

Computermethoden: Computer Vision

Part 6: Python Programming

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BioQuant
MODEL base of LIFE



Contents

Introduction to Python programming:

- Python resources
- Characteristics of Python
- Basic elements: Data types, variables, operators
- Control structures: Selection, iteration
- Re-usable code: Functions, modules
- Data structures: Lists, multi-dimensional arrays
- Understanding errors & common mistakes



Python resources

Official Python 3 tutorial:

- <https://docs.python.org/3/tutorial/>



Python 3 course on codecademy:

- <https://www.codecademy.com/learn/learn-python-3>
- Paid subscription required, but free for 7 days

Further resources:

- <https://jupyter.org> – IDE for data analysis
- <https://www.anaconda.com> – Recommended software for installing/managing Python and additional modules



Python in 2019

- Python was created by **Guido van Rossum** and first released in 1991
- Python 2 was released in 2000 and will be discontinued in 2020
- **Python Software Foundation** launched 2001, is a nonprofit organization devoted to continued development of the Python programming language
- Python 3 was first released in 2008
- **Freely available!**

Python rates as the most wanted programming language

Stack Overflow developer survey 2019: Python more popular than Java

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#python



Stack Overflow's annual developer survey is back with results for 2019. Find out what technology is most loved, most dreaded, and most wanted. This year there are more insights about the global developer profile, demographics, and what challenges get in the way of workflow. With nearly 90,000 responses from around the globe, this is the world's largest developer survey.



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<https://jaxenter.com/stack-overflow-dev-survey-2019-157815.html>



Characteristics of Python

High-level general-purpose programming language

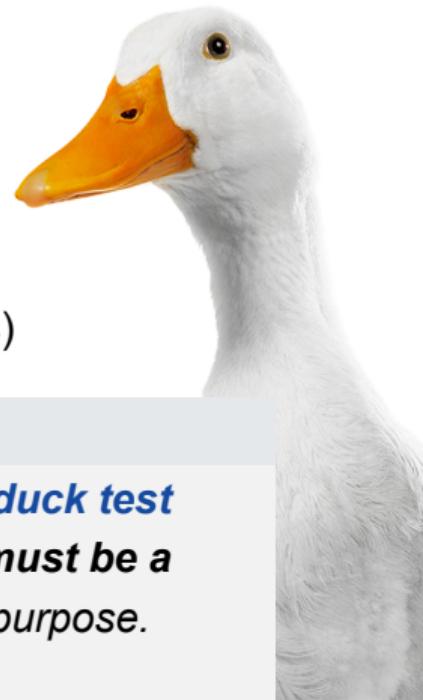
- Interpreted, dynamically typed, garbage-collected
- Very easy to write and understand
 - English keywords
 - Object-oriented and duck-typed
- Well-suited for image and data analysis
- Widely used in scientific computing



Python: Object-oriented and duck-typed

Python is **object-oriented**. What does this mean?

- Python programs consist of **objects** which
 - perform certain tasks
 - interact with each other
- An **object** comprises **attributes** (data) and **methods** (behaviours)



Python is duck-typed

*Duck typing in computer programming is an application of the **duck test***

*– “**If it walks like a duck and it quacks like a duck, then it must be a duck**” – to determine if an object can be used for a particular purpose.*

– https://en.wikipedia.org/wiki/Duck_typing



Objects and types

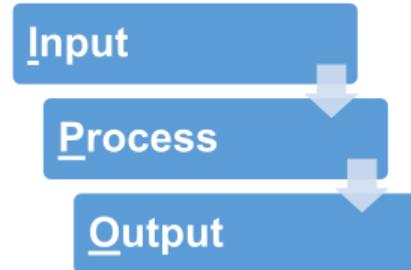
- An object (e.g., “Donald”) is instantiated (created) from a **type** (e.g., “Duck”)
- An object’s **type** defines
 - **which** methods the **object** offers (e.g., walking, quaking, ...)
 - **which** attributes the **object** possesses (e.g., age, color, ...)
 - **...but not their values!** (e.g., Donald has a *different* age and color than Daisy)



Python Programming

Input-process-output (IPO) model of a program

1. Loads input data (e.g., an image)
2. Processes the loaded data
3. Outputs the processed data (e.g., analysis results)



Cycle of Python programming steps

1. Write Python code
2. Run the written Python code
3. Compare the output results with the expected results
4. If something is wrong: **(this is the usual case!)**

Critically re-consider your code → Fix errors → Return to step 2

A simple Python program

```
print('Welcome to Python programming!')
```

- `print` is a **built-in function**
- Prints *one line of text* to the **standard output** (e.g., the screen)
- The part between “(” and “)” are the **function parameters**
 - For `print`, this is the **content to be printed**
 - Here a **string** (text, must be put in quotes like “`' ... '`”) is printed
- In strings, special characters can be inserted:

<code>\\"</code>	backslash character	<code>\t</code>	tab stop
<code>\n</code>	line break	<code>\'</code>	single quote



Data types, variables, and operators



Variables, assignments, and expressions

Assignment syntax

```
variable = value
```

Assigns value to variable, where value can be

- An **object** (e.g., number, string, list, duck, ...)
- An **expression** which *evaluates* to an object
(e.g., the expression “6 + 5” evaluates to the numeric object 11)

The variable then **represents** the object which it was assigned

Combined expressions: The expression “3 * (6 + 5)” evaluates to 33



Numbers, strings, and variables

```
var1 = 2  
var2 = 11  
var3 = var1 + var2  
print(var3)  
var1 = var3  
print(var1 * 2 + 0.5)
```

```
var1 = '42'  
var2 = 'What is the answer?'  
var3 = var2 + ' ' + var1  
print(var3)
```

Reminder: String-type objects *start and end* with single quotes!

Output

13

26.5

Output

What is the answer? 42



Numbers, strings, and variables

```
var1 = 2  
var2 = 11  
var3 = var1 + var2  
print(var3)  
var1 = var3  
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```

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var1 = '42'  
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```

Reminder: String-type objects *start and end* with single quotes!

Output

13

26.5

Output

What is the answer? 42

⇒ The **behaviour** of the “+” operator depends on the **type** of the operands!



Built-in types

In Python, **numbers** are represented by one of two types

- An object of type **float** can be **any decimal number** between $\pm 1.8 \cdot 10^{308}$ but **most numbers cannot be represented exactly** (limited machine precision)
- An object of type **int** can be **any integer number** (e.g., -123, 0, 321, ...)

Examples for objects of type float

-123.2, 1.2e3, 0.0, 12.0, 3.14, ...

Examples for objects of type int

-123, 0, 321, ...

Many other types: str, list, dict, set, frozenset, complex, bool, ...



Operators and types

Different **operations** (behaviours) performed by different **operators** and **types**:

Pythonic expression	op1 and op2 are numbers (e.g., float or int)	op1 is a list or string and op2 is...	
		an int	same type as op1
<code>op1 + op2</code>	sum of op1 and op2	<i>undefined</i>	concatenation of op1 and op2
<code>op1 - op2</code>	difference of op1 and op2	<i>undefined</i>	<i>undefined</i>
<code>op1 * op2</code>	product of op1 and op2	op1 repeated op2 times	<i>undefined</i>
<code>op1 / op2</code>	(true) division of op1 and op2	<i>undefined</i>	<i>undefined</i>
<code>op1 % op2</code>	modulo of op1 and op2	<i>undefined</i>	<i>undefined</i>
<code>op1 // op2</code>	integer division of op1 and op2	<i>undefined</i>	<i>undefined</i>

Note: “`op1 += op2`” is a shorthand for “`op1 = op1 + op2`”. The same holds analogously for the other operators (`-=`, `*=`, `/=`, `%=`, `//=`).



True division vs integer division

True division

- “`6 / 3`” yields “`2.0`” (`float`)
- “`7 / 4`” yields “`1.75`” (`float`)
- “`17 / 5`” yields “`3.4`” (`float`)

Integer division: Fractal part truncated

- “`6 // 3`” yields “`2`” (`int`)
- “`7 // 4`” yields “`1`” (`int`)
- “`17 // 5`” yields “`3`” (`int`)

Modulo operator: Remainder after integer division (fractal part nominator)

- “`6 % 3`” yields “`0`” (`int`, fractal part: $0/4 = 0$)
- “`7 % 4`” yields “`3`” (`int`, fractal part: $3/4 = 0.75$)
- “`17 % 5`” yields “`2`” (`int`, fractal part: $2/5 = 0.4$)
- **Question:** Is “`op1 // op2`” a shorthand for “`(op1 - op1 % op2) / op2`”?
- **Application example:** Determine whether one number is a multiple of the other



Other mathematical operators

Remember: The operators `+`, `-`, `*`, `%`, `//` yield an object of type `int` if op1 and op2 both are of type `int`, and `float` otherwise

Examples

- “`6 + 2`” yields “`8`” (`int`)
- “`6 + 2.0`” yields “`8.0`” (`float`)

Pythonic expression	Type of the result	
	op1 or op2 is <code>float</code>	op1 and op2 are <code>int</code>
<code>op1 + op2</code>	<code>float</code>	<code>int</code>
<code>op1 - op2</code>	<code>float</code>	<code>int</code>
<code>op1 * op2</code>	<code>float</code>	<code>int</code>
<code>op1 / op2</code>	<code>float</code>	<code>float</code>
<code>op1 % op2</code>	<code>float</code>	<code>int</code>
<code>op1 // op2</code>	<code>float</code>	<code>int</code>

Why is this important?

Example: Indexing – see later, be patient!



String formatting

```
day = 31  
month = 'January'  
year = 2019
```

Task: Print the above variables in a canonical date format ("31. January 2019")

Is this a correct solution?

```
print(day + '. ' + month + ' ' + year)
```



String formatting

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day = 31  
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```

Task: Print the above variables in a canonical date format ("31. January 2019")

Is this a correct solution?

```
print(day + '. ' + month + ' ' + year)
```

It is wrong! The "+"-operators are used for operands of *different* types
(numbers and strings). This case is *undefined!*



String formatting

```
day    = 31  
month = 'January'  
year   = 2019
```

Task: Print the above variables in a canonical date format ("31. January 2019")

Correct solutions:

```
print(str(day) + '. ' + str(month) + ' ' + str(year))
```

```
print(f'{day}. {month} {year}')
```

- “f”-prefix creates a **formatted string**
- Substitutes “{day}” by the value of the variable “day”, ...

```
print('%d. %s %d' % (day, month, year))
```

C-style string formatting (old-fashioned)



Selections and iterations



Selections

Structures of the `if`-statement permitted in Python

```
if condition:  
    instruction1  
    instruction2
```

```
if condition1:  
    instruction1  
    instruction2  
else:  
    instruction3  
    instruction4
```

```
if condition1:  
    instruction1  
    instruction2  
elif condition2:  
    instruction3  
    instruction4  
else:  
    instruction5  
    instruction6
```

```
if condition1: instruction1  
elif condition2: instruction2  
else: instruction3
```

Indentation: 4× whitespace! (or 



Conditions

Conditions can be implemented as

- An object of type `bool` (either of the two built-in objects “`True`” or “`False`”)
- A variable which *represents* an object of type `bool` – **Example:**

```
var1 = True  
if var1: print('var1 is True')
```

- An expression which *evaluates* to an object of type `bool`
(e.g., uses *equality or relational operators*) – **Example:**

```
var1 = True  
if not var1: print('var1 is False')
```



Equality or relational operators

Expressions which evaluate to an object of type `bool`:

Pythonic expression	Evaluates to <code>True</code> if... (and <code>False</code> otherwise)
<i>Equality operators</i>	
<code>op1 == op2</code>	... <code>op1</code> is equal to <code>op2</code>
<code>op1 != op2</code>	... <code>op1</code> is not equal to <code>op2</code> (equivalent to “ <code>not op1 == op2</code> ”)
<i>Relational operators</i>	
<code>op1 < op2</code>	... <code>op1</code> is less than <code>op2</code>
<code>op1 > op2</code>	... <code>op1</code> is greater than <code>op2</code>
<code>op1 <= op2</code>	... <code>op1</code> is less equal than or equal to <code>op2</code>
<code>op1 >= op2</code>	... <code>op1</code> is greater than or equal to <code>op2</code>
<code>op1 in op2</code>	... <code>op2</code> contains <code>op1</code> (only defined if <code>op2</code> is a string, list, ...)



Example for if-conditions

```
student_grade = 25
s1 = 'Passed!'
s2 = 'Failed!'

student_grade *= 2

if student_grade >= 50: res = s1
else: res = s2

res = f"Grade={student_grade} ==> {res}"
print(res)
```



Example for if-conditions

```
student_grade = 25
s1 = 'Passed!'
s2 = 'Failed!'

student_grade *= 2

if student_grade >= 50: res = s1
else: res = s2

res = f"Grade={student_grade} ==> {res}"
print(res)
```

Output

Grade=50 ==> Passed!



Iterations

Structures of the `while`-loop in Python

```
while condition:  
    instruction1  
    instruction2  
    ...
```

Indentation: 4x whitespace! (or 

Example

```
i = 0  
while i < 10:  
    print(i)  
    i += 1
```

Output

```
0  
1  
2  
...  
9
```



The for-loop and iterables

The `while`-loop from the previous slide can be formulated as follows

Structures of the for-loop in Python

```
for item in iterable:  
    instruction1  
    instruction2  
    ...
```

Example

```
for i in range(0, 10):  
    print(i)
```

Indentation: 4× whitespace! (or 

An **iterable** can be any **object which contains items**, for example:

- A **range** of **int** objects, `range(a, b)` corresponds to the half-closed interval $\mathbb{Z} \cap [a, b)$. **Note: a and b must be of type int!**
- A **list** (sequence of arbitrary objects), a **string** (sequence of characters), ...
- More examples will be learned during the practical lab sessions!



More loop examples

Example 1

```
product = 2
while product <= 10_000:
    product *= 2
print(product)
```

Example 2

```
result = ''
for character in 'Hello World':
    result = character + result
print(result)
```

Hint: “10_000” is a more easily
human-readable notation for 10000



More loop examples

Example 1

```
product = 2
while product <= 10_000:
    product *= 2
print(product)
```

Example 2

```
result = ''
for character in 'Hello World':
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```

Hint: “10_000” is a more easily
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Output: 16384



More loop examples

Example 1

```
product = 2
while product <= 10_000:
    product *= 2
print(product)
```

Hint: “10_000” is a more easily human-readable notation for 10000

Output: 16384

Example 2

```
result = ''
for character in 'Hello World':
    result = character + result
print(result)
```

Output: dlrow olleH



Functions and modules



Re-usable code

Python supports **code re-usability** at different levels:

1. **Classes** (e.g., specify the *blueprint* of a duck, i.e., its *attributes* and how it *behaves*, then synthesize as many ducks as you want)
2. **Functions** (e.g., specify a receipt for how to roast ~~a~~ duck tofu *once*, then roast many ~~ducks~~ tofus on an assembly line)
3. **Modules:** Collections of classes + functions for specific tasks (e.g., load and use the *duck processing toolkit* someone else wrote, or write your own one)



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Functions

Built-in functions

- `abs(number)` – computes $|x|$ where x is a number
- `int(number)` – truncates the fractal part of number (yields an `int` object)
- `len(iterable)` – counts items in `iterable` (e.g., characters in a string)
- `pow(a, b)` – computes a^b for any numbers a and b
- `print(value)` – prints value to the standard output
- `range(a, b)` – yields an iterable for `int` objects in $[a, b) \cap \mathbb{Z}$
- `round(number)` – rounds number to the closest integer value (yields `int`)
- `str(value)` – converts value (e.g., `float`, `int`) to a string
- `sum(iterable)` – yields sum of items in `iterable` (e.g., numbers in a list)
- *and many others...*

Writing functions

Lets define a **re-usable function** “reverse” which **reverses a string**

Syntax for function definitions

```
def function(parameters):  
    instruction1  
    instruction2  
    ...
```

Example

```
def reverse(string):  
    result = ''  
    for character in string:  
        result = character + result  
    return result
```

Indentation: 4× whitespace! (or )

- The **return** instruction determines the object, which the function evaluates to
- The **return** instruction terminates the execution of the function
- The function evaluates to the object **None** if no **return** instruction is encountered



Examples for self-written functions

```
def reverse(string):
    result = ''
    for character in string:
        result = character + result
    return result

reverse('Hello World')
reverse(reverse('Hello World'))
```



Examples for self-written functions

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Output

dlrow olleH



Examples for self-written functions

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reverse('Hello World')
reverse(reverse('Hello World'))
```

Output

dlrow olleH

Hello World



Modules

An ecosystem that can hardly be overlooked



Popular low-level Python modules

- numpy – numerical Python extensions (linear algebra, multi-dimensional arrays, ...)
- scipy – scientific computing (e.g., optimization, interpolation, image processing, ...)

Popular high-level Python modules

- sklearn – machine learning
- skimage – image processing (stand-alone + integrates into sklearn)



Loading and using modules

Fundamentals of working with modules

Purpose	Syntax	Example
Loading a module	<code>import module</code>	<code>import math</code>
Using an object from a loaded module	<code>module.object</code>	<code>print(math.pi)</code>
Using a function from a loaded module	<code>module.function(...)</code>	<code>print(math.log10(10))</code>

Hierarchical organization: Some modules contain sub-modules – Example:

```
import skimage.io  
img = skimage.io.imread('filepath.tiff')
```

Reads the image from the file “filepath.tiff” as an object represented by img



Lists and multi-dimensional arrays

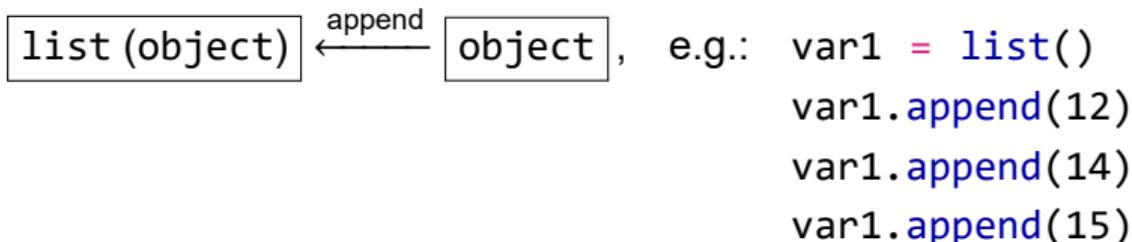


Lists

- So far: A **single variable** represents a **single object**



- A **list** is an **object** which contains references to **multiple objects**

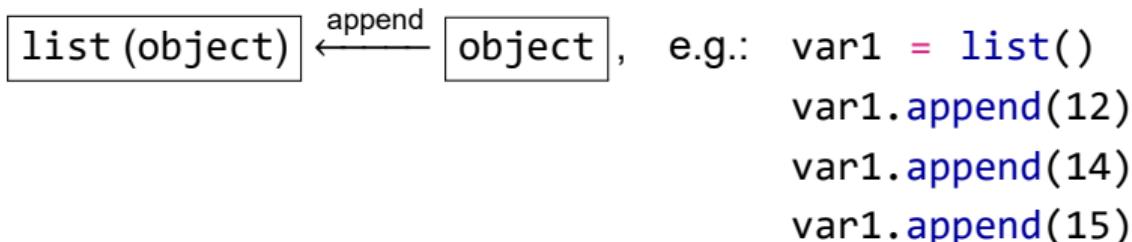


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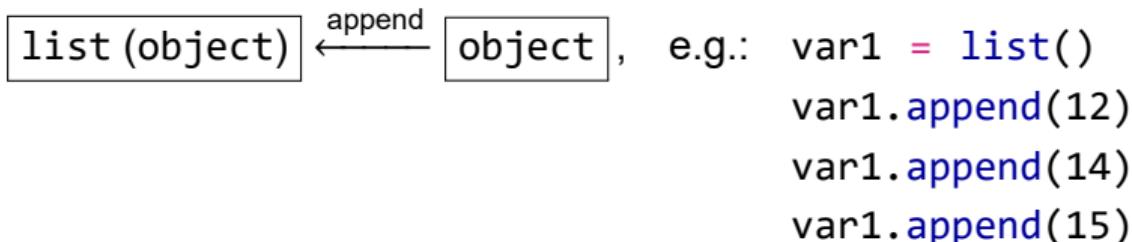


Lists

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- A **list** is an **object** which contains references to **multiple objects**



- Removing an **object** from a list deletes the reference (the object still exists)

Example: var1.remove(14)

print(var1) produces the output: [12, 15]



list indexing and iterating

A list is a continuous sequence of object references (“flat map of positions to objects”)

```
var1 = list()  
var1.append(12)  
var1.append(14)  
var1.append(15)  
var1.append(-3)
```

Position	Object
0	12
1	14
2	15
3	-3

Accessing data in a list

- `len(var1)`: Yields number of items in var1
- `var1[i]`: Represents the i-th item (entry) of the list (“i” is called *position* or *index*)

Notes: • i must suffice $-len(var1) \leq i < len(var1)$

- `i = -1` refers to the last item
- `i = -2` to the one before the last, ...
- i must be an `int`

Iteration by index

```
for i in range(0, len(var1)):  
    print(var1[i])
```

Lists are iterable

```
for obj in var1:  
    print(obj)
```

Output

12

14

15

-3



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- `i = -2` to the one before the last, ...
- `i` must be an int

Iteration by index

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for i in range(0, len(var1)):  
    print(var1[i])
```

Lists are iterable

```
for obj in var1:  
    print(obj)
```

Output

12

14

15

-3



list indexing example

Note:

```
var1 = list()  
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is equivalent to

```
var1 = [12, 14, 15]
```



list indexing example

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var1.append(12)  
var1.append(14)  
var1.append(15)
```

is equivalent to

```
var1 = [12, 14, 15]
```

Example

```
data = [3, 1, 6, 11, 5, 2]  
print(data[len(data) / 2])
```



list indexing example

Note:

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var1 = list()  
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is equivalent to

```
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Example (error)

```
data = [3, 1, 6, 11, 5, 2]  
print(data[len(data) / 2])
```



list indexing example

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```

is equivalent to

```
var1 = [12, 14, 15]
```

Example (error)

```
data = [3, 1, 6, 11, 5, 2]  
print(data[len(data) / 2])
```

“`len(data) / 2`” evaluates to “`3.0`”
`(float)` but “`data[...]`” expects an
`int` object! – cf. Slides 13 and 30

Example (corrected)

```
data = [3, 1, 6, 11, 5, 2]  
print(data[len(data) // 2])
```



list indexing example

Note:

```
var1 = list()  
var1.append(12)  
var1.append(14)  
var1.append(15)
```

is equivalent to

```
var1 = [12, 14, 15]
```

Example (error)

```
data = [3, 1, 6, 11, 5, 2]  
print(data[len(data) / 2])
```

“`len(data) / 2`” evaluates to “`3.0`”
`(float)` but “`data[...]`” expects an
`int` object! – cf. Slides 13 and 30

Example (corrected)

```
data = [3, 1, 6, 11, 5, 2]  
print(data[len(data) // 2])
```

Output

11



Assignment using list indexing

Indexing can also be used for manipulation of lists

Example 1

```
data = [3, 1, 6, 11, 5, 2]
data[2] = -5
print(data)
```



Assignment using list indexing

Indexing can also be used for manipulation of lists

Example 1

```
data = [3, 1, 6, 11, 5, 2]  
data[2] = -5  
print(data)
```

Output

[3, 1, -5, 11, 5, 2]



Assignment using list indexing

Indexing can also be used for manipulation of lists

Example 1

```
data = [3, 1, 6, 11, 5, 2]
data[2] = -5
print(data)
```

Output

[3, 1, -5, 11, 5, 2]

Example 2

```
data = [3, 1, 6, 11, 5, 2]
data[2] = data[0]
print(data)
```



Assignment using list indexing

Indexing can also be used for manipulation of lists

Example 1

```
data = [3, 1, 6, 11, 5, 2]
data[2] = -5
print(data)
```

Output

[3, 1, -5, 11, 5, 2]

Example 2

```
data = [3, 1, 6, 11, 5, 2]
data[2] = data[0]
print(data)
```

Output

[3, 1, 3, 11, 5, 2]



list slicing

```
data = [1, 6, 3, 1, 1, 2, 1]
```

- **Indexing:** Accesses an item (*element*) of a list (e.g., “`data[2]`” yields 3)
- **Slicing:** Retrieves a list (*subset*) of another list

Syntax	Example	Slice
<code>data[start:end]</code>	<code>data[1:4]</code>	[6, 3, 1]
<code>data[start:]</code>	<code>data[4:]</code>	[1, 2, 1]
<code>data[:end]</code>	<code>data[:3]</code>	[1, 6, 3]
<code>data[start:end:step]</code>	<code>data[2:7:2]</code>	[3, 1, 1]
<code>data[: : step]</code>	<code>data[: : 3]</code>	[1, 1, 1]

- Slicing can also be used for **manipulation** of lists – **Example:**

```
data[2:5] = [-1, -2, -1]
print(data)
```

Output: [1, 6, -1, -2, -1, 2, 1]

Arrays

- An **array** is a **list of fixed length and type** (fundamental programming entity in lower-level programming languages, e.g., C, C++, Java, ...)
- A **multi-dimensional array** is an array with multiple axes
 - **Application examples:** Vector, matrix, 2-D or 3-D image, ...
 - **In Python:** Represented by objects of the type `numpy.ndarray` (`numpy` module)



Working with arrays

- An **array** is an object of the type `numpy.ndarray`
- **Load the numpy module:**

```
import numpy
```

- **Create a new `float`-type array** filled with zeros:

```
array = numpy.zeros(shape)
```

or

```
array = numpy.zeros(shape, float)
```

`shape` is a list which specifies the **array size** (e.g., “[32, 64]” corresponds to a 2-D array with 32 rows and 64 columns)

- `array.ndim` evaluates to the **number of the array dimensions**
- `array` is called **flat** if it is single-dimensional (`array.ndim == 1`)



Arrays and lists

Arrays can also be created from lists

Example 1: List of values

```
array1 = numpy.asarray([1, 2, 3])
print(array1)
print(f'Dimensions: {array1.ndim}')
```

Output

[1 2 3]

Dimensions: 1

Example 2: List of rows

```
array2 = numpy.asarray([[1, 2, 3], [4, 5, 6], [7, 8, 9]])
print(array2)
print(f'Dimensions: {array2.ndim}')
```

Output

[[1 2 3]

[4 5 6]

[7 8 9]]

Dimensions: 2



Array indexing and slicing

Arrays can be sliced and indexed analogously to lists

Example 1 – Indexing

```
array1 = numpy.asarray([[1, 2], [3, 4]])
print(array1[0, 0])
```

Output

1

Example 2 – Slicing

```
array1 = numpy.asarray([[1, 2, 3], [4, 5, 6], [7, 8, 9]])
print(array1[:2, 1:])
```

Output

[[2 3]
 [5 6]]

Example 3 – Slicing

```
array1 = numpy.zeros([3, 3])
array2 = numpy.asarray([[1, 2], [3, 4]])
array1[1:, :2] = array2
print(array1)
```

Output

[[0. 0. 0.]
 [1. 2. 0.]
 [3. 4. 0.]]



Understanding errors & Common mistakes



Tracebacks

- Python provides a so-called *traceback* when an error occurs
- **Reading a traceback** leads to the error you have made (fundamental programming skill)

Example

```
def get_item(data, i):
    return data[i]

print(get_item([1, 6, 3], 3))
```



Tracebacks

- Python provides a so-called *traceback* when an error occurs
- **Reading a traceback** leads to the error you have made (fundamental programming skill)

Example

```
def get_item(data, i):
    return data[i]

print(get_item([1, 6, 3], 3))
```

Output

```
-----
IndexError          Traceback (most recent call last)
<ipython-input-20-bf91d868e666> in <module>
      2     return data[i]
      3
----> 4 print(get_item([1, 6, 3], 3))


```

```
<ipython-input-20-bf91d868e666> in get_item(data, i)
      1 def get_item(data, i):
----> 2     return data[i]
      3
      4 print(get_item([1, 6, 3], 3))
```

IndexError: list index out of range



Tracebacks

- Python provides a so-called *traceback* when an error occurs
- **Reading a traceback** leads to the error you have made (fundamental programming skill)

Example

```
def get_item(data, i):
    return data[i]

print(get_item([1, 6, 3], 3))
```

Common mistake

IndexError: Accessing list/array
items out of range

Output

```
-----
IndexError          Traceback (most recent call last)
<ipython-input-20-bf91d868e666> in <module>
      2     return data[i]
      3
----> 4 print(get_item([1, 6, 3], 3))

<ipython-input-20-bf91d868e666> in get_item(data, i)
      1 def get_item(data, i):
----> 2     return data[i]
      3
      4 print(get_item([1, 6, 3], 3))
```

IndexError: list index out of range



Common mistakes

Example

```
def reverse(string):
    result = ''
    for character in string:
        result = character + result
    return result

reverse('Hello World')
```



Common mistakes

Example

```
def reverse(string):
    result = ''
    for character in string:
        result = character + result
    return result

reverse('Hello World')
```

Output

```
File "<ipython-input-21-e6c02796aba8>", line 4
    result = character + result
               ^
IndentationError: expected an indented block
```



Common mistakes

Example

```
def reverse(string):
    result = ''
    for character in string:    ↴
        result = character + result
    return result

reverse('Hello World')
```

Output

```
File "<ipython-input-21-e6c02796aba8>", line 4
    result = character + result
                           ^
IndentationError: expected an indented block
```

Common mistake

IndentationError: Wrong indentation



Common mistakes

Example

```
data = [1, 6, 3, 1, 1, 2, 1]
for i in range(0, len(data)):
    print(fancy_function(data, i))

def fancy_function(data, position):
    return sum(data[:1 + position])
```



Common mistakes

Example

```
data = [1, 6, 3, 1, 1, 2, 1]
for i in range(0, len(data)):
    print(fancy_function(data, i))

def fancy_function(data, position):
    return sum(data[:1 + position])
```

Output

```
-----
NameError                                 Traceback (most recent call last)
<ipython-input-24-fcf3bd0f1bea> in <module>
      1 data = [1, 6, 3, 1, 1, 2, 1]
      2 for i in range(0, len(data)):
----> 3     print(fancy_function(data, i))
      4
      5 def fancy_function(data, position):

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



Common mistakes

Example

```
data = [1, 6, 3, 1, 1, 2, 1]
for i in range(0, len(data)):
    print(fancy_function(data, i))

def fancy_function(data, position):
    return sum(data[:1 + position])
```

Output

```
-----
NameError                                 Traceback (most recent call last)
<ipython-input-24-fcf3bd0f1bea> in <module>
      1 data = [1, 6, 3, 1, 1, 2, 1]
      2 for i in range(0, len(data)):
----> 3     print(fancy_function(data, i))
      4
      5 def fancy_function(data, position):
```

NameError: name 'fancy_function' is not defined

Common mistake

NameError: Function used before definition



Common mistakes

Example

```
for character in 'Hello World':  
    result = character + result  
print(result)
```



Common mistakes

Example

```
for character in 'Hello World':  
    result = character + result  
print(result)
```

Output

```
-----  
NameError Traceback (most recent call last)  
<ipython-input-26-bc66d091382b> in <module>  
      1 for character in 'Hello World':  
----> 2     result = character + result  
      3 print(result)  
  
NameError: name 'result' is not defined
```



Common mistakes

Example

```
for character in 'Hello World':  
    result = character + result ←  
print(result)
```

Output

```
-----  
NameError Traceback (most recent call last)  
<ipython-input-26-bc66d091382b> in <module>  
      1 for character in 'Hello World':  
----> 2     result = character + result  
      3 print(result)  
  
NameError: name 'result' is not defined
```

Common mistake

NameError: Variable usage before assignment



Common mistakes

Example 1

```
data = [3, 1, 6, 11, 5, 2, 1]
for i in range(0, len(data) / 2):
    print(data[i])
```



Common mistakes

Example 1

```
data = [3, 1, 6, 11, 5, 2, 1]
for i in range(0, len(data) / 2):
    print(data[i])
```

Output

```
-----
TypeError                                     Traceback (most recent call last)
<ipython-input-27-af826dd5c45c> in <module>
      1 data = [3, 1, 6, 11, 5, 2, 1]
----> 2 for i in range(0, len(data) / 2):
      3     print(data[i])
      4
```

TypeError: 'float' object cannot be interpreted as an integer



Common mistakes

Example 1

```
data = [3, 1, 6, 11, 5, 2, 1]
for i in range(0, len(data) / 2):
    print(data[i])
```

Output

```
-----
TypeError                                 Traceback (most recent call last)
<ipython-input-27-af826dd5c45c> in <module>
      1 data = [3, 1, 6, 11, 5, 2, 1]
----> 2 for i in range(0, len(data) / 2):
      3     print(data[i])
      4

TypeError: 'float' object cannot be interpreted as an integer
```

Common mistake

TypeError: The object used for range, indexing, or slicing is not of type int



Common mistakes

Example 1

```
data = [3, 1, 6, 11, 5, 2, 1]
for i in range(0, len(data) / 2):
    print(data[i])
```

Output

```
-----
TypeError                                 Traceback (most recent call last)
<ipython-input-27-af826dd5c45c> in <module>
      1 data = [3, 1, 6, 11, 5, 2, 1]
----> 2 for i in range(0, len(data) / 2):
      3     print(data[i])
      4
```

Example 2

```
data = [3, 1, 6, 11, 5, 2, 1]
for i in range(0, len(data)):
    print(data[i / 2])
```

TypeError: 'float' object cannot be interpreted as an integer

Common mistake

TypeError: The object used for range, indexing, or slicing is not of type int



Questions?

