

Writing Structured Programs

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Objectives

- With a focus on NLP applications, we discuss:
 - Writing well-structured and readable codes.
 - Reviewing fundamental building blocks of Python programming:
 - Functions;
 - Control structures such as loops;
 - Assignments;
 - Programming constructs.
 - Gaining knowledge about shortcomings of Python.

Assignment

- An assignment statement sets the value stored by a variable name.
 - The assignment operator is the equal sign “=”.
 - The **name** of the variable is always on the left side of the equals sign, and the **value** of the variable on the right side of the equals sign.

```
>>> foo = 'Monty'
```

Assignment

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>>> foo = 'Monty'
```

- A variable, object fields, and entries in collections, etc. are just **references**.
- **Values** are stored else where and **referenced** by variables.
- Multiple **references** can refer to the same value.
- In simplest terms, a variable is just a box that you can put stuff in.

Assignment Quiz: basic data type

What is the output for bar?!

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>>> foo = 'Monty'  
>>> bar = foo  
>>> foo = 'Python'  
>>> bar
```

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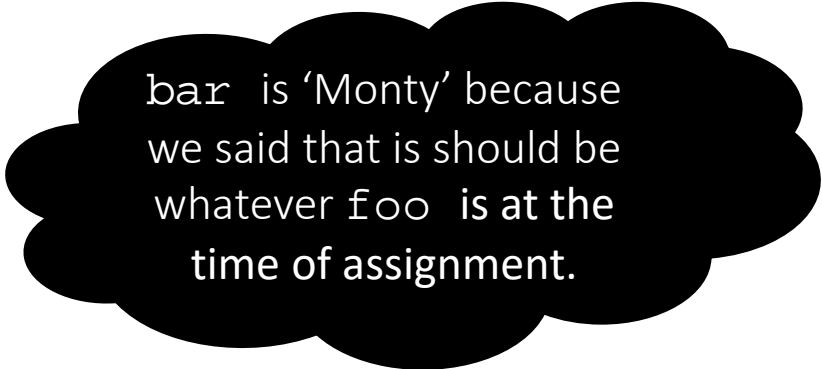


WHY?!

Assignment Quiz: basic data type

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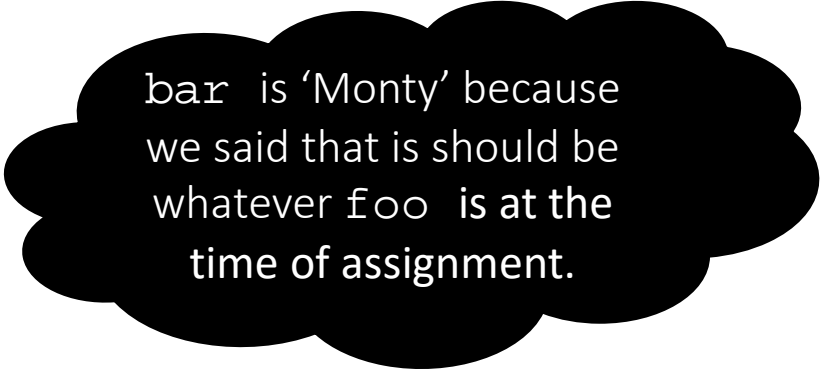


bar is 'Monty' because we said that it should be whatever foo is at the time of assignment.

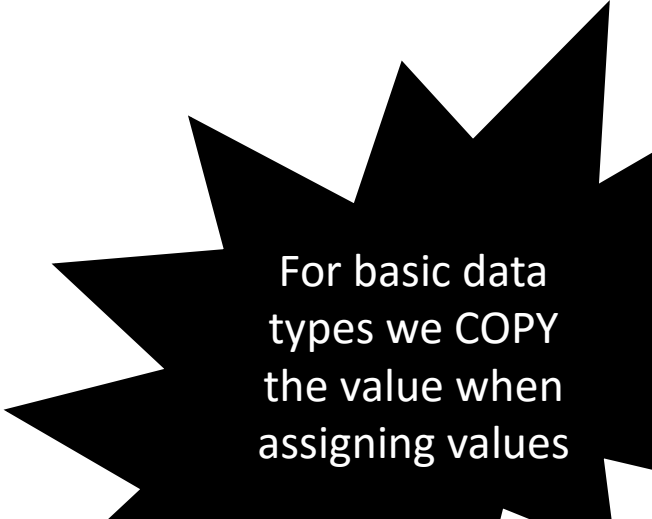
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For basic data types we COPY the value when assigning values

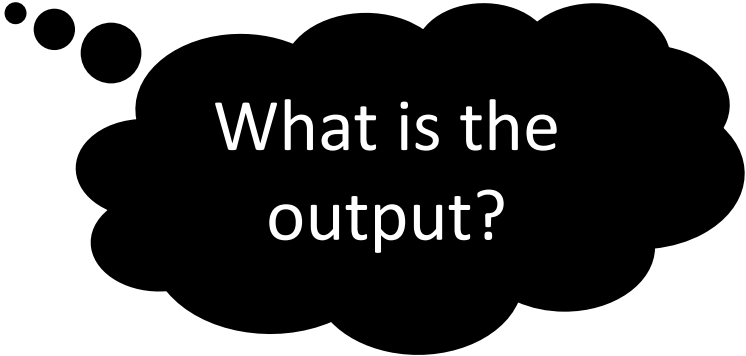
Assignment: lists and dictionaries

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>>> foo = [ 'Monty', 'Python' ]  
>>> bar = foo  
>>> foo[1] = 'Bodkin'  
>>> bar
```



What is the
output?

Assignment: lists and dictionaries

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[ 'Monty', 'Bodkin' ]
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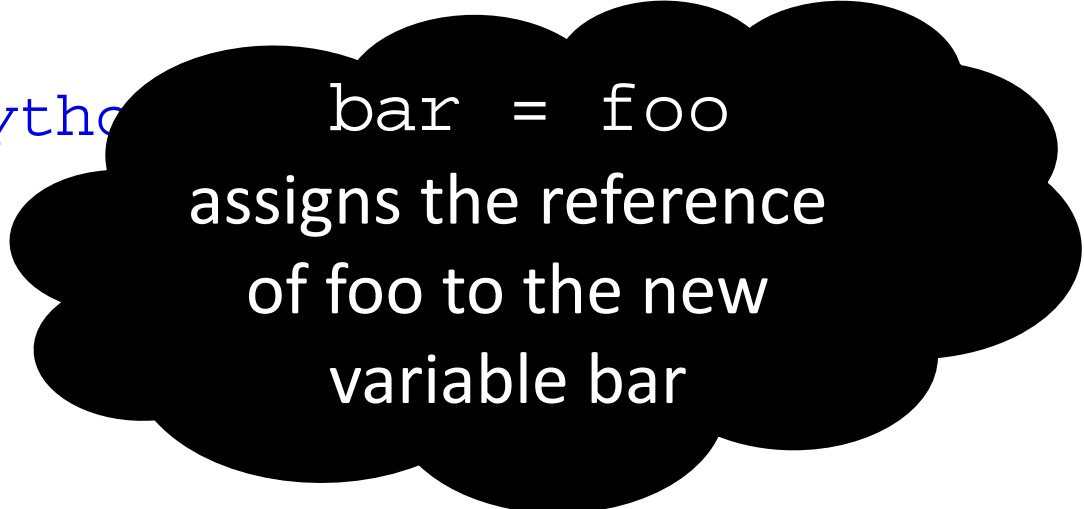
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```



Assignment: lists and dictionaries

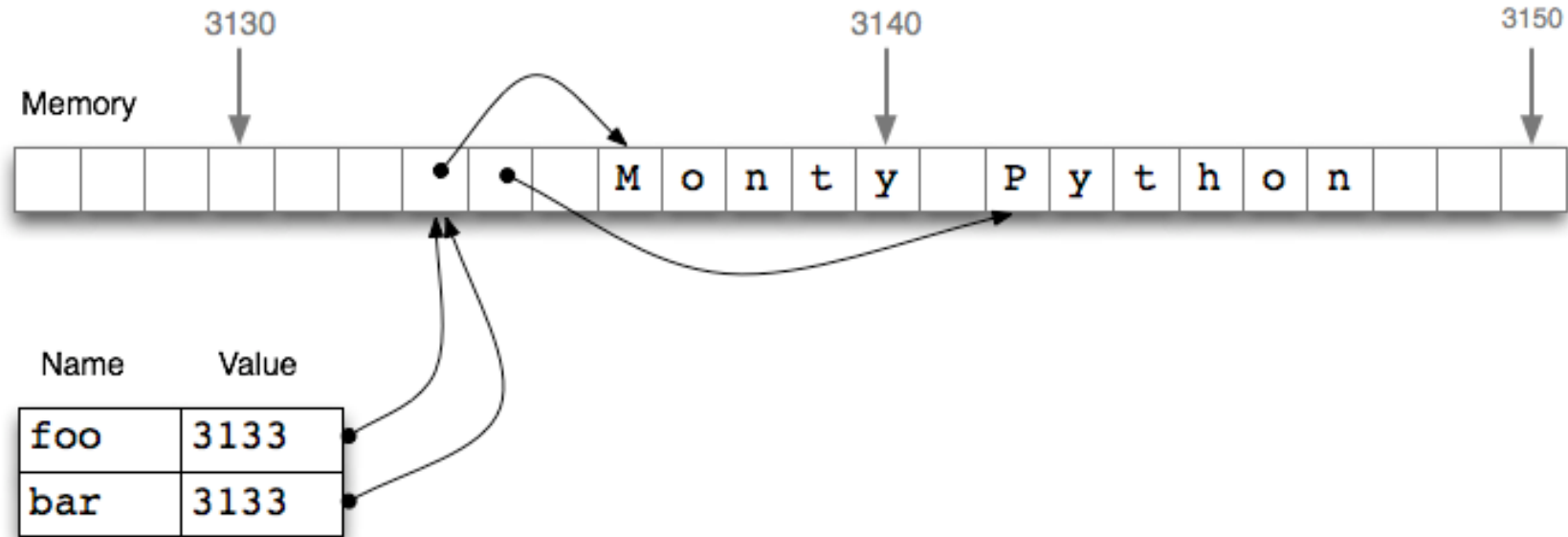
- The “value” of a structured object such as a list or a dictionary is actually just a **reference** to the object.

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>>> foo = ['Monty', 'Python']
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>>> foo[1] = 'Bodkin'
>>> bar
['Monty', 'Bodkin']
```

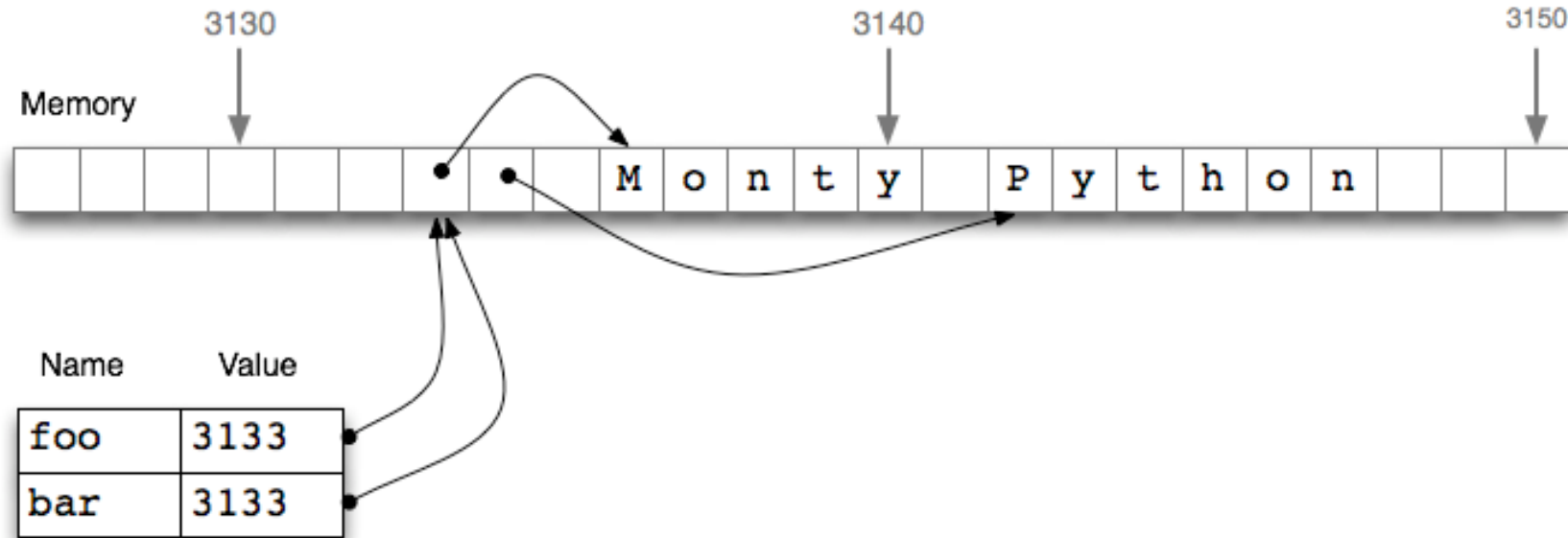


bar = foo
assigns the reference
of foo to the new
variable bar

Assignment: lists and dictionaries



Assignment: lists and dictionaries



- Read more on data types:
http://en.wikibooks.org/wiki/Python_Programming/Data_Types

Quiz

- What is the output?

```
>>> empty = []
>>> nested = [empty, empty, empty]
>>> nested[1].append('Python')
>>> nested
```

```
>>> nested = [[]] * 3
>>> nested[1].append('Python')
>>> nested[1] = ['Monty']
>>> nested
```


Quiz

- What is the output?

```
>>> empty = []
>>> nested = [empty, empty, empty]
>>> nested[1].append('Python')
>>> nested
```

```
[[ 'Python' ], [ 'Python' ], [ 'Python' ]]
```

```
>>> nested = [[]] * 3
>>> nested[1].append('Python')
>>> nested[1] = ['Monty']
>>> nested
```

```
[[ 'Python' ], [ 'Monty' ], [ 'Python' ]]
```

Quiz

- What is the output?

```
>>> empty = []
>>> nested = [empty, empty, empty]
>>> nested[1].append('Python')
>>> nested
```

```
[['Python'], ['Python'], ['Python']]
```

```
>>> nested = [[]] * 3
>>> nested[1].append('Python')
>>> nested[1] = ['Monty']
>>> nested
```

```
[['Python'], ['Monty'], ['Python']]
```

Quiz

- What is the output?

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>>> nested = [empty, empty, empty]
>>> nested[1].append('Python')
>>> nested
>>> nested = [[]] * 3
>>> nested[1].append('Python')
>>> nested[1] = ['Monty']
>>> nested
```

```
[['Python'], ['Python'], ['Python']]
[['Python'], ['Monty'], ['Python']]
```

`id()` function Return the identity of an object. Try function `id()`, e.g. type in `id(nested[1])`

Assignment

- Assignment statements in Python do not copy objects, they create bindings between a target and an object.
- To copy items from a list called `foo` to a new list called `bar` you can use `bar = foo[:]`
 - Compare `bar = foo[:]` and `bar = foo`
 - What if `foo` and `bar` contains lists?
- Shallow and deep copy operations can be performed using `copy`
 - A *shallow copy* constructs a new compound object and then (to the extent possible) inserts *references* into it to the objects found in the original.
 - A *deep copy* constructs a new compound object and then, recursively, inserts *copies* into it of the objects found in the original.

Equality and identity

- It is sometimes necessary to compare two values for equality.
- The `is` operator tests for object **identity (remember `id()`?!)**:
 - in the previous slide, what is the output of `nested[0] is nested[1]`?
- Identity (`is`) implies equality (`==`) but the reverse is not true:
 - Two distinct objects can have the same value.
- You use `==` when comparing values and `is` when comparing identities.

Conditionals

```
>>> mixed = ['cat', '', ['dog'], []]
>>> for element in mixed:
    if element:
        print element

cat
['dog']
>>>
```

- In the condition part of an if statement, a non-empty string or list is evaluated as true, while an empty string or list evaluates as false.

Conditionals

- Be informed of the difference of `elif` and a number of consecutive `if` statements:
 - The satisfaction of `if` statements, terminates the rest of comparisons in the conditional construct.

```
>>> animals = ['cat', 'dog']
>>> if 'cat' in animals:
    print(1)
    elif 'dog' in animals:
    print(2)
```

1

Conditionals

- The functions `all()` and `any()` can be applied to a list (or other sequence) to check condition for all or any items:
 - They can be used for writing more natural and concise codes!

```
>>> sent = ['No', 'good', 'fish', 'goes', 'anywhere',  
'without', 'a', 'porpoise', '.']
```

```
>>> all(len(w) > 4 for w in sent)
```

```
False
```

```
>>> any(len(w) > 4 for w in sent)
```

```
True
```


Sequences: String, List, Tuple

- Sequence data types can be sliced, indexed and they have length:

```
>>> t = "passau", "Innstr", 94032
>>> t[0]
'passau'
>>> t[1:]
('Innstr', 94032)
>>> len(t)
3
>>>
```

Sequences: String, List, Tuple

- Iterations over a sequence is common:

Python Expression

```
for item in s
```

```
for item in sorted(s)
```

```
for item in set(s)
```

```
for item in reversed(s)
```

```
for item in set(s).difference(t)
```

Comment

iterate over the items of s

iterate over the items of s in order

iterate over unique elements of s

iterate over elements of s in reverse

iterate over elements of s not in t

Sequences: String, List, Tuple

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```
for item in reversed(s)
```

```
for item in set(s).difference
```

Comment

iterate over the items of s

iterate over the items of s in sorted order

iterate over the unique items of s

You can combine the sequence functions in a variety of way:
`reverse(sorted(set(s)))`

Sequences: String, List, Tuple

- One sequence type can be converted into another one:
 - `tuple(s)` converts any kind of sequence to tuple;
 - `list(s)` converts any kind of sequence to list;
 - `join()` convert a sequence to string.
- Other objects (such as the `FreqDist`) can be converted to a sequence (e.g. `FreqDist` to list).

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 - `tuple(s)` converts any kind of sequence to tuple;
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```
>>> raw = 'Red lorry, yellow lorry, red lorry, yellow lorry.'
>>> text = nltk.word_tokenize(raw)
>>> fdist = nltk.FreqDist(text)
>>> sorted(fdist)
['.', ',', 'Red', 'lorry', 'red', 'yellow']
>>> for key in fdist:
    print(key + ':', fdist[key], end='; ')
lorry: 4; red: 1; .: 1; ,: 3; Red: 1; yellow: 2
```

Sequences: String, List, Tuple

- There are functions that modify the **structure** of a sequence and which can be handy for language processing.
- **zip()** takes the items of two or more sequences and "zips" them together into a single list of tuples.

Sequences: String, List, Tuple

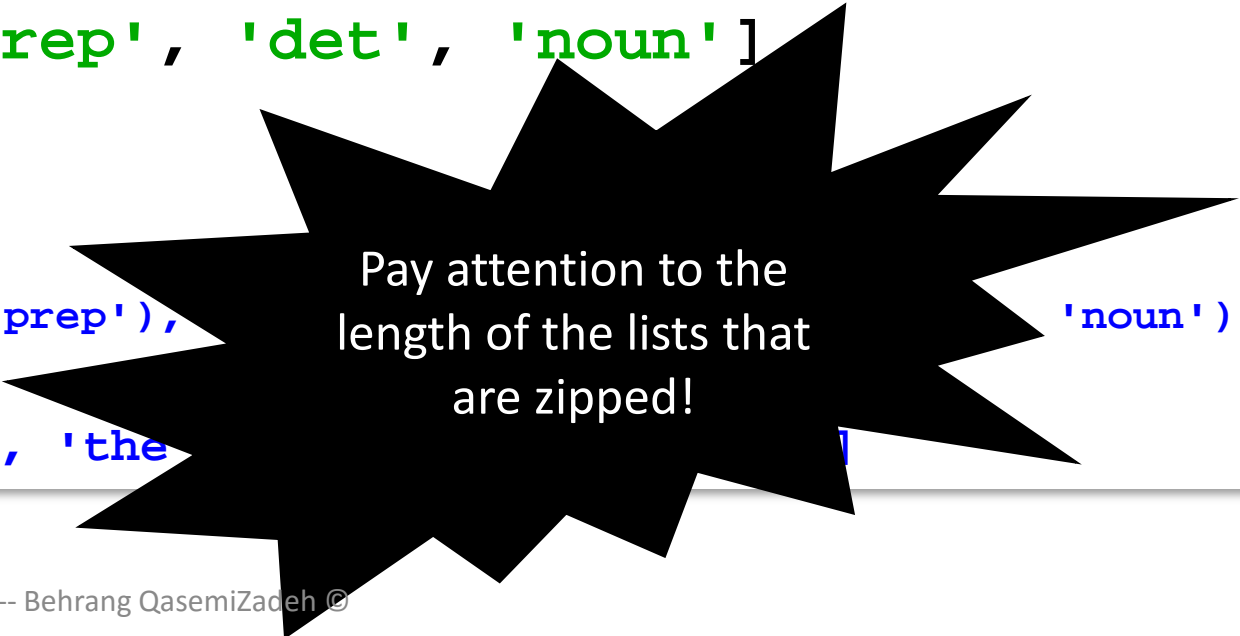
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```
>>> words = ['I', 'turned', 'off', 'the', 'spectroroute']
>>> tags = ['noun', 'verb', 'prep', 'det', 'noun']
>>> zip(words, tags)
<zip object at ...>
>>> list(zip(words, tags))
[('I', 'noun'), ('turned', 'verb'), ('off', 'prep'), ('the', 'det'), ('spectroroute', 'noun')]
>>> list(enumerate(words))
[(0, 'I'), (1, 'turned'), (2, 'off'), (3, 'the'), (4, 'spectroroute')]
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```



Pay attention to the length of the lists that are zipped!

Sequences: String, List, Tuple

- For some NLP tasks it is necessary to cut up a sequence into two or more parts.
 - Example: 80% of a corpus for train and 20% for test!
 - This can be achieved by slicing

```
>>> text = nltk.corpus.nps_chat.words()  
>>> cut = int(0.9 * len(text))  
>>> training_data, test_data = text[:cut], text[cut:]  
>>> text == training_data + test_data  
True  
>>> len(training_data) / len(test_data)  
9.0
```

Quiz

What is the output of the following code snippet? Can you explain each line of this code?

```
>>> words = 'I turned off the spectroroute'.split()
>>> wordlens = [(len(word), word) for word in words]
>>> wordlens.sort()
>>> ' '.join(w for (_, w) in wordlens)
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>>> wordlens.sort()
>>> ' '.join(w for (_, w) in wordlens)
'I off the turned spectroroute'
```

Sequences: When to Use What!

- String: in the beginning and the end:
 - Typical when reading in some text and producing output for us to read.
- Lists and tuples are used in the middle, but for different purposes.

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 - All objects have the **same type**;
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 - We often use lists to hold **sequences of words**.

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Sequences: mutable vs immutable

- Strings are immutable.
 - You cannot sort characters in a string;
- Tuples are immutable.
 - You cannot sort the elements of a tuple;
- Lists are mutable.
 - But, you can sort a list!

Generator Expressions

- Compare the following code snippets:

```
>>> max([w.lower() for w in word_tokenize(text)])  
'word'
```

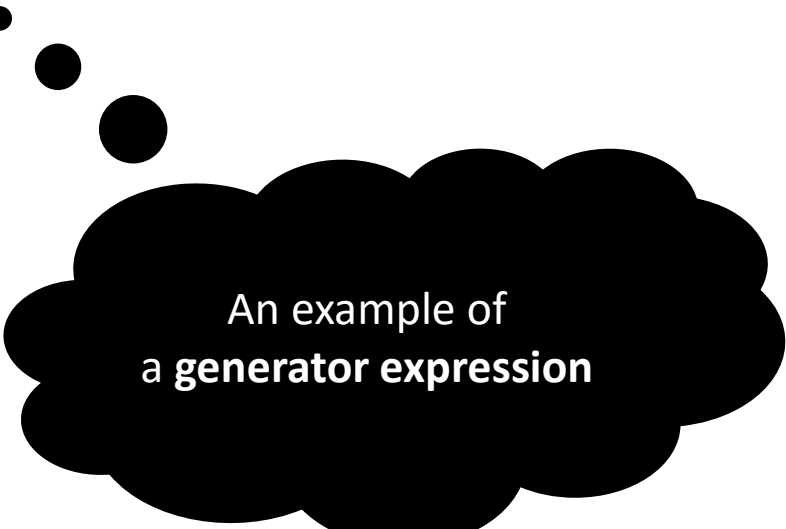
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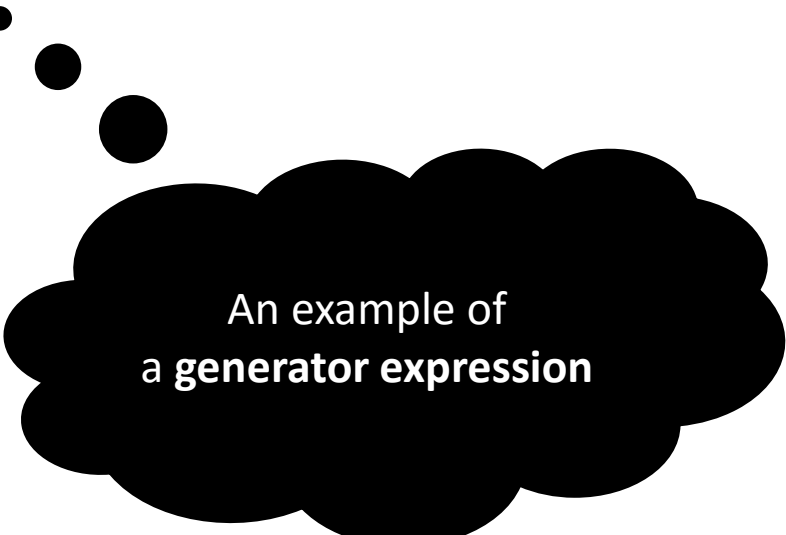
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Generator Expressions

- Compare the following code snippets:

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This could be slow.

The list object must be allocated before the value of `max()` is computed.

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Let's have a little break!

Python Style!

- No, we are not talking about poor pythons skin!
 - **pythons** are hunted in Indonesia and Malaysia, and species are threatened.
- We are talking about more civilized choices:
 - variable names;
 - Spacing;
 - comments, etc.



Python Style!

- A style guide for Python code can be found at <https://www.python.org/dev/peps/pep-0008/>.
- The most important matter the style guide is consistency.
- The goal is to improve readability.
 - This is important specifically when you are working in teams.

Python Style!

- Lines should be less than 80 characters long:
 - Break a line inside parentheses, brackets, or braces;
 - Add extra parentheses;
 - And, you can always add a backslash at the end of the line that is broken.
- Remember that the indentation of blocks of code is not the matter of choice (4 space character):
 - Spaces are the preferred indentation method.
 - Most editor does the automatic indent.

Python Style!

- From <https://www.python.org/dev/peps/pep-0008> see also:
 - Whitespace in Expressions and Statements
 - Naming Conventions
 - Version bookkeeping
 - Comments
 - etc.

Procedural vs Declarative Style

- Compare these two code snippets (yellow and green blocks):


```
>>> tokens = nltk.corpus.brown.words(categories='news')
>>> count = 0
>>> total = 0
>>> for token in tokens:
    count += 1
    total += len(token)
>>> total / count
4.401545438271973
```

```
>>> total = sum(len(t) for t in tokens)
>>> print(total / len(tokens))
4.401...
```

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*Declarative
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Procedural vs Declarative Style

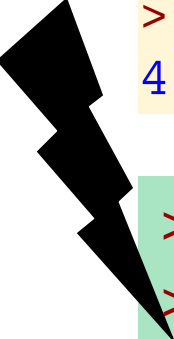
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*Declarative
style!*

READ and PRACTICE!

Structured Programming Using Functions

- Functions provide an effective way to reuse and package code.
- Using functions has the benefit of
 - Saving space in our program;
 - Improving the readability of our codes;
 - Easing code maintenance, debugging and upgrades.
- Well-structured programs usually make extensive use of functions.
- A block of code longer than 10-20 lines must be decomposed into multiple functions.

Structured Programming Using Functions

```
import re
def get_text(file):
    """Read text from a file, normalizing whitespace and stripping HTML markup."""
    text = open(file).read()
    text = re.sub(r'<.*?>', ' ', text)
    text = re.sub('\s+', ' ', text)
    return text
```

Structured Programming Using Functions

Argument (call-by-value)



```
import re
```

```
def get_text(file):
```

```
    """Read text from a file, normalizing whitespace and stripping HTML markup."""
```

```
    text = open(file).read() # and we know how to add comments
```

```
    text = re.sub(r'<.*?>', ' ', text)
```

```
    text = re.sub('\s+', ' ', text)
```

```
    return text
```



Return statement

Docstring (to be used for help()).



body



Variable Scope

- Function definitions create a new, **local scope** for variables.
 - The name is not visible outside the function, or in other functions.
 - You can choose variable names without being concerned about collisions with names used in your other function definitions.
- Resolving variable names (**LGB rule**):
 - The Python interpreter first tries to resolve the name with respect to the names that are local to the function.
 - If nothing is found, the interpreter checks if it is a global name within the module.
 - Finally, if that does not succeed, the interpreter checks if the name is a Python built-in.

Checking Parameter Types

- Python doesn't let us to declare the type of a variable.
 - This permits us to define functions that are flexible about the type of their arguments.
- In a defensive style of programming, we may want to check the type of arguments:
 - A naive approach would be to check the type of the argument using `if not type(x) is Y`, e.g. a string variable of type `str`.
 - Dangerous because the calling program may not detect the `None` output of the `if` statement properly.
 - Using an `assert` statement is a safer choice.
 - `If assert` fails, it will produce an error that cannot be ignored.

Checking Parameter Types

```
>>> def tag(word):
    assert isinstance(word, basestring), "argument to tag() must be a string"
    if word in ['a', 'the', 'all']:
        return 'det`
    else:
        return 'noun'
```

Checking Parameter Types

`isinstance` checks to see if the object passed in the first argument is of the type of any of the type objects passed in the second argument.

```
>>> def tag(word):  
    assert isinstance(word, basestring), "argument to tag() must be a string"  
    if word in ['a', 'the', 'all']:  
        return 'det'  
    else:  
        return 'noun'
```


Documenting Functions

- For the simplest functions, a one-line **docstring** is usually adequate:
 - a triple-quoted string containing a complete sentence on a single line.
- For non-trivial functions, consider providing docstring followed by a blank line, then a more detailed description of the functionality
- Docstring can also include a **doctest block**, illustrating the use of the function and the expected output.
 - Look into **doctests** module.

Documenting Functions

- Docstrings should document the **type of each parameter** to the function, **and the return type**.
- Docstring can be a simple text, however, you can also use some kind of markup language for documentation.
- NLTK uses the Sphinx markup language
 - <http://sphinx-doc.org/index.html>
 - Sphinx markups can be converted into richly structured API documentation.
 - Output formats: HTML, LaTeX, ePub, Texinfo, manual pages, plain text
 - Extensive cross-references:
 - Hierarchical structure
 - Automatic indices
 - Code handling
 - Extensions, etc.

Advanced Features of Functions

- **Functions as Arguments**

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```
>>> sent = ['Take', 'care', 'of', 'the', 'sense']
>>> def extract_property(prop):
    return [prop(word) for word in sent]
>>> extract_property(len)
[4, 4, 2, 3, 5]
>>> def last_letter(word):
    return word[-1]
>>> extract_property(last_letter)
['e', 'e', 'f', 'e', 'e']
```

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```
>>> extract_property(lambda w: w[-1])  
['e', 'e', 'f', 'e', 'e']
```

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```
>>> sent = ['hello', 'and', 'greetings', 'friends']
>>> sorted(sent)
['and', 'friends', 'greetings', 'hello']
>>> sorted(sent, cmp)
['and', 'friends', 'greetings', 'hello']
>>> sorted(sent, lambda x, y: cmp(len(y), len(x)))
['greetings', 'friends', 'hello', 'and']
```

Advanced Features of Functions

- **Accumulative functions**

- These functions start by initializing some storage, and iterate over input to build it up, before returning some final object:

```
def search1(substring, words):  
    result = []  
    for word in words:  
        if substring in word:  
            result.append(word)  
    return result
```


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    for word in words:  
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            yield word
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def search2(substring, words):  
    for word in words:  
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            yield word
```

- Function `search2()` is a generator:
 - The first time `search2()` is called, it gets as far as the `yield` statement and pauses.
 - The calling program gets the first word and does any necessary processing.
 - Once the calling program is ready for another word, execution of `search2()` is continued from where it stopped, until the next time it encounters a `yield` statement.

```
def search1(substring, words):  
    result = []  
    for word in words:  
        if substring in word:  
            result.append(word)  
    return result
```

```
def search2(substring, words):  
    for word in words:  
        if substring in word:  
            yield word
```

Advanced Features of Functions

- **Higher order functions**

- `filter()` applies the function to each item in the sequence contained in its second parameter, and retains only the items for which the function returns `True`.

```
>>> def is_content_word(word):
    return word.lower() not in ['a', 'of', 'the', 'and', 'will', ',', '.']
>>> sent = ['Take', 'care', 'of', 'the', 'sense', ',', 'and', 'the',
... 'sounds', 'will', 'take', 'care', 'of', 'themselves', '.']
>>> list(filter(is_content_word, sent))
['Take', 'care', 'sense', 'sounds', 'take', 'care', 'themselves']
>>> [w for w in sent if is_content_word(w)]
['Take', 'care', 'sense', 'sounds', 'take', 'care', 'themselves']
```

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- `map()` applies a function to every item in a sequence.

```
>>> lengths = map(len, nltk.corpus.brown.sents(categories='news'))
>>> sum(lengths) / len(lengths)
21.75081116158339
>>> lengths = [len(sent) for sent in nltk.corpus.brown.sents(categories='news')]
>>> sum(lengths) / len(lengths)
21.75081116158339
```

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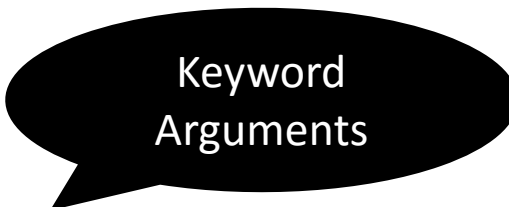
```
>>> def repeat(msg='<empty>', num=1):  
    return msg * num  
>>> repeat(num=3)  
'<empty><empty><empty>'  
>>> repeat(msg='Alice')  
'Alice'  
>>> repeat(num=5, msg='Alice')  
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Keyword
Arguments

Advanced Features of Functions

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```
>>> def generic(*args, **kwargs):  
    print(args)  
    print(kwargs)  
>>> generic(1, "African swallow", monty="python")  
(1, 'African swallow') {'monty': 'python'}
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All the unnamed parameters

The keyword arguments

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You can use the `*args` in other occasions: a short hand to denote the items in a list, e.g. `args[0]`, `args[1]`, `args[2]`, etc.

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>>> def generic(*args,
               print(args)
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```
>>> with open("lexicon.txt") as f:  
    data = f.read()
```

Program Development

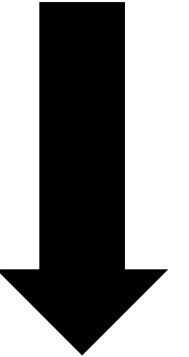
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 - Structured Programming
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Structure of a Python Module

- Module is used to bring logically-related definitions and functions together:
 - The goal is to facilitate re-use and abstraction.
 - An individual `.py` file is a Python module.
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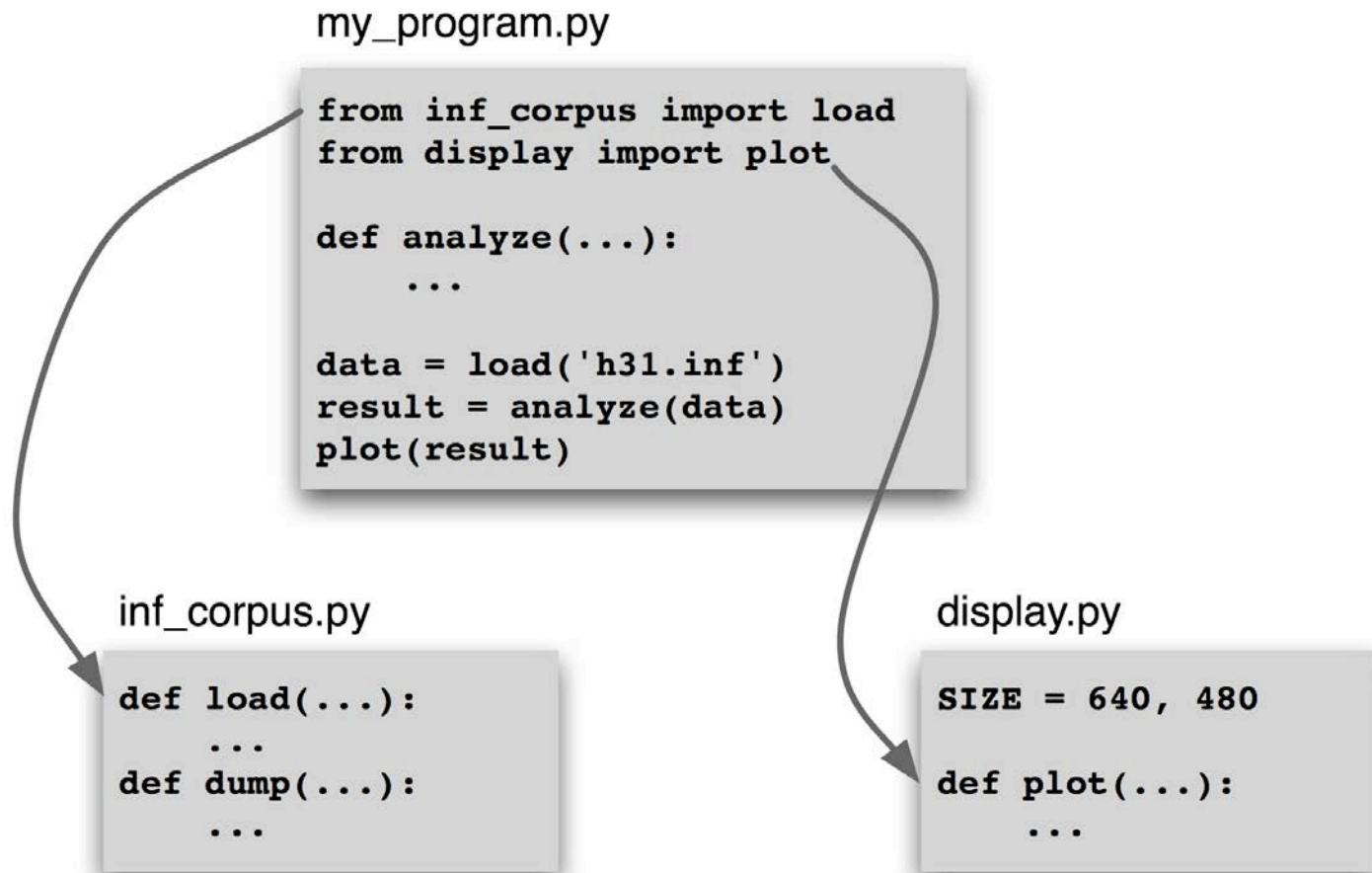
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- Module is used to bring logically-related definitions and functions together:
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- The usual structure for a module:
 - Commented lines, e.g. for copyright notice, license information, revision history, etc.
 - Module level docstring
 - Import statements required for the module
 - Global variables
 - A series of function definitions that make up most of the module

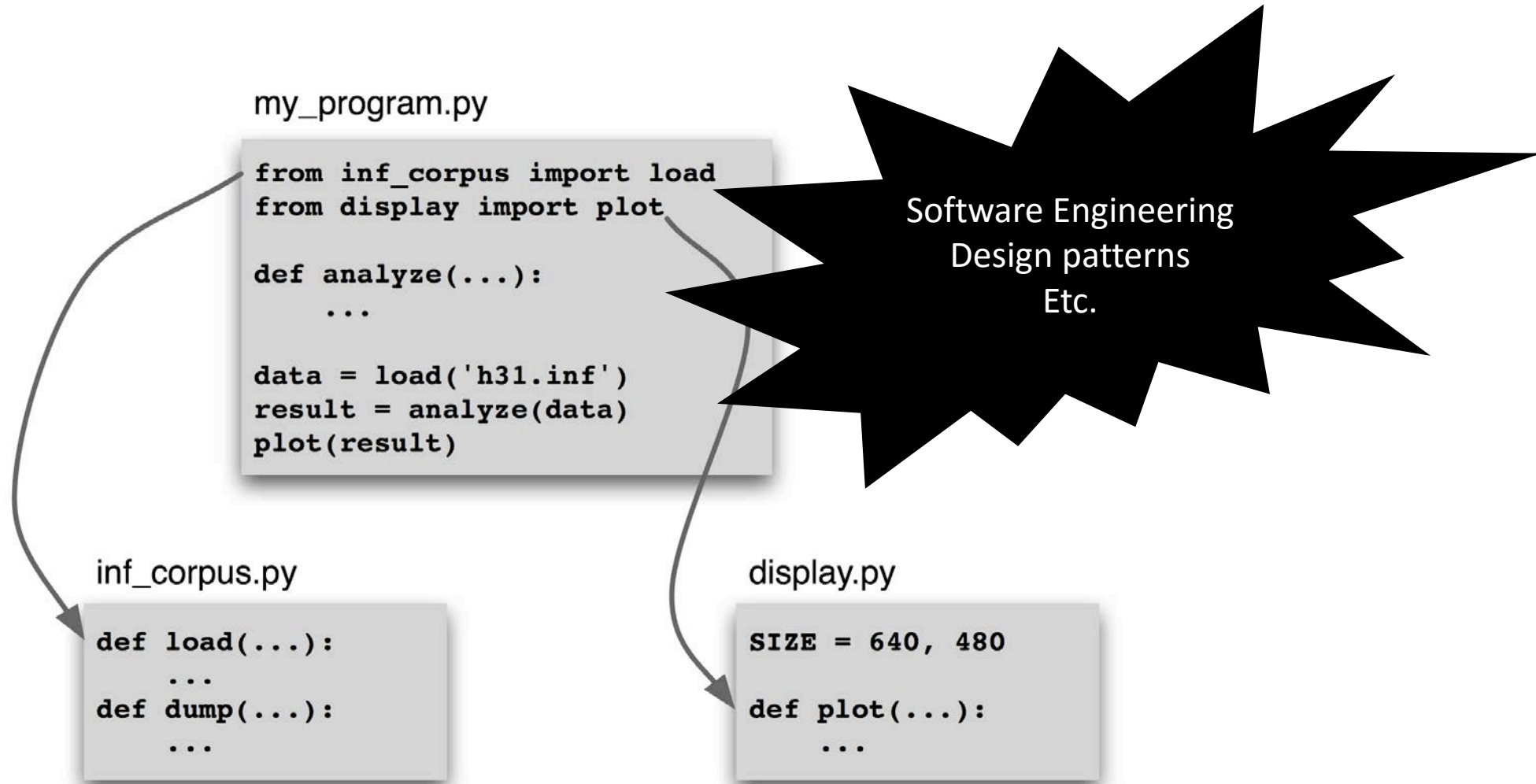
Structure of a Python Module

- Module is used to bring logically-related definitions and functions together:
 - The global namespace
 - An imported module
 - For internal use only
 - Some module variables and functions must be only used within the module:
 - Use an underscore in the beginning of their names to hide them, e.g. `_helper()`
 - These names won't be imported when using `from module import *`
 - List the externally accessible names of a module using a special built-in variable `__all__ = ['method1', 'variablen']`.
- The usual structure of a module
 - Comments
 - Module docstring
 - Import statements from other modules
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Multi-Module Programs



Multi-Module Programs



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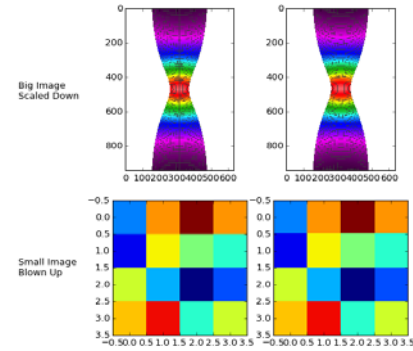
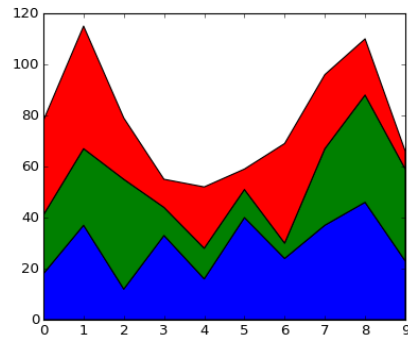
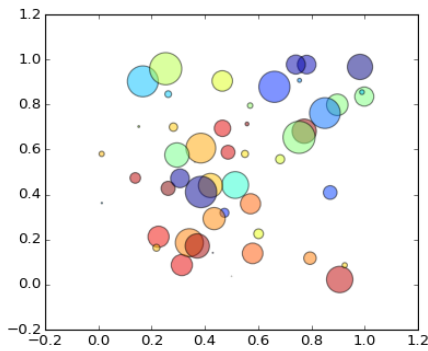
```
import foo # foo imported and bound locally
import foo.bar.baz # foo.bar.baz imported, foo bound locally
import foo.bar.baz as fbb # foo.bar.baz imported and bound as fbb
from foo.bar import baz # foo.bar.baz imported and bound as baz
from foo import attr # foo imported and foo.attr bound as attr
```

A sample of Python Libraries (Packages)

- **Matplotlib**
- **NetworkX**
- **CSV**
- **NumPy**
- ...

Matplotlib

- A package for visualizing data:
 - Sophisticated plotting functions with a MATLAB-style interface;
 - Available from <http://matplotlib.sourceforge.net/> .
- You are going to use this library for writing reports and generating results.



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- Browse Matplotlib website at <http://matplotlib.org>
 - For inspiration, look at the Matplotlib Gallery (</gallery.html>)
 - For learning to use the package, look at </examples/api/index.html>
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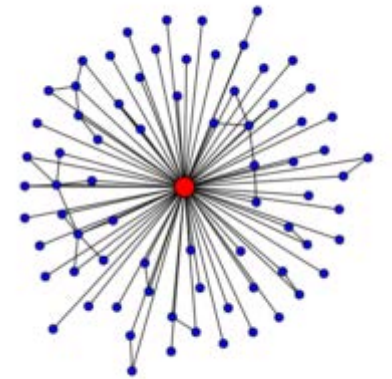
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Remember, the goal is to express (then impress).
Use the right plot for presenting your findings.

NetworkX

- The NetworkX package is for defining and manipulating graph.
 - Graph is a structure consists of nodes and edges.
- NetworkX can be used in conjunction with Matplotlib to visualize networks, such as WordNet.
- The NetworkX is available from <https://networkx.lanl.gov/>
- Browse the website for inspiration, code examples, etc.



There are a lot of libraries to use

- **CSV**

- Python's CSV library can be used to read and write files stored in comma separated values.

- **NumPy**

- Provides methods for numerical processing in Python.
- NumPy includes linear algebra functions, which are very useful!

- **PyML**

- Machine learning in Python.

- **Also look at bindings** for OpenNLP, Gate, Stanford NLP tools, Mallet, ...

- **And, even web frameworks** (see <https://wiki.python.org/moin/WebFrameworks>)

- **Have a look at Python package index** <http://pypi.python.org/> before writing something from scratch!

Other important resources

- Always HELP files
- Mailing lists
 - For instance, for NLTK look at <https://groups.google.com/forum/#!forum/nltk-users>
 - For any other third party libraries that you are going to use there are often a mailing list