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In [1]: import numpy as np
        from hw1_utils import load_images, load_labels
        import matplotlib.pyplot as plt
        matplotlib inline

        train_X = load_images()
        train_y = load_labels()
```

a) see the code below

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In [2]: we take out all the Xs that corresponded to a 1 or 6
        = train_X[(train_y==1)|(train_y==6),]
        we set 1 to be class 1 and 6 to be class 0
        = train_y[(train_y==1)|(train_y==6)]==1

        we generate a hyperplane that separates 1 from 6, recycled from pset 1, it works
        x = np.size(X,1)+1
        y = np.size(X,0)
        X0 = np.hstack((X,-np.ones((ny,1))))
        X0[~y,] = -X0[~y,]
        w = np.zeros((nx))
        y_est = np.squeeze(np.matmul(X0,w))>0
        pcnt = 0
        while sum(y_est)<ny:
            lpcnt+=1
            i = 0
            while i<ny:
                y_est[i] = np.matmul(X0[i,],w)>0
                if y_est[i]<=0:
                    w+=X0[i,]/np.linalg.norm(X0[i,])
                i+=1
```

b) We pick a random digit and apply the equation from Question 4, except we use the preprocessed x with the -1 added at the end.

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In [3]: 1 = np.hstack((X,-np.ones((ny,1))))
        = np.squeeze(X1[np.random.randint(ny,size=1),])
        = -np.matmul(x,w)*w/np.linalg.norm(w)**2
        = x+r
        lt.subplot(1,3,1)
        lt.imshow(np.reshape(x[:-1],[28,28]))
        lt.axis('off')
        lt.title('Sample x')
        lt.subplot(1,3,2)
        lt.imshow(np.reshape(y[:-1],[28,28]))
        lt.axis('off')
        lt.title('Adversarial y')
        lt.subplot(1,3,3)
        lt.imshow(np.reshape(r[:-1],[28,28]))
        lt.axis('off')
        lt.title('Noise r')
        lt.show()
        rint('The norm of r is {:.2f}'.format(np.linalg.norm(r[:-1])))
        rint('Compared to the norm of x which is {:.2f}'.format(np.linalg.norm(x[:-1]
        )))
        rint('We check that w*y is indeed {:.2f}'.format(np.matmul(y,w)))

```



The norm of r is 208.11
 Compared to the norm of x which is 1616.60
 We check that $w*y$ is indeed 0.00

c) Now we use an optimization package to search for an r that miminized $L1$ norm

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In [5]: from cvxopt import matrix
        from l1 import l1

        kipped cause ran out of time

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