Scientific Software Development with Python

Python recipes



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1. Overview

- 2. Context managers
- 3. Error handling
- 4. Serializing objects
- 5. Log messages
- 6. Type annotations

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Conceptual

Technical

Organisational

Project planning & management

Version control, testing, deployment (DevOps)

Implementational

Software design PThis priecture scientific computing



Lecture content

- Pythonic approaches to handling common programming tasks:
 - Acquiring and releasing of resources
 - Error handling
 - Storing data
 - Logging
 - Type annotations
- Some real hacking (exercises)

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- 1. Overview
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The problem

Some code may require specific setup and tear down actions.

Example

- Opening and closing of files:
 - File needs to be closed to ensure that all data is written to it.¹

```
f1 = open("test_file.txt", "w")
f1.write("hi!")

f2 = open("test_file.txt", "r")
content = f2.read()
print(content) # Prints: ''
```

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¹This is called *buffering* and implemented to minimize the number of slow hard disc accesses.



 To obtain the correct result, the file must be closed by calling the close method:

```
f1 = open("test_file.txt", "w")
f1.write("hi!")
f1.close()

f2 = open("test_file.txt", "r")
content = f2.read()
print(content) # Prints: 'hi!'
```

Problems with this approach

 The file is not closed if an exception is thrown between the opening and the closing of the first file.

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The need for context manager



Python, of course, takes care of that for you:

```
with open("test_file.txt", "w") as f1:
    f1.write("hi!")

f2 = open("test_file.txt", "r")
content = f2.read()
print(content) # Prints: 'hi!'
```

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How does this work

- The with statement is only syntactic sugar for two special methods:
 - __enter__: Is called when the with block is entered
 - __exit__: Is called when the with block is left

Example

```
class MyContextManager:
    def __init__(self):
        print("1: Context manager created.")

def __enter__(self):
        print("2: Entering with block.")
        return self

def __exit__(self, exc_type, exc, exc_tb):
        print("4: Leaving with block.")
        return False

with MyContextManager():
        print("3: Inside with block.")
```

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Context manager classes



Example usage

```
with MyContextManager():
    print("3: Inside with block.")
```

Output

- 1: Context manager created.
- 2: Entering with block.
- 3: Inside with block.
- 4: Leaving with block.

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Example usage

 Note that the __exit__ method is called even when an exception is raised.

```
with MyContextManager():
    raise Exception("Uh oh. Something went wrong.)
    print("3: Inside with block.")
```

Output

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Error handling

- The arguments of the __exit__ method can be used to handle errors occurring in the with block:
 - exc_type: The type of the thrown exception
 - exc: The thrown exception object
 - exc_tb: The traceback describing the program state
- To avoid an exception from propagating upwards, the __exit__ method should return True

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Error handling

```
class NotSoSeriousException(Exception):
    pass

class MyContextManager:
    def __init__(self):
        print("1: Context manager created.")

def __enter__(self):
        print("2: Entering with block.")
        return self

def __exit__(self, exc_type, exc, exc_tb):
        print("4: Leaving with block.")
        if exc_type == NotSoSeriousException:
             print("4: Something happened but it's not so bad.")
             return True
        return False
```

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Error handling

```
with MyContextManager():
    raise NotSoSeriousException("Uh oh. Something went wrong.")
    print("3: Inside with block.")
```

Output

```
1: Context manager created.
```

- 2: Entering with block.
- 4: Leaving with block.
- 5: Something happene but it's not so bad.

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The contextlib module

- Provides abstract base classes for defining context managers.
- Also defines a decorator function to simplify the definition of context managers

Using the contextmanager decorator

```
from contextlib import contextmanager

@contextmanager
def my_context_manager():
    print("2: Entering with block.")
    try:
        yield
    finally:
        print("4: Leaving with block.")
```

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Context manager classes



Using the contextmanager decorator

```
with my_context_manager():
    print("3: Inside with block.")
```

Output

```
2: Entering with block.
3: Inside with block.
4: Leaving with block.
```

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Exercise 1



- Exercise 1 in exercise notebook
- Time: 15 minutes

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Raising exception

- Exceptions are special objects used to signal an error occurring in a program.
- Exceptions are raised using the raise keyword:

```
raise Exception("Uh oh, something went wrong.")
```

 When an exception is raised, execution of the current function and any calling functions stops. The exception propagates upwards in the call stack until it is either caught or program execution is aborted.

```
def a_fragile_function():
    print("This will be printed.")
    raise Exception("Uh oh, something went wrong.")
    print("This will not be printed.")
```

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Tracebacks

 When an exception propagates all the way up to the interpreter it is printed together with a traceback of the call stack, which helps to identify the problem:

```
~/ssdp/lectures/10/test_module.py in a_fragile_function()
    1 def a_fragile_function():
----> 2    raise Exception("Uh oh, something went wrong.")
Exception: Uh oh, something went wrong.
```

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Handling exceptions

 Error are handled using special blocks try, except, else, finally.

Basic error handling

- If we want to try something but don't care if it works
- The try block designates a region of codes in which an error may occur.
- The except keyword is followed by the exception type that we want to catch.

```
try:
    a_fragile_function()
except Exception:
    pass
```

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The problem with excepting too general exceptions

- The Exception class is the base class for all built-in exceptions.
- except Exception therefore handles *all possible exceptions*, which is seldomly what we want to achieve.

Example

 In the example below I wouldn't even realize, that there is a spelling error in the function I intended to call:

```
try:
    a_fagile_function()
except Exception:
    pass
print("This codes executes correctly despite the spelling error.")
```

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Handling exceptions



Excepting too general exceptions

except blocks that specify a very general exception class (or no exception class at all) are considered bad practice.

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 When you raise an exception, define a custom exception class:

```
class ExampleError(exception): pass

def a_fragile_function():
    """
    This function throws an error.

Raises:
        ExampleError: Raised when the funciton is called.
    """
    print("This will be printed.")
    raise ExampleError("Uh oh, something went wrong.")
    print("This will not be printed.")
```

• Note: Exceptions raised by a function must be documented.

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 Calling code can now handle the exceptions that it really intends to handle:

```
try:
    a_fagile_function()
except ExampleError:
    pass
```

 The exception caused by the misspelled function name now propagates upwards as expected:

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

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Handling exceptions



A try block can be followed by multiple except blocks:

```
from test_module import a_fragile_function, ExampleError
try:
    a_fagile_function()
except ExampleError:
    pass
except NameError:
    print("You made a spelling mistake!")
```

 The exception caused by the misspelled function name now propagates up as expected:

Output

```
You made a spelling mistake!
```

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The else and finally blocks

- The except blocks can be followed by an else and a finally block:
 - The else block:
 - Executed only if no exception was encountered in try block.
 - The finally block:
 - Executed independent of outcome from try block
 - Useful to perform clean up operations (like __exit__ in a context manager)

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Handling exceptions



Example

```
from test_module import a_fragile_function, ExampleError
    get_resources()
    input = get_input()
except ExampleError:
    pass
except NameError:
    print("You made a spelling mistake!")
    check_input()
   release_resources()
```

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What's the else block for?

- Code that should execute before the finally block but for which you don't want to catch error should go in the else block
- This is better than adding more statements to the try block because it avoids exceptions from being swallowed.

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Define a root exception for your module

- If you define custom exceptions in your package, it is good practice to define a root exception.
- The root exception should be the base class for all exception classes defined in your package
- This allows calling code distinguish exception from your code from other exceptions.

```
class TestModuleException(Exception):
    """Base class for all exceptions from the ``test_module``."""

class ExampleError(TestModuleException):
    """Example error raised from the ``test_modul``."""
```

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The problem

- How do we store custom classes to disk?
- Serialization: Converting a class hierarchy to a 1-dimensional data stream

Naive approach

 Define load and save methods which store and read objects to and from disk using primitive data types (numbers and strings).

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The pythonic approach: pickle

 The pickle module allows storing most Python classes as binary data.

```
import random
import pickle
class MyClass:
   def __init__(self, n):
        self.data = list(range(n))
mv object = MvClass(10)
print(my_object.data) # Prints: [0, ..., 9]
with open("my_class.pckl", "wb") as file:
   pickle_dump(my_object, file)
with open("my_class.pckl", "rb") as file:
   my_loaded_object = pickle.load(file)
print(my_loaded_object.data) # Prints: [0, ..., 9]
```

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Restrictions

- Functions and classes are pickled by name reference
 - Pickle only stores class data, not the the code defining the class
 - They must be importable from the environment where the unpickling is performed
- Certain types that interact with the computing environment cannot be pickled

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Example

```
class MyClass:
    def __init__(self, filename):
        self.file_handle = open(filename, "v")

    def __del__(self):
        if (self.file_handle):
            self.file_handle.close()
            self.file_handle = None

my_object = MyClass("some_file.txt")

with open("my_object.pckl", "vb") as file:
        pickle.dump(my_object, file)
```

Output

```
TypeError: cannot serialize '_io.TextIOWrapper' object
```

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Customizing pickling behavior

 To avoid these problems pickling behavior can be customized using the __setstate__ and __getstate__ special methods.

```
class MyClass:
    def __init__(self, filename):
        self.filename = filename
        self.file_handle = open(filename, "w")

    def __setstate__(self, state):
        self.file_handle = open(state["filename"])

    def __getstate__(self):
        return {"filename": self.filename}

    def __del__(self):
        if (self.file_handle):
            self.file_handle = None
```

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Warning

Unpickling data is a security risk. Only unpickle data from trusted sources.²

²We'll see more of this later.



Serialization using json

- Uses JavaScript Object Notation (JSON) format
- Stores data in (human-readable) text files
- Cross-language compatibility
- Works only for lists, dicts and primitive types
- Considered safe

```
import json

data = [1, 2, "data"]

with open("data.json", "w") as file:
    json.dump(data, file)

with open("data.json", "rt") as file:
    data_loaded = json.load(file)

print(data_loaded)
```

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Serializing custom classes with json

- Can define custom encoder and decoder classes
- Provided to dump and load methods using the cls argument.

```
import json
from json import JSONEncoder, JSONDecoder

class MyClassEncoder(JSONEncoder):
    ...

class MyClassDecoder(JSONDecoder):
    ...

my_object = MyClass("some_file.txt")
with open("my_object.json", "w") as file:
    json dump(my_object, file, cls=MyClassEncoder)

with open("my_object.json", "r") as file:
    my_object = json.load(file, cls=MyClassDecoder)
```

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The custom encoder

- Should from JSONEncoder base class
- Should override default(obj) method, which turns an object into a representation of json serializable datatypes.
- Should handle objects of targeted class and delegate reset to base class implementation.

```
class MyClassEncoder(JSONEncoder):
    def default(self, obj):
        if isinstance(obj, MyClass):
            return {"MyClass": obj.filename}
        return JSONEncoder.default(self, obj)
```

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The custom decoder

- Should inherit from JSONDecoder base class.
- Should provide custom object_hook to __init__ call of base class.
- object_hook should check if a loaded json object should be turned into an object of the custom class.

```
class MyClassDecoder(JSONDecoder):
    def __init__(self, *args, **kwargs):
        super().__init__(*args, object_hook=self_object_hook, **kwargs)

def object_hook(self, obj):
    if "MyClass" in obj:
        return MyClass(obj["MyClass"])
    return obj
```

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Notes on pickle and json

- Both pickle and json also provide the dumps and loads methods, which write and read data to and from stream object instead of file handles, respectively.
- Prefer specialized data formats when storing large data (NetCDF, HDF5).

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Excercise 2



- Exercise 2 on exercise sheet
- Time: 15 minutes

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The problem

 For diagnostic purposes it is often useful to provide messages from different parts of a program

The solution

 The logging module provides a standardized solution to handle logging of information

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Types of messages

DEBUG Detailed information for diagnosing problems

INFO General information

WARNING Something unexpected happened but things still work.

ERROR Something unexpected happened and the program was not able to perform a certain function³.

CRITICAL A very serious error

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³This should only be used when the program can resume execution. Otherwise throw an exception.



Example

```
import logging
logger = logging.getLogger("test_logger")
logger.debug("A debug message.")
logger.info("An info message.")
logger.warning("A warning.")
logger.error("An error.")
logger.critical("A critical error.")
```

Output

 By default, only messages with levels higher or equal than warning are printed.

```
A warning.
An error.
An critical error.
```

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Controlling the output level

 The logging behavior should be customized using the basicConfig function upon program start.

```
import logging
loggin.basicConfig(level=logging.DEBUG)
logger = logging.getLogger("test_logger")
logger.debug("A debug message.")
```

Output

```
DEBUG:test_logger:A debug message.
```

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Controlling message formatting

 The message format can be customized by providing a custom format string:

Output

```
__main__ ( DEBUG ) :: A debug message.
```

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Logging to a file

This will store log output to log.txt.

```
import logging
loggin basicConfig(level=logging.DEBUG, filename="log.txt", mode="w")
logger = logging.getLogger("test_logger")
logger.debug("A debug message.")
```

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Handling output from different modules

 It is useful to separate output from different modules by using different logger objects⁴:

```
import logging
logger = logging.getLogger(__name__)
```

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⁴The __name__ attribute of contains the filename of the current file.



Application example

 Finally, you can combine the logging module with argparse to interactively control the logging behavior of your command line application:

```
argparse
import logging
parser = argparse.ArgumentParser(description='Logging example.')
parser add_argument('--verbose', action='store_true')
    = parser.parse args()
if args.verbose:
   logging_level = logging.DEBUG
    logging_level = logging.WARNING
format string = "{name} ( {levelname:10} ) :: {message} "
logging basicConfig(level=logging_level, format=format_string, style="{"}
logger = logging.getLogger(__name__)
logger.debug("A debug message.")
logger.info("An info message.")
logger.warning("A warning.")
```

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Non-verbose output

```
$ python logging_example.py
__main__ ( WARNING ) :: A warning.
__main__ ( ERROR ) :: An error.
__main__ ( CRITICAL ) :: A critical error.
```

Verbose output

```
$ python logging_example.py --verbose
__main__ ( DEBUG     ) :: A debug message.
__main__ ( INFO     ) :: An info message.
__main__ ( WARNING     ) :: A varning.
__main__ ( ERROR     ) :: An error.
```

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Example from last lecture

• Python supports type hints since version 3.5:

```
from dataclasses import dataclass
@dataclass
class Record:
   id: int
   name: str
   properties: list
   record = Record(1, "name", [])
```

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Example from last lecture

• However, type annotation are not enforced:

```
# This is valid although the first to arguments
# are swapped.
record = Record("name", 1, [])
```

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Checking types with mypy

• To check types an external tool such as mypy is required:

```
$ pip install mypy
```

Then types can be checked as follows:

```
python -m mypy type_example.py
type_example.py:9: error: Argument 1 to "Record" has incompatible type "str"; expected "int"
type_example.py:9: error: Argument 2 to "Record" has incompatible type "int"; expected "str"
Found 2 errors in 1 file (checked 1 source file)
```

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Annotating functions

- Types hints can be used to specify types for arguments as well as return type
- Example from Python docs⁵:

```
Vector = list[float] # Type alias

def scale(scalar: float, vector: Vector) -> Vector:
    return [scalar * num for num in vector]
```

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⁵https://docs.python.org/3/library/typing.html



Advanced type annotations

 The typing module provides special type objects to specify types for e.g. callables and sequences

```
from typing import List, Sequence, Callable

Vector = List[float]
Functional = Callable[[Vector], float]

def dot_product(x: Vector, y: Vector) -> float:
    return sum([a * b for a, b in zip(x, y)])

def apply(f: Functional, vectors: Sequence[Vector]) -> Sequence[float]:
    return [f(v) for v in vectors]

apply(dot_product, [[1.0, 0.0], [0.0, 1.0]]) # Doesn't pass type check.
apply(lambda x: dot_product(x, x), [[1.0, 0.0], [0.0, 1.0]])
```

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Advantages

 Type hints allow static type checkers to catch logical errors such as this one⁶:

```
from typing import List, Sequence, Callable

def do_something(input List[int]):
    for i in input:
        i.something() # Error: int has not attribute something.
```

• Type hints make your code easier to understand

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⁶Using mypy in your IDE will thus help you catch logical errors while programming.

Excercise 3



- Exercise 3 on exercise sheet
- Time: 15 minutes

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What we have learned

- Special syntax to handle errors and context
- Object oriented approaches to storing data, logging
- Using types hints for gradual typing

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Conclusions



Conclusions

- Python is complex and keeps changing
 - There is a lot to learn
- General principles:
 - Object orientation
 - Customizing behavior using special methods

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