

# Axis 3: Research and analysis of data driven by AI



الجمهورية الجزائرية الديمقراطية الشعبية  
Algerian Democratic Republic and Populaire  
وزارة التعليم العالي و البحث العلمي  
Ministry of Higher Education and Scientific Research



اللجنة الوطنية للإشراف ومتابعة تنفيذ برنامج تدعيم التكوين الأولي  
في الطور الثالث في مؤسسات التعليم العالي- 2025-

## Dataset Loading

### Scikit Learn

# Axis 3: Research and analysis of data driven by AI

## Steps to Build a Machine Learning System

1. **Data collection.**
2. **Improving data quality (data preprocessing: drop duplicate rows, handle missing values and outliers).**
3. **Feature engineering (feature extraction and selection, dimensionality reduction).**
4. **Splitting data into training (and evaluation) and testing sets.**
5. **Algorithm selection (Regression, Classification, Clustering ...).**
6. **Training.**
7. **Evaluation + Hyperparameter tuning.**
8. **Testing.**
9. **Deployment**

# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading

Examples (Training sample + Test sample) = Dataset

Features

rank

discipline

yrs.since.phd

yrs.service

sex

salary

Lab el

1

Prof

B

19

18

Male

139750

2

Prof

B

20

16

Male

173200

3

AsstProf

B

4

3

Male

79750

4

Prof

B

45

39

Male

115000

5

Prof

B

40

41

Male

141500

6

AssocProf

B

6

6

Male

97000

7

Prof

B

30

23

Male

175000

8

Prof

B

45

45

Male

147765

9

Prof

B

21

20

Male

119250

10

Prof

B

18

18

Female

129000

One Example

# 1. Dataset Loading

## Places to Find Free Datasets :

- Google Dataset Search
- Kaggle
- GitHub
- OpenML
- Data.Gov
- Datahub.io
- UCI Machine Learning Repository

# 1. Dataset Loading: **Pandas**

```
import pandas as pd
```

```
df = pd.DataFrame(  
    {"a": [4, 5, 6],  
     "b": [7, 8, 9],  
     "c": [10, 11, 12]},  
    index = [1, 2, 3])
```

```
print(df)
```

|   | a | b | c  |
|---|---|---|----|
| 1 | 4 | 7 | 10 |
| 2 | 5 | 8 | 11 |
| 3 | 6 | 9 | 12 |

# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading: Pandas

Read data from file 'filename.csv'

```
import pandas as pd
data = pd.read_csv("filename.csv")
print(data)
```

Select only the feature\_1 and feature\_2 columns

```
my_data = pd.DataFrame(data, columns= ['feature_1', 'feature_2'])
print(my_data)
```

Data Exploration

*# Using head() method with an argument which helps us to restrict the number of initial records that should be displayed*

```
data.head(n=2)
```

*# Using .tail() method with an argument which helps us to restrict the number of initial records that should be displayed*

```
data.tail(n=2)
```

# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading: Pandas

### Training Set & Test Set

```
columns = [' ', ... , ' '] # n -1  
my_data = data[columns ]  
# information about the data  
print(my_data.describe())
```

```
# assigning the 'col_i' column as target  
target = data['col_i ']  
data.head(n=2)
```

### Read and Write to CSV & Excel

```
df = pd.read_csv('file.csv')  
df.to_csv('myDataFrame.csv')
```

```
df = pd.read_excel('file.xlsx')  
df.to_excel('myDataFrame.xlsx')
```

## 1. Dataset Loading: Pandas

Split training and test sets

```
data_copy = data.copy()
train_set = data_copy.sample(frac=0.80, random_state=0)
test_set = data_copy.drop(train_set.index)

# Use 'pop' to extract the labels
train_set_labels = train_set.pop('col_i ')
test_set_labels = test_set.pop('col_i ')

print("train_set : \n",train_set)
print("train_set_labels : \n",train_set_labels)
```



# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading: Pandas

### pandas.DataFrame.from\_dict

By default the keys of the dict become the DataFrame columns:

```
>>> data = {'col_1': [3, 2, 1, 0], 'col_2': ['a', 'b', 'c', 'd']}
>>> pd.DataFrame.from_dict(data)
   col_1 col_2
0       3    a
1       2    b
2       1    c
3       0    d
```

Specify orient='index' to create the DataFrame using dictionary keys as rows:

```
>>> data = {'row_1': [3, 2, 1, 0], 'row_2': ['a', 'b', 'c', 'd']}
>>> pd.DataFrame.from_dict(data, orient='index')
   row_1  row_2
0       3     a
1       2     b
2       1     c
3       0     d
```

When using the 'index' orientation, the column names can be specified manually:

```
>>> pd.DataFrame.from_dict(data, orient='index',
...                        columns=['A', 'B', 'C', 'D'])
   row_1  row_2
0       3     a
1       2     b
2       1     c
3       0     d
```

# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading: Files txt

Files

storing data on disk, and reading it back

```
f = open("file.txt", "w", encoding="utf8")
```

file variable for operations      name of file on disk (+path...)  
opening mode      encoding of chars for text files:

- 'r' read
- 'w' write
- 'a' append
- ... '+' 'x' 'b' 't' latin1 ...

cf. modules `os`, `os.path` and `pathlib`

---

|                                                                            |                                                                                                                                                                                     |
|----------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| <b>writing</b>                                                             | <b>reading</b>                                                                                                                                                                      |
| <code>f.write("coucou")</code><br><code>f.writelines(list of lines)</code> | <code>f.read([n])</code> → next chars<br>if <i>n</i> not specified, read up to end !<br><code>f.readlines([n])</code> → list of next lines<br><code>f.readline()</code> → next line |

📖 text mode *t* by default (read/write **str**), possible binary mode *b* (read/write **bytes**). Convert from/to required type !

---

`f.close()`      📖 dont forget to close the file after use !

---

|                                    |                                        |
|------------------------------------|----------------------------------------|
| <code>f.flush()</code> write cache | <code>f.truncate([size])</code> resize |
|------------------------------------|----------------------------------------|

reading/writing progress sequentially in the file, modifiable with:

|                                  |                                        |
|----------------------------------|----------------------------------------|
| <code>f.tell()</code> → position | <code>f.seek(position[,origin])</code> |
|----------------------------------|----------------------------------------|

---

Very common: opening with a guarded block (automatic closing) and reading loop on lines of a text file:

```
with open(...) as f:  
    for line in f:  
        # processing of line
```

## 1. Dataset Loading: Numpy

### Saving & Loading Text Files

```
import numpy as np
```

```
In [1]: a = np.array([1, 2, 3, 4])
```

```
In [2]: np.savetxt('test1.txt', a, fmt='%d')
```

```
In [3]: b = np.loadtxt('test1.txt', dtype=int)
```

```
In [4]: a == b
```

```
Out[4]: array([ True,  True,  True,  True], dtype=bool)
```

```
# write and read binary files
```

```
In [5]: a.tofile('test2.dat')
```

```
In [6]: c = np.fromfile('test2.dat', dtype=int)
```

```
In [7]: c == a
```

```
Out[7]: array([ True,  True,  True,  True], dtype=bool)
```

## 1. Dataset Loading: **Numpy**

### Saving & Loading On Disk

```
import numpy as np
```

```
# .npy extension is added if not given
```

```
In [8]: np.save('test3.npy', a)
```

```
In [9]: d = np.load('test3.npy')
```

```
In [10]: a == d
```

```
Out[10]: array([ True,  True,  True,  True], dtype=bool)
```

### 1. Dataset Loading: **glob**

The **glob** module finds **all the pathnames** matching a specified pattern.

```
from glob import glob
```

```
# Returns a list of pathnames in list files
```

```
pathnames = glob("/home/Desktop/my_images*/*")
```

```
# pathnames = glob("/home/Desktop/my_images/*.png")
```

```
for path in pathnames:  
    print(path)
```



## 1. Dataset Loading: Scikit Learn

```
from sklearn import datasets
```

```
dat = datasets.load_breast_cancer()  
print("Examples = ", dat.data.shape, " Labels = ", dat.target.shape)
```

|                                                  |                                                                       |
|--------------------------------------------------|-----------------------------------------------------------------------|
| <code>load_boston</code> ([return_X_y])          | Load and return the boston house-prices dataset (regression).         |
| <code>load_iris</code> ([return_X_y])            | Load and return the iris dataset (classification).                    |
| <code>load_diabetes</code> ([return_X_y])        | Load and return the diabetes dataset (regression).                    |
| <code>load_digits</code> ([n_class, return_X_y]) | Load and return the digits dataset (classification).                  |
| <code>load_linnerud</code> ([return_X_y])        | Load and return the linnerud dataset (multivariate regression).       |
| <code>load_wine</code> ([return_X_y])            | Load and return the wine dataset (classification).                    |
| <code>load_breast_cancer</code> ([return_X_y])   | Load and return the breast cancer wisconsin dataset (classification). |

# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading: Scikit Learn

```
from sklearn import datasets
```

```
dat = datasets.fetch_20newsgroups(subset='train')
```

```
from pprint import pprint
```

```
pprint(list(dat.target_names))
```

|                                                                |                                                                                     |
|----------------------------------------------------------------|-------------------------------------------------------------------------------------|
| <code>fetch_olivetti_faces([data_home, shuffle, ...])</code>   | Load the Olivetti faces data-set from AT&T (classification).                        |
| <code>fetch_20newsgroups([data_home, subset, ...])</code>      | Load the filenames and data from the 20 newsgroups dataset (classification).        |
| <code>fetch_20newsgroups_vectorized([subset, ...])</code>      | Load the 20 newsgroups dataset and vectorize it into token counts (classification). |
| <code>fetch_lfw_people([data_home, funneled, ...])</code>      | Load the Labeled Faces in the Wild (LFW) people dataset (classification).           |
| <code>fetch_lfw_pairs([subset, data_home, ...])</code>         | Load the Labeled Faces in the Wild (LFW) pairs dataset (classification).            |
| <code>fetch_covtype([data_home, ...])</code>                   | Load the covtype dataset (classification).                                          |
| <code>fetch_rcv1([data_home, subset, ...])</code>              | Load the RCV1 multilabel dataset (classification).                                  |
| <code>fetch_kddcup99([subset, data_home, shuffle, ...])</code> | Load the kddcup99 dataset (classification).                                         |
| <code>fetch_california_housing([data_home, ...])</code>        | Load the California housing dataset (regression).                                   |

## 1. Dataset Loading: Scikit Learn

**scikit-learn** includes utility functions for loading datasets in the **svmlight / libsvm** format. In this format, each line takes the form

**<label>** **<feature-id>:<feature-value>** **<feature-id>:<feature-value>** ....

This format is especially suitable for sparse datasets. In this module, scipy sparse CSR matrices are used for **X** and numpy arrays are used for **Y**.

You may load a dataset like as follows:

```
from sklearn.datasets import load_svmlight_file
```

```
X_train, Y_train = load_svmlight_file("/path/to/train_dataset.txt")
```

You may also load two (or more) datasets at once:

```
X_train, y_train, X_test, y_test = load_svmlight_files(("path/to/train_dataset.txt",  
"path/to/test_dataset.txt"))
```



# 1. Dataset Loading: Scikit Learn

---

```
>>> from sklearn.datasets import fetch_openml
>>> mice = fetch_openml(name='miceprotein', version=4)

>>> mice.data.shape
(1080, 77)
>>> mice.target.shape
(1080,)
>>> np.unique(mice.target)
array(['c-CS-m', 'c-CS-s', 'c-SC-m', 'c-SC-s', 't-CS-m', 't-CS-s', 't-SC-m', 't-SC-s'],
      dtype=object)
>>> mice.url
'https://www.openml.org/d/40966'
>>> mice.details['version']
'1'
```

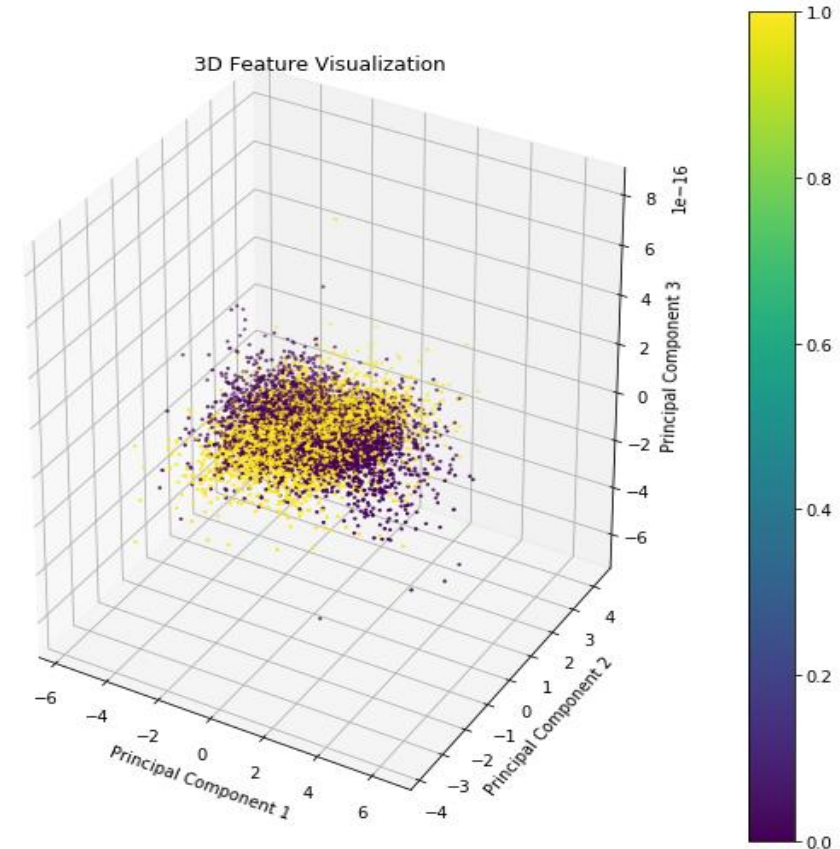
# Axis 3: Research and analysis of data driven by AI

## 1. Dataset Loading: Generated Datasets - classification

```
from sklearn.datasets import  
make_classification  
X, y = make_classification( n_samples=10000,  
# n_features=3,  
flip_y=0.1, class_sep=0.1)
```

```
print("X shape = ",X.shape)  
print("len y  = ", len(y))  
print(y)
```

```
from mirapy.visualization import visualize_2d,  
visualize_3d  
visualize_3d(X,y)
```

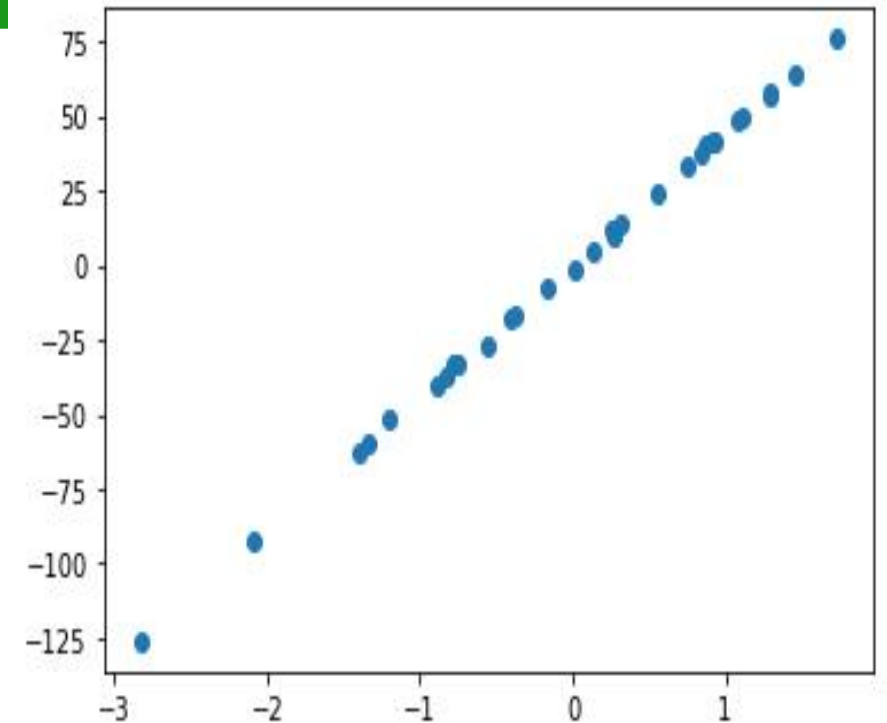


## 1. Dataset loading: Generated Datasets - Regression

```
from sklearn import datasets  
from matplotlib import pyplot as plt
```

```
x, y = datasets.make_regression(  
    n_samples=30,  
    n_features=1,  
    noise=0.8)
```

```
plt.scatter(x,y)  
plt.show()
```



# Axis 3: Research and analysis of data driven by AI

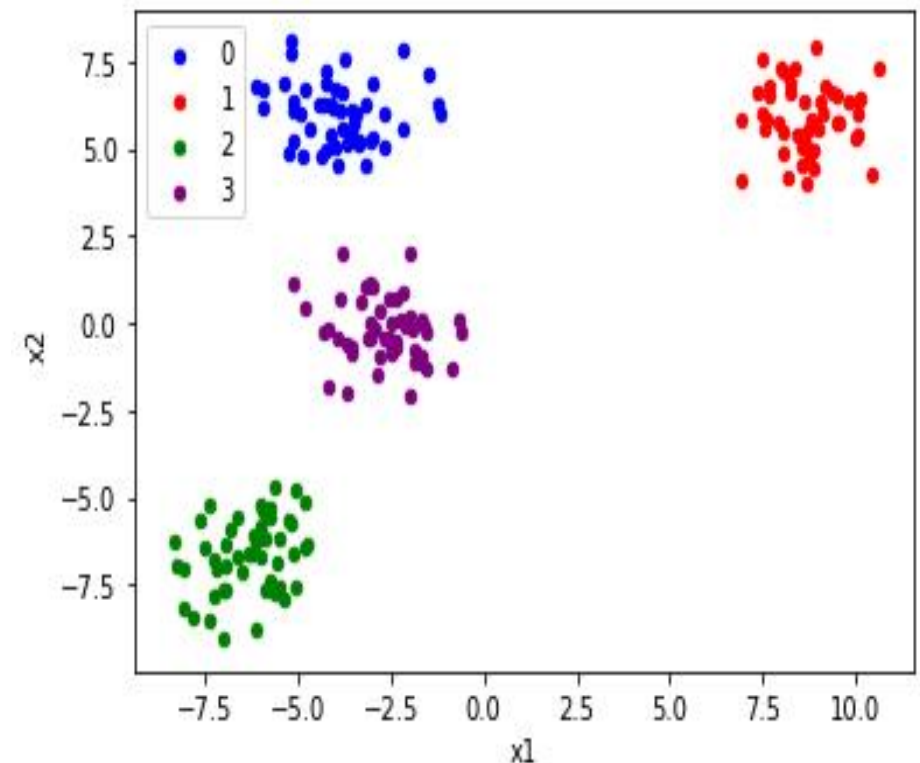
## 1. Dataset Loading: Generated Datasets - Clustering

```
from sklearn.datasets.samples_generator import  
make_blobs  
from matplotlib import pyplot as plt  
import pandas as pd
```

```
X, y = make_blobs(n_samples=200, centers=4,  
n_features=2)
```

```
Xy = pd.DataFrame(dict(x1=X[:,0], x2=X[:,1], label=y))  
groups = Xy.groupby('label')
```

```
fig, ax = plt.subplots()  
colors = ["blue", "red", "green", "purple"]  
for idx, classification in groups:  
    classification.plot(ax=ax, kind='scatter', x='x1', y='x2',  
label=idx, color=colors[idx])  
plt.show()
```



# Axis 3: Research and analysis of data driven by AI

## 2. Data Preprocessing: missing values

```
import pandas as pd
import numpy as np
# dictionary of lists
dictionary = {"Name":["Alex", "Mike", "John", "Dave", "Joey"],
             "Height(m)": [1.75, 1.65, 1.73, np.nan, 1.82],
             "Test Score": [70, np.nan, 8, 62, 73]}
# creating a dataframe from dict
df = pd.DataFrame(dictionary)

# using isnull() function this function return dataframe of Boolean values
# which are True for NaN values.
print(df.isnull())
print("SUM : \n",df.isnull().sum())
```

### Dealing with missing values :

```
df = df.fillna('*')
df['Test Score'] = df['Test Score'].fillna('*')
df['Test Score'] = df['Test Score'].fillna(df['Test Score'].mean())
df['Test Score'] = df['Test Score'].fillna(df['Test Score'].interpolate())
df= df.dropna() #delete the missing rows of data
df['Height(m)']= df['Height(m)'].dropna()
```

|   | Name  | Height(m) | Test Score |
|---|-------|-----------|------------|
| 0 | False | False     | False      |
| 1 | False | False     | True       |
| 2 | False | False     | False      |
| 3 | False | True      | False      |
| 4 | False | False     | False      |

SUM :

```
Name      0
Height(m)  1
Test Score  1
dtype: int64
```

## 2. Data Preprocessing: missing values

# Dealing with Non-standard missing values:

# dictionary of lists

```
dictionary_1 = {"Name":["Alex", "Mike", "John", "Dave", "Joey"],  
               "Height(m)": [1.75, 1.65, "-", "na", 1.82],  
               "Test Score":[70, np.nan, 8, 62, 73]}
```

Out[27]:

# creating a dataframe from list

```
df_1 = pd.DataFrame(dictionary_1)  
print("df_1 : \n",df_1)  
print("isnull : \n",df_1.isnull())
```

```
df_1 = df_1.replace(["-", "na"], np.nan)  
print("replace non-standard missing values : \n",df_1)
```

```
df_1 = df_1.fillna(0)  
print("fillna : \n",df_1)
```

|   | Name | Height(m) | Test Score |
|---|------|-----------|------------|
| 0 | Alex | 1.75      | 70.0       |
| 1 | Mike | 1.65      | NaN        |
| 2 | John | -         | 8.0        |
| 3 | Dave | na        | 62.0       |
| 4 | Joey | 1.82      | 73.0       |



## 2. Data Preprocessing: missing values

```
import numpy as np
from sklearn.impute import SimpleImputer
X = [[np.nan, 2], [6, np.nan], [7, 6]]
# mean, median, most_frequent, constant(fill_value = )
imp = SimpleImputer(missing_values = np.nan, strategy='mean')
data = imp.fit_transform(X)
print(data)
```

Multivariate feature imputation :  
IterativeImputer  
Nearest neighbors imputation :  
KNNImputer  
Marking imputed values :  
MissingIndicator

```
>>> import pandas as pd
>>> df = pd.DataFrame([[ "a", "x"],
...                     [np.nan, "y"],
...                     [ "a", np.nan],
...                     [ "b", "y"]], dtype="category")
>>> imp = SimpleImputer(strategy="most_frequent")
>>> print(imp.fit_transform(df))
[[ 'a' 'x' ]
 [ 'a' 'y' ]
 [ 'a' 'y' ]
 [ 'b' 'y' ]]
```

# Axis 3: Research and analysis of data driven by AI

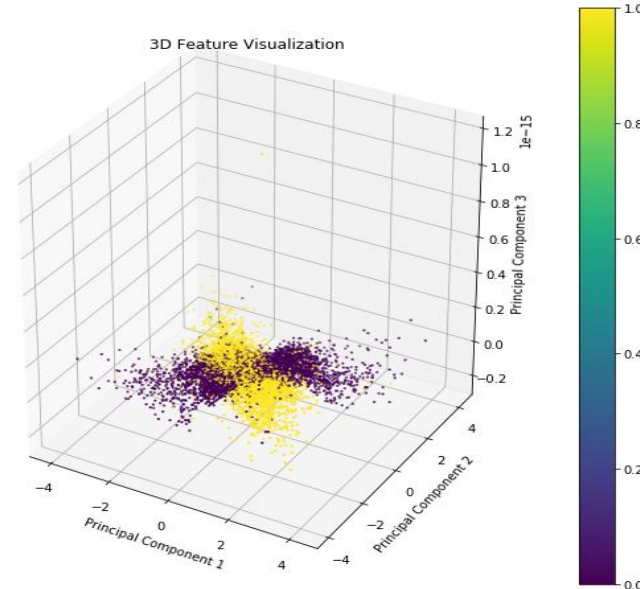
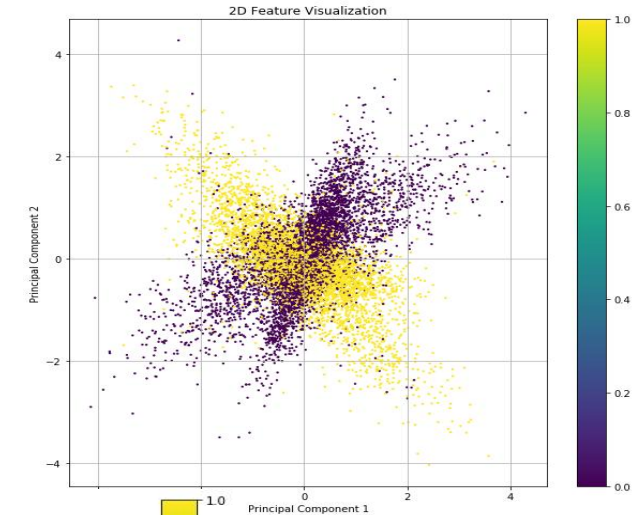
## 2. Data Preprocessing: Data Projection

```
from sklearn.datasets import make_classification
```

```
X, y = make_classification( n_samples=10000,  
                           n_features=4,  
                           flip_y=0.1, class_sep=0.1)
```

```
print("X shape = ",X.shape)  
print("len y  = ", len(y))  
print(y)
```

```
from mirapy.visualization import visualize_2d,  
visualize_3d  
visualize_2d(X,y)  
visualize_3d(X,y)
```



Thank you for your  
Attention