SYSTEMS DEVELOPMENT FOR COMPUTATIONAL SCIENCE LECTURE 9

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LAST TIME

- The concept for consistency in the Python language:
 - The Python data model
 - Special class methods (also called "dunder" methods)
- A custom sequence example: French deck of cards
- Software Licenses

TODAY

Main topics: Classes and member functions (methods) revisited, Python modules and packages, Python Package Index

Details:

- Revisiting classes:
 - Class methods
 - Static class methods
 - Instance methods
- Python modules
- Python packages and the Python Package Index (PyPI)

AGENDA CHECK:

 Milestone M1B is due on Tuesday 10/04 → first touch with GitHub Actions to prepare your project repository for task automation using continuous integration (CI).

At this point you should feel comfortable with user-defined classes, special class methods and the *Python data model*. You should develop an intuition for the *consistency* of the Python programming language once you have understood these *key concepts*.

Recall the decorator design pattern discussed in Lecture 6:

- A decorator wraps hidden code around a function argument and returns a new decorated function object.
- Python makes use of decorators to further specialize methods in a user-defined class.
- These decorators are available since Python 2.2 (new-style classes, see previous lecture).
- There are two such decorators (PEP318) useful in classes:
 - @classmethod: transforms a method into a class method.
 - @staticmethod: transforms a method into a static method.

Let us revisit the Complex class from Lecture 7:

```
class Complex:
       def __init__(self, real, imag):
            """Default initialization of a complex number"""
           self.real = real
           self.imag = imag
       @classmethod
       def make_complex(cls, real, imag):
8
            """Factory method for a complex number"""
           return cls(real, imag)
10
       def __repr__(self):
            """String representation"""
13
           return f"{type(self).__name__}({self.real}, {self.imag})"
14
15
16
       def __eq__(self, other):
            """Equality of two complex numbers"""
17
18
           return (self.real == other.real) and (self.imag == other.imag)
```

Let us revisit the Complex class from Lecture 7:

```
1 class Complex:
2   def __init__(self, real, imag):
3     """Default initialization of a complex number"""
4     self.real = real
5     self.imag = imag
6
7   @classmethod
8   def make_complex(cls, real, imag):
9     """Factory method for a complex number"""
10     return cls(real, imag)
```

- make_complex is a special class method; a result from the @classmethod decorator.
- Note the difference in the function signature:
 - Regular methods take self as first argument (reference to instance of class).
 - Class methods take cls as first argument (reference to class type).
- The name cls is again a convention just as self is chosen by convention.
- The return value cls(real, imag) is the same as Complex(real, imag). The
 @classmethod decorator strips away the reference to the instance of the class and returns a reference to the Complex class type (cls) instead.

Example usage of our decorated class method:

```
1 >>> z1 = Complex(1, 2) # calls __init__
2 >>> z2 = Complex.make_complex(1, 2) # create an instance from the Complex type directly
3 >>> z3 = z2.make_complex(1, 2) # create an instance via another instance
4 >>> z1 == z2 and z2 == z3 # the three instances are all equal
5 True
```

The instances are all equal but they are separate objects in memory:

```
1 >>> id(z1); id(z2); id(z3)
2 140022962355792
3 140022964138048
4 140022964039344
```

Takeaway:

- A @classmethod has access to what is defined in the class itself, but no access to the **state** of a particular instance of the class. **Note:** self is a reference to **state**, this state is initialized only when __init__ is called and may change over time. The cls reference does not have access to such state.
- The main use case for @classmethod is to provide alternate ways of constructing an object of your class. **Example in practice:**
 - The original client only needed the Cartesian form to create complex numbers.
 - A new client requires complex numbers to be constructed from Polar coordinates (radius r and angle φ). This new class feature would be implemented with a new constructor using @classmethod.

Construct complex numbers from Cartesian and Polar coordinates:

```
import numpy as np
       def __init__(self, real, imag):
           self.real = real
           self.imag = imag
       @classmethod
9
       def from_polar(cls, r, phi):
10
           """Construct a complex number from Polar coordinates"""
           return cls(r * np.cos(phi), r * np.sin(phi))
12
           return f"{type(self).__name__}({self.real}, {self.imag})"
       def __eq__(self, other):
           return (self.real == other.real) and (self.imag == other.imag)
```

Construct complex numbers from Cartesian and Polar coordinates:

```
import numpy as np
       def __init__(self, real, imag):
           self.real = real
           self.imag = imag
       @classmethod
       def from_polar(cls, r, phi):
10
           """Construct a complex number from Polar coordinates"""
           return cls(r * np.cos(phi), r * np.sin(phi))
12
1 >>> z1 = Complex(np.cos(np.pi / 4), np.sin(np.pi / 4))
 >>> z2 = Complex.from_polar(1, np.pi / 4)
 >>> z1 == z2
 True
```

The @staticmethod decorator is similar but *strips away* the first argument *completely*:

```
class MyClass:
       def __init__(self):
           """Default initialization of MyClass with reference to an instance"""
           print(self)
       @classmethod
       def class_method(cls):
           """Class method with a reference to MyClass"""
8
           print(cls)
10
       @staticmethod
       def static_method(): # no first argument here!
            """Static methods are just normal functions in the scope of the class"""
13
14
           pass
```

```
class MyClass:
       def init (self):
           """Default initialization of MyClass with reference to an instance"""
           print(self)
 5
       @classmethod
       def class method(cls):
           """Class method with a reference to MyClass"""
 8
           print(cls)
 9
10
       @staticmethod
       def static_method(): # no first argument here!
12
           """Static methods are just normal functions in the scope of the class"""
13
14
           pass
  >>> c = MyClass()
  <__main__.MyClass object at 0x7f06d0ce1b20>
 >>> MyClass.class_method()
 <class '__main__.MyClass'>
 >>> type(MyClass.static_method)
6 <class 'function'>
```

```
1 >>> c = MyClass()
2 <__main__.MyClass object at 0x7f06d0ce1b20>
3 >>> MyClass.class_method()
4 <class '__main__.MyClass'>
5 >>> type(MyClass.static_method)
6 <class 'function'>
```

- Static methods are just *normal functions* inside the class scope (MyClass in this example).
- You can call them directly from the class type like MyClass.static_method() or from an instance like this c.static_method().
- Static methods in Python are the same as C++ methods declared with the static keyword.
- Can you use static methods to modify state?

Let's look at the difference from another perspective: (Fluent Python)

```
class Demo:
       def instance_method(*args):
           return args
       @classmethod
       def class_method(*args):
           return args
8
       @staticmethod
       def static_method(*args):
10
           return args
1 \gg d = Demo()
 >>> dummy_args = ('A', 'B', 'C')
  >>> d.instance_method(*dummy_args)
  (<__main__.Demo object at 0x7fec186bab80>, 'A', 'B', 'C') # bound method → self
 >>> d.class_method(*dummy_args)
  (<class '__main__.Demo'>, 'A', 'B', 'C') # class method → cls
 >>> d.static_method(*dummy_args)
 ('A', 'B', 'C') # static methods: no explicit first argument!
```

- Static methods are used for global class operations that do not depend on state (an instance of the class carries state).
- Just as there are *static* and *instance* methods for a class, there are also *static variables* (*class variables*) and *instance variables*.
- Class variables are *global* to the class itself (just like static methods), whereas instance variables are *local to the class instance* (they represent state and may hold different values for different instances of the class).

Recall the French deck class from the previous lecture:

```
from collections import namedtuple
 2
   Card = namedtuple('Card', ['rank', 'suit'])
 4
   class FrenchDeck:
       """French deck of 52 playing cards"""
       ranks = [str(rank) for rank in range(2, 11)] + list('JOKA')
       suits = 'spades diamonds clubs hearts'.split()
 8
       def __init__(self):
10
            """Initialize ordered deck of cards"""
           self._cards = [
12
               Card(rank, suit) for suit in self.suits for rank in self.ranks
13
14
15
16
```

Recall the French deck class from the previous lecture:

Class variables (global to the class type itself) do not have a self. prepended, because self is a reference to an instance of the class.

- ranks and suits are global (class) properties. The card deck will always consist of 52 cards.
- self._cards is a state that is local to the instance because the deck might be shuffled differently between two instances, hence their state is different.

Class variable and instance variable example:

```
1 >>> class Demo:
2 ...     class_variable = 1 # a class variable (global to the type Demo)
3 >>> demo = Demo() # create an instance of Demo
4 >>> demo.class_variable = 2 # this shadows Demo.class_variable > duck typing!
5 >>> demo.class_variable # the value 2 is now local to the instance!
6 2
7 >>> demo.__class__.class_variable # but the global class variable is still untouched
8 1
```

Class variable and instance variable example:

Same example on pythontutor

Note: the reason the code in line 4 **shadows** the class variable is because of **duck typing** in Python. The duck typing rules create a new **self.class_variable** attribute **for the instance**, you can see that in the Python tutor example above.

Class variable and instance variable example:

- We can further investigate this duck typing phenomenon with the dir() and vars() built-in functions.
- dir(): lists the names of the class attributes and recursively of its base classes:

```
1 >>> dir(demo)
2 ['__class__', '__delattr__', '__dict__', '__dir__', '__doc__', '__eq__', '__format__', '__ge__',
3 '__getattribute__', '__gt__', '__hash__', '__init__', '__init_subclass__', '__le__', '__lt__',
4 '__module__', '__ne__', '__new__', '__reduce__', '__reduce_ex__', '__repr__', '__setattr__',
5 '__sizeof__', '__str__', '__subclasshook__', '__weakref__', 'class_variable']
6 >>> dir(new_demo)
7 ['__class__', '__delattr__', '__dict__', '__dir__', '__doc__', '__eq__', '__format__', '__ge__',
8 '__getattribute__', '__gt__', '__hash__', '__init__', '__init_subclass__', '__le__', '__lt__',
9 '__module__', '__ne__', '__new__', '__reduce__', '__reduce_ex__', '__repr__', '__setattr__',
10 '__sizeof__', '__str__', '__subclasshook__', '__weakref__', 'class_variable']
```

• vars(): lists the contents of the __dict__ attribute (local to instance):

```
1 >>> vars(demo) # affected by our duck-typing on line 4 in previous slide
2 {'class_variable': 2}
3 >>> vars(new_demo) # we did not duck-type anything on this instance
4 {}
```

Summary:

- @classmethod is primarily used as a factory to create new class instances in different ways other than how you define it in __init__(). In @classmethod you perform the desired transformation first and then create a new instance by calling __init__ with the result of your data transformation.
- @classmethod may not need to return an instance of cls all the time, it is just often used this way!
- Optional reading: The factory pattern is further described in Chapter 3 of Design Patterns: Elements of Reusable Object-Oriented Software by E. Gamma, R. Helm, R. Johnson and J. Vlissides, Addison Wesley Professional, 1995.
- @staticmethod are regular functions that are contained within the class scope. You can either call them via an instance self.static_method() (assuming self is an instance of MyClass) or via the class type directly MyClass.static_method().

- We are now at a point where we can take our Python knowledge one step further.
- You learned about the basic Python language features such as defining functions, writing user-defined types (classes) all aligned with the consistency enabled by the Python data model.
- This knowledge allows you develop large software projects already but when you are starting to scale up your code, *structure is important*.
- For your projects, you should structure the code into modules which can be imported. Many modules are then packed together into a *package*. All larger Python projects (NumPy, Matplotlib, Pandas, etc.) are packages.
- Python modules contain subsets of your code project.
- Python packages are a collection of modules. This collection is often hierarchical in the same way as your Linux filesystem is and they can form components of your software projects.

- A Python module most of the time is a simple Python file with code inside, e.g. my_module.py. You could execute a module with python my_module.py.
- The more common use case is to import a module in your code where you need the functionality provided by that module:

```
1 import my_module
2 retval = my_module.some_function() # use a function implemented in my_module
```

Note: some_function is *inside* the namespace of my_module.

• You could have used this form to import into the current namespace (you should generally try to avoid this form, it is bad practice!):

```
1 from my_module import *
2 retval = some_function() # use a function imported from my_module
```

Good practice:

Import only the functionality you actually need:

```
1 from my_module import some_function
2 retval = some_function() # use a function imported from my_module
```

Importing into the current namespace does not prevent from name clashes

 It is usually a better idea to keep the namespace of the module. To minimize typing entropy → use the as keyword to make your life easier:

```
1 import my_module as mm
2 retval = mm.some_function() # use a function implemented in my_module
```

• You may have seen this many times with more widely used packages: (these are again *conventions* that the Python community sticks with)

```
1 import numpy as np # numerical python package (linear algebra, regression, etc.)
2 import pandas as pd # data analysis package
3 import matplotlib.pyplot as plt # powerful plotting package
```

• Other useful Python packages: scipy (scientific library), sympy (symbolic math), numba (performance)

Where does Python look for modules:

Python searches some system dependent locations for modules:

```
1 >>> import sys
2 >>> print(sys.path)
3 ['', '/usr/lib/python39.zip', '/usr/lib/python3.9', '/usr/lib/python3.9/lib-dynload',
4 '/home/fabs/.local/lib/python3.9/site-packages', '/usr/lib/python3.9/site-packages']
```

- '': current directory
- /home/fabs/.local/lib/python3.9/site-packages: version dependent user directory for packages on Linux. Everything you install with python -m pip install --user goes there. To find out the user base of your Python installation run python -m site --user-base. Make sure you also add the bin directory of your user base to PATH.
- The others are *system* directories. Anything you install via your *package manager* or by sudo python -m pip install goes there.
- Use the PYTHONPATH environment variable to extend the search path to your own locations. This is also very useful for *development*: point the PYTHONPATH to the module/package you are developing in order to skip installing it into the default search path all the time! PYTHONPATH behaves the same as PATH in the shell!
- If a module can not be found, you will get a ModuleNotFoundError.

When and in what order should you import modules in your code:

- If you need to import other modules in your module, you should import *after* your module's documentation.
- The order of imported modules in your code should be as follows:
 - 1. Standard library modules (sys, os, path and so on)
 - 2. Third-party modules (numpy, pandas, pytorch, etc.)
 - 3. Your own modules

Example: simple module in current directory, call it module_1.py

```
11 11 11
   Docstring for module_1
 4
   import numpy as np
 6
         from module_1 import *
  # it will import only what you specify in the __all__ list
  __all__ = ['foo']
11
   pi = np.pi # \pi in module scope
13
   def foo():
       print(f"module_1.foo(): pi = {pi:.6f}")
15
16
   def bar():
       print(f"module_1.bar(): pi = {pi:.6f}")
18
```

Example: simple module in current directory, call it module_1.py

```
import numpy as np
   all = Γ'foo'l
   pi = np.pi # \pi in module scope
 6
   def foo():
       print(f"module_1.foo(): pi = {pi:f}")
 8
 9
10 def bar():
       print(f"module_1.bar(): pi = {pi:f}")
1 >>> dir()
  ['__annotations__', '__builtins__', '__doc__', '__loader__', '__name__',
  '__package__', '__spec__']
4 >>> from module_1 import *
5 >>> dir()
  ['__annotations__', '__builtins__', '__doc__', '__loader__', '__name__',
  '__package__', '__spec__', 'foo']
8 >>> foo()
 module_1.foo(): pi = 3.141593
```

- Modules are a great way to organize your code into logical units.
- The one-level organization of modules is typically not deep enough for larger projects.
- Python packages allow you to organize your project hierarchically, just like you would organize your code in your project directory on your file system.

Example package hierarchy:

```
cs107_package # main package
       __init__.py
      - subpkg_1 # sub-package
 3
           __init__.py
4
          - module_1.py # simple module file
 5
         -- module_2.py
6
       subpkg_2 # sub-package
8
           __init__.py
          - module_3.py
9
          - module_4.py
10
           module_5.py
```

Example package hierarchy:

```
1 cs107_package # main package
2 ____init__.py
3 ___subpkg_1 # sub-package
4 ____init__.py
___module_1.py # simple module file
6 ____module_2.py
7 ___subpkg_2 # sub-package
____init__.py
___module_3.py
___module_4.py
10 ___module_5.py
```

- The root of the Python package
- You could also have modules on this level (there are none in this example).

Example package hierarchy:

```
cs107_package # main package
    __init__.py
subpkg_1 # sub-package
    __init__.py
    module_1.py # simple module file
    module_2.py
subpkg_2 # sub-package
    __init__.py
    module_3.py
    module_4.py
module_5.py
```

- A sub-package within your package. It again contains a number of modules.
- You could have another sub-package inside here as well.

The __init__.py file:

- The __init__.py is used for package-level initialization either when your package is imported or a module within the package is imported.
- You write normal Python code in that file which is then executed when the package is imported (once).
- You can use the __all__ list inside __init__.py to define what should be imported when someone executes from cs107_package import *.
- Often the file is empty. Since Python 3.3 you do not need to have the __init__. py file if it is empty.

How to import nested packages:

Packages (or nested sub-packages) are imported the same as modules:

• This can be tedious! Use the __init__.py file to make the life for your users a bit easier or use the as keyword to define an alias for code where the __all__ list is not specified.

How to import nested packages:

Let's assume we have this code in our modules:

cs107_package/subpkg_1/module_1.py:cs107_package/__init__.py:

```
2 class Foo:
 def foo():
      print("cs107_package.subpkg_1.module_1.foo()")
```

cs107_package/subpkg_1/module_2.py:

```
1 # note the '..': relative import in packages
2 from ..subpkg_2 import module_3 as mod3
  def bar():
      mod3.baz()
      print("cs107_package.subpkg_1.module_2.bar()")
```

cs107_package/subpkg_2/module_3.py:

```
1 def baz():
      print("cs107_package.subpkg_2.module_3.baz()")
```

You could then write your __init__.py files like this:

```
1 # note the '.': relative import in packages
2 from .subpkg_1 import (foo, bar)
3 from .subpkg_2 import baz
 __all__ = ['foo', 'bar', 'baz']
```

cs107_package/subpkg_1/__init__.py:

```
1 from .module_1 import foo
2 from .module_2 import bar
```

cs107_package/subpkg_2/__init__.py:

```
1 from .module_3 import baz
3 __all__ = ['baz']
```

Often it makes sense to keep the names local to the sub-package \rightarrow e.g. np.linalg

How to import nested packages:

 With this structure defined in our __init__.py files, we can use our package in a more natural way we are used to from other packages we work with:

```
1 >>> import cs107_package as pkg
2 >>> dir(pkg)
3 ['__all__', '__builtins__', '__cached__', '__doc__', '__file__', '__loader__',
4 '__name__', '__package__', '__path__', '__spec__', 'bar', 'baz', 'foo',
5 'subpkg_1', 'subpkg_2']
```

Compare to NumPy:

```
1 >>> import numpy as np
2 >>> dir(np)
3 # a lot of output...
```

• Use the __init__.py files to define what you want to export from our code and what should remain hidden in the package. For example, the top-level __init__.py of numpy 1.21.2 contains 429 lines of code.

• Let us enter the Python interpreter, and investigate the __name__ attribute:

```
1 >>> dir()
2 ['__annotations__', '__builtins__', '__doc__', '__loader__', '__name__', '__package__', '__spec__']
3 >>> __name__
4 '__main__'
5 >>> import module_1 as mod1
6 >>> mod1.__name__
7 'module_1'
```

- The top-level environment in Python is called '__main___'.
- When we import a module, its name is set to the module filename without suffix.
- When we execute the module with the Python interpreter directly, the module __name__ attribute will be set to '__main__' by the interpreter. When the module is executed it is not imported into another namespace and hence its name is set to the string '__main__'. This allows you to add code to your modules that is run only when the module is executed by the interpreter directly. It is why you may have seen code like this at the end of a module:

```
1 if __name__ == "__main__":
2 main() # function to be run when module is passed to the interpreter
```

- The same can be done with Python packages
- Because a package is a hierarchy of (module) files and directories, you
 must implement this functionality in the __main__.py file.
- This file is then executed by the interpreter whenever you pass it the -m option on the command line. Assume the __main__.py in our test package contains:

```
1 import datetime as dt
2 print(f"Hello from cs107_package! Today is: {dt.datetime.now()}")
```

We can execute the package __main__.py like this:

```
1  $ python -m cs107_package
2  Hello from cs107_package! Today is: 2021-09-21 19:45:15.069913
```

This is exactly what happens when you use the pip package, for example:

```
1 $ python -m pip # runs the __main__.py file in the pip package
```

- You now know what Python modules and packages are for.
- You are still missing the tools to properly install and distribute packages. (Up to now we have made things work using PYTHONPATH only.)
- Most Python packages are available through the Python Package
 Index (PyPI). It is simply a remote server to fetch the software from.
- By default, python -m pip install <package> obtains the package from PyPI (https://pypi.org/).
- Because PyPI is a production platform you should use the test server (https://test.pypi.org/) when playing around with pip. Use it like this:
 - Simple package without dependencies:

```
1 $ python -m pip install --index-url https://test.pypi.org/simple/ your-package
```

If you need to resolve dependencies from the PyPI server add --extra-index-url:

```
1 $ python -m pip install --index-url https://test.pypi.org/simple/ \
2 --extra-index-url https://pypi.org/simple/ your-package
```

There are many ways in Python to create packages and distribute them. The main documentation you should consult is:

- Installing packages: https://packaging.python.org/tutorials/installing-packages/
- Packaging projects: https://packaging.python.org/tutorials/packaging-projects/
- The *main tool to install packages* in Python is pip. The old-school style of installing packages is (was) via distutils/setuptools. pip can work with these old methods as well and you should therefore prefer pip. *There are two parts to pip*:
 - 1. pip itself is a *frontend* for installing Python packages.
 - 2. It uses a backend to accomplish this task (e.g. setuptools).
- The backend is *modular*, it can be setuptools, for example, or anything else that conforms to PEP517.

The basics steps required to create a release of a Python package that is publishable on PyPI:

- 1. Add a pyproject.toml file to your project (PEP518)
- 2. Install build: python -m pip install build (a PEP517 package builder)
- 3. Build your next package release: python -m build .
- 4. Upload to PyPI: twine upload dist/* (use https://test.pypi.org/)

Steps 1 and 2 need to be done only once. To create a consecutive new release, this is sufficient (steps 3 and 4):

1 \$ rm dist/* && python -m build && twine upload dist/*

(twine can be installed via pip)

Aside: the dist/ directory contains the built distributions that will be uploaded to the server. There are two distinctions:

- 1. Source distributions: contains source code only
- 2. Binary distributions: called wheels

Assume we have this project structure:

```
python_project
       LICENSE
       pyproject.toml # project build and meta data
       README.md
 4
       setup.cfg # build configuration for setuptools backend
 5
6
      - src

    cs107_package # the actual Python code for the package

                 __init__.py
8
                 _main__.py
10
                subpkg_1
                     __init__.py
                    module_1.py
                    module_2.pv
14
                subpkg_2
                     init__.py
15
                    module_3.py
16
18
                    module_5.pv
```

The cs107_package is our Python package from the previous discussion. (You can find this package in supplementary code for this lecture in the class repository.)

Create a pyproject. tom1 file:

- This file is used to specify the *minimum build system requirements*. It can also contain project meta data such as version, authors, etc.
- It is defined in PEP518
- For our simple test project the pyproject.toml file looks like this:

```
1 [build-system]
2 requires = [
3    "setuptools>=42",
4    "wheel"
5 ]
6 build-backend = "setuptools.build_meta" # use setuptools for building
```

For setuptools we need to create a setup.cfg file:

```
[metadata]
 2 name = cs107_package
 3 \text{ version} = 1.0.0
 4 author = Fabian Wermelinger
 5 author_email = fabianw@seas.harvard.edu
 6 description = CS107/AC207 test package
 7 long_description = file: README.md
 8 long_description_content_type = text/markdown
 9 url = https://code.harvard.edu/CS107/main/tree/master/lecture/code/lecture09/python_project
  classifiers =
       Intended Audience :: Developers
       Programming Language :: Python :: 3
12
       Topic :: Software Development :: Libraries :: Python Modules
13
14
   [options]
   package_dir =
                             ; for our test package we chose to put the source code into 'src'
       =src
   packages = find:
                     ; required to automatically find our package in `src`
   install_requires = ; additional package dependencies (examples)
       python_version>="3.6"; minimum Python version requirement (example)
20
21
                             : package requires numpy (example)
       numpy
22
   [options.packages.find] ; additional config required for find above
   where = src
```

Building and distributing the project is now easy:

```
1 $ python -m build # omitting output
2 $ ls -1 dist/
3 cs107_package-1.0.0-py3-none-any.whl
4 cs107_package-1.0.0.tar.gz
5 $ twine upload --repository testpypi dist/*
```

- After twine upload → the new package version is available at https://test.pypi.org/project/cs107-package/ (note that used the testing server for publishing this example, not the production server)
- Once you have published a release (version) you can not overwrite it if you found a mistake. You must create a new release for this.
- You can install the package with this command:

```
1 $ python -m pip install -i https://test.pypi.org/simple/ cs107-package
```

The -i option tells pip which *index* to use. It must be the test index here because our package is only available there. You would install *production* projects without this option.

RECAP

- Class methods, static methods and instance methods
- Python modules
- Python packages and the Python package index (PyPI)

Further reading:

- Chapter 9 in Luciano Ramalho, "Fluent Python: Clear, Concise, and Effective Programming", O'Reilly Media, 2015
- Python modules and packages (*recommended*): https://docs.python.org/3/tutorial/modules.html#modules
- Distributing Python modules: https://docs.python.org/3/distributing/index.html#distributing-python-modules
- Configuring setuptools using setup.cfg:
 https://setuptools.pypa.io/en/latest/userguide/declarative_config.html
- Configuring meta data using pyproject.toml:
 https://packaging.python.org/tutorials/packaging-projects/#configuring-metadata