$Kernel_SVM$

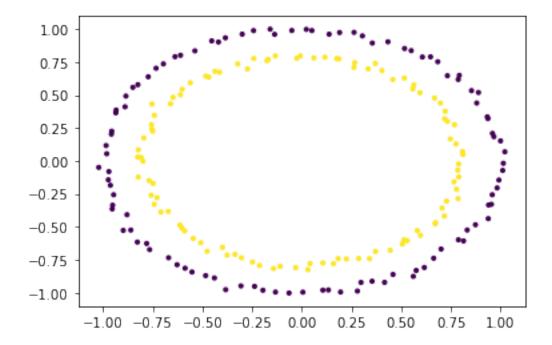
April 26, 2022

```
[67]: import numpy as np
  import matplotlib.pyplot as plt
  from sklearn import svm
  from matplotlib.backends.backend_pdf import PdfPages
  from sklearn.datasets import make_circles
  import seaborn as sns
  from sklearn.model_selection import train_test_split
  from sklearn.metrics import accuracy_score, confusion_matrix
```

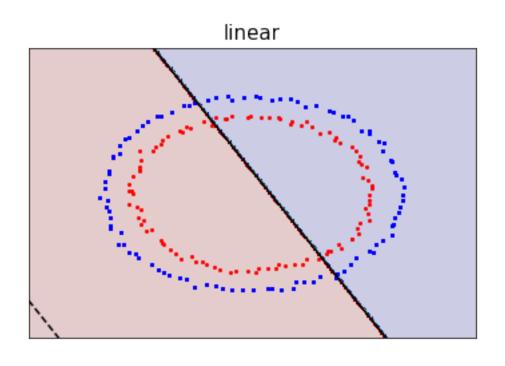
1 Example 1

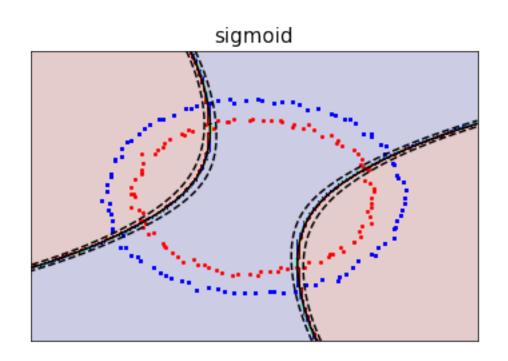
```
[2]: # Generate dataset and targets
X, Y = make_circles(n_samples = 200, noise = 0.02)

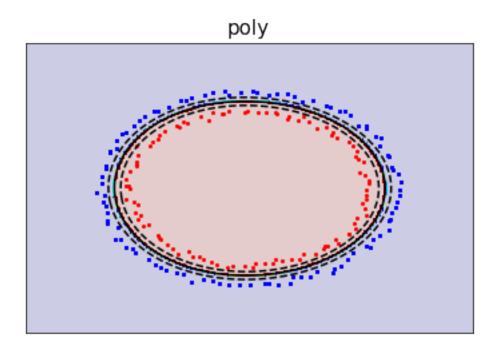
# visualizing data
plt.scatter(X[:, 0], X[:, 1], c = Y, marker = '.')
plt.show()
```

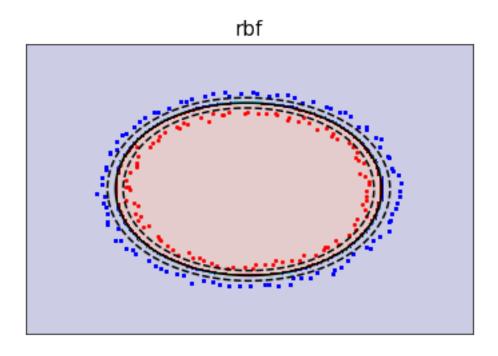


```
[3]: fignum = 1
     # fit the model
     for kernel in ('linear', 'sigmoid', 'poly', 'rbf'):
         clf = svm.SVC(kernel=kernel, gamma=1, coef0 = 1)
         clf.fit(X, Y)
         with PdfPages(kernel + '3.pdf') as pdf:
             # plot the line, the points, and the nearest vectors to the plane
             fig, ax = plt.subplots()
             plt.figure(fignum, figsize=(5, 5))
             plt.clf()
             plt.scatter(clf.support_vectors_[:, 0], clf.support_vectors_[:, 1],__
     -s=80,
                         facecolors='None')
             plt.plot(X[Y==0, 0], X[Y==0, 1], 'bs', markersize = 2)
             plt.plot(X[Y==1, 0], X[Y==1, 1], 'ro', markersize = 2)
             plt.axis('tight')
             x_min = -1.5
             x_max = 1.5
             y_min = -1.5
             y_max = 1.5
             XX, YY = np.mgrid[x_min:x_max:200j, y_min:y_max:200j]
             Z = clf.decision_function(np.c_[XX.ravel(), YY.ravel()])
             # Put the result into a color plot
             Z = Z.reshape(XX.shape)
             plt.figure(fignum, figsize=(5, 5))
             CS = plt.contourf(XX, YY, np.sign(Z), 200, cmap='jet', alpha = .2)
             plt.contour(XX, YY, Z, colors=['k', 'k', 'k'], linestyles=['--', '-', u
     levels=[-.5, 0, .5])
             plt.title(kernel, fontsize = 15)
             plt.xlim(x_min, x_max)
             plt.ylim(y_min, y_max)
             plt.xticks(())
             plt.yticks(())
             fignum = fignum + 1
             pdf.savefig()
     plt.show()
```



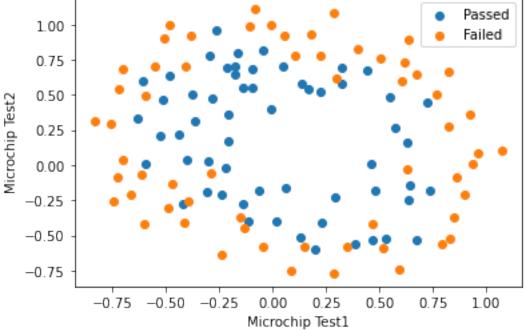






```
[2]: import os os.chdir('/home/nhanta/ML/data/kernel')
```

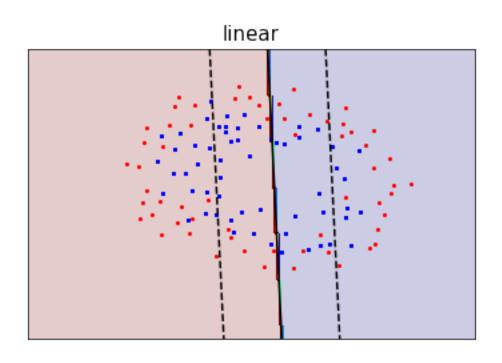
```
[3]: import pandas as pd
[7]: t = pd.read_csv('ex2data2.txt', header = None)
[10]: X = t.iloc[:, [0,1]]
[14]: Y = t.iloc[:, 2]
[18]: # visualizing data
    mask = Y == 1
    passed = plt.scatter(X[mask][0].values, X[mask][1].values)
    failed = plt.scatter(X[~mask][0].values, X[~mask][1].values)
    plt.xlabel('Microchip Test1')
    plt.ylabel('Microchip Test2')
    plt.legend((passed, failed), ('Passed', 'Failed'))
    plt.show()
Passed
```



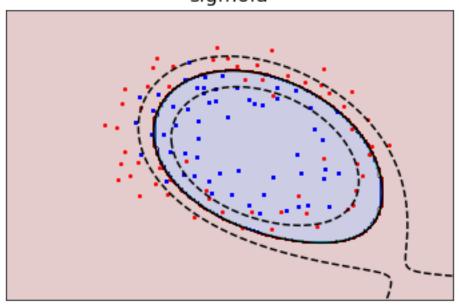
```
fignum = 1

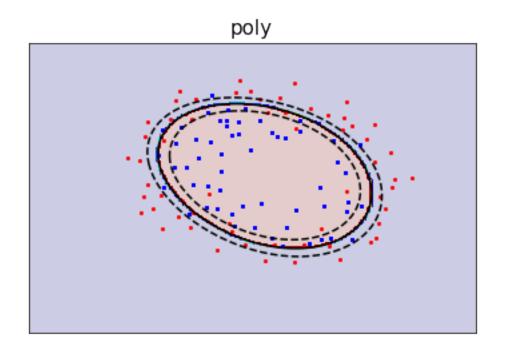
# fit the model
for kernel in ('linear', 'sigmoid', 'poly', 'rbf'):
    clf = svm.SVC(kernel=kernel, gamma=1, coef0 = 1)
    clf.fit(X, Y)
    with PdfPages(kernel + '3.pdf') as pdf:
```

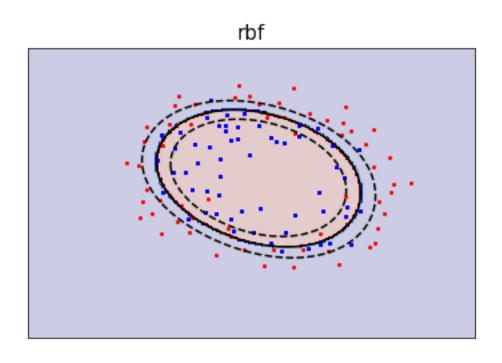
```
# plot the line, the points, and the nearest vectors to the plane
        fig, ax = plt.subplots()
        plt.figure(fignum, figsize=(5, 5))
        plt.clf()
        plt.scatter(clf.support_vectors_[:, 0], clf.support_vectors_[:, 1],__
-s=80.
                    facecolors='None')
        plt.plot(X[mask][0].values, X[mask][1].values, 'bs', markersize = 2)
        plt.plot(X[~mask][0].values, X[~mask][1].values, 'ro', markersize = 2)
        plt.axis('tight')
        x_min = -1.5
        x_max = 1.5
        y_min = -1.5
        y_max = 1.5
        XX, YY = np.mgrid[x_min:x_max:200j, y_min:y_max:200j]
        Z = clf.decision_function(np.c_[XX.ravel(), YY.ravel()])
        # Put the result into a color plot
        Z = Z.reshape(XX.shape)
        plt.figure(fignum, figsize=(5, 5))
        CS = plt.contourf(XX, YY, np.sign(Z), 200, cmap='jet', alpha = .2)
        plt.contour(XX, YY, Z, colors=['k', 'k', 'k'], linestyles=['--', '-', _
 \rightarrow '--'], levels=[-.5, 0, .5])
        plt.title(kernel, fontsize = 15)
        plt.xlim(x_min, x_max)
        plt.ylim(y_min, y_max)
        plt.xticks(())
        plt.yticks(())
        fignum = fignum + 1
        pdf.savefig()
plt.show()
```



sigmoid





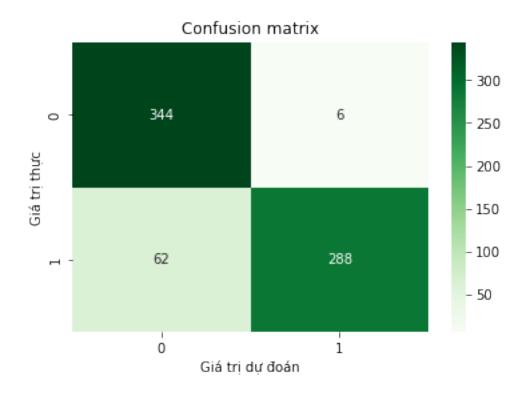


2 Example 2

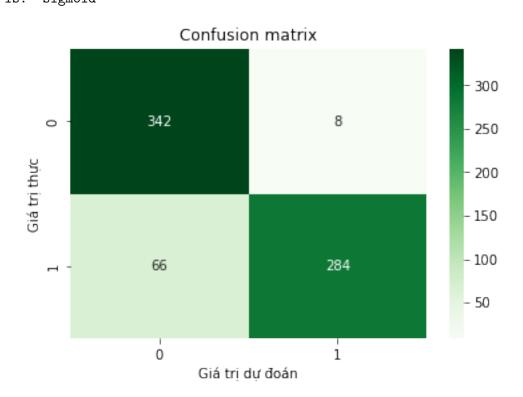
2.0.1 Task 1

```
[21]: import scipy.io as sio
[28]: A = sio.loadmat('ARgender.mat')
      X_train = A['Y_train'].T
      X_test = A['Y_test'].T
      print(X_train.shape)
      N = 700
      y_train = A['label_train'].reshape(N)
      y_test = A['label_test'].reshape(N)
     (700, 300)
[48]: fignum = 1
      # fit the model
      for kernel in ('linear', 'sigmoid', 'poly', 'rbf'):
          print ("Kernel is: ", kernel)
          clf = svm.SVC(kernel=kernel, gamma=1, coef0 = 1)
          clf.fit(X train, y train)
          svm_pred = clf.predict(X_test)
          cm_svm = confusion_matrix(y_test, svm_pred)
          ax = plt.subplot()
          sns.heatmap(cm_svm,annot=True, ax = ax, fmt='g', cmap='Greens')
          # labels, title and ticks
          ax.set_xlabel('Giá trị dự đoán')
          ax.set_ylabel('Giá tri thưc')
          ax.set_title('Confusion matrix')
          plt.show()
          print ("Accuracy of " + kernel, acr)
```

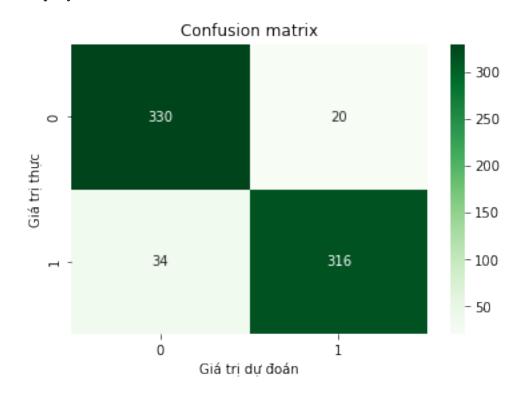
Kernel is: linear



Accuracy of linear 0.9028571428571428 Kernel is: sigmoid

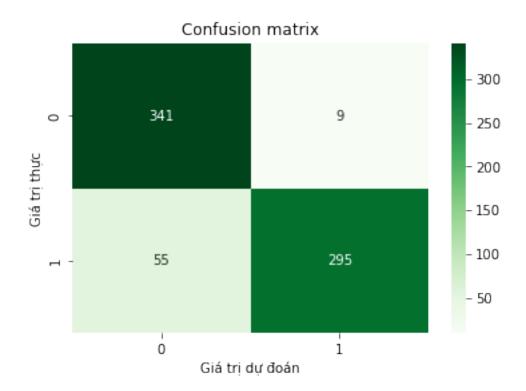


Accuracy of sigmoid 0.8942857142857142 Kernel is: poly



Accuracy of poly 0.9228571428571428

Kernel is: rbf

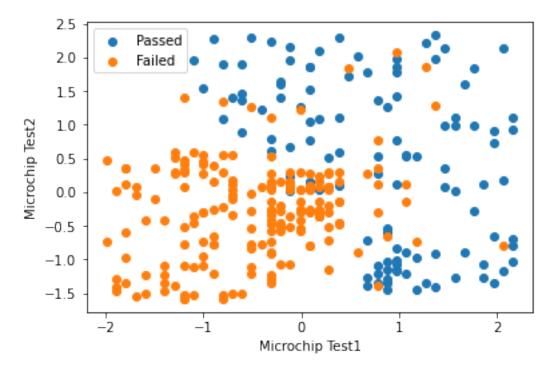


Accuracy of rbf 0.9085714285714286

2.1 Task 2

```
[49]: import numpy as np
      from sklearn.preprocessing import StandardScaler
[50]: dataset = pd.read_csv('dataset.csv')
      X = dataset.iloc[:, :-1].values
      y = dataset.iloc[:, -1].values
[52]: XTrain, XTest, yTrain, yTest = train_test_split(X, y, test_size = 0.25,__
       \rightarrowrandom_state = 0)
[53]: sc = StandardScaler()
      XTrain = sc.fit transform(XTrain)
      XTest = sc.transform(XTest)
[62]: # visualizing data
      mask_train = yTrain == 1
      passed = plt.scatter(XTrain[mask_train][:, 0], XTrain[mask_train][:, 1])
      failed = plt.scatter(XTrain[~mask_train][:, 0], XTrain[~mask_train][:, 1])
      plt.xlabel('Microchip Test1')
      plt.ylabel('Microchip Test2')
```

```
plt.legend((passed, failed), ('Passed', 'Failed'))
plt.show()
```



```
[66]: fignum = 1
      # fit the model
      for kernel in ('linear', 'sigmoid', 'poly', 'rbf'):
          clf = svm.SVC(kernel=kernel, gamma=1, coef0 = 1)
          clf.fit(XTrain, yTrain)
          svm_pred = clf.predict(XTest)
          acr = accuracy_score(yTest, svm_pred)
          print ('Kernel: ', kernel)
          print ('acc:', acr)
          with PdfPages(kernel + '4.pdf') as pdf:
              # plot the line, the points, and the nearest vectors to the plane
              fig, ax = plt.subplots()
              plt.figure(fignum, figsize=(5, 5))
              plt.clf()
              plt.scatter(clf.support_vectors_[:, 0], clf.support_vectors_[:, 1],__
       ⇒s=80,
                          facecolors='None')
              plt.plot(XTrain[mask_train][:, 0], XTrain[mask_train][:, 1], 'bs',__
       →markersize = 2)
```

```
plt.plot(XTrain[~mask_train][:, 0], XTrain[~mask_train][:, 1], 'ro', __
 →markersize = 2)
        plt.axis('tight')
        x_min = -1.5
        x max = 1.5
        y_{min} = -1.5
        y_max = 1.5
        XX, YY = np.mgrid[x_min:x_max:200j, y_min:y_max:200j]
        Z = clf.decision_function(np.c_[XX.ravel(), YY.ravel()])
        # Put the result into a color plot
        Z = Z.reshape(XX.shape)
        plt.figure(fignum, figsize=(5, 5))
        CS = plt.contourf(XX, YY, np.sign(Z), 200, cmap='jet', alpha = .2)
        plt.contour(XX, YY, Z, colors=['k', 'k', 'k'], linestyles=['--', '-', _
 \rightarrow '--'], levels=[-.5, 0, .5])
        plt.title(kernel, fontsize = 15)
        plt.xlim(x_min, x_max)
        plt.ylim(y_min, y_max)
        plt.xticks(())
        plt.yticks(())
        fignum = fignum + 1
        pdf.savefig()
plt.show()
```

Kernel: linear
acc: 0.9
Kernel: sigmoid
acc: 0.7
Kernel: poly
acc: 0.93
Kernel: rbf
acc: 0.93

