Python Tutorial for CSE 446

CSE446

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• Know some basics about how to use Python.

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See how you may use Python for CSE 446.

Python is a general-purpose interpreted language. It is popular for machine learning because it is easy to code, has diverse libraries, and can use C for heavy computation tasks.

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Simple hello world:

```
def hello_world():
    print("hello_world")
```

hello_world()

Intro: running the Python Shell

 You can run the Python Shell by typing python command on Linux or Mac, and open the Python Shell application if on Windows.

```
% python
Python 2.7.12 (default, Nov 19 2016, 06:48:10)
[GCC 5.4.0 20160609] on linux2
Type "help", "copyright", "credits" or "license" for
    more information.
>>>
```

We do not care about which Python version you use. The code in this tutorial is guaranteed to work on Python 2.7+.

Math Operators

- ► +, -, *, / work the way you expect them to. For /, if either the divisor or dividend is a float, the result is a float; otherwise, the result is an integer.
- // is the truncating integer division operator. 5.0 // 1.5 will yield 3.0. The decimal part is dropped.
- % is the modulo operator.
- ▶ ** exponential. ** has precedence over *, /, and //.
- ► AeB means A × 10^B, where A is an integer or float, and B is an integer. A and B cannot be variables.

Math Operators: Example

```
a = 3
b = 11
b % a # outputs 2
b / a # outputs 3
b / float(a) # outputs 3.666...5
b // a # outputs 3
a**2 # outputs 9
1.5e10 # outputs 1500000000.0
```



Language Basics: Types

In Python, you can convert from one type to another by invoking that type as a function (e.g. int(), str()). You can check the type of a variable with type function. See example below:

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```
>>> a = 5
>>> type(a)
<type 'int'>
>>> str(a) + ","
'5,'
>>> b = 0x2424
>>> type(b)
<type 'int'>
>>> str(hex(b))
'0x2424'
```

Language Basics: Conditionals

 Python keywords related to Boolean expressions are: True, False, and, or, not. For example:

>>> False or not ((2 == 3) and (7 <= 5)) True

- Comparison operators are ==, !=, >, <, >=, <=.</p>
- Operators is, in are used with data structures (soon).
- Example program with if-else syntax:

```
def compare(a, b):
    if a > b:
        print("a is larger!")
    elif a < b:
        print("b is larger!")
    else:
        print("a and b are equal!")</pre>
```

Language Basics: Loops

Python supports for-loop and while-loop. Keywords continue and break are the same as in Java. More examples when discuss DS.

```
import sys
# output: 0, 1, 2, 3, 4,
for i in range(5):
   sys.stdout.write(str(i)+",")
# There will be nothing written!
for i in range(6, 2):
   sys.stdout.write(str(i)+",")
# output: 6, 5, 4, 3
for i in xrange(6, 2, -1):
   sys.stdout.write(str(i)+",")
i = 5
while i \ge 0:
   i -= 1
```

Data structures

- The Python data structures that you will use the most are list, dict, tuple, set, string. We will take a look at them.
- Other data structures, such as queue, stack, priority queue, etc. can either be mimicked using the above ones (e.g. use list for stack), or there is some library that implements it (e.g. heap and deque).
- We won't cover everything here. Refer to Python documentation:

https://docs.python.org/2/library/functions.html

Data structures: list

Think about ArrayList in Java. A list is a dynamic-sized integer-indexed array. Here is an example program:

```
def reverse_list(1):
    for i in range(len(1)/2):
        tmp = 1[i]
        1[i] = 1[-(i+1)]
        1[-(i+1)] = tmp
        1.append("hey!")

1 = [2, [0, 1], 'hi', -9]
reverse_list(1) # 1 becomes: [-9, 'hi', [0, 1], 2, 'hey!']
```

You can take slices off a list as follows.

```
1 = [0,1,2,3,4]
1[:4] # returns [0,1,2,3]
1[3:] # returns [3,4]
1[2:4] # returns [2,3]
```

Data structures: dict

. . .

Think about Map in Java. A dict is a hash table. Here is a demonstration of the operations that you can do with it.

```
staff446 = {'Prof': 'Sham M. Kakade', 'TA': ['Kousuke',
    'Ben', 'Fanny', 'Sean', 'Vardhman', 'Patrick',
    'Jeannette', 'Kaiyu']}
staff446['Prof'] # returns 'Sham M. Kakade'
staff446['Coordinator'] = 'Pim Lustig'
staff446[99] = 100
# Won't work. key 100 does not exist yet!
staff446[100] += 1
# Removes the key 99. If 99 isn't a key, returns None.
staff446.pop(99, None)
# Check if key exists
if 'XYZ' in staff446:
   . . .
# key pair iteration
for role in staff446:
```

Data structures: tuple I

A tuple is a finite, ordered list of elements. For example:

p0 = (0, 0, 1)p1 = (1, 'a', [2,3])

You can access an element in a tuple just like accessing a list:

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```
date = (1, 4, 2018)
month = date[0] # month is 1
day = date[1] # day is 4
year = date[-1] # year is 2018
```

Or, more conveniently, you can unpack a tuple:

day, month, year = date

Data structures: tuple II

A tuple is hashable if all elements are hashable (i.e. has hash value). So you can have:

uw = {} uw[(1,3,2018)] = 'Quarter starts'

Won't work because p1=(1, 'a', [2,3]); lists are not hashable,

uw[p1] = 'VALUE'

. . .

You can iterate through a tuple with for-loop just like with lists:

for e in (1,3,2017):

You can slice a tuple just like a list.

a = (0,1,2,3,4)
a[:3] # returns (0, 1, 2). etc.

Data structures: set

Think about Set in Java. No duplicated elements, and no indexing of elements. Example code:

```
empty_set = set({})
myset = {1, 2, 3}
myset.add(4)
myset.update([5,6,7]) # add multiple elements
for item in myset:
    ....
```

You can do basic set operations:

```
a, b = {1, 4, 5}, {0, 2, 4, 7}
a | b # Union: set([0, 1, 2, 4, 5, 7])
a & b # Intersection: set([4])
a - b # Difference: set([1, 5])
a ^ b # Symmetric difference: set([0, 1, 2, 5, 7])
```

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Data structures: string

A string is created by either putting characters inside single quotes or double quotes, or by casting an object of another type to string using str. You can expect python strings to have the same power as Java strings. See https://docs.python.org/2/library/string.html. You can iterate over a string just like a list.

Example: csv file processing

- You will deal with data in machine learning. One common format to store plain-text data is csv.
- We will go through an example of how a csv data file can be processed with Python.

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Example: csv file processing — Laser scan readings

Many mobile robots have an on-board laser scanner, which shoots dozens of laser beams and can sense the distance the beam travelled before it hits an obstacle. Suppose we have a dataset of laser readings. It is in CSV format.

1	148210	9355	. 586939	921	7.448	462009	43	7.434	41057	205	7.42	0551	77689	7.4	0688	6577	61	7.3	93411
2	1/19216	0355	696939	021	7 1/19	467731	10	7 434	11534	942	7 42	05570	97577	7 /	0690	1977	01	7 3	03/16
2	140210	0255	7060339	921	7 . 440	407751	100	7.434	11010	502	7.42	05573	2011	417	0009	1022	01		00440
ک	148210	9355	. 186939	921	7.448	492527	01	7.434	44013	590	1.42	0282	29440	1.4	0091	0141	51	1.3	93440
4	148210	9355	.886939	921	7.448	469638	382	7.434	41724	777	7.42	05598	88312	7.4	0689	3730	16 '	7.3	93418
5	148210	9355	.986939	921	7.448	467254	64	7.434	41486	359	7.42	05574	49893	7.4	0689	1345	98	7.3	93416
6	148210	9356	.086939	921	7.448	497772	22	7.434	44585	в 7.	4205	88493	335 7	. 406	9213	8672	7.	393	44692
7	148210	9356	. 186939	921	7.448	457241	.06	7.434	40532	684	7.42	05484	43903	7.4	0688	1809	23	7.3	93407
8	148210	9356	.286939	921	7.448	463916	578	7.434	41295	624	7.42	0554:	16107	7.4	0688	8484	95	7.3	93413
9	148210	9356	. 386939	921	7.448	464870)45	7.434	41200	256	7.42	0555:	11475	7.4	0688	8484	95	7.3	93413
10	14821	.09350	5.486939	921	7.44	846677	78	7.434	41534	942	7.42	05565	54526	7.4	0689	0869	14	7.3	93416
11	. 14821	.09350	5.586939	921	7.44	845247	269	7.43	44005	5847	7.4	2054:	176331	17.	4068	7608	719	7.	39340
12	14821	.09350	5.686939	921	7.44	847631	454	7.43	44244	0033	7.4	2056	51283	37.	4069	0040	588	7.	39342
13	14821	.09350	5.786939	921	7.44	847249	985	7.43	44196	3196	7.4	2056:	17904	77.	4068	9611	435	7.	39342
14	14821	.09350	5.886939	921	7.44	848012	924	7.43	44282	1503	7.4	20570	937354	47.	4069	0469	742	7.	39342
15	14821	.0935(5.986939	921	7.44	843196	i869	7.43	43805	3131	7.4	20522	221298	37.	4068	5749	054	7.	39338
16	14821	.0935	7.086939	921	7.44	838762	283	7.43	43371	3913	7.4	20479	977448	37.	4068	1457	52	7.3	93341
17	14821	0935	7.186939	921	7.44	840574	265	7.43	43543	9527	7.4	20490	646378	37.	4068	3221	817	7.	39335
18	14821	0935	7.286939	921	7.44	838237	762	7.43	43309	4025	7.4	20474	405243	37.	4068	1028	366	7.	39333
19	14821	0935	7.386939	921	7.44	838047	028	7.43	43295	0974	7.4	20472	262192	27.	4068	0789	948	7.	39333
20	14821	.0935	7.486939	921	7.44	837903	976	7.43	43285	5606	7.4	2047:	11914:	17.	4068	0694	58	7.3	93332
21	. 14821	.0935	7.586939	921	7.44	843959	808	7.43	43891	1438	7.4	20532	222656	57.	4068	6798	096	7.	39339
22	14821	.0935	7.686939	921	7.44	846105	576	7.43	44096	1838	7.4	20552	273056	57.	4068	8800	812	7.	39341

Here is the actual format of this dataset for one row. You don't need to understand what they mean exactly.

Note: The number of readings in <readings \ldots > equals to the value in <n_beams>.

Example: csv file processing - Code I

Below is the actual code to preprocess a dataset like this. We hope to obtain a list of data rows, and each row is a dictionary. Here is the abbreviated code to show you how you can do this task with Python.

```
def parse_laser(lsfname):
             """Parse given laser scans file and return a list of
                                       ROS messages in dictionary form"""
             laser_data = []
            with open(lsfname) as f:
                                     print("Reading laser scans in %s " % lsfname)
                                        . . .
                                     lines = f.readlines()
                                     for i, row in enumerate(lines):
                                                              msg = \{\}
                                                               cols = row.split(' ')
                                                              # assign values
                                                              msg['id'] = cols[0]
                                                                                                                                                                                                                                                                     < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > <
```

Example: csv file processing - Code II

```
msg['time_stamp'] = float(cols[1])
       msg['n_beams'] = int(cols[2])
       msg['ranges'] = [None] * msg['n_beams']
       for k in range(msg['n_beams']):
           msg['ranges'][k] = float(cols[3 + k])
       . . .
       laser_data.append(msg)
       # print progress
       sys.stdout.write('Processing file [%.1f%%]\r'
           % (float(i+1)/len(lines)*100))
       sys.stdout.flush()
   sys.stdout.write('\n')
    . . .
print("Finished processing %d laser scans." %
   len(laser_data))
```

```
return laser_data
```

Beyond

For your homework, you may need to use various tools and libraries. Here are some useful ones to know:

PDB: The interactive Python debugger. Really useful. You use it by putting the follow line of code at the breakpoint:

import pdb; pdb.set_trace()

- NumPy: Useful for dealing with large-scale arrays and matrices, with many math operations.
- matplotlib: Python plotting library, if you want visualization.

- Pandas: Data analysis, IO, etc.
- pip & virtualenv: Python package management.

NumPy

Part of SciPy stack, for scientific computing with Python. Visit www.numpy.org for documentation.

 Core data structure: homogeneous nd-array. Much faster than Python's list. Both are written in C though (assuming you use CPython).

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- High-level math operations for linear algebra, etc.
- Broadcasting: treating arrays with different shapes.
- ▶ Provides C-API, for accessing the array object in C code.

Let's see some quick examples.

NumPy: Examples

import numpy as np

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NumPy: Vectorization

In Python (unlike, for instance, C), writing for or while loops that iterate over the elements of a vector will result in really slow code. Instead, vectorize. For instance, consider two arrays x and y with a million elements each that you want to add together.

```
# BAD
# x and y stored as built-in Python lists
z = []
n = int(1e6)
for i in range(n):
    z.append(x[i] + y[i])
```

```
# GOOD
# x and y stored as numpy arrays
z = x + y
```

The second version runs 200x faster (try it!)

NumPy: Caveats

- If you need to multiply two vectors or matrices, don't write you own code to do it. Instead, use numpy.dot.
- If you need to invert a matrix, don't write your own code or use numpy.inv. Instead, use numpy.solve.
- In general, any time you're doing heavy numerical work, do it with NumPy functions on NumPy data structures.
- It's worth going through "the basics" in this tutorial: https://docs.scipy.org/doc/numpy-dev/user/quickstart.html

Matplotlib: Python Plotting

Go-to library for plotting in Python. https://matplotlib.org/

```
import numpy as np
import matplotlib.pyplot as plt
# Weather for the next 7 days
x = np.array([i for i in range(7)])
lo = np.array([42,40,39,42,40,40,37])
hi = np.array([45,50,46,45,49,47,46])
plt.plot(x, lo)
plt.plot(x, hi)
plt.show()
```

Tutorials:

https://matplotlib.org/tutorials/index.html#introductory

Pandas: Python Data Analysis Library

- The core Pandas data type is a DataFrame, which is like a NumPy array except the row and column indices can be anything you want. It is 2-dimensional.
- If you have some tabular data that you want to get into Python, use pandas.read_table.
- To convert DataFrame to a NumPy array, use the frame.values attribute.
- Pandas also supports many plotting functions through the frame.plot method.

Much more in the Pandas docs: http://pandas.pydata.org/pandas-docs/stable/

Pandas: process csv file

For the same task of processing csv laser data, you can definitely make use of Pandas.

```
import pandas as pd
import numpy as np
def parse_laser(lsfname):
   df = pd.read_csv(lsfname, delim_whitespace=True,
       header=None) # read csv as DataFrame
   df.columns = ['id', 'timestamp', 'n_beams'] +
       (df.columns[3:3+df.iloc[0][2]].values -
       3).tolist() + ['...the remaining headers...']
   for index, row in df.iterrows():
       . . .
   # The DataFrame looks like this (when you print it)
   # id
             timestamp n_beams 0 1 ... 920 ...
   # 0 1 1482109355... 921 .....
   # 1 2 ...
   # 2 3 ...
   # ...
```

pip & virtualenv: Package management

- Python (and its packages) have too many versions!
- Use virtualenv to create isolated python environments, and use pip to install packages within them.

```
% virtualenv -p python3 <envname> # e.g. CSE446
% source CSE446/bin/activate
(CSE446) % pip install numpy
(CSE446) % deactivate
% # You are now out of the environment.
```

Both supported on Linux, MacOS, Windows.

Other extensions

- Scipy extends NumPy with more scientific computing capabilities. Probably not necessary for this course.
- IPython is an interactive Python console with auto-completion, plotting and debugging support: https://ipython.org/
- To set a breakpoint that will drop you into IPython, use import ipdb; ipdb.set_trace()

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