Question 1

Implement least square regression with help of matrix inversion For this we simply write the code:

```
dict = {"Iris-setosa":'1', "Iris-versicolor": '2',
   "Iris-virginica": '3'}
fname = 'iris.data'
fout = open ('iris-svm-input.txt', 'w')
with open (fname) as f:
   content = f.readlines()
content = [line[:-1] for line in content]
#print (content)
for x in content:
   words = x.split(",")
   if len(words) < 2:</pre>
       break
   while i < 4:
       if words[i] == 0:
           break;
       else:
           fout.write (dict[words[4]]+' '+str(i+1)+':'+words[i]+' ')
           i = i+1
   fout.write('\n')
f.close()
fout.close()
```

Question 2

Implement stochastic gradient descent algorithm with step size 0.1 to solve ridge regression

we simply use the formula:

```
def LeastSquare(X, Y):
    X_ = X.T
    return (matmul(inv( matmul(X_,X)) , matmul(X_, Y)))
```

Question 3

The relation between x and y can be non-linear. Hence to catch non-linear relationship we will generate

```
Featurematrix=[1, x, x^{**}2, \dots, x^{**}10] for this we code:
```

```
x_{-} = genfromtxt('Regressiondata/x.txt', delimiter=',')[np.newaxis] x = x_{-}.T
```

```
Featurematrix = np.hstack((x**0, x, x**2, x**3, x**4, x**5, x**6, x**7, x**8, x**9, x**10))
```

Question 4

Model selection: find optimal lamda and plot error vs lamda graphs. For this we loop in following loop:

```
def CrossValidation(X, Y, fold):
  #X.shape[0] = X.shape[0]
  set_length = X.shape[0]/fold
  TrainError = []
  TestError = []
  ValidationError = []
  L = []
  for x in range(-10,11):
     lamda = 2**x
     L = hstack((L, x))
     i = 0
     sqError = 0
     sqTrainError = 0
     sqTestError = 0
     while i*set_length + set_length <= X.shape[0]:</pre>
     CvX = np.vstack((X[:i*set_length], X[(i+1)*set_length:]))
     CvY = np.vstack((Y[:i*set_length],Y[(i+1)*set_length:]))
     w = RidgeRegression(CvX, CvY, lamda)
     error1 = norm(x=(matmul(CvX, w) - CvY), ord =2)
     sqTrainError = sqTrainError + error1
     error2 = norm(x=(matmul(X, w) - Y), ord = 2)
     sqTestError = sqTestError + error1
```

```
w)-y[i*set_length:(i+1)*set_length])
  sqError = sqError + error
  i = i + set_length
sqError = sqError / set_length**2
sqTrainError = sqTrainError /
   ((X.shape[0]-set_length)*set_length)
sqTestError = sqTestError / (set_length * Y.shape[0])
ValidationError.append(sqError)
TrainError.append(sqTrainError)
TestError.append(sqTestError)
if x == -10:
  prevError = sqError
  lamdaMin = lamda
elif sqError<prevError:</pre>
  prevError = sqError
  lamdaMin = lamda
print ("optimal lamda: "+str(lamdaMin))
And to plot we do the following in the same function:
```

error = norm(matmul(X[i*set_length:(i+1)*set_length],

```
plt.plot(L, TrainError, 'r')
plt.plot(L, ValidationError, 'g')
plt.plot(L, TestError, 'b')
plt.show()
```

I am only a learner: so I dont know how to add an image to latex. Next submission, I will also add plots in documents.

Thank you