TOPICS

- 1. Installing and setting up Python3/Anaconda IDE. "Hello World".
- 2. Installing Python modules using the command line and conda.
- 3. Basic coding operations in Python: decisions, loops, functions (parameters, return values, scoping).
- 4. Using files in Python (csv, txt)
- 5. Using pandas dataframes in Python.
- 6. Commonly used Python data structures: lists, dictionaries, numpy arrays, sets.
- 7. Basic math and stats in Python and numpy.
- 8. Basic plotting in Python with matplotlib.pyplot

HOW TO INSTALL AND TEST ANACONDA

Please use this link tutorial:

http://drgates.georgetown.domains/ANLY500/GetPython.pdf

TOPICS

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INSTALLING NEW PACKAGES/MODULES IN ANACONDA.

- 1) Sometimes this is easy. You go to your command line. You type: conda install packagename and you are done.
- 2) However, very often, it is not easy. Sometimes, you need to search for available packages...

To do this – go to your command line. In windows, choose Start and then cmd. In MAC, you will have to find it as I do not have a MAC.

On the command line, search for the package you want: anaconda search –t conda packagename

INSTALLING NEW PACKAGES/MODULES IN ANACONDA.

See here that I have typed: anaconda search —t conda wordcloud

Next, it brings up the options. I need to find an option for win-64 because that is the type of OS I have.

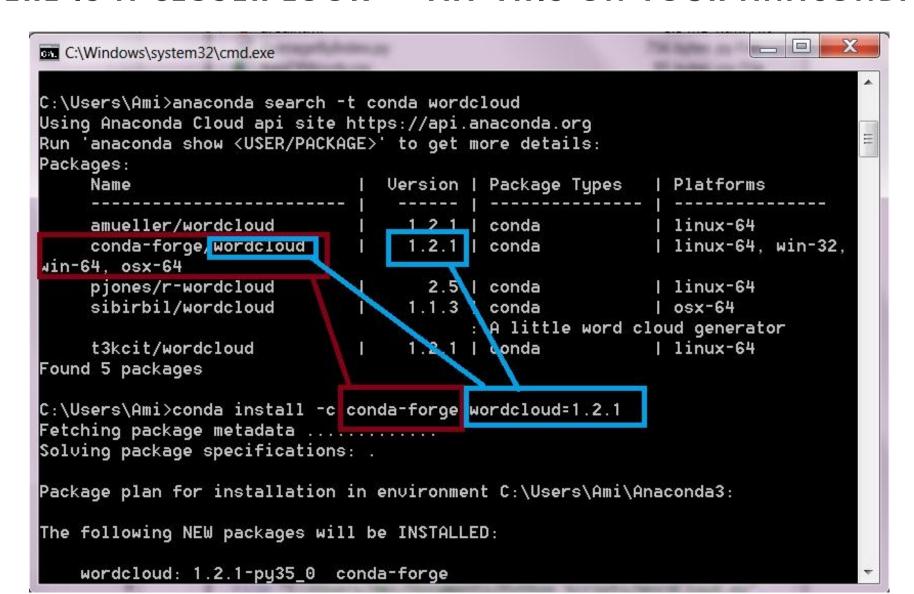
Once I find it (if I do), I can install it with this command:

conda install -c conda-forge wordcloud=1.2.1

The format is critical!

```
C:\Windows\system32\cmd.exe
C:\Users\Ami>anaconda search -t conda wordcloud
Using Anaconda Cloud api site https://api.anaconda.org
Run 'anaconda show <USER/PACKAGE>' to get more details:
Packages:
     Name
                                  Version | Package Types
                                                              Platforms
     amueller/wordcloud
                                    1.2.1 | conda
                                                             | linux-64
     conda-forge/wordcloud
                                    1.2.1 | conda
                                                            | linux-64, win-32,
win-64. osx-64
     pjones/r-wordcloud
                                      2.5 | conda
                                                            | linux-64
    sibirbil/wordcloud
                                    1.1.3 | conda
                                                              osx-64
                                          : A little word cloud generator
     t3kcit/wordcloud
                                    1.2.1 | conda
                                                            | linux-64
Found 5 packages
C:\Users\Ami>conda install -c conda-forge wordcloud=1.2.1
Fetching package metadata .......
Solving package specifications: .
Package plan for installation in environment C:\Users\Ami\Anaconda3:
The following NEW packages will be INSTALLED:
   wordcloud: 1.2.1-py35_0 conda-forge
```

HERE IS A CLOSER LOOK — TRY THIS ON YOUR ANACONDA



PRACTICE:

- 1) Install the package called pandas.
- 2) Install the package called wordcloud.

TOPICS

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BASIC PROGRAMMING IN PYTHON3

Class – I have created several chapters that cover basic Python3.

As such, I will not duplicate them here.

<u>Here are links to the all chapters and the topics</u> – please review and practice with the examples to make sure you understand basic Python3:

http://drgates.georgetown.domains/ANLY500/python/

Pay close attention to Chapters 13 & 14 – for data cleaning, wrangling, and APIs, etc.

(Note: there are no chapters 10 - 12)

AFTER YOUR INITIAL REVIEW

- 1) Once you review the chapters from the previous slide (http://drgates.georgetown.domains/ANLY500/python/) you should have a basic understanding of how to use Python 3.
- 2) You should be comfortable with functions, parameters, scope, files and I/O, data structures such as lists and dictionaries, data wrangling, and using APIs.

TOPICS

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READING DATA INTO PYTHON AND USING PANDAS

The next several slides will show examples for reading data into Python.

Examples will include using pandas and dataframes.

Note that basic file I/O including reading, writing, and appending can be located in chapter 8 of the python 3 reference book: http://drgates.georgetown.domains/ANLY500/python/

PANDAS INTRODUCTION

Gates

REMINDER: BASIC READING IN CSV FILE

```
##Basic open for reading

FILE=open("AirNowResultsLatLong.csv", "r")

##Now, FILE points to the contents of the FILE

## Use a for loop to print the first few lines of

##the file

for line in FILE:

print(line)
```

```
##Because the file is csv, we can split each line
and
## create a list
for line in FILE:
   LineList = line.split(sep=",")
   print(LineList[0])
FILE.close()
##Using with open
with open("AirNowResultsLatLong.csv") as FILE:
  for line in FILE:
     print(line)
```

USING PANDAS AND DATAFRAMES

##An easier way to read a file and use the data
is to use a package called pandas
##Here, I am importing pandas and calling it pd
##I am also importing numpy and calling it np
import pandas as pd
import numpy as np

```
##Note - my dataset has no col names so I will
##create them: see example on next slide
colnames=["city", "state", "date", "type", "value"]
Mydf = pd.read_csv("AirNowResultsLatLong.csv",
names=colnames, header=None)
print(Mydf)
print(Mydf["state"])
print(np.mean(Mydf["value"]))
##To get the names of the columns
print(Mydf.columns)
```

USING PANDAS DATAFRAMES

When using dataframes and pandas, data will appear as a set of rows and columns.

It is also easier to access, manipulate, and aggregate data.

Notice here that the dataframe has the names given on the previous slide. (see code from previous slide)

	city	state	date	type	value
0	Northern Virginia	VA	2016-09-10	OZONE	51
1	Northern Virginia	VA	2016-09-10	PM2.5	55
2	Northern Virginia	VA	2016-09-10	PM10	20
3	Northern Virginia	VA	2016-09-10	OZONE	51
4	Northern Virginia	VA	2016-09-10	PM2.5	55
5	Northern Virginia	VA	2016-09-10	PM10	20
6	Chicago	IL	2016-09-10	OZONE	31
7	Chicago	IL	2016-09-10	PM2.5	33
8	Santa Cruz	CA	2016-09-10	OZONE	28
9	Santa Cruz	CA	2016-09-10	PM2.5	27
10	Fort Lee	NJ	2016-09-10	OZONE	54
11	Fort Lee	NJ	2016-09-10	PM2.5	62

INTRODUCTION TO PYTHON 3 PANDAS

Python pandas (http://pandas.pydata.org/) is an open source library that offers excellent data structures, such as the pandas dataframe, as well as a number of analysis tools.

The pandas library is installed with Anaconda and can be used by including the following import statement:

import pandas as pd

PANDAS: SERIES

```
import numpy as np
import pandas as pd

# Create an array from 0 to 4
myData=np.arange(5)
```

```
# Note the index (row) value names
indexValue=["C1", "C2", "C3", "C4", "C5"]
mySeries=pd.Series(myData, index=indexValue)
print(mySeries)
```

PANDAS: SERIES AND DICTIONARIES

```
myDict={"Name":"Bob", "Age":29,
"Degree":"MS"}
print(pd.Series(myDict))
```

The Output:

Age 29

Degree MS

Name Bob

PANDAS: SERIES

```
myDict2={"Grade1":90.1, "Grade2":88.5,
"Grade3":93.6}
mySeries=pd.Series(myDict2)
print(mySeries)
print("Grade 2 is: ", mySeries[1])
print ("The mean of the grades:",
mySeries.mean())
print("Grades plus 5 points added
is:\n", mySeries+5)
print("Grade 1 is: ",
mySeries.get("Grade1"))
```

The Output: Gradel 90.1 Grade2 88.5 Grade3 93.6 Grade 2 is: 88.5 The mean of the grades: 90.73 Grades plus 5 points added is: Grade1 95.1 Grade2 93.5 Grade3 98.6 Grade 1 is: 90.1

PANDAS: DATAFRAME

```
import pandas as pd
gradebook={"Student1": pd.Series([89.3, 78.7,
92.2], index=['Grade1', 'Grade2', 'Grade3']),
           "Student2": pd.Series([77.3, 83.4,
91.8], index=['Grade1', 'Grade2', 'Grade3']),
           "Student3": pd.Series([97.1, 88.6,
98.5], index=['Grade1', 'Grade2', 'Grade3'])
gradeBookDF=pd.DataFrame(gradebook)
print(gradeBookDF)
```

OUTPUT: DATA FRAME

	Student1	Student2	Student3
Grade1	89.3	77.3	97.1
Grade2	78.7	83.4	88.6
Grade3	92.2	91.8	98.5

PANDAS DF: CREATE EMPTY DF AND ADD VALUE

```
#Create an empty dataframe
Gradebook2 = pd.DataFrame(Gradebook, index=['G1', 'G2', 'G3'], columns=['Bob
Smith', 'Sandy Stern'])

print(Gradebook2)
#Fill in values
Gradebook2.ix["G1","Bob Smith"]=98.1
```

print(Gradebook2)

The Output:

	Bob Smith	Sandy Stern
G1	NaN	NaN
G2	NaN	NaN
G3	NaN	NaN

	Bob Smith	Sandy Stern		
G1	98.1	NaN		
G2	NaN	NaN		
G3	NaN	NaN		

PANDAS DF: ADD NEW COLUMN

#Create an empty dataframe

Gradebook2 = pd.DataFrame(Gradebook, index=['G1', 'G2', 'G3'], columns=['Bob Smith', 'Sandy Stern'])

print(Gradebook2)

#Create a new column

Gradebook2["NewColumn"]="NaN" print(Gradebook2)

The Outpu	ut					
I	3ob	Smith	Sandy	Stern	NewColumn	
G1		NaN		NaN	NaN	
G2		NaN		NaN	NaN	
G3		NaN		NaN	NaN	

PANDAS DF: ADD VALUES

import random

for i in range(len(Gradebook2.BobSmith)):

Gradebook2.ix[i,"BobSmith"]=random.randint(50,100)

print(Gradebook2)

umn
NaN
NaN
NaN

PANDAS DF: CONVERT DICT AND ADD

```
MyDict=[{"Name":"Bob", "Age":29, "Degree":"MS"}, {"Name":"Rob", "Age":34, "Degree":"PhD"}]

DictDF=pd.DataFrame.from_dict(MyDict)

DictDF.insert(2, 'NewColumn', [20007, 23604])

print(DictDF)
```

```
The Output:

Age Degree NewColumn Name

0 29 MS 20007 Bob

1 34 PhD 23604 Rob
```

PANDAS DF: DROPPING ROWS AND COLUMNS

```
MyDict=[{"Name":"Bob", "Age":29, "Degree":"MS"}, {"Name":"Rob", "Age":34, "Degree":"PhD"}]
DictDF=pd.DataFrame.from_dict(MyDict)
DictDF.insert(2, 'NewColumn', [20007, 23604])
#REMOVE the "Degree" column
DictDF=DictDF.drop("Degree", axis=1)
#axis=1 is the column, axis=0 is the row
#Remove the first row (row 0)
DictDF=DictDF.drop(0)
print(DictDF)
```

```
csvFile="MyCSVFile3.csv"
File2=open(csvFile, "w", newline=")
Header=(["FirstName", "Lastname", "Grade1", "Grade2",
"Grade3"])
Data 1 = (["John", "Smith", 90.3, 87.5, 77.2])
Data2=(["Bob", "Benson", 88.8, 77.7, 66.6])
Fwriter=csv.writer(File2)
Fwriter.writerow(Header)
Fwriter.writerow(Data1)
```

Fwriter.writerow(Data2)

print(csvDataFrame)

csvDataFrame=**pd.read_csv**(csvFile)

File2.close()

READ CSV TO PANDAS DF

The Output:

FirstName Lastname Grade1 Grade2 Grade3

O John Smith 90.3 87.5 77.2

Bob Benson 88.8 77.7 66.6

PANDAS DF: ADDING A NEW FEATURE PART 1

```
import pandas as pd
import csv
csvFile="MyCSVFile4.csv"
File2=open(csvFile, "w", newline=")
Header=(["FirstName", "Lastname", "Grade1", "Grade2", "Grade3"])
Data 1 = (["John", "Smith", 90.3, 97.5, 97.2])
Data2=(["Bob", "Benson", 88.8, 77.7, 66.6])
Data3=(["Sally", "Sue", 78.8, 71.7, 76.6])
Data4=(["Annie", "Apple", 58.8, 67.7, 69.6])
Fwriter=csv.writer(File2)
Fwriter.writerow(Header)
for i in [Data1, Data2, Data3, Data4]:
  Fwriter.writerow(i)
File 2.close()
csvDataFrame=pd.read csv(csvFile)
```

```
csvDataFrame["NewFeature"]="NaN"
for i in range(len(csvDataFrame.Grade1)):
  Avg=mean([csvDataFrame.ix[i,"Grade1"],
csvDataFrame.ix[i,"Grade2"]])
  if Avg > 89.9:
     csvDataFrame.ix[i,"NewFeature"]="A"
  elif 79.9 < Avg < 90:
     csvDataFrame.ix[i,"NewFeature"]="B"
  elif 69.9 < Avg < 80:
     csvDataFrame.ix[i,"NewFeature"]="C"
  else:
     csvDataFrame.ix[i,"NewFeature"]="D"
print(csvDataFrame)
```

PANDAS DF: ADDING A NEW FEATURE PART 2

OU	TPUT					
Fire	stName	Lastname	Grade1	Grade2	Grade3	NewFeature
0	John	Smith	90.3	97.5	97.2	Α
1	Bob	Benson	88.8	77.7	66.6	С
2	Sally	Sue	78.8	81.7	86.6	В
3	Annie	Apple	58.8	67.7	69.6	D

A FULL REVIEW OF READING DATA AND USING PANDAS

Class – the following offers a very good overview of various methods for managing data in Python:

http://drgates.georgetown.domains/ANLY500/python/Chapter14DataWranglingCleaningGates.pdf

Please review this carefully as I will not duplicate the information here and will assume that you have read it.

TOPICS

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- 4. Using files in Python (csv, txt)
- 5. Using pandas dataframes in Python.
- 6. Commonly used Python data structures: lists, dictionaries, numpy arrays, sets. covered here:
- http://drgates.georgetown.domains/ANLY500/python/IntroPythonGatesChapter%207___Dat aStructures Lists Dict .pdf
- 7. Basic math and stats in Python and numpy. covered here: http://drgates.georgetown.domains/ANLY500/python/IntroPythonGatesChapter%206___Dat aTypes Strings BasicMath.pdf
- 8. Basic plotting in Python with matplotlib.pyplot covered here: http://drgates.georgetown.domains/ANLY500/python/IntroPythonGatesChapter%209___Basi cGraphics.pdf

MORE ON NUMPY

RE: http://www.numpy.org/

https://docs.scipy.org/doc/numpy-dev/user/quickstart.html

The Basics

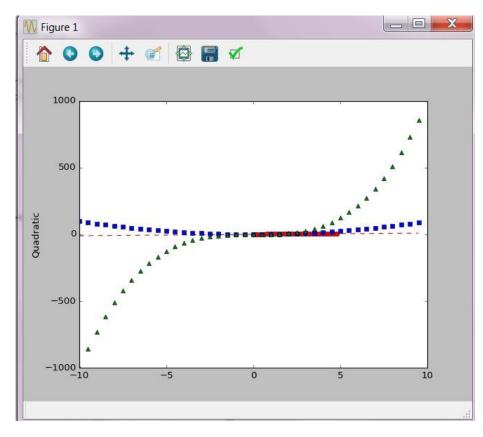
NumPy's main object is the homogeneous multidimensional array. It is a table of elements (usually numbers), all of the same type, indexed by a tuple of positive integers. In NumPy dimensions are called axes. The number of axes is rank.

For example, the coordinates of a point in 3D space [1, 2, 1] is an array of rank 1, because it has one axis. That axis has a length of 3. In the example pictured below, the array has rank 2 (it is 2-dimensional). The first dimension (axis) has a length of 2, the second dimension has a length of 3.

```
[[ 1., 0., 0.],
[ 0., 1., 2.]]
```

NumPy's array class is called ndarray. It is also known by the alias array.

NUMPY AND PLOT EXAMPLES



```
##numpy
import numpy as np
a = np.arange(15).reshape(3, 5)
print(a)
print(a.shape)
print(a.ndim)
b=np.arange(10, 30, 5)
print(b)
from numpy import pi
numbers=np.linspace(0, 2, 9)
print(numbers)
x = \frac{np.linspace(0, 2*pi, 100)}{}
f = \frac{np.sin(x)}{}
print(f)
x = \frac{np}{np}.arange(0., 5., 0.2)
V=X+2
import matplotlib.pyplot as plt
plt.plot(x,y, "ro")
plt.ylabel('Quadratic')
plt.show()
t=np.arange(-10,10,.5)
plt.plot(t, t, 'r--', t, t**2, 'bs', t, t**3, 'g^')
plt.show()
```

NUMPY AND MATPLOTLIB.PYPLOT

- 1) numpy is often used for functions, calculations, and plotting.
- 2) matplotlib is Python's standard plotting package and pyplot is the most common library.
- 3) Use the Internet and my chapter references to review these Python options.

References:

https://matplotlib.org/users/pyplot_tutorial.html

https://docs.scipy.org/doc/numpy-dev/user/quickstart.html

https://docs.scipy.org/doc/numpy-1.12.0/reference/routines.statistics.html

https://docs.scipy.org/doc/scipy/reference/stats.html

SCIPY: SCIPY.ORG

scipy contains core and common Python packages.

Review the site and investigate numpy, scipy, pandas, and matplotlib.















Install

Getting Started

Documentation Report Bugs

SciPy Central

Blogs

SciPy (pronounced "Sigh Pie") is a Python-based ecosystem of open-source software for mathematics, science, and engineering. In particular, these are some of the core packages:



NumPy Base N-dimensional array package



SciPy library Fundamental library for scientific computing



Matplotlib Comprehensive 2D Plotting



IPython Enhanced Interactive Console



Sympy Symbolic mathematics



pandas Data structures & analysis About SciPy

Install

Getting Started

Documentation

Bug Reports

Topical Software

Citing

SciPy Central

Cookbook 🗷

SciPy Conferences

Blogs @

NumFOCUS @

CORE PACKAGES:

Numpy 🗈

SciPy library 🗗

Matplotlib 🗹

More information...

SCIKIT-LEARN

The scikit-learn package contains a lot of analysis tools.

http://scikit-learn.org/stable/index.html

1) PCA

http://scikit-learn.org/stable/auto_examples/decomposition/plot_pca_iris.html

2) Classification – SVM – Random Forest

http://scikit-learn.org/stable/supervised_learning.html#supervised-learning

3) Clustering – kmeans

http://scikit-learn.org/stable/modules/clustering.html#clustering

It is a good idea to read these pages and to gain some practice and familiarity with these packages. I recommend kmeans, SVM, and random forest.

SCIKIT-LEARN

Machine Learning for Python 3 Intro to Clustering Gates

SCIPY.ORG

SciKits(short for SciPyToolkits)

Getting scikit-Learn

http://scikits.appspot.com/scikit-learn

All SciKits

http://scikits.appspot.com/scikits

STEPS FOR GETTING SCIKIT-LEARN

Homepage: http://scikit-learn.org/stable/

Built on: NumPy, Matplotlib, Scipy

To Install: http://scikit-learn.org/stable/install.html

```
Microsoft Windows [Version 6.1.7601]
Copyright (c) 2009 Microsoft Corporation. All rights reserved.

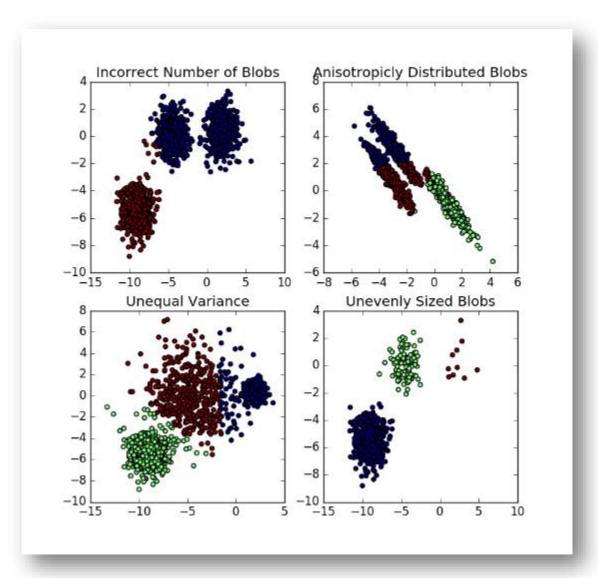
C:\Users\Ami>conda install scikit-learn_

C:\Windows\system32\cmd.exe
```

ON A PC, FROM CMD

```
_ D X
                                    Total:
                                               128.6 MB
The following packages will be UPDATED:
               4.1.12-py35_0
                               --> 4.2.7-py35_0
   conda:
               2.5.2-py35_0
   conda-env:
                               --> 2.6.0-0
   mk1:
               11.3.1-0
                               --> 11.3.3-1
   mkl-service: 1.1.2-py35_0
                               --> 1.1.2-py35_2
               2.5-np110py35_0
                               --> 2.6.1-np111py35_0
   numexpr:
               1.10.4-py35_0
                               --> 1.11.1-py35_1
   numpy:
   scikit-learn: 0.17.1-np110py35_0 --> 0.17.1-np111py35_1
               0.17.0-np110py35_0 --> 0.18.1-np111py35_0
   scipy:
Proceed ([y]/n)? y
Fetching packages ...
conda-enu-2.6. 100% |########################### Time: 0:00:00 248.99 kB/s
mkl-11.3.3-1.t 100% |############################# Time: 0:01:08
mkl-service-1. 100% |############################ Time: 0:00:00 730.31 kB/s
numpy-1.11.1-p 100% |########################## Time: 0:00:01
conda-4.2.7-py 100% |############################# Time: 0:00:00
numexpr-2.6.1- 100% |########################## Time: 0:00:00
scipy-0.18.1-n 100% |############################ Time: 0:00:48 254.79 kB/s
scikit-learn-0 100% |############################## Time: 0:00:04 801.84 kB/s
Extracting packages ...
      COMPLETE
                  Unlinking packages ...
     COMPLETE
                  Linking packages ...
     COMPLETE
                 C:\Users\Ami>
```

TEST YOUR
INSTALL:
SCIKIT-LEARN K
MEANS



A K MEANS CODE EXAMPLE AND TUTORIALS

The Code: http://scikit-learn.org/stable/auto_examples/cluster/plot_kmeans_assumptions.html

Imports

sklearn.cluster KMeans

http://scikit-learn.org/stable/modules/generated/sklearn.cluster.KMeans.html#sklearn.cluster.KMeans

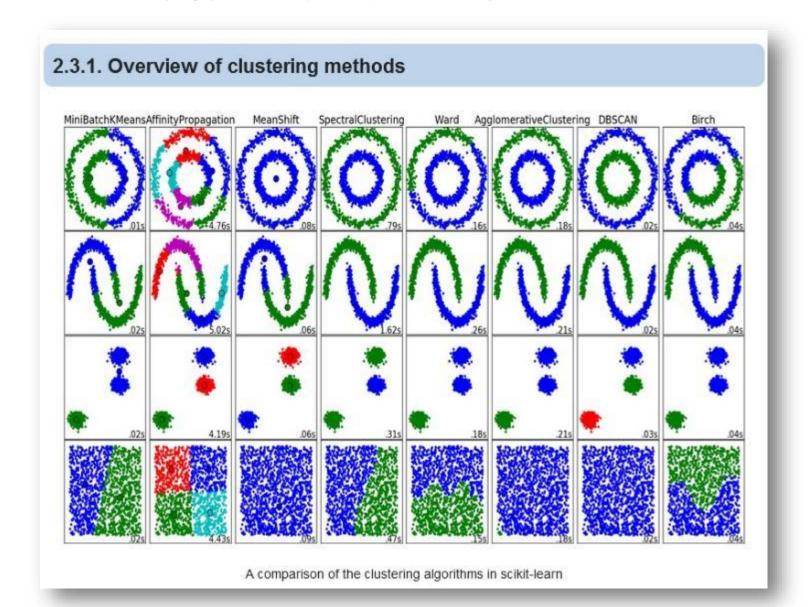
sklearn.datasets make_blobs

http://scikit-

learn.org/stable/modules/generated/sklearn.datasets.make_blobs.html#sklearn.datasets.make_blobs

matplotlib.pyplot (See Ami's Python Book – Chapter 9)

SCIKIT-LEARN CLUSTERING ALGORITHMS



K MEANS

sklearn.cluster.KMeans

class sklearn.cluster. KMeans (n_clusters=8, init='k-means++', n_init=10, max_iter=300, tol=0.0001, precompute_distances='auto', verbose=0, random_state=None, copy_x=True, n_jobs=1)

fit (X[, y])	Compute k-means clustering.
fit_predict(X[, y])	Compute cluster centers and predict cluster index for each sample.
fit_transform(X[, y])	Compute clustering and transform X to cluster-distance space.
get_params ([deep])	Get parameters for this estimator.
predict(X)	Predict the closest cluster each sample in X belongs to.
score (X[, y])	Opposite of the value of X on the K-means objective.
set_params (**params)	Set the parameters of this estimator.
transform (X[, y])	Transform X to a cluster-distance space.

```
#kmeansSMALL.py
import numpy as np
import matplotlib.pyplot as plt
from mpl toolkits.mplot3d import
Axes3D
from sklearn.cluster import KMeans
from sklearn import datasets
iris = datasets.load iris()
#print(iris.data[0:5])
#Iris dataset: http://scikit-
#learn.org/stable/auto examples/data
sets/plot iris dataset.html
X = iris.data
y = iris.target
```

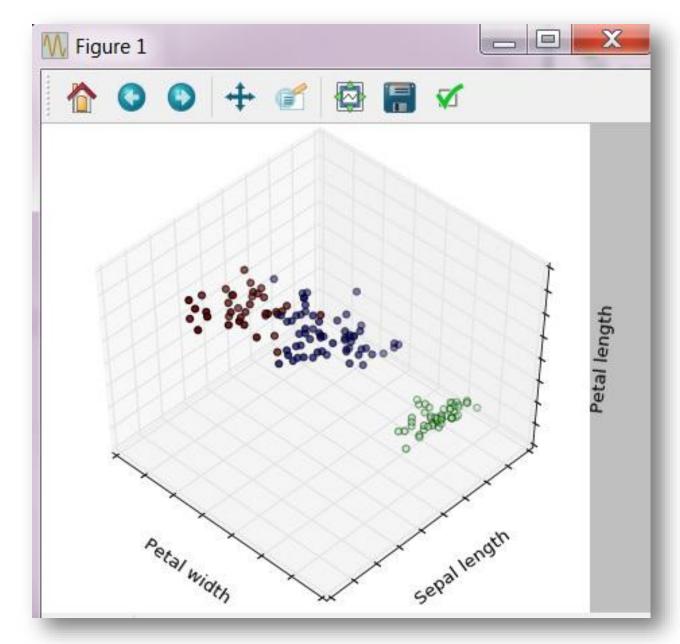
CODE EXAMPLE

```
Result=KMeans(n clusters=3,
verbose=1)
fignum = 1
fig = plt.figure(fignum, figsize=(4,
3))
#Axes3D is part of Matplot lib, rect
defines the rectangle
#elev stores the elevation angle in
the z plane
#azim stores the azimuth angle in the
x, y plane
ax = Axes3D(fiq, rect=[0, 0, .90, 1],
elev=48, azim=134)
#fit(X[, y]) Compute k-means
clustering
Result.fit(X)
```

```
#labels : Labels of each point, attribute of Kmeans
labels = Result.labels
#print(labels)
\#X[:, 3] are the x's, X[:, 0] are the y's, X[:, 2] are the z's
#ref: http://matplotlib.org/mpl toolkits/mplot3d/tutorial.html
#c can be single color format str or a seq of color specs of len
Ν
# The labels are an array. labels.astype(np.float) casts to
float
ax.scatter(X[:, 3], X[:, 0], X[:, 2], c=labels.astype(np.float))
ax.w xaxis.set ticklabels([])
ax.w yaxis.set ticklabels([])
ax.w zaxis.set ticklabels([])
ax.set xlabel('Petal width')
ax.set ylabel('Sepal length')
ax.set zlabel('Petal length')
plt.show()
```

CODE CONT.

OUTPUT



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DPSCAN CODE (AND VS KMEANS)

The following code is broken into many parts.

The code has several comments that offer web references and resources.

IMPORTING AND CREATING DATA

```
import time
import numpy as np
import matplotlib.pyplot as plt
from sklearn import cluster, datasets
from sklearn.preprocessing import StandardScaler
n samples = 500
noisy_circles = datasets.make_circles(n_samples=n_samples, factor=.5, noise=.05)
noisy_moons = datasets.make_moons(n_samples=n_samples, noise=.05)
blobs = datasets.make_blobs(n_samples=n_samples, random_state=8)
#Reference
#http://scikit-learn.org/stable/modules/generated/sklearn.datasets.make_blobs.html
#no_structure = np.random.rand(n_samples, 2)
```

SETTING UP COLORS, NAMES, ETC.

```
colors = np.array([x for x in 'bgrcmykbgrcmykbgrcmykbgrcmyk'])
colors = np.hstack([colors] * 20)

clustering_names = ['KMeans','DBSCAN']

plt.figure(figsize=(len(clustering_names) * 2 + 3, 10))
plt.subplots_adjust(left=.02, right=.98, bottom=.001, top=.96, wspace=.25,hspace=.25)

#Reference:
#http://matplotlib.org/faq/howto_faq.html
```

NORMALIZE DATA: PREPROCESSING

```
plot_num = 1
datasets = [noisy_circles, noisy_moons, blobs]
for i_dataset, dataset in enumerate(datasets):
    X, y = dataset
    print("Std and mean of original data:", round(np.std(X),2), "and ",
round(np.mean(X),2))
    # normalize dataset for easier parameter selection
    #Reference
    #http://scikit-
#learn.org/stable/modules/generated/sklearn.preprocessing.StandardScaler.html
    X = StandardScaler().fit_transform(X)
    print("Std and mean of whitened data:", round(np.std(X),2), "and ",
round(np.mean(X),2))
```

SET UP DPSCAN AND KMEANS

```
dbscan = cluster.DBSCAN(eps=.2)
#eps: The maximum distance between two samples for
them #to be considered as in the same neighborhood.
#ref:
# http://scikit-learn.org/stable/modules/generated/sklearn.cluster.DBSCAN.html
# http://scikit-learn.org/stable/auto_examples/cluster/plot_dbscan.html
KMeans=cluster.KMeans(n_clusters=3)
#n_clusters is your choice of k
```

clustering_algorithms = [KMeans, dbscan]

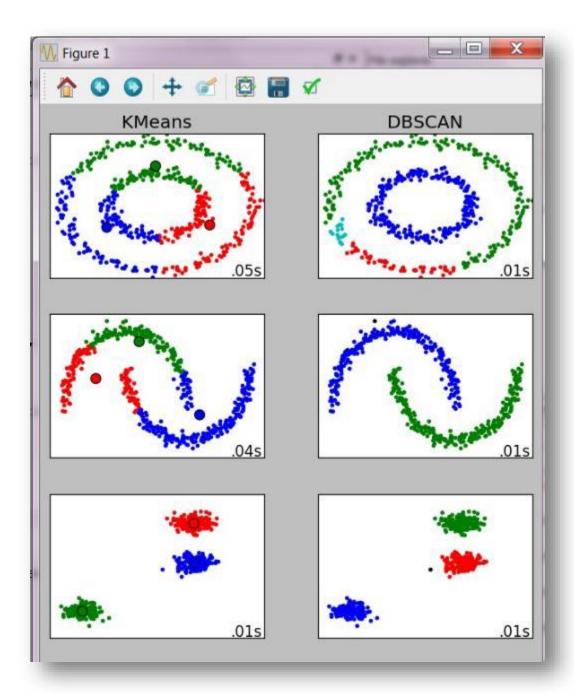
RUN THE CLUSTERING ALGORITHMS

```
for name, algorithm in zip(clustering_names, clustering_algorithms):
     #record the time
     t0 = time.time()
     #run each cluster algorithm
     algorithm.fit(X)
      #note duration
     t1 = time.time()
     if hasattr(algorithm, 'labels_'):
        #cast labels to int
        # labels_: Labels of each point
         y_pred = algorithm.labels_.astype(np.int)
     else:
        #kmeans:Predict the closest cluster each X belongs to
         #http://scikit-learn.org/stable/modules/generated/sklearn.cluster.KMeans.html
         y_pred = algorithm.predict(X)
```

ALSO IN THE **FOR LOOP** — MAKE THE PLOTS

```
# plot – all of the following is in the for loop on the prev slide
      #reference
      #http://matplotlib.org/api/pyplot_api.html#matplotlib.pyplot.subplot
      plt.subplot(4, len(clustering_algorithms), plot_num)
      if i dataset == 0:
            plt.title(name, size=18)
      plt.scatter(X[:, 0], X[:, 1], color=colors[y_pred].tolist(), s=10)
      #https://docs.python.org/3/library/functions.html#hasattr
      if hasattr(algorithm, 'cluster_centers_'):
           centers = algorithm.cluster_centers_
           center_colors = colors[:len(centers)]
            plt.scatter(centers[:, 0], centers[:, 1], s=100, c=center_colors)
      plt.xlim(-2, 2)
      plt.ylim(-2, 2)
      plt.xticks(())
      plt.yticks(())
      plt.text(.99, .01, ('%.2fs' % (t1 - t0)).lstrip('0'), transform=plt.gca().transAxes, size=15,
            horizontalalignment='right')
      plot num += 1
#Not in for loop – shows the plot
plt.show()
```

RESULTING CLUSTER PLOT



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FURTHER RESOURCES

Kumar's Book - Chapter 8

http://www-users.cs.umn.edu/~kumar/dmbook/ch8.pdf

Excellent Python Clustering Notes and Examples http://scikit-learn.org/stable/modules/clustering.html#k-means

KMeans with scikit-learn examples

http://scikit-learn.org/stable/auto_examples/cluster/plot_cluster_iris.html

MatplotLib

http://matplotlib.org/mpl_toolkits/mplot3d/tutorial.html

The Public Iris Dataset

http://scikit-learn.org/stable/auto_examples/datasets/plot_iris_dataset.html

Preprocessing Data and Normalization

http://scikit-learn.org/stable/modules/generated/sklearn.preprocessing.StandardScaler.html