

# Variational Autoencoder

October 16, 2018

## 1 Importing the packages

```
In [4]: import numpy as np
import matplotlib.pyplot as plt
from scipy.misc import imread , imresize
import os
import time
```

## 2 Parameters

```
In [30]: no_latent = 10
lr = 1e-3
epochs = 100
batch_size = 5000
```

## 3 Declaring functions

```
In [6]: # Sigmoid

def sigmoid(x):
    return 1/(1 + np.exp(-x))

#derivative of sigmoid
def deriv_sigmoid(x):
    return np.exp(-x)/((1+ np.multiply(np.exp(-x),np.exp(-x))))

# softmax

def softmax(x):
    out = np.zeros(x.shape)
    for i in range(0,x.shape[0]):
        for j in range(0,x.shape[1]):
            out[i,j] = np.exp(x[i,j])/np.sum(np.exp(x[i]))
    return out

# sum of Squared error
```

```

def squared_error(y_train, y_predicted):
    return np.sum(np.multiply(y_train - y_predicted , y_train - y_predicted))

In [7]: def load_flattened_images(Loc):
    Images = []
    for root, dirs, files in os.walk(Loc):
        for file in files:
            Image = imread(os.path.join(root, file))
            Image = Image / 255.0
            Images.append(Image.flatten())

    Images = np.asmatrix(Images)
    print(Images.shape)

    return Images

In [34]: ## fitting the model

def net_fit_vae(x_t , y_t , epochs = 100 , no_latent = 10 , lr = 1e-3 , batch_size = 50)
    input_dim = x_t.shape[1]
    training_samples = x_t.shape[0]
    output_dim = y_t.shape[1]
    costs = []
    x_t = np.hstack((np.ones((training_samples , 1)), x_t))
    #initializing the parameters
    alpha = np.asmatrix(np.random.normal(0,1e-5,(input_dim + 1 , no_latent)))
    gaama = np.asmatrix(np.random.normal(0,1e-5,(input_dim + 1 , no_latent)))
    beta = np.asmatrix(np.random.normal(0,1e-5,(no_latent+1 , output_dim)))

    #looping for number of iterations
    for epoch in range(0,epochs):
        for i in range(0,int(training_samples/batch_size)):
            x_train = x_t[i*batch_size:(i+1)*batch_size , :]
            y_train = y_t[i*batch_size:(i+1)*batch_size , :]
            mu_raw = x_train * alpha
            mu = sigmoid(mu_raw)
            sigma_raw = x_train * gaama
            sigma = sigmoid(sigma_raw)

            #finding z matrix
            epsilon = (np.repeat(np.asmatrix(np.random.multivariate_normal(np.zeros((no
            z = np.multiply( epsilon, np.exp(0.5*sigma))+mu
            z_biased = np.asmatrix(np.hstack((np.ones((batch_size,1)),z)))

            #finding y matrix
            y_raw = z_biased * beta
            y_predicted = sigmoid(y_raw)

```

```

    ##finding the cost
    cost = squared_error(y_train , y_predicted) + 0.5*(np.sum(np.square(mu)) +
    costs.append(cost)
    #finding gradient w.r.t beta
    delta = np.multiply((y_predicted - y_train), deriv_sigmoid(y_raw))
    d_beta = z_biased.T * delta

    temp_beta = beta[1:,:]

    #finding gradient w.r.t alpha
    ss_alpha = np.multiply((delta * temp_beta.T),deriv_sigmoid(mu_raw))
    d_alpha = x_train.T * (ss_alpha + np.multiply(mu , deriv_sigmoid(mu_raw)))

    #finding gradient w.r.t gaama
    ss_beta = np.multiply((delta * temp_beta.T),deriv_sigmoid(sigma_raw))
    d_gaama = x_train.T * 0.5*( - 1* np.multiply(epsilon , np.multiply(ss_beta

    #updating the weights
    beta = beta - lr * d_beta
    alpha = alpha - lr*d_alpha
    gaama = gaama - lr*d_gaama
#    print(np.max(alpha) , np.max(beta) , np.min(alpha) , np.min(beta))
    print("\nEpoch: " + str(epoch+1) + "    batch : " + str(i+1) + "    cost : "
    return beta , costs

```

In [80]: *#prediction*

```

def net_generate(number , weights , no_latent):
    generated = []
    for i in range(0,number):
        x = np.asmatrix(np.random.multivariate_normal(np.zeros((no_latent)) , np.eye(no
        x = np.asmatrix(np.hstack([[1]],x)))
        gen = sigmoid(x * weights)
        gen_image = np.round(gen.reshape(28,28))
        generated.append(gen_image)
    return generated

```

## 4 Generating training data

```

In [89]: # x_train = load_flattened_images("/home/snehith/Documents/machine learning/datasets/mn
# np.save("train_set_vae.npy" , x_train)
x_train = np.asmatrix(np.load("train_set_vae.npy"))
print(x_train.shape)

```

(28000, 784)

## 5 Training the Model

```
In [35]: # alpha , beta , losses = net_fit(x_Train , y_train_and , hidden_nodes = hidden_nodes ,
        tic = time.time()
        weights , lossesses = net_fit_vae(x_train , x_train , no_latent = no_latent , epochs = ep
        print("time taken: "+ str(time.time() - tic) + "sec")
        # print("\nalpha:\n",alpha ,"\nbeta:\n", beta,"\n" ,"\nloss:\n", losses[epochs-1])
        np.save("weights_vae.npy" , weights)
        # np.save("beta_weights_vae.npy" , beta)
```

```
Epoch: 1    batch : 1    cost : 894881.5249358417
Epoch: 1    batch : 2    cost : 1676604.399344305
Epoch: 1    batch : 3    cost : 836585.4236027156
Epoch: 1    batch : 4    cost : 2236734.8544620196
Epoch: 1    batch : 5    cost : 347814.4512032438
Epoch: 2    batch : 1    cost : 317521.29779653245
Epoch: 2    batch : 2    cost : 509330.21611798066
Epoch: 2    batch : 3    cost : 354953.83838184056
Epoch: 2    batch : 4    cost : 3169763.9514268045
Epoch: 2    batch : 5    cost : 2167246.5699105226
Epoch: 3    batch : 1    cost : 2432599.972278135
Epoch: 3    batch : 2    cost : 371774.3044271679
Epoch: 3    batch : 3    cost : 3148258.8589601796
Epoch: 3    batch : 4    cost : 299496.00505048194
Epoch: 3    batch : 5    cost : 351601.627779848
Epoch: 4    batch : 1    cost : 375597.57715359563
Epoch: 4    batch : 2    cost : 349980.09691169363
Epoch: 4    batch : 3    cost : 3055150.5294021782
Epoch: 4    batch : 4    cost : 1405978.3770361503
```

Epoch: 4    batch : 5    cost : 506721.0524602135

Epoch: 5    batch : 1    cost : 1705950.434894276

Epoch: 5    batch : 2    cost : 372211.36472275737

Epoch: 5    batch : 3    cost : 337531.02700029017

Epoch: 5    batch : 4    cost : 1386260.2617328533

Epoch: 5    batch : 5    cost : 667577.3418397839

Epoch: 6    batch : 1    cost : 423548.9424026123

Epoch: 6    batch : 2    cost : 331173.4661909817

Epoch: 6    batch : 3    cost : 891115.1277096414

Epoch: 6    batch : 4    cost : 1519799.3333451445

Epoch: 6    batch : 5    cost : 362955.64441618806

Epoch: 7    batch : 1    cost : 456252.90245337016

Epoch: 7    batch : 2    cost : 364562.7429126703

Epoch: 7    batch : 3    cost : 379249.9388141697

Epoch: 7    batch : 4    cost : 349128.09692617704

Epoch: 7    batch : 5    cost : 496822.38210271683

Epoch: 8    batch : 1    cost : 371634.7527114676

Epoch: 8    batch : 2    cost : 360707.39480689005

Epoch: 8    batch : 3    cost : 550437.4437581858

Epoch: 8    batch : 4    cost : 362735.736169687

Epoch: 8    batch : 5    cost : 425497.30208456743

Epoch: 9    batch : 1    cost : 361123.17208818265

Epoch: 9    batch : 2    cost : 354001.877230114

Epoch: 9    batch : 3    cost : 325349.594918995

Epoch: 9    batch : 4    cost : 343856.47501076834  
Epoch: 9    batch : 5    cost : 354886.13308531116  
Epoch: 10    batch : 1    cost : 829234.0365832951  
Epoch: 10    batch : 2    cost : 406060.9820890123  
Epoch: 10    batch : 3    cost : 389110.5974712974  
Epoch: 10    batch : 4    cost : 344682.76189954224  
Epoch: 10    batch : 5    cost : 358994.41502576333  
Epoch: 11    batch : 1    cost : 361686.8657097705  
Epoch: 11    batch : 2    cost : 381185.2943366271  
Epoch: 11    batch : 3    cost : 1689011.277850785  
Epoch: 11    batch : 4    cost : 369037.2368646116  
Epoch: 11    batch : 5    cost : 340194.98925384105  
Epoch: 12    batch : 1    cost : 349306.8203414394  
Epoch: 12    batch : 2    cost : 357300.4393059197  
Epoch: 12    batch : 3    cost : 370825.2881118607  
Epoch: 12    batch : 4    cost : 350951.17144898564  
Epoch: 12    batch : 5    cost : 526518.544314013  
Epoch: 13    batch : 1    cost : 502167.9490078639  
Epoch: 13    batch : 2    cost : 520405.6478246604  
Epoch: 13    batch : 3    cost : 369670.5314211751  
Epoch: 13    batch : 4    cost : 395225.51636791765  
Epoch: 13    batch : 5    cost : 366280.411091237  
Epoch: 14    batch : 1    cost : 350047.432950887  
Epoch: 14    batch : 2    cost : 370753.0668403734

Epoch: 14	batch : 3	cost : 376860.4446962331
Epoch: 14	batch : 4	cost : 367612.9391222404
Epoch: 14	batch : 5	cost : 772124.1051101264
Epoch: 15	batch : 1	cost : 599765.2732413582
Epoch: 15	batch : 2	cost : 383663.70106951793
Epoch: 15	batch : 3	cost : 381160.54025396856
Epoch: 15	batch : 4	cost : 381222.7065542868
Epoch: 15	batch : 5	cost : 364059.3850401185
Epoch: 16	batch : 1	cost : 486296.6403732618
Epoch: 16	batch : 2	cost : 382105.94964590226
Epoch: 16	batch : 3	cost : 352374.90356640966
Epoch: 16	batch : 4	cost : 387475.81715471915
Epoch: 16	batch : 5	cost : 401955.15835433564
Epoch: 17	batch : 1	cost : 370661.58868778334
Epoch: 17	batch : 2	cost : 370348.6252363222
Epoch: 17	batch : 3	cost : 366910.7093360341
Epoch: 17	batch : 4	cost : 360391.05740447284
Epoch: 17	batch : 5	cost : 388863.45611935016
Epoch: 18	batch : 1	cost : 370804.8065694805
Epoch: 18	batch : 2	cost : 376470.4764457072
Epoch: 18	batch : 3	cost : 366114.244291099
Epoch: 18	batch : 4	cost : 377575.1450789321
Epoch: 18	batch : 5	cost : 379617.5372575375
Epoch: 19	batch : 1	cost : 387910.13844222826

Epoch: 19	batch : 2	cost : 377804.2659269273
Epoch: 19	batch : 3	cost : 380054.4527457212
Epoch: 19	batch : 4	cost : 363533.62096288416
Epoch: 19	batch : 5	cost : 395274.0440290438
Epoch: 20	batch : 1	cost : 394142.19176380726
Epoch: 20	batch : 2	cost : 392466.06503573054
Epoch: 20	batch : 3	cost : 356538.6976652741
Epoch: 20	batch : 4	cost : 459402.36236992327
Epoch: 20	batch : 5	cost : 415465.64663228526
Epoch: 21	batch : 1	cost : 360484.9092142089
Epoch: 21	batch : 2	cost : 398407.2488674678
Epoch: 21	batch : 3	cost : 362801.21648409846
Epoch: 21	batch : 4	cost : 388199.7894238662
Epoch: 21	batch : 5	cost : 374343.9677086741
Epoch: 22	batch : 1	cost : 367874.59517047333
Epoch: 22	batch : 2	cost : 420193.1137320784
Epoch: 22	batch : 3	cost : 378462.615442715
Epoch: 22	batch : 4	cost : 488958.29947646376
Epoch: 22	batch : 5	cost : 399052.1730023442
Epoch: 23	batch : 1	cost : 561037.1506268834
Epoch: 23	batch : 2	cost : 408734.89674006857
Epoch: 23	batch : 3	cost : 380605.04178547347
Epoch: 23	batch : 4	cost : 381121.77576585946
Epoch: 23	batch : 5	cost : 363229.6485763206



Epoch: 24	batch : 1	cost : 369029.83367379545
Epoch: 24	batch : 2	cost : 379701.1934751491
Epoch: 24	batch : 3	cost : 384973.58827627526
Epoch: 24	batch : 4	cost : 356118.05786255596
Epoch: 24	batch : 5	cost : 471186.557449086
Epoch: 25	batch : 1	cost : 377031.4273713295
Epoch: 25	batch : 2	cost : 370635.1587020446
Epoch: 25	batch : 3	cost : 375174.692799081
Epoch: 25	batch : 4	cost : 387709.6428872521
Epoch: 25	batch : 5	cost : 400784.78201553173
Epoch: 26	batch : 1	cost : 363752.720508917
Epoch: 26	batch : 2	cost : 382904.73530189146
Epoch: 26	batch : 3	cost : 379745.79578864895
Epoch: 26	batch : 4	cost : 376427.7945138029
Epoch: 26	batch : 5	cost : 369914.3121563745
Epoch: 27	batch : 1	cost : 364306.8449365747
Epoch: 27	batch : 2	cost : 411576.4527024198
Epoch: 27	batch : 3	cost : 392458.6324722377
Epoch: 27	batch : 4	cost : 381442.53720474447
Epoch: 27	batch : 5	cost : 395302.98015117535
Epoch: 28	batch : 1	cost : 378703.1219298445
Epoch: 28	batch : 2	cost : 370570.34953455155
Epoch: 28	batch : 3	cost : 361172.23910308076
Epoch: 28	batch : 4	cost : 377547.66765242215

Epoch: 28	batch : 5	cost : 374276.665222065
Epoch: 29	batch : 1	cost : 381677.4239267636
Epoch: 29	batch : 2	cost : 399801.0014918844
Epoch: 29	batch : 3	cost : 386935.3681460631
Epoch: 29	batch : 4	cost : 371440.77508594154
Epoch: 29	batch : 5	cost : 383384.599450979
Epoch: 30	batch : 1	cost : 366912.2492407307
Epoch: 30	batch : 2	cost : 370199.94889992423
Epoch: 30	batch : 3	cost : 391485.4634859952
Epoch: 30	batch : 4	cost : 358144.8313504965
Epoch: 30	batch : 5	cost : 373264.7053642994
Epoch: 31	batch : 1	cost : 399065.3349567207
Epoch: 31	batch : 2	cost : 398206.4357324095
Epoch: 31	batch : 3	cost : 401272.5221758087
Epoch: 31	batch : 4	cost : 379778.1500150035
Epoch: 31	batch : 5	cost : 361927.42292744276
Epoch: 32	batch : 1	cost : 370654.0511645674
Epoch: 32	batch : 2	cost : 401112.7106181223
Epoch: 32	batch : 3	cost : 360633.91367312166
Epoch: 32	batch : 4	cost : 373287.93542307266
Epoch: 32	batch : 5	cost : 375302.01051702077
Epoch: 33	batch : 1	cost : 384000.1601312193
Epoch: 33	batch : 2	cost : 392331.29463738296
Epoch: 33	batch : 3	cost : 364079.24153587356

Epoch: 33	batch : 4	cost : 385519.20058874105
Epoch: 33	batch : 5	cost : 361837.32077460916
Epoch: 34	batch : 1	cost : 375469.3474709418
Epoch: 34	batch : 2	cost : 385187.74681602366
Epoch: 34	batch : 3	cost : 384486.2245251813
Epoch: 34	batch : 4	cost : 369785.78630550584
Epoch: 34	batch : 5	cost : 384684.8208451181
Epoch: 35	batch : 1	cost : 364403.0136873008
Epoch: 35	batch : 2	cost : 369956.7231989068
Epoch: 35	batch : 3	cost : 372300.2909645963
Epoch: 35	batch : 4	cost : 370976.0197647894
Epoch: 35	batch : 5	cost : 363825.97150601
Epoch: 36	batch : 1	cost : 419132.2380083096
Epoch: 36	batch : 2	cost : 396456.8574731221
Epoch: 36	batch : 3	cost : 456435.9380035514
Epoch: 36	batch : 4	cost : 368838.9684825259
Epoch: 36	batch : 5	cost : 378171.69561898184
Epoch: 37	batch : 1	cost : 371741.6006649504
Epoch: 37	batch : 2	cost : 365715.6259041299
Epoch: 37	batch : 3	cost : 477908.9802839797
Epoch: 37	batch : 4	cost : 374487.9476938455
Epoch: 37	batch : 5	cost : 394575.12378192437
Epoch: 38	batch : 1	cost : 374484.8059010422
Epoch: 38	batch : 2	cost : 365684.7888374939

Epoch: 38	batch : 3	cost : 380927.60712002445
Epoch: 38	batch : 4	cost : 388371.50431824115
Epoch: 38	batch : 5	cost : 387978.9784335108
Epoch: 39	batch : 1	cost : 373342.5876907832
Epoch: 39	batch : 2	cost : 368575.07859288534
Epoch: 39	batch : 3	cost : 356134.6350215666
Epoch: 39	batch : 4	cost : 358681.72219981876
Epoch: 39	batch : 5	cost : 426503.16167869646
Epoch: 40	batch : 1	cost : 376243.39166103856
Epoch: 40	batch : 2	cost : 361513.1779210053
Epoch: 40	batch : 3	cost : 387488.9811822424
Epoch: 40	batch : 4	cost : 363615.79898985586
Epoch: 40	batch : 5	cost : 386187.59949834587
Epoch: 41	batch : 1	cost : 367279.98138372845
Epoch: 41	batch : 2	cost : 361187.5506240499
Epoch: 41	batch : 3	cost : 379770.8032754283
Epoch: 41	batch : 4	cost : 371518.40582513844
Epoch: 41	batch : 5	cost : 361652.15527150943
Epoch: 42	batch : 1	cost : 418310.4357202608
Epoch: 42	batch : 2	cost : 379833.345709098
Epoch: 42	batch : 3	cost : 361251.23912650824
Epoch: 42	batch : 4	cost : 383676.94922145456
Epoch: 42	batch : 5	cost : 359825.621153571
Epoch: 43	batch : 1	cost : 365229.2533963977

Epoch: 43	batch : 2	cost : 369998.27834852476
Epoch: 43	batch : 3	cost : 398551.5227114817
Epoch: 43	batch : 4	cost : 386539.4575926856
Epoch: 43	batch : 5	cost : 375139.7202816211
Epoch: 44	batch : 1	cost : 396820.8100404915
Epoch: 44	batch : 2	cost : 372228.42358973046
Epoch: 44	batch : 3	cost : 362614.11013121036
Epoch: 44	batch : 4	cost : 374777.9926854398
Epoch: 44	batch : 5	cost : 385222.74849790265
Epoch: 45	batch : 1	cost : 397825.4063210196
Epoch: 45	batch : 2	cost : 372862.28328318783
Epoch: 45	batch : 3	cost : 436598.161295448
Epoch: 45	batch : 4	cost : 380109.80743975146
Epoch: 45	batch : 5	cost : 380866.0876383866
Epoch: 46	batch : 1	cost : 384481.0346047879
Epoch: 46	batch : 2	cost : 376968.1239575672
Epoch: 46	batch : 3	cost : 374819.9317715304
Epoch: 46	batch : 4	cost : 389067.8895227598
Epoch: 46	batch : 5	cost : 395248.5069230972
Epoch: 47	batch : 1	cost : 412321.70993695676
Epoch: 47	batch : 2	cost : 371991.82868275273
Epoch: 47	batch : 3	cost : 380440.88972698926
Epoch: 47	batch : 4	cost : 375456.9781959909
Epoch: 47	batch : 5	cost : 383626.94812737784

Epoch: 48	batch : 1	cost : 386626.21174498094
Epoch: 48	batch : 2	cost : 377601.4903268782
Epoch: 48	batch : 3	cost : 382059.78699069086
Epoch: 48	batch : 4	cost : 353951.3160504736
Epoch: 48	batch : 5	cost : 366972.73054454394
Epoch: 49	batch : 1	cost : 380229.78112477635
Epoch: 49	batch : 2	cost : 378895.63819146977
Epoch: 49	batch : 3	cost : 380505.65326517756
Epoch: 49	batch : 4	cost : 367200.67073872464
Epoch: 49	batch : 5	cost : 375985.0971682116
Epoch: 50	batch : 1	cost : 380560.93879250373
Epoch: 50	batch : 2	cost : 377870.7648372308
Epoch: 50	batch : 3	cost : 393234.82259688707
Epoch: 50	batch : 4	cost : 396377.07691354555
Epoch: 50	batch : 5	cost : 380359.50303083233
Epoch: 51	batch : 1	cost : 401292.03954589774
Epoch: 51	batch : 2	cost : 406066.9672278115
Epoch: 51	batch : 3	cost : 394448.2651155442
Epoch: 51	batch : 4	cost : 393119.9738016764
Epoch: 51	batch : 5	cost : 384055.2460141788
Epoch: 52	batch : 1	cost : 387783.3387661972
Epoch: 52	batch : 2	cost : 376344.7564865915
Epoch: 52	batch : 3	cost : 374326.09721610806
Epoch: 52	batch : 4	cost : 380146.25488632655

Epoch: 52	batch : 5	cost : 373741.00552299136
Epoch: 53	batch : 1	cost : 418485.8847950184
Epoch: 53	batch : 2	cost : 390979.9222793502
Epoch: 53	batch : 3	cost : 402576.07767010527
Epoch: 53	batch : 4	cost : 393609.1164896341
Epoch: 53	batch : 5	cost : 392303.24644563353
Epoch: 54	batch : 1	cost : 369462.56242713705
Epoch: 54	batch : 2	cost : 373158.8224376496
Epoch: 54	batch : 3	cost : 394548.49416877073
Epoch: 54	batch : 4	cost : 395857.73941517714
Epoch: 54	batch : 5	cost : 378008.34415715473
Epoch: 55	batch : 1	cost : 453370.07259887084
Epoch: 55	batch : 2	cost : 386843.7857970175
Epoch: 55	batch : 3	cost : 373606.53894974233
Epoch: 55	batch : 4	cost : 407202.0678722843
Epoch: 55	batch : 5	cost : 395776.9179965028
Epoch: 56	batch : 1	cost : 419131.35005640716
Epoch: 56	batch : 2	cost : 450157.28879819845
Epoch: 56	batch : 3	cost : 383191.65925101703
Epoch: 56	batch : 4	cost : 399078.5158857723
Epoch: 56	batch : 5	cost : 382204.3937427347
Epoch: 57	batch : 1	cost : 370844.3095566645
Epoch: 57	batch : 2	cost : 397956.5135565944
Epoch: 57	batch : 3	cost : 390606.3637045006

Epoch: 57	batch : 4	cost : 395685.51355177455
Epoch: 57	batch : 5	cost : 391131.753334375
Epoch: 58	batch : 1	cost : 399825.35978018626
Epoch: 58	batch : 2	cost : 399648.07761137583
Epoch: 58	batch : 3	cost : 398502.29944678023
Epoch: 58	batch : 4	cost : 387905.3233020655
Epoch: 58	batch : 5	cost : 385836.5425549794
Epoch: 59	batch : 1	cost : 414540.27659299795
Epoch: 59	batch : 2	cost : 384892.6997853966
Epoch: 59	batch : 3	cost : 379048.7782744143
Epoch: 59	batch : 4	cost : 392296.8352067441
Epoch: 59	batch : 5	cost : 399189.5045435761
Epoch: 60	batch : 1	cost : 383242.2761277647
Epoch: 60	batch : 2	cost : 403240.7157319934
Epoch: 60	batch : 3	cost : 389172.5660761838
Epoch: 60	batch : 4	cost : 396348.44589442614
Epoch: 60	batch : 5	cost : 399264.6641083303
Epoch: 61	batch : 1	cost : 378205.81675504416
Epoch: 61	batch : 2	cost : 395890.5974267349
Epoch: 61	batch : 3	cost : 390037.4202583877
Epoch: 61	batch : 4	cost : 396889.9718692182
Epoch: 61	batch : 5	cost : 409520.09769495303
Epoch: 62	batch : 1	cost : 381877.31501933077
Epoch: 62	batch : 2	cost : 427908.9471461009



Epoch: 62	batch : 3	cost : 389131.64208782354
Epoch: 62	batch : 4	cost : 378704.1548004042
Epoch: 62	batch : 5	cost : 390456.1701968506
Epoch: 63	batch : 1	cost : 401091.27878969954
Epoch: 63	batch : 2	cost : 390127.2595455087
Epoch: 63	batch : 3	cost : 385517.62500787893
Epoch: 63	batch : 4	cost : 403185.84479457454
Epoch: 63	batch : 5	cost : 378562.7362883314
Epoch: 64	batch : 1	cost : 395897.6283465202
Epoch: 64	batch : 2	cost : 389134.5004429809
Epoch: 64	batch : 3	cost : 388929.17605538154
Epoch: 64	batch : 4	cost : 379809.4873517154
Epoch: 64	batch : 5	cost : 379333.8643021571
Epoch: 65	batch : 1	cost : 383016.05825817474
Epoch: 65	batch : 2	cost : 380750.9439555575
Epoch: 65	batch : 3	cost : 399908.1256084409
Epoch: 65	batch : 4	cost : 386430.6803692072
Epoch: 65	batch : 5	cost : 374918.60021033534
Epoch: 66	batch : 1	cost : 422985.8879163598
Epoch: 66	batch : 2	cost : 407260.5285692924
Epoch: 66	batch : 3	cost : 381837.24768361985
Epoch: 66	batch : 4	cost : 376291.81857381016
Epoch: 66	batch : 5	cost : 370714.4714561359
Epoch: 67	batch : 1	cost : 408073.229049813

Epoch: 67	batch : 2	cost : 385982.20596246753
Epoch: 67	batch : 3	cost : 374924.70562269783
Epoch: 67	batch : 4	cost : 393002.66844454466
Epoch: 67	batch : 5	cost : 380553.0014476797
Epoch: 68	batch : 1	cost : 390624.39093751065
Epoch: 68	batch : 2	cost : 385634.0037266076
Epoch: 68	batch : 3	cost : 382254.7364555289
Epoch: 68	batch : 4	cost : 407989.168785062
Epoch: 68	batch : 5	cost : 410079.501117883
Epoch: 69	batch : 1	cost : 386104.83163251326
Epoch: 69	batch : 2	cost : 383112.9515129432
Epoch: 69	batch : 3	cost : 388774.91895711084
Epoch: 69	batch : 4	cost : 392219.2531165233
Epoch: 69	batch : 5	cost : 386697.1155522425
Epoch: 70	batch : 1	cost : 376610.75910581654
Epoch: 70	batch : 2	cost : 384691.0319132913
Epoch: 70	batch : 3	cost : 388104.7077300143
Epoch: 70	batch : 4	cost : 394262.8851122813
Epoch: 70	batch : 5	cost : 385970.94268098037
Epoch: 71	batch : 1	cost : 385160.2091417122
Epoch: 71	batch : 2	cost : 397771.443192827
Epoch: 71	batch : 3	cost : 381753.119120129
Epoch: 71	batch : 4	cost : 388973.7594100753
Epoch: 71	batch : 5	cost : 385672.3315790706

Epoch: 72	batch : 1	cost : 393449.9566483828
Epoch: 72	batch : 2	cost : 384619.22193135327
Epoch: 72	batch : 3	cost : 385091.1489177354
Epoch: 72	batch : 4	cost : 390864.48005289224
Epoch: 72	batch : 5	cost : 385503.63647394313
Epoch: 73	batch : 1	cost : 430022.6254021217
Epoch: 73	batch : 2	cost : 372501.6042143973
Epoch: 73	batch : 3	cost : 395024.3861492805
Epoch: 73	batch : 4	cost : 387943.5327443105
Epoch: 73	batch : 5	cost : 454500.92811681615
Epoch: 74	batch : 1	cost : 384815.0378002448
Epoch: 74	batch : 2	cost : 414869.75049245317
Epoch: 74	batch : 3	cost : 393150.7948487134
Epoch: 74	batch : 4	cost : 379408.9507098907
Epoch: 74	batch : 5	cost : 379332.16047057597
Epoch: 75	batch : 1	cost : 387343.57675365655
Epoch: 75	batch : 2	cost : 418341.6778025913
Epoch: 75	batch : 3	cost : 393999.8664266253
Epoch: 75	batch : 4	cost : 397054.66831983125
Epoch: 75	batch : 5	cost : 399191.1770999615
Epoch: 76	batch : 1	cost : 388162.5849495444
Epoch: 76	batch : 2	cost : 381486.4049460715
Epoch: 76	batch : 3	cost : 403959.5117328571
Epoch: 76	batch : 4	cost : 377036.7082421789

Epoch: 76	batch : 5	cost : 373808.72793638776
Epoch: 77	batch : 1	cost : 390645.57025378797
Epoch: 77	batch : 2	cost : 418583.7488198804
Epoch: 77	batch : 3	cost : 398384.10862921434
Epoch: 77	batch : 4	cost : 404670.82037557435
Epoch: 77	batch : 5	cost : 410453.9759875422
Epoch: 78	batch : 1	cost : 384833.7046602175
Epoch: 78	batch : 2	cost : 384241.0398536972
Epoch: 78	batch : 3	cost : 393019.0599189544
Epoch: 78	batch : 4	cost : 392252.36090719316
Epoch: 78	batch : 5	cost : 370719.5410715468
Epoch: 79	batch : 1	cost : 383904.22996020573
Epoch: 79	batch : 2	cost : 400391.10196350573
Epoch: 79	batch : 3	cost : 385560.90294457704
Epoch: 79	batch : 4	cost : 394881.0913831472
Epoch: 79	batch : 5	cost : 379757.1041823386
Epoch: 80	batch : 1	cost : 394782.15221344435
Epoch: 80	batch : 2	cost : 379464.5850654384
Epoch: 80	batch : 3	cost : 377720.99954066385
Epoch: 80	batch : 4	cost : 385018.4230975112
Epoch: 80	batch : 5	cost : 387551.76084539
Epoch: 81	batch : 1	cost : 388884.20860898285
Epoch: 81	batch : 2	cost : 388862.1214361409
Epoch: 81	batch : 3	cost : 383719.50229956553

Epoch: 81	batch : 4	cost : 383732.528378197
Epoch: 81	batch : 5	cost : 388603.6625357904
Epoch: 82	batch : 1	cost : 380393.40970464837
Epoch: 82	batch : 2	cost : 376919.54173941066
Epoch: 82	batch : 3	cost : 385621.03881618497
Epoch: 82	batch : 4	cost : 384413.85300736676
Epoch: 82	batch : 5	cost : 372782.882666477
Epoch: 83	batch : 1	cost : 386070.9737139491
Epoch: 83	batch : 2	cost : 391432.69580766093
Epoch: 83	batch : 3	cost : 378031.3251720275
Epoch: 83	batch : 4	cost : 396215.8251516057
Epoch: 83	batch : 5	cost : 387588.19182915724
Epoch: 84	batch : 1	cost : 393146.74301027163
Epoch: 84	batch : 2	cost : 381928.4508728939
Epoch: 84	batch : 3	cost : 380737.4299821435
Epoch: 84	batch : 4	cost : 382033.7715530904
Epoch: 84	batch : 5	cost : 387234.6393710547
Epoch: 85	batch : 1	cost : 389111.1674321563
Epoch: 85	batch : 2	cost : 377728.0628297289
Epoch: 85	batch : 3	cost : 388517.346157924
Epoch: 85	batch : 4	cost : 384067.5785591372
Epoch: 85	batch : 5	cost : 369227.58025734586
Epoch: 86	batch : 1	cost : 392090.72784438834
Epoch: 86	batch : 2	cost : 384218.818813032

Epoch: 86	batch : 3	cost : 390862.84463922575
Epoch: 86	batch : 4	cost : 400331.7875580071
Epoch: 86	batch : 5	cost : 382944.74228868587
Epoch: 87	batch : 1	cost : 389840.79238785396
Epoch: 87	batch : 2	cost : 410740.42057458416
Epoch: 87	batch : 3	cost : 388771.93335850554
Epoch: 87	batch : 4	cost : 387429.4226539494
Epoch: 87	batch : 5	cost : 383838.0084044421
Epoch: 88	batch : 1	cost : 388330.1444710021
Epoch: 88	batch : 2	cost : 393316.4851430407
Epoch: 88	batch : 3	cost : 385945.40280870703
Epoch: 88	batch : 4	cost : 385541.1661583775
Epoch: 88	batch : 5	cost : 374258.4147161241
Epoch: 89	batch : 1	cost : 370014.21203457343
Epoch: 89	batch : 2	cost : 387325.4050663948
Epoch: 89	batch : 3	cost : 375937.7041617186
Epoch: 89	batch : 4	cost : 405462.15091088903
Epoch: 89	batch : 5	cost : 380486.986851737
Epoch: 90	batch : 1	cost : 377206.4876611927
Epoch: 90	batch : 2	cost : 392917.7973418301
Epoch: 90	batch : 3	cost : 381683.7781168005
Epoch: 90	batch : 4	cost : 381588.9124043903
Epoch: 90	batch : 5	cost : 372729.59917097766
Epoch: 91	batch : 1	cost : 366540.15856403945

Epoch: 91	batch : 2	cost : 376778.0361052168
Epoch: 91	batch : 3	cost : 385354.4019060463
Epoch: 91	batch : 4	cost : 388259.2163103925
Epoch: 91	batch : 5	cost : 380317.00421880116
Epoch: 92	batch : 1	cost : 388326.02082222246
Epoch: 92	batch : 2	cost : 392524.4614465859
Epoch: 92	batch : 3	cost : 392827.2706470245
Epoch: 92	batch : 4	cost : 381198.9082991764
Epoch: 92	batch : 5	cost : 372076.95319423504
Epoch: 93	batch : 1	cost : 391960.0638456567
Epoch: 93	batch : 2	cost : 385902.3395041327
Epoch: 93	batch : 3	cost : 375970.83002128376
Epoch: 93	batch : 4	cost : 371325.31262853584
Epoch: 93	batch : 5	cost : 365559.1455711167
Epoch: 94	batch : 1	cost : 390614.92249400576
Epoch: 94	batch : 2	cost : 417283.5401668897
Epoch: 94	batch : 3	cost : 394452.3196891679
Epoch: 94	batch : 4	cost : 435809.3996758036
Epoch: 94	batch : 5	cost : 381780.1532532945
Epoch: 95	batch : 1	cost : 393194.47962792264
Epoch: 95	batch : 2	cost : 380694.8767854122
Epoch: 95	batch : 3	cost : 381566.8807664006
Epoch: 95	batch : 4	cost : 401440.12047537393
Epoch: 95	batch : 5	cost : 376294.1760282921

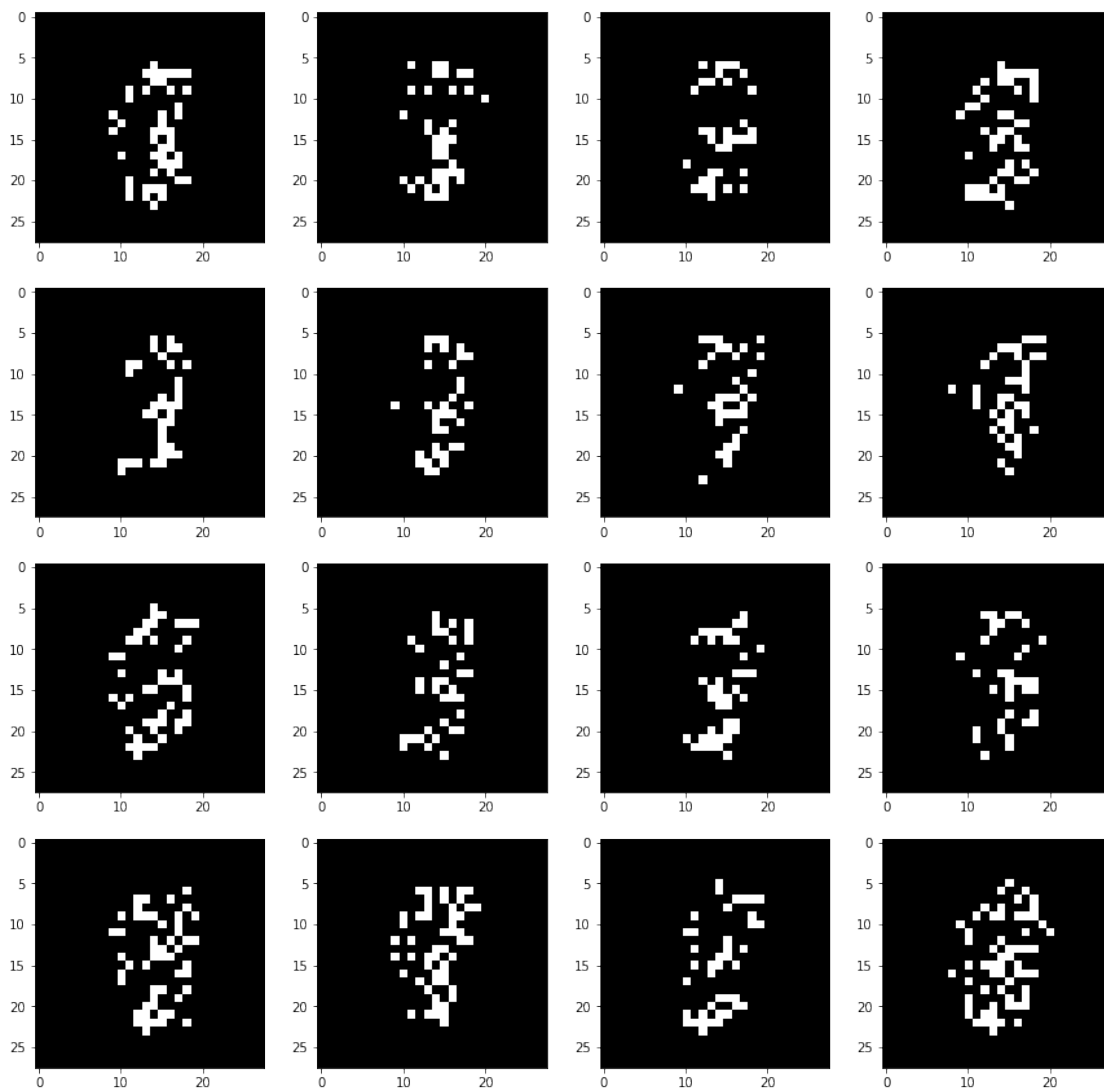
Epoch: 96    batch : 1    cost : 388608.5159898003  
Epoch: 96    batch : 2    cost : 393582.2935896662  
Epoch: 96    batch : 3    cost : 394222.03123207693  
Epoch: 96    batch : 4    cost : 400153.2385986445  
Epoch: 96    batch : 5    cost : 367965.8404721447  
Epoch: 97    batch : 1    cost : 373924.361722677  
Epoch: 97    batch : 2    cost : 379269.2044880599  
Epoch: 97    batch : 3    cost : 396631.78704500536  
Epoch: 97    batch : 4    cost : 391578.99110759  
Epoch: 97    batch : 5    cost : 373211.0092878053  
Epoch: 98    batch : 1    cost : 383722.6022924775  
Epoch: 98    batch : 2    cost : 393833.44619494426  
Epoch: 98    batch : 3    cost : 386814.11418744636  
Epoch: 98    batch : 4    cost : 380908.3368854595  
Epoch: 98    batch : 5    cost : 382166.5589008395  
Epoch: 99    batch : 1    cost : 381995.174765198  
Epoch: 99    batch : 2    cost : 392830.6962310641  
Epoch: 99    batch : 3    cost : 372973.6015363721  
Epoch: 99    batch : 4    cost : 385830.7161260835  
Epoch: 99    batch : 5    cost : 390707.27737520763  
Epoch: 100    batch : 1    cost : 381133.7317133874  
Epoch: 100    batch : 2    cost : 382274.33306743356  
Epoch: 100    batch : 3    cost : 394116.710108392  
Epoch: 100    batch : 4    cost : 379346.7504260815



Epoch: 100    batch : 5    cost : 399816.61837643705  
time taken: 281.8900511264801sec

### 5.0.1 Generating new images

```
In [81]: #Generating new images
         result = net_generate(16 , weights , no_latent)
         plt.figure(figsize = (15,15))
         for i in range(0,16):
             plt.subplot(4,4,i+1)
             plt.imshow(result[i] , cmap = 'gray')
```



```
In [37]: #plotting the cost vs epochs
plt.plot(np.arange(len(lossses)),lossses)
plt.title("training samples: " + str(x_train.shape[0]))
plt.xlabel("epochs")
plt.ylabel("cost")
plt.show()
```

