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PYTHON PROGRAMMER

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Drastically Improve Your Python: Understanding Python's Execution Model

Those new to Python are often surprised by the behavior of their own code. They expect *A* but, seemingly for no reason, *B* happens instead. The root cause of many of these "surprises" is confusion about the Python execution model. It's the sort of thing that, if it's explained to you once, a number of Python concepts that seemed hazy before become crystal clear. It's also really difficult to just "figure out" on your own, as it requires a fundamental shift in thinking about core language concepts like variables, objects, and functions.

In this post, I'll help you understand what's happening behind the scenes when you do common things like creating a variable or calling a function. As a result, you'll write cleaner, more comprehensible code. You'll also become a better (and faster) code reader. All that's necessary is to forget everything you know about programming...

"Everything is an object?"

When most people first hear that in Python, "everything is an object", it triggers flashbacks to languages like Java where everything the *user* writes is encapsulated in an object. Others assume this means that in the implementation of the Python interpreter, everything is implemented as objects. The first interpretation is wrong; the second is true but not particularly interesting (for our purposes). What the phrase actually refers to is the fact that all "things", be they values, classes, functions, object instances (obviously), and almost every other language construct is conceptually an object.

What does it mean for everything to be an object? It means all of the "things" mentioned above have all the properties we usually associate with objects (in the object oriented sense); types have member functions, functions have attributes, modules can be passed as arguments, etc. And it has important implications with regards to how assignment in Python works.

A feature of the Python interpreter that often confuses beginners is what happens when <code>print()</code> is called on a "variable" assigned to a user-defined object (I'll explain the quotes in a second). With built-in types, a proper value is usually printed, like when calling <code>print()</code> on <code>strings</code> and <code>ints</code>. For simple, user-defined classes, though, the interpreter spits out some odd looking string like:

```
>>> class Foo(): pass
>>> foo = Foo()
```

```
>>> print(foo)
<__main__.Foo object at 0xd3adb33f>
```

print() is supposed to print the value of a "variable", right? So why is it printing that garbage?

To answer that, we need to understand what foo actually represents in Python. Most other languages would call it a variable. Indeed, many Python articles would refer to foo as a variable, but really only as a shorthand notation.

In languages like C, foo represents storage for "stuff". If we wrote

```
int foo = 42;
```

it would be correct to say that the integer variable foo contained the value 42. That is, *variables are a sort of container for values*.

And now for something completely different...

In Python, this isn't the case. When we say:

```
>>> foo = Foo()
```

it would be wrong to say that <code>foo</code> "contained" a <code>foo</code> object. Rather, <code>foo</code> is a <code>name</code> with a <code>binding</code> to the <code>object</code> created <code>by Foo()</code>. The portion of the right hand side of the equals sign creates an object. Assigning <code>foo</code> to that object merely says "I want to be able to refer to this object as <code>foo</code>." **Instead of variables (in the classic sense), Python has <code>names</code> and <code>bindings</code>.**

So when we printed **foo** earlier, what the interpreter was showing us was the address in memory where the object that **foo** is bound to is stored. This isn't as useless as it sounds. If you're in the interpreter and want to see if two names are bound to the same object, you can do a quick-and-dirty check by printing them and comparing the addresses. If they match, they're

bound to the same object; if not, their bound to different objects. Of course, the idiomatic way to check if two names are bound to the same object is to use is

If we continued our example and wrote

```
>>> baz = foo
```

we should read this as "Bind the name baz to the same object foo is bound to (whatever that may be)." It should be clear, then why the following happens

```
>>> baz.some_attribute
Traceback (most recent call last):
File "<stdin>", line 1, in <module>
AttributeError: 'Foo' object has no attribute 'some_attribute'
>>> foo.some_attribute = 'set from foo'
>>> baz.some_attribute
'set from foo'
```

Changing the object in some way using foo will also be reflected in baz: they are both bound to the same underlying object.

What's in a name...

names in Python are not unlike names in the real world. If my wife calls me "Jeff", my dad calls me "Jeffrey", and my boss calls me "Idiot", it doesn't fundamentally change *me*. If my boss decides to call me "Captain Programming," great, but it still hasn't changed anything about me. It does mean, however, that if my wife kills "Jeff" (and who could blame her), "Captain Programming" is also dead. Likewise, in Python binding a name to an object doesn't change it. Changing some property of the object, however, will be reflected in all other names bound to that object.

Everything really is an object. I swear.

Here, a questions arises: How do we know that the thing on the right hand side of the equals sign will always be an object we can bind a name to? What about

```
>>> foo = 10
```

or

```
>>> foo = "Hello World!"
```

Now is when "everything is an object" pays off. Anything you can (legally) place on the right hand side of the equals sign is (or creates) an object in Python. Both 10 and Hello World are objects. Don't believe me? Check for yourself

```
>>> foo = 10
>>> print(foo.__add__)
<method-wrapper '__add__' of int object at 0x8502c0>
```

If 10 was actually just the number '10', it probably wouldn't have an add attribute (or any attributes at all).

In fact, we can see all the attributes 10 has using the dir() function:

With all those attributes and member functions, I think it's safe to say 10 is an object.

Since everything in Python is essentially names bound to objects, we can do silly (but interesting) stuff like this:

```
>>> import datetime
>>> import imp
>>> datetime.datetime.now()
datetime.datetime(2013, 02, 14, 02, 53, 59, 608842)
>>> class PartyTime():
        def call (self, *args):
          imp.reload(datetime)
          value = datetime.datetime(*args)
          datetime.datetime = self
           return value
       def getattr (self, value):
            if value == 'now':
                return lambda: print('Party Time!')
            else:
                imp.reload(datetime)
                value = getattr(datetime.datetime, value)
                datetime.datetime = self
                return value
>>> datetime.datetime = PartyTime()
>>> datetime.datetime.now()
Party Time!
>>> today = datetime.datetime(2013, 2, 14)
>>> print(today)
2013-02-14 00:00:00
>>> print(today.timestamp())
1360818000.0
```

datetime datetime is just a name (that happens to be bound to an object representing the datetime class). We can rebind it to whatever we please. In the example above, we bind the datetime attribute of the datetime module to our new class, PartyTime. Any call to the datetime constructor returns a valid datetime object. In fact, the class is

indistinguishable from the real datetime class. Except, that is, for the fact that if you call datetime.datetime.now() it always prints out 'Party Time!'.

Obviously this is a silly example, but hopefully it gives you some insight into what is possible when you fully understand and make use of Python's execution model. At this point, though, we've only changed bindings associated with a name. What about changing the object itself?

Two types of objects

It turns out Python has two flavors of objects: mutable and immutable. The value of mutable objects can be changed after they are created. The value of immutable objects cannot be. A list is a mutable object. You can create a list, append some values, and the list is updated in place. A string is immutable. Once you create a string, you can't change its value.

I know what you're thinking: "Of course you can change the value of a string, I do it all the time in my code!" When you "change" a string, you're actually rebinding it to a newly created string object. The original object remains unchanged, even though its possible that nothing refers to it anymore.

See for yourself:

```
>>> a = 'foo'
>>> a
'foo'
>>> b = a
>>> a += 'bar'
>>> a
'foobar'
>>> b
'foo'
```

Even though we're using += and it *seems* that we're modifying the string, we really just get a new one containing the result of the change. This is why you may hear people say, "string concatenation is slow.". It's because concatenating strings must allocate memory for a new string and copy the contents, while appending to a list (in most cases) requires no allocation.

Immutable objects are fundamentally expensive to "change", because doing so involves creating a copy. Changing mutable objects is cheap.

Immutable object weirdness

When I said the value of immutable objects can't change after they're created, it wasn't the whole truth. A number of containers in Python, such as tuple, are immutable. The value of a tuple can't be changed after it is created. But the "value" of a tuple is conceptually just a sequence of names with unchangeable bindings to objects. The key thing to note is that the *bindings* are unchangeable, not the objects they are bound to.

This means the following is perfectly legal:

```
>>> class Foo():
        def init (self):
               self.value = 0
     def str (self):
               return str(self.value)
       def repr (self):
         return str(self.value)
>>> f = Foo()
>>> print(f)
\cap
>>> foo tuple = (f, f)
>>> print(foo tuple)
(0, 0)
>>> foo tuple[0] = 100
Traceback (most recent call last):
File "<stdin>", line 1, in <module>
TypeError: 'tuple' object does not support item assignment
>>> f.value = 999
>>> print(f)
999
>>> print(foo tuple)
(999, 999)
```

When we try to change an element of the tuple directly, we get a TypeError telling us that (once created), tuples can't be assigned to. But changing the underlying object has the effect of "changing" the value of the tuple. This is a subtle point, but nonetheless important: the "value" of an immutable object can't change, but it's constituent objects can.

Function calls

If variables are just names bound to objects, what happens when we pass them as arguments to a function? The truth is, we aren't really passing all that much. Take a look at this code:

```
def add to tree(root, value string):
    """Given a string of characters `value string`, create or update a
    series of dictionaries where the value at each level is a dictionary of
    the characters that have been seen following the current character.
    Example:
   >>> my string = 'abc'
    >>> tree = {}
    >>> add to tree(tree, my string)
    >>> print(tree['a']['b'])
    {'c': {}}
    >>> add to tree(tree, 'abd')
    >>> print(tree['a']['b'])
    {'c': {}, 'd': {}}
    >>> print(tree['a']['d'])
    KeyError 'd'
    for character in value string:
        root = root.setdefault(character, {})
```

We're essentially creating an auto-vivifying dictionary that operates like a trie. Notice that we change the root parameter in the for loop. And yet after the function call completes, tree is still the same dictionary with some updates. It is *not* the last

value of root in the function call. So in one sense tree is being updated; in another sense it's not.

To make sense of this, consider what the root parameter actually is: a new binding to the object refereed to by the name passed in as the root parameter. In the case of our example, root is a name initially bound to the same object as tree. It is not tree itself, which explains why changing root to a new dictionary in the function leaves tree unchanged. As you'll recall, assigning root to root.setdefault(character, {}) merely rebinds root to the object created by the root.setdefault(character, {}) statement.

Here's another, more straightforward, example:

```
def list_changer(input_list):
    input_list[0] = 10

    input_list = range(1, 10)
    print(input_list)
    input_list[0] = 10
    print(input_list)

>>> test_list = [5, 5, 5]
>>> list_changer(test_list)
[1, 2, 3, 4, 5, 6, 7, 8, 9]
[10, 2, 3, 4, 5, 6, 7, 8, 9]
>>> print test_list
[10, 5, 5]
```

Our first statement *does* change the value of the underlying list (as we can see in the last line printed). However, once we rebind the name <code>input_list</code> by saying <code>input_list = range(1, 10)</code>, we're now referring to a completely different object. We basically said "bind the name <code>input_list</code> to this new list." After that line, we have no way of referring to the original <code>input_list</code> parameter again.

By now, you should have a clear understanding of how binding a name works. There's just one more item to take care of.

Blocks and Scope

The concepts of names, bindings, and objects should be quite familiar at this point. What we haven't covered, though, is how the interpreter "finds" a name. To see what I mean, consider the following:

This is a contrived example, but a couple of things should jump out at you. First, how does the print_formatted_calculation function have access to value and number_of_digits even though they were never passed as arguments? Second, how do both functions seem to have access to GLOBAL_CONSTANT?

The answer is all about scope. In Python, when a name is bound to an object, that name is only usable within the name's scope. The scope of a name is determined by the block in which it was created. A block is just a "block" of Python code that is executed as a single unit. The three most common types of blocks are modules, class definitions, and the bodies of functions. So the scope of a name is the innermost block in which it's defined.

Let's now return to the original question: how does the interpreter "find" what a name is bound to (or if it's even a valid name at all)? It begins by checking the scope of the innermost block. Then it checks the scope that contained the innermost block, then the scope that contained that, and so on.

In the <code>print_formatted_calculation</code> function, we reference <code>value</code>. This is resolved by first checking the <code>scope</code> of the innermost <code>block</code>, which in this case is the body of the function itself. When it doesn't find <code>value</code> defined there, it checks the <code>scope</code> that <code>print_formatted_calculation</code> was defined in. In our case, that's the body of the <code>print_some_weird_calculation</code> function. Here it does find the name <code>value</code>, and so it uses that binding and stops looking. The same is true for <code>GLOBAL_CONSTANT</code>, it just needs to look an extra level higher: the module (or script) level. Anything defined at this level is considered a <code>global</code> name. These are accessible from anywhere.

A few quick things to note. A name's scope extends to any blocks contained in the block where the name was defined, unless the name is rebound in one of those blocks. If print_formatted_calculation had the line value = 3, then the scope of the name value in print_some_weird_calculation would only be the body of that function. It's scope would not include print_formatted_calculation, since that block rebound the name.

Use this power wisely...

There are two keywords that can be used to tell the interpreter to **reuse a preexisting binding**. Every other time we bind a name, it binds that name to a new object, but only in the current scope. In the example above, if we rebound <code>value</code> in <code>print_formatted_calculation</code>, it would have no affect on the <code>value</code> in <code>print_some_weird_calculation</code>, which is <code>print_formatted_calculation</code> 's enclosing scope. With the following two keywords, we can actually affect the bindings outside our local scope.

global my_variable tells the interpreter to use the binding of the name my_variable in the top-most (or "global" scope).

Putting global my_variable in a code block is a way of saying, "copy the binding of this global variable, or if you don't find it, create the name my_variable in the global scope." Similarly, the nonlocal my_variable statement instructs the interpreter to use the binding of the name my_variable defined in the nearest enclosing scope. This is a way to rebind a

name not defined in either the local or global scope. Without nonlocal, we would only be able to alter bindings in the local scope or the global scope. Unlike global my_variable however, if we use nonlocal my_variable then my_variable must already exist; it won't be created if it's not found.

To see this in action, let's write a quick example:

```
GLOBAL CONSTANT = 42
print(GLOBAL CONSTANT)
def outer scope function():
    some value = hex(0x0)
   print(some value)
    def inner scope function():
        nonlocal some value
        some value = hex(0xDEADBEEF)
    inner scope function()
   print(some value)
    global GLOBAL CONSTANT
    GLOBAL CONSTANT = 31337
outer scope function()
print(GLOBAL CONSTANT)
# Output:
# 42
# 0x0
# 0xdeadbeef
# 31337
```

By making use of <code>global</code> and <code>nonlocal</code>, we're able to use and change the existing binding of a name rather than merely assigning the name a new binding and losing the old one.

Summary

If you've made it to the end of this post, congratulations! Hopefully Python's execution model is much more clear. In a (much shorter) follow-up post, I'll show some examples of how we can make use of the fact that everything is an object in interesting ways. Until next time...

If you found this post useful, check out Writing Idiomatic Python. It's filled with common Python idioms and code samples showing the right and wrong way to use them.

Posted on Feb 14, 2013 by Jeff Knupp



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Name



John Shecter • 6 days ago

Do you know what would really help people understand Python better and other programming languages?

Stop using "Foo" and "Bar" and use something that actually has some CONTEXT.

What is easier to understand for someone trying to learn about and UNDERSTAND programming:

This:

FooBar

def FooBar(Foo, Bar):

""" Return FooBar """

FooBar = Foo + ' ' + Bar

return FooBar.title()

Foo = foo bar('foo, 'bar')

nrint(har)

see more



nim • 2 months ago

oh now i know i am new to python



Kapil Gupta • 6 months ago

Indeed a must read. Great work. Written beautifully.



Kishore Grylls • 7 months ago

Beautifully explained. Worth every bit of it. Thank a lot for this article. :)



Clyde • 8 months ago

Good one. Btw the "What's in a name" section was really funny:)



Jinet Jose • 8 months ago

Good one. Thank you.



Rainald Koch • 10 months ago

[further errata]:)

First a merely technical point: Please remove empty lines in indented blocks or fill them with the right number of spaces. That would allow to copy-paste the example code into the interpreter console (Python 3.6 on Windows 10, if that matters. Idle would ignore single empty lines but doesn't allow multi-line input.).

It's --> Its

trie --> tree

In the list changer example:

Tracture learned abject dans not arrespet their assistances

Type⊑rror: range object does not support item assignment

This is because after

input_list = range(1, 10)

input_list holds a reference to a range object, not a list. The following

print(input_list)

outputs "range(1, 10)", not "[1, 2, 3, 4, 5, 6, 7, 8, 9]". Was that different in earlier versions? To get the intended output, change the previous line to

input_list = [i for i in range(1, 10)]

see more

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Jacob → Rainald Koch • 3 months ago

> trie --> tree

> series of dictionaries _in a tree of dictionaries_ where the value at each level is a dictionary of the characters that have been seen following _the partial string up to _ the current character.

What you are describing is a specific type of tree shaped data structure called a Trie: https://en.m.wikipedia.org/...



SUDIP BHANDARI • a year ago

very much insightful



Joakim_N • 2 years ago

Thanks for a superb tutorial! Incredible how these things can pass unnoticed under one's nose for years of using Python.



fjc • 2 years ago

Awesome explanation! Clear, insightful and super smart examples



Yiling Liu • 2 years ago

[erreta]:)

the "value" of an immutable object can't change, but it's constituent objects can.

-> it's -> its

∧ V • Reply • Share >



fmars • 2 years ago

best python execution model explanation I have seen. Thanks a lot. I'll try other popular articles and decide whether to buy the book:)



jbandy1564 • 2 years ago

The list test_list, created before the call to the list_changer function, is passed into list_changer as an argument referred to in the list_changer function as input_list. At the time list_changer begins execution, input_list refers to test_list, so the first line changes the value of the first element of test_list. When the line 'input_list = range(1, 10)' is executed, input_list is re-bound to the range, and continues to refer to the range to the end of the function definition.



Umek • 2 years ago

Hi Jeff, great article. Could I get some clarifications on the following paragraph.

"Our first statement does change the value of the underlying list (as we can see in the last line printed). However, once we rebind the name input_list by saying input_list = range(1, 10), we're now referring to a completely different object. We basically said "bind the name input_list to this new list." After that line, we have no way of referring to the original input_list parameter again."

I can understand that we are referring to a completely different object, but why do you say "bind the name input_list to this new list" as opposed to "bind the name test_list to this new list"?

I was expecting [10, 2, 3, 4, 5, 6, 7, 8, 9] to show up when you called print test_list

Thanks and have a great year ahead!



Rohan • 2 years ago

Thank you sir!! That was great explanation..



Albert de Wit • 3 years ago

This is actually the first time I really understood how python works. I've bought myself a book recently, and I've gotten up to page 120, still encountering errors and wondering why some things won't work. It's all covered here, thanks a lot!



ali • 3 years ago

Very very usefull.

TNX TNX TNXXXX

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4 comments • 9 months ago

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