SUPPORT VECTOR MACHINES

PYTHON CODE:

```
import numpy as np
import pandas as pd
import quadprog as quad
svm = pd.read_csv("mystery.data", names=["X1","X2","X3","X4","Y"])
X = \text{sym.loc}[:, "X1":"X4"]
X['Xb'] = 1
X = X.values
Y = svm.loc[:, "Y":].values
## SOLVING PRIMAL PROBLEM USING FEATURE TRANSFORMATION
def featureTransformation(X):
  ft = []
  ftx31 = X[:,0].reshape(1000,1)**3
  ftx32 = X[:,1].reshape(1000,1)**3
  ftx33 = X[:,2].reshape(1000,1)**3
  ftx34 = X[:,3].reshape(1000,1)**3
  ftx21 = X[:,0].reshape(1000,1)**2
  ftx22 = X[:,1].reshape(1000,1)**2
  ftx23 = X[:,2].reshape(1000,1)**2
  ftx24 = X[:,3].reshape(1000,1)**2
  ftx212 = X[:,0].reshape(1000,1)*X[:,1].reshape(1000,1)
  ftx223 = X[:,1].reshape(1000,1)*X[:,2].reshape(1000,1)
  ftx234 = X[:,2].reshape(1000,1)*X[:,3].reshape(1000,1)
  ftx213 = X[:,0].reshape(1000,1)*X[:,2].reshape(1000,1)
  ftx214 = X[:,0].reshape(1000,1)*X[:,3].reshape(1000,1)
  ftx224 = X[:,1].reshape(1000,1)*X[:,3].reshape(1000,1)
  #ft = np.concatenate((ftx31, ftx32, ftx33, ftx34, ftx21, ftx22, ftx23, ftx24, ftx212, ftx223, ftx234,
ftx213, ftx214, ftx224, X), axis=1)
  ft = np.concatenate((ftx21, ftx22, ftx23, ftx24, ftx212, ftx223, ftx234, ftx213, ftx214, ftx224, X),
axis=1)
  #ft = np.concatenate((ftx31, ftx32, ftx33, ftx34, ftx21, ftx22, ftx23, ftx24, ftx212, ftx223, ftx234,
X), axis=1)
  return ft
def solve(X,Y):
  NUM, DIM = X.shape
  P = np.eye(DIM)
  q = np.zeros(DIM)
  G = featureMap*Y*-1.
  h = np.ones(NUM)^*-1.
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return quad.solve qp(.5 * P, q, -G.T, -h, 0)
def score(W, X, Y):
  pred = np.dot(X, W)
  pred[pred>0] = 1
  pred[pred<0] = -1
  return np.sum(pred-Y)
def support_vectors(lagrange):
  lagrange = lagrange > 0
  return X[lagrange.ravel()]
featureMap = featureTransformation(X)
solution = solve(featureMap,Y)
W = solution[0]
print("WEIGHT VECTORS", W[:14])
print("BIAS", W[14])
print("MARGIN", (1 / np.sqrt((W[0:14] ** 2).sum())))
print("SCORE ", score(W, featureMap, Y))
print("SUPPORT VECTORS ", support_vectors(solution[4].reshape(1000,1)))
#print("WEIGHT VECTORS ", W[:18])
#print("BIAS ", W[18])
#print("MARGIN", (1 / np.sqrt((W[0:18] ** 2).sum())))
#print("SCORE ", score(W, featureMap, Y))
#print("SUPPORT VECTORS ", support_vectors(solution[4].reshape(1000,1)))
#print("WEIGHT VECTORS ", W[:15])
#print("BIAS ", W[15])
#print("MARGIN", (1 / np.sqrt((W[0:15] ** 2).sum())))
#print("ERROR ", score(W.reshape(16,1), featureMap, Y))
#print("SUPPORT VECTORS ", support_vectors(solution[4].reshape(1000,1)))
RESULT:
('WEIGHT VECTORS', array([ 5.57715117e+01, 2.43938599e+00, -1.19481235e+01,
    -2.85422573e+01, 1.24810054e+02, -3.79566720e+00,
    9.83338305e+00, -8.41185412e+01, 7.14584105e-02,
     4.88019179e+00, 1.07538595e+02, -9.63224918e+00,
     1.96300790e+00, -4.76537826e+01, -7.53784124e+01))
('BIAS', 82.066939694760279)
('MARGIN', 0.0046385760055291589)
('ERROR', 0.0)
('SUPPORT VECTORS', array([[ 0.01852987, 0.50782148, 0.71364513, 0.69774797, 1.
                                                                                       ],
   [0.67760052, 0.01731556, 0.22660751, 0.91446604, 1.
                                                             ],
   [ 0.56116788, 0.94932549, 0.95929542, 0.9899408, 1.
                                                            ],
   [ 0.523322 , 0.39248601, 0.06702511, 0.77851889, 1.
                                                            ],
   [ 0.06156021, 0.65899664, 0.0993981, 0.60866886, 1.
                                                            ],
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[ 0.02269783, 0.29143716, 0.35408261, 0.64963031, 1. ], [ 0.19385208, 0.83338556, 0.74510427, 0.74385454, 1. ], [ 0.16933499, 0.62115084, 0.42461128, 0.67708347, 1. ], [ 0.50743509, 0.14759421, 0.92070003, 0.92946127, 1. ], [ 0.22847848, 0.0126919, 0.12022385, 0.63297825, 1. ], [ 0.38033462, 0.37208327, 0.42427464, 0.74312689, 1. ], [ 0.60270148, 0.62545054, 0.01968289, 0.8197326, 1. ]]))
```