CS189 - HW4 Jeffrey Tsui Justin Nguyen

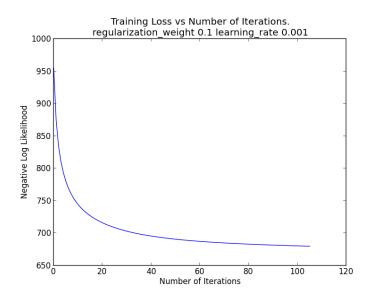
i) Standardized columns
 ii) Log transform
 iii) Binarized
i) Standardized columns
 ii) Log transform
 iii) Binarized
TODO
 i) Standardized columns
 ii) Log transform
 iii) Binarized

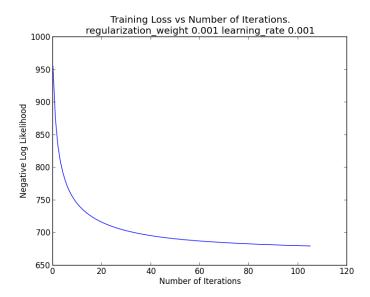
1.

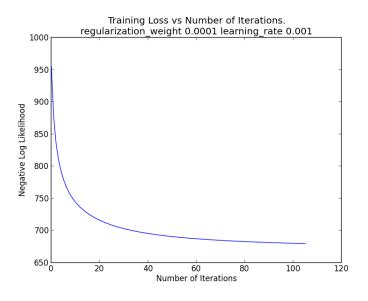
<u>4.</u>

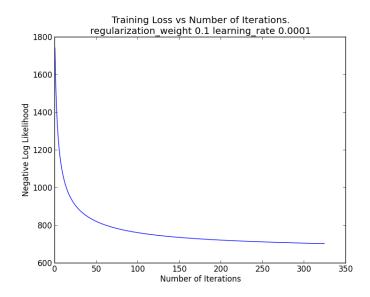
i) Standardized columns

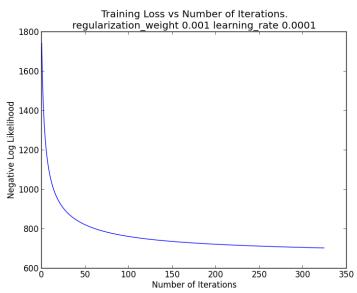
regularization weight	learning rate	training error	test error
0.1	0.001	0.0799347471452	0.0911458333333
0.1	0.0001	0.078967934323	0.0846322917867
0.001	0.001	0.0802610114192	0.0930989583333
0.001	0.0001	0.078955954323	0.0827832926667
0.0001	0.001	0.0802610114192	0.0930989583333
0.0001	0.0001	0.078955954323	0.0826822916667

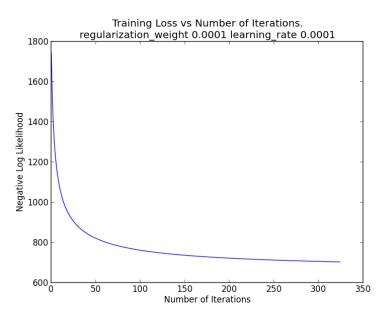






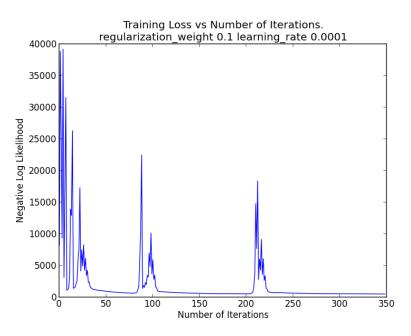


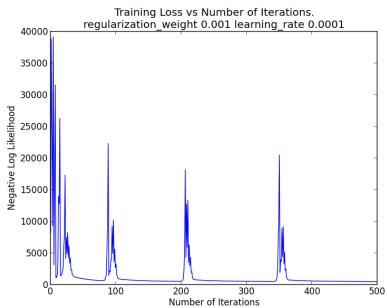


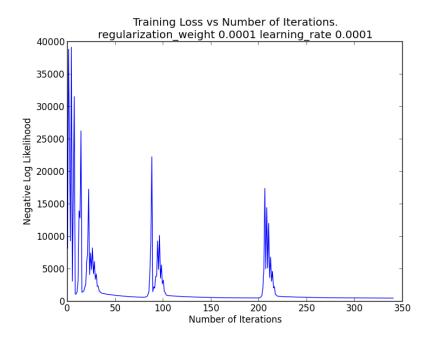


ii) Log transform

regularization weight	learning rate	training error	test error
0.1	0.0001	0.0531810766721	0.060546875
0.001	0.0001	0.0515497553018	0.056640625
0.0001	0.0001	0.0531810766721	0.060546875

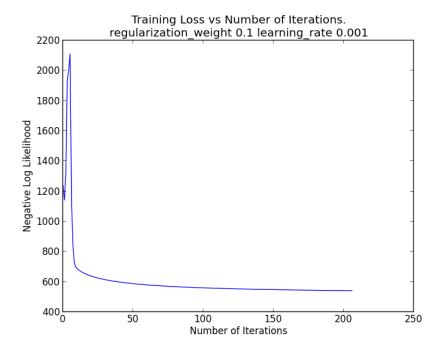


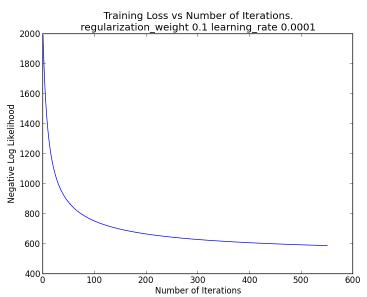


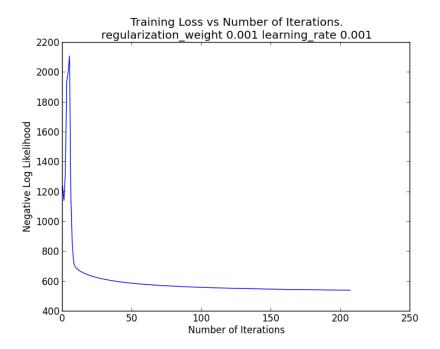


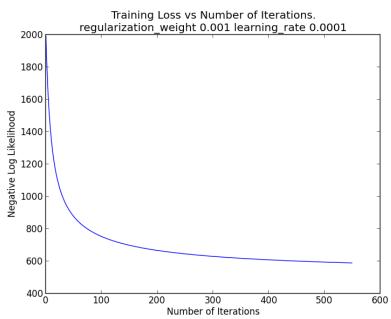
iii) Binarized

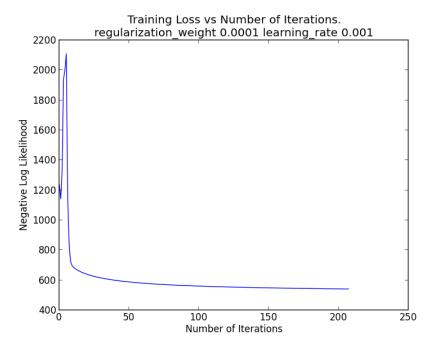
regularization weight	learning rate	training error	test error
0.1	0.001	0.0655791190865	0.0748697916667
0.1	0.0001	0.0662316476346	0.076171875
0.001	0.001	0.0639477977162	0.0748697916667
0.001	0.0001	0.0662316476346	0.0755208333333
0.0001	0.001	0.0649477977162	0.0750697916667
0.0001	0.0001	0.0662316476346	0.0755208333333

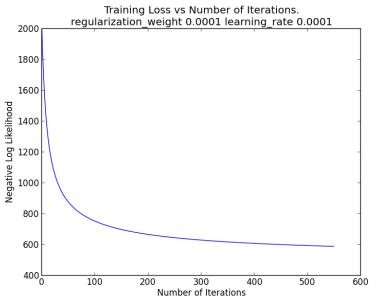










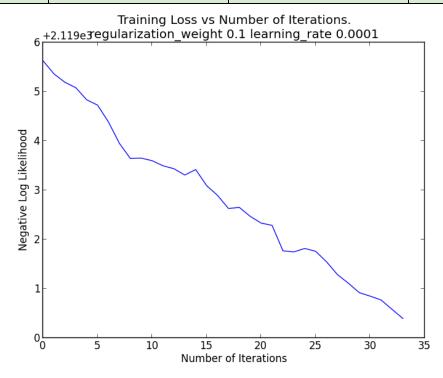


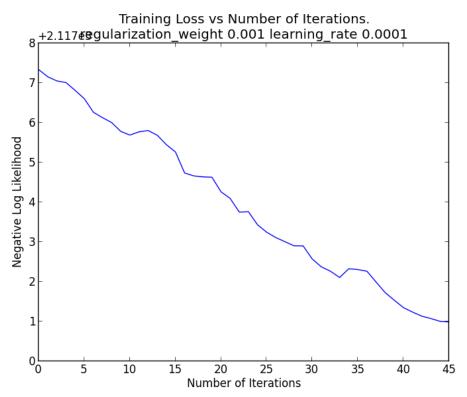
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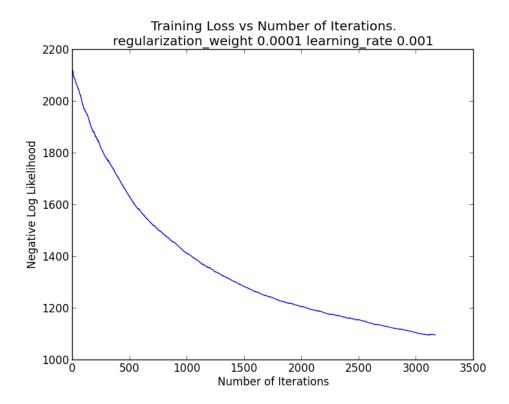
i) Standardized columns

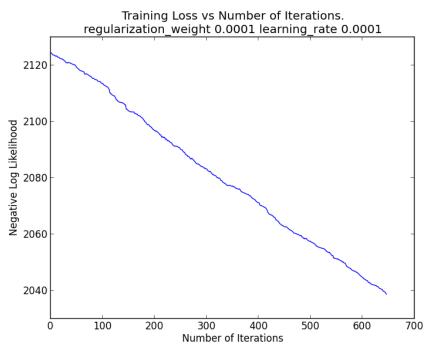
regularization weight	learning rate	training error	test error
0.1	0.001	0.179771615008	0.202473958333
0.1	0.0001	0.156280587276	0.166015625
0.001	0.001	0.0972267536705	0.106770833333

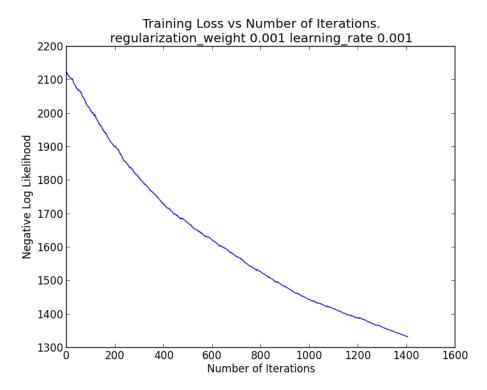
0.001	0.0001	0.122022838499	0.142578125
0.0001	0.001	0.0920065252855	0.106119791667
0.0001	0.0001	0.099836867863	0.10546875

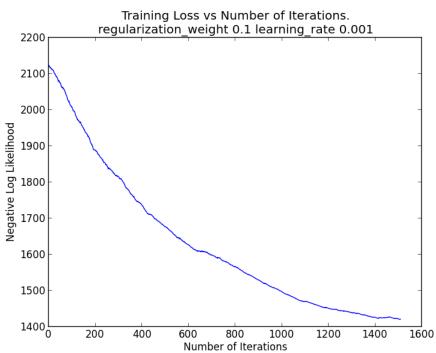








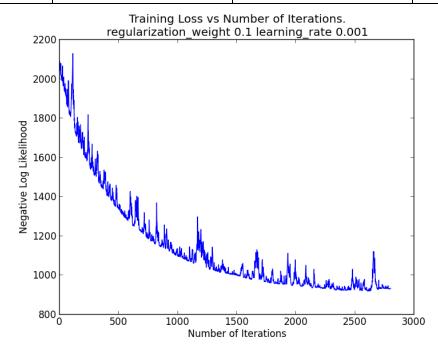


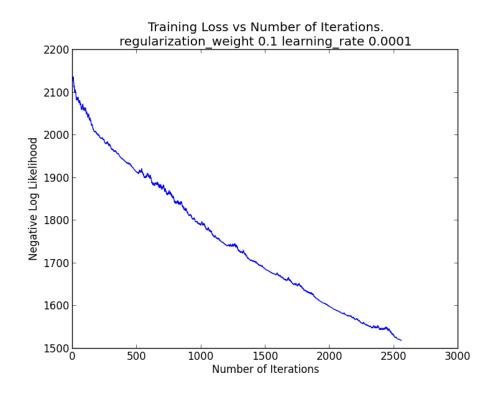


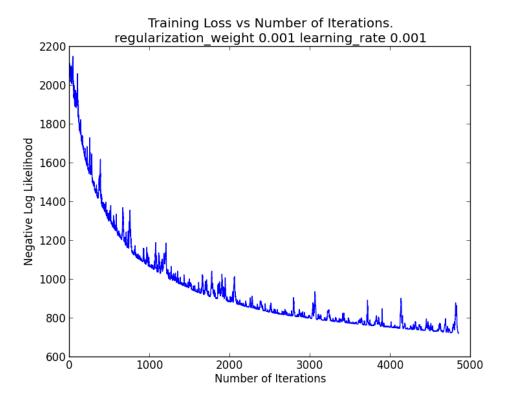
ii) Log transform

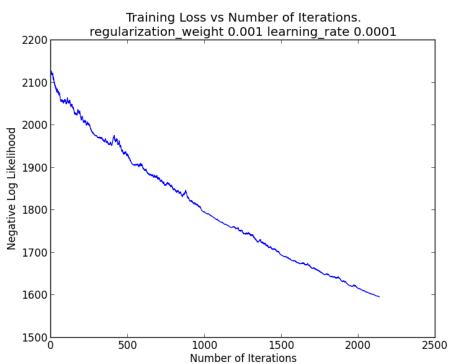
regularization weight	learning rate	training error	test error
0.1	0.001	0.0867862969005	0.0970052083333
0.1	0.0001	0.15823817292	0.15234375
0.001	0.001	0.0792822185971	0.08984375

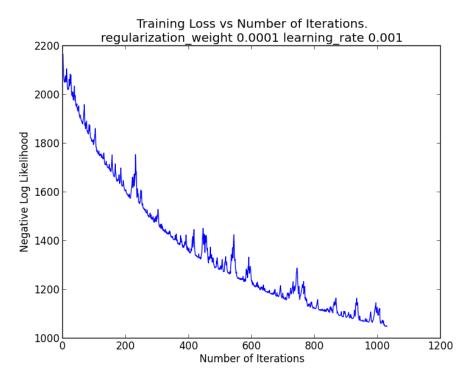
0.001	0.0001	0.187601957586	0.179036458333
0.0001	0.001	0.10277324633	0.110677083333
0.0001	0.0001	0.206525285481	0.192708333333

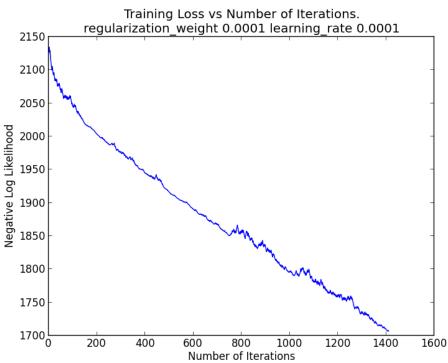








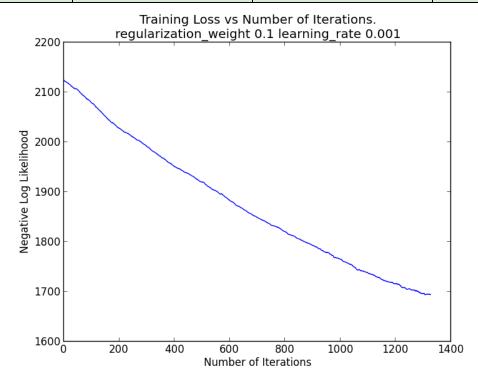


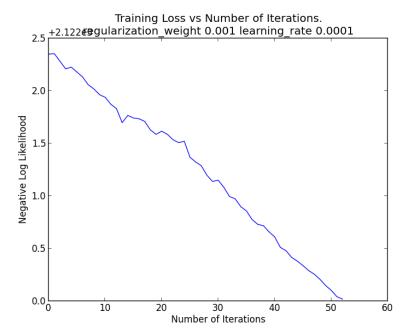


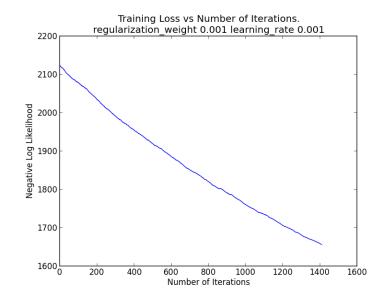
iii) Binarized

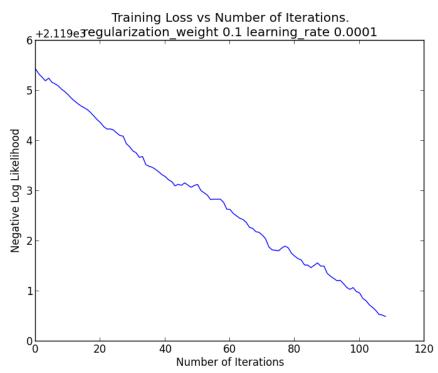
regularization weight	learning rate	training error	test error
0.1	0.001	0.203588907015	0.204427083333
0.1	0.0001	0.119738988581	0.117838541667
0.001	0.001	0.122022838499	0.119140625

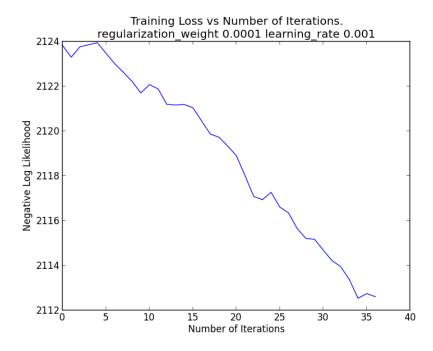
0.001	0.0001	0.160195758564	0.159505208333
0.0001	0.001	0.393148450245	0.384765625
0.0001	0.0001	0.111582381729	0.116536458333

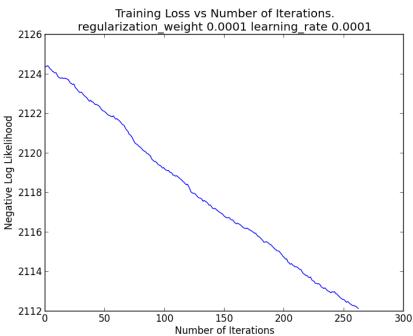












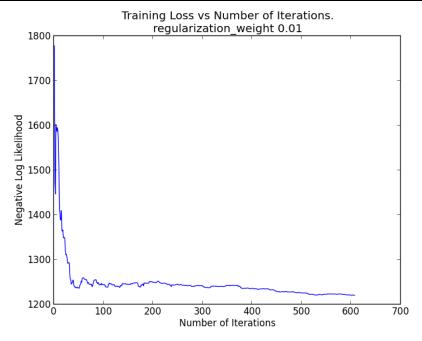
3.

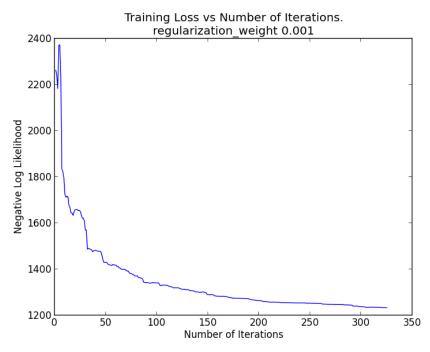
Other strategies, besides setting learning rate to 1/x for xth iteration that might work well:

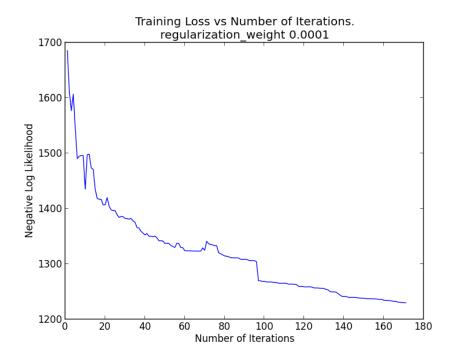
- 1. Update the learning rate alpha = alpha/(1 + t/T) where t is the number of iterations so far and T is a constant that can be tuned. This way the more iterations have passed, the lower the learning rate becomes allowing for faster convergence.
- 2. We could use momentum: we could add a fraction of the previous weight update to the current weight update. In this way, if we keep calculating gradients that point in the same direction, we'll move in that direction faster. If we encounter oscillating gradients, the momentum will help smooth out the variations.

i) Standardized columns

regularization weight	training error	test error
0.01	0.13572593801	0.150390625
0.001	0.140293637847	0.172526041667
0.0001	0.157911908646	0.170572916667

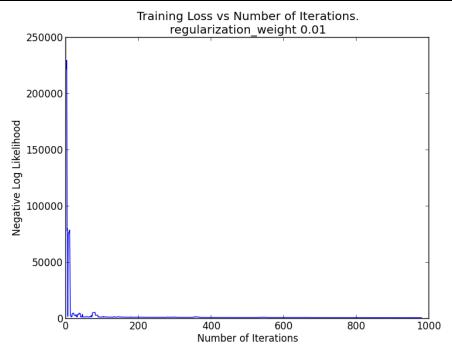


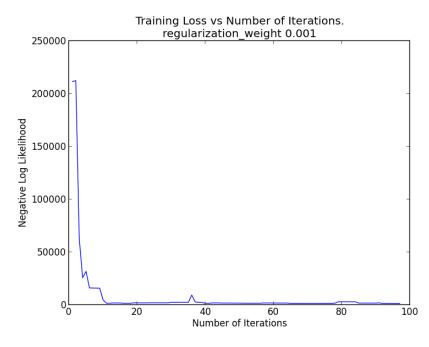


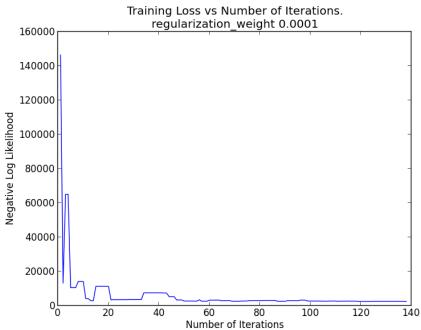


ii) Log transform

regularization weight	training error	test error
0.01	0.142903752039	0.143229166667
0.001	0.122349102773	0.140625
0.0001	0.152365415987	0.16796875

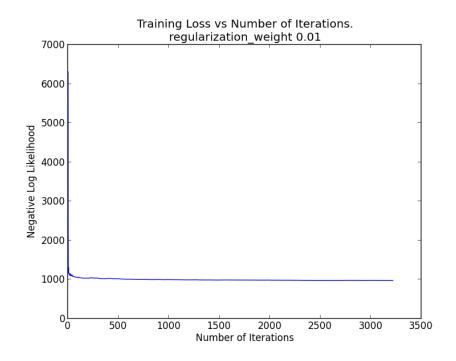


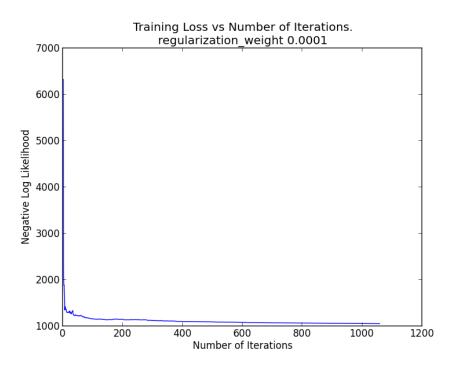


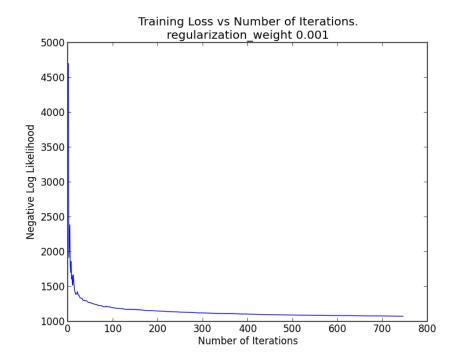


iii) Binarized

regularization weight	training error	test error
0.01	0.11647634584	0.1171875
0.001	0.108972267537	0.110026041667
0.0001	0.123001631321	0.11328125







4.

threshold = 0.0001, learning rate = 0.0001

regularization weight	training error	test error
0.1	0.189722675367	0.192822185971
0.01	0.183686786297	0.174225122349
0.001	0.175611745514	0.182055464927
0.0001	0.214681892333	0.219902120718

