

JOHNNY WEI-BING LIN

A Hands-On Introduction to Using
Python in the Atmospheric and
Oceanic Sciences

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Glossary

attribute data bound to an object that are designed to be acted on by methods also bound to that object.

calling execute or run a function.

class the template or “pattern” all instances of that class follow.

data coordinates a coordinate system for a plot where locations are specified by the values of the x - and y -axes data ranges.

delimit show where a sequence or collection begins and ends.

development environment an application that facilitates software development, often by providing coding, documentation, debugging, and execution tools in one place.

docstring a triple-quote delimited string that goes right after the `def` statement (or similar construct) and which provides a “help”-like description of the function.

dynamically typed variables take on the type of whatever value they are set to when they are assigned.

exception an error state in the program that cannot be processed by the current scope.

immutable a variable/object that cannot be changed.

import compile a module or package and make what is in the module or package accessible to the Python program that is doing the importing.

inherit incorporate the attribute and method definitions of another class into a definition of a new class of objects.

inheritance dealing with inheriting attribute and method definitions of another class into a definition of a new class of objects.

instance an object that is the specific realization of a class of objects.

instantiate create an instance of a class.

instantiating creating an instance of a class.

instantiation the act of creating an instance of a class.

interpreter the execution environment for Python commands.

iterable a data structure that one can go through, one element at a time; in such a structure, after you've looked at one element of it, it will move you on to the next element.

iterator used nearly interchangeably with the noun form of "iterable".

method functions bound to an object that are designed to act on the data also bound to that object.

module an importable Python source code file that typically contains function, class, and variable object definitions.

multi-paradigm language a computer language that supports multiple programming methodologies, for instance, object-oriented programming and procedural programming.

mutable a variable/object that can be changed.

namespace a set of function, variable, class, etc. names; these names can be stored inside an object variable and referenced via that variable.

newline character a special text code that specifies a new line; the specific code is operating system dependent.

object a "variable" that has attached to it both data (attributes) and functions designed to act on that data (methods).

object file for a compiled language, this is a file produced by the compiler after compiling the source code file; this is *not* an object in the sense of object-oriented programming.

package a directory of importable Python source code files (and, potentially, subpackages) that typically contains function, class, and variable object definitions.

package manager a program that streamlines the installation of tools and applications as part of an operating system or distribution; this is not to be confused with a Python package, which is not, in general, an operating system or distribution package.

procedural programming a programming paradigm where a program is broken up into discrete procedures or subroutines, each of which do a specified task and communicate with the rest of the program solely (ideally) through input and output variables that are passed in argument lists and/or return values..

PyAOS a web community whose goal is to support the use of Python in the atmospheric and oceanic sciences; see <http://pyaos.johnny-lin.com>.

rank the number of dimensions in an array; thus, a 2-D array has rank 2.

runtime when some code or a program is actually executing.

shape a tuple whose elements are the number of elements in each dimension of an array; in Python, the elements are arranged so the fastest varying dimension is the last element in the tuple and the slowest varying dimension is the first element in the tuple.

terminal window a text window in which you can directly type in operating system and other commands.

typecode a single character string that specifies the type of the elements of a NumPy array.

Acronyms

AMS American Meteorological Society.

AOS atmospheric and oceanic sciences.

API application programming interface.

CDAT Climate Data Analysis Tools.

cdms Climate Data Management System.

CISL Computational Information Systems Laboratory.

dpi dots per inch.

EPD Enthought Python Distribution.

GCM general circulation model.

GUI graphical user interface.

HOPS Hyperslab OPERator Suite.

i/o input/output.

IDL Interactive Data Language.

LLNL Lawrence Livermore National Laboratory.

NCAR National Center for Atmospheric Research.

NGL NCAR Graphics Language.

NRCC Northeast Regional Climate Center.

OO object-oriented.

OOP object-oriented programming.

PCMDI Program for Coupled Model Diagnostics and Intercomparison.

UV-CDAT Ultrascale Visualization-Climate Data Analysis Tools.

vcs Visualization Control System.

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Colophon

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