`, and an expression.

```
lambda parameter_1, parameter_2, ..., parameter_n : expression
```

Imp

Here is an example:

Defining a `lambda` Function

```
lambda x, y: x + y
```

This defines a simple `lambda` function that accepts two input parameters, `x` and `y`, and returns their sum `x + y`. You can apply the defined `lambda` to arguments by surrounding the `lambda` definition and its arguments with parentheses, as in:

Using a `lambda` Function

```
(lambda x, y: x + y)(3, 4)
```

Yields:

7

Please note that:

```
lambda parameter_list: expression
```

is equivalent to:

```
def function_name(parameter_list):
    return expression
```

The following section will show one common application of `lambda` functions.

`lambda` Function

A **lambda function** is a small anonymous function defined using the `lambda` keyword. It can take any number of arguments but can only have a single expression. `lambda` functions are often used functions like `map()`, `filter()`, and `sorted()`.

11.1 lambda Function with the sorted Function

lambda functions are used very frequently with the built-in `sorted()` function. `sorted()` sorts members of a given iterable in ascending or descending order and returns a new sorted list. The syntax of the `sorted()` function is as follows:

```
sorted(iterable, key=None, reverse = False)
```

`sorted()` has two important optional parameters:

- Optional `reverse` argument with a default value of `False`. For sorting in descending order, set `reverse=True`.
- Optional `key` argument with a default value of `None`. You can pass a function to the `key` argument for the sort comparison. This function is called on each iterable element before making comparisons.

It is common practice to use a `lambda` function with the `key` argument.

Here are a few examples:

Sorting a list Alphabetically

```
names_list = ['Milo', 'Daisy', 'Ray', 'Howard']
sorted(names_list)
```

Yields an alphabetically sorted list:

```
['Daisy', 'Howard', 'Milo', 'Ray']
```

Now, let's try to sort the `names_list` according to their length:

Sorting by Length Using `len`

```
names_list = ['Milo', 'Daisy', 'Ray', 'Howard']
sorted(names_list, key=len)
```

Yields:

```
['Ray', 'Milo', 'Daisy', 'Howard']
```

By passing the built-in function `len` as a key, only the lengths of the list items are compared and sorted. Let's do the same thing using a `lambda` function:

Sorting by Length Using `lambda`

```
names_list = ['Milo', 'Daisy', 'Ray', 'Howard']
sorted(names_list, key=lambda item: len(item))
```

This passes every item of `names_list` to the `lambda` function; this function returns `len(item)` for each `item`. Finally, the `sorted` function compares only the lengths of items and returns:

```
['Ray', 'Milo', 'Daisy', 'Howard']
```

Imagine, for some reason, you would like to sort members of `names_list` based on the third character of each member. This is easily doable by:

Sorting by Third Character Using `lambda`

```
names_list = ['Milo', 'Daisy', 'Ray', 'Howard']
sorted(names_list, key=lambda item: item[2])
```

This passes every item of `names_list` to the `lambda` function; this function returns each item's third character (at index 2). Finally, the `sorted` function compares only the third characters and returns:

```
['Daisy', 'Milo', 'Howard', 'Ray']
```

Let's conclude this section with a more elaborate practical example. Imagine you have a list of employees:

list of employee dictionaries

```
employees = [
    {'name': 'Tina', 'age': 23},
    {'name': 'Alexis', 'age': 35},
    {'name': 'Cynthia', 'age': 32}
]
```

You are tasked with sorting and printing the employee dictionaries by their age. This can be easily accomplished using the `lambda` function, as shown in the snippet below:

Sorting by Third Character Using `lambda`

```
employees = [
    {'name': 'Tina', 'age': 23},
    {'name': 'Alexis', 'age': 35},
    {'name': 'Cynthia', 'age': 32}
]

sorted_employees = sorted(employees, key=lambda x: x['age'])
print(sorted_employees)
```

The output will be:

```
['name': 'Tina', 'age': 23, 'name': 'Cynthia', 'age': 32, 'name': 'Alexis',
'age': 35]
```

12 Distinction Between function, module, package, and library

So far, we have used Python's standard library and its vast capabilities.

Python's standard library has well over 200 modules such as `math`, `random`, and `decimal`. Each module has

numerous submodules and functions, such as the `sqrt` function in the `math` module or the `randint` function in the `random` module.

Python has a hierarchical structure for organizing these capabilities, similar to the file structure in your computer, where a folder may contain a set of subfolders, and each of those subfolders may include files and more subfolders. The following describes this hierarchical structure:

- A collection of Python variables, classes, and functions is called a **module**. ⁴
- A collection of related modules is usually called a **package**.
- A **library** is a collection of one or more packages.

12.1 A Few Notes About Module Import Practices

This section explains a few important notes about module importation using the `random` module of the standard library as an example. This approach can be used with any other library/module.

Python has a standard library. You can import a module called `random` from this library using:

Importing the `random` Module

```
import random
```

A function called `random()` in the `random` module generates a random number between 0 and 1. You can access this function using:

Using `random.random()`

```
import random
random.random()
```

To shorten the notation, you can use:

Importing with an Alias

```
from random import random as rd
rd()
```

By executing `rd()` without the need to precede it with the module name `random` and a dot `.`, you can generate a random number. It is possible to import more than one identifier from a module. Here is an example:

Importing Multiple Identifiers with Aliases

```
from random import random as rd, randint as rint
```

Now you can simply use the shortened names `rd` and `rint`.

⁴Any Python file with the extension `.py` is considered a module.

12.2 Wildcard Import Using *

It is possible to import all identifiers in a module with a **wildcard import** in the form of:

```
from modulename import *
```

This makes all the module's identifiers available in your code.

Warning: Avoid wildcard imports! This can lead to errors.

Here is an example:

An Example of Naming Collision

```
pi = 'delicious'

from math import *
print(pi)
```

This defines an object `'delicious'` and binds the variable `pi` to it. Then it uses a wildcard import and finally prints `pi`. This will yield:

```
3.141592653589793
```

Now let's try:

Another Example of Naming Collision

```
from math import *
pi = 'delicious'

print(pi)
```

This does a wildcard import, then defines an object `'delicious'` and binds the variable `pi` to it. By printing `pi`, you will get:

```
delicious
```

As you can imagine, there is a high possibility of naming collisions. **So please avoid wildcard imports as much as possible.**

Next Topic Preview

In the next handout, we will explore Pandas, a powerful data manipulation and analysis library for Python. We will cover essential functionalities, including data structures like Series and DataFrames, how to import and export data, and perform operations such as filtering, grouping, and aggregating.

13 Exercises

1. Write a function `calculate_sample_variance(data)` that accepts a list of numbers and calculates the sample variance.
2. Define a function `filter_even_numbers(numbers)` that takes a list of integers and returns a new list containing only the even numbers from the original list.
3. Create a function `count_vowels(string)` that takes a string as input and returns the count of vowels (a, e, i, o, u) in the string, ignoring case.
4. Create a function `reverse_string(string)` that takes a string as input and returns the string reversed.
5. Write a function `calculate_factorial(n)` that takes a non-negative integer `n` and returns its factorial.
6. Define a function `merge_dictionaries(dict1, dict2)` that takes two dictionaries and merges them into a single dictionary. For
 - `dict1 = { 'a': 1, 'b': 2 }` and
 - `dict2 = { 'b': 3, 'c': 4 }``merge_dictionaries(dict1, dict2)` should return `{ 'a': 1, 'b': 3, 'c': 4 }`.
7. Define a function `merge_dictionaries(dict1, dict2)` that takes two dictionaries and merges them into a single dictionary. If there are overlapping keys, sum their values. For example:
 - `dict1 = { 'a': 1, 'b': 2 }`
 - `dict2 = { 'b': 3, 'c': 4 }``merge_dictionaries(dict1, dict2)` should return `{ 'a': 1, 'b': 5, 'c': 4 }`.
8. Write a function `roll_dice(num_rolls)` that accepts the number of rolls as an argument and generates the results of rolling a six-sided die the specified number of times. Use the `random` module.
9. Define a function `generate_random_password(length)` that generates a random password containing uppercase letters, lowercase letters, digits, and special characters. The length of the password should be specified as an argument. Use the `random` module. **Hint:** Look into the `random.choice()` function to select random characters.
10. Create a function `calculate_mean(numbers)` that takes a list of numbers as input and returns the mean (average) value.
11. Create a function `count_occurrences(data, target)` that takes a list and a target value, and returns the number of times the target appears in the list.
12. Write a function `trimmed_mean(grades, percentage)` that takes a list of grades and a percentage as input.

The function should remove the specified percentage of the highest and lowest grades and then return the mean of the remaining grades. Ensure to handle cases where the percentage might result in removing more grades than are available.

14 Exercise Solutions

Solutions to these problems can be found on the following GitHub page:

https://github.com/NaserNikandish/Python_For_Data_Analysis

You can also access the same link using the QR code below:



15 References

References and Resources

The following references and resources were used in the preparation of these materials:

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11. Python learning platform at <https://www.learnpython.org/>.
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