

## 一. 初始模型与参数

- 模型构建包含卷积、池化、Dropout、全连接层，卷积、池化层激活函数采用relu，全连接层激活函数采用softmax\_cross\_entropy
- 模型参数：
  - kernel\_size=[5,5]
  - pool\_size=[2,2]
  - padding='same'
  - strides=[1,1]
  - 初始化方式
  -
- 超参数：
  - 学习率: 0.01
  - 正则化: L2
  - 正则化惩罚因子:
  - 优化器: mini\_batch
  - batch\_size = 100

运行结果:

step 100, entropy loss: 1.849904, l2\_loss: 790.795227, total loss: 1.905260  
0.68  
step 200, entropy loss: 0.709117, l2\_loss: 792.926086, total loss: 0.764621  
0.8  
step 300, entropy loss: 0.452408, l2\_loss: 793.878540, total loss: 0.507980  
0.88  
step 400, entropy loss: 0.330668, l2\_loss: 794.399841, total loss: 0.386276  
0.89  
step 500, entropy loss: 0.281191, l2\_loss: 794.775085, total loss: 0.336826  
0.94  
step 600, entropy loss: 0.374945, l2\_loss: 795.076111, total loss: 0.430600  
0.92  
step 700, entropy loss: 0.231746, l2\_loss: 795.308899, total loss: 0.287418  
0.93  
step 800, entropy loss: 0.239418, l2\_loss: 795.549622, total loss: 0.295107  
0.94  
step 900, entropy loss: 0.106085, l2\_loss: 795.770691, total loss: 0.161789  
0.98  
step 1000, entropy loss: 0.175273, l2\_loss: 795.962891, total loss: 0.230991  
0.95  
0.9454  
step 1100, entropy loss: 0.124797, l2\_loss: 796.131958, total loss: 0.180526  
0.97  
step 1200, entropy loss: 0.134832, l2\_loss: 796.253418, total loss: 0.190570  
0.99  
step 1300, entropy loss: 0.082072, l2\_loss: 796.392334, total loss: 0.137819  
0.99  
step 1400, entropy loss: 0.087212, l2\_loss: 796.563660, total loss: 0.142971  
0.99

step 1500, entropy loss: 0.099127, l2\_loss: 796.668213, total loss: 0.154893  
0.98  
step 1600, entropy loss: 0.228102, l2\_loss: 796.794128, total loss: 0.283878  
0.96  
step 1700, entropy loss: 0.183832, l2\_loss: 796.908325, total loss: 0.239616  
0.95  
step 1800, entropy loss: 0.056207, l2\_loss: 797.020142, total loss: 0.111998  
1.0  
step 1900, entropy loss: 0.089802, l2\_loss: 797.092041, total loss: 0.145598  
0.98  
step 2000, entropy loss: 0.157577, l2\_loss: 797.173096, total loss: 0.213379  
0.98  
0.9672  
step 2100, entropy loss: 0.115989, l2\_loss: 797.248230, total loss: 0.171797  
0.97  
step 2200, entropy loss: 0.071114, l2\_loss: 797.323730, total loss: 0.126927  
0.99  
step 2300, entropy loss: 0.094903, l2\_loss: 797.418457, total loss: 0.150723  
0.99  
step 2400, entropy loss: 0.092348, l2\_loss: 797.484131, total loss: 0.148172  
0.98  
step 2500, entropy loss: 0.155914, l2\_loss: 797.534607, total loss: 0.211742  
0.97  
step 2600, entropy loss: 0.302149, l2\_loss: 797.601440, total loss: 0.357981  
0.95  
step 2700, entropy loss: 0.082496, l2\_loss: 797.666870, total loss: 0.138333  
0.99  
step 2800, entropy loss: 0.067962, l2\_loss: 797.711670, total loss: 0.123802  
0.98  
step 2900, entropy loss: 0.164072, l2\_loss: 797.770447, total loss: 0.219916  
0.95  
step 3000, entropy loss: 0.050256, l2\_loss: 797.783813, total loss: 0.106101  
0.98  
0.9758

## 二. 模型参数调整

### 1. 初始化为0.01并采用动态调整学习率

运行结果:

step 100, entropy loss: 1.850278, l2\_loss: 791.384399, total loss: 1.905675  
0.71  
step 200, entropy loss: 0.713405, l2\_loss: 793.432678, total loss: 0.768946  
0.84  
step 300, entropy loss: 0.319187, l2\_loss: 794.421509, total loss: 0.374796  
0.93  
step 400, entropy loss: 0.510379, l2\_loss: 794.953613, total loss: 0.566026  
0.91

step 500, entropy loss: 0.246463, l2\_loss: 795.365967, total loss: 0.302138  
0.95  
step 600, entropy loss: 0.257614, l2\_loss: 795.654846, total loss: 0.313310  
0.92  
step 700, entropy loss: 0.177166, l2\_loss: 795.949097, total loss: 0.232883  
0.96  
step 800, entropy loss: 0.243096, l2\_loss: 796.152405, total loss: 0.298826  
0.95  
step 900, entropy loss: 0.247563, l2\_loss: 796.391113, total loss: 0.303311  
0.96  
step 1000, entropy loss: 0.095748, l2\_loss: 796.520691, total loss: 0.151504  
0.98  
0.9497  
step 1100, entropy loss: 0.187835, l2\_loss: 796.695984, total loss: 0.243604  
0.95  
step 1200, entropy loss: 0.146277, l2\_loss: 796.859070, total loss: 0.202057  
0.97  
step 1300, entropy loss: 0.306683, l2\_loss: 797.011658, total loss: 0.362474  
0.93  
step 1400, entropy loss: 0.078561, l2\_loss: 797.163513, total loss: 0.134363  
1.0  
step 1500, entropy loss: 0.137630, l2\_loss: 797.291870, total loss: 0.193441  
0.99  
step 1600, entropy loss: 0.266665, l2\_loss: 797.418030, total loss: 0.322484  
0.93  
step 1700, entropy loss: 0.143067, l2\_loss: 797.538391, total loss: 0.198895  
0.97  
step 1800, entropy loss: 0.129760, l2\_loss: 797.625000, total loss: 0.185594  
0.99  
step 1900, entropy loss: 0.135627, l2\_loss: 797.747986, total loss: 0.191469  
0.97  
step 2000, entropy loss: 0.095492, l2\_loss: 797.828247, total loss: 0.151340  
0.98  
0.9662  
step 2100, entropy loss: 0.114843, l2\_loss: 797.928223, total loss: 0.170698  
0.97  
step 2200, entropy loss: 0.039386, l2\_loss: 797.989807, total loss: 0.095246  
1.0  
step 2300, entropy loss: 0.088655, l2\_loss: 798.078796, total loss: 0.144521  
0.98  
step 2400, entropy loss: 0.146738, l2\_loss: 798.149109, total loss: 0.202609  
0.95  
step 2500, entropy loss: 0.087545, l2\_loss: 798.219788, total loss: 0.143420  
0.97  
step 2600, entropy loss: 0.053545, l2\_loss: 798.285889, total loss: 0.109425

0.99  
step 2700, entropy loss: 0.102562, l2\_loss: 798.347107, total loss: 0.158446  
0.99  
step 2800, entropy loss: 0.039657, l2\_loss: 798.390503, total loss: 0.095544  
1.0  
step 2900, entropy loss: 0.045832, l2\_loss: 798.460083, total loss: 0.101724  
0.99  
step 3000, entropy loss: 0.119970, l2\_loss: 798.496216, total loss: 0.175865  
0.98  
0.9772

运行结果发现，单个batch的准确率最高可以到1，每10个batch的平均准确率最后到达了97.72%。  
下面继续针对其他参数进一步调整。

## 2. 正则化惩罚因子调整，根据之前学习内容，计算出最佳因子为 $4e-5$

运行结果：

step 100, entropy loss: 1.788078, l2\_loss: 791.092957, total loss: 1.819722  
0.77  
step 200, entropy loss: 0.550500, l2\_loss: 793.152893, total loss: 0.582226  
0.87  
step 300, entropy loss: 0.302877, l2\_loss: 794.065430, total loss: 0.334640  
0.94  
step 400, entropy loss: 0.480698, l2\_loss: 794.574341, total loss: 0.512481  
0.87  
step 500, entropy loss: 0.444423, l2\_loss: 795.015076, total loss: 0.476223  
0.9  
step 600, entropy loss: 0.273977, l2\_loss: 795.325623, total loss: 0.305790  
0.94  
step 700, entropy loss: 0.288855, l2\_loss: 795.597168, total loss: 0.320679  
0.96  
step 800, entropy loss: 0.238980, l2\_loss: 795.896423, total loss: 0.270816  
0.93  
step 900, entropy loss: 0.277348, l2\_loss: 796.147217, total loss: 0.309194  
0.96  
step 1000, entropy loss: 0.211008, l2\_loss: 796.367249, total loss: 0.242862  
0.95  
0.9309  
step 1100, entropy loss: 0.215767, l2\_loss: 796.585022, total loss: 0.247631  
0.96  
step 1200, entropy loss: 0.109165, l2\_loss: 796.786438, total loss: 0.141036  
0.98  
step 1300, entropy loss: 0.192210, l2\_loss: 796.995483, total loss: 0.224090  
0.96  
step 1400, entropy loss: 0.143750, l2\_loss: 797.176880, total loss: 0.175637  
0.98

step 1500, entropy loss: 0.160150, l2\_loss: 797.335754, total loss: 0.192044  
0.97  
step 1600, entropy loss: 0.180469, l2\_loss: 797.480347, total loss: 0.212368  
0.95  
step 1700, entropy loss: 0.171942, l2\_loss: 797.665771, total loss: 0.203849  
0.97  
step 1800, entropy loss: 0.139911, l2\_loss: 797.822205, total loss: 0.171824  
0.98  
step 1900, entropy loss: 0.174031, l2\_loss: 797.980530, total loss: 0.205951  
0.97  
step 2000, entropy loss: 0.059516, l2\_loss: 798.112305, total loss: 0.091440  
0.99  
0.9665  
step 2100, entropy loss: 0.171978, l2\_loss: 798.283203, total loss: 0.203910  
0.96  
step 2200, entropy loss: 0.156063, l2\_loss: 798.412048, total loss: 0.188000  
0.95  
step 2300, entropy loss: 0.059024, l2\_loss: 798.554565, total loss: 0.090966  
1.0  
step 2400, entropy loss: 0.204444, l2\_loss: 798.682678, total loss: 0.236391  
0.95  
step 2500, entropy loss: 0.055232, l2\_loss: 798.790466, total loss: 0.087184  
1.0  
step 2600, entropy loss: 0.092282, l2\_loss: 798.900391, total loss: 0.124238  
0.99  
step 2700, entropy loss: 0.058093, l2\_loss: 799.029175, total loss: 0.090054  
0.99  
step 2800, entropy loss: 0.141317, l2\_loss: 799.153381, total loss: 0.173283  
0.98  
step 2900, entropy loss: 0.121015, l2\_loss: 799.245972, total loss: 0.152985  
0.96  
step 3000, entropy loss: 0.067800, l2\_loss: 799.354004, total loss: 0.099774  
1.0  
0.9741  
改进不大，改了回来，尝试其他调整。

3. 更换各层参数初始化方式，默认为glorot\_uniform，改为TruncatedNormal初始化  
更换偏执初始值，默认为0，改为TruncatedNormal初始化1

运行结果：

step 100, entropy loss: 0.846743, l2\_loss: 3094.337646, total loss: 0.970516  
0.81  
step 200, entropy loss: 0.436098, l2\_loss: 3095.417969, total loss: 0.559915  
0.88  
step 300, entropy loss: 0.394600, l2\_loss: 3095.850342, total loss: 0.518434  
0.9

step 400, entropy loss: 0.182623, l2\_loss: 3096.116211, total loss: 0.306467  
0.97  
step 500, entropy loss: 0.277338, l2\_loss: 3096.274414, total loss: 0.401189  
0.93  
step 600, entropy loss: 0.293917, l2\_loss: 3096.358398, total loss: 0.417771  
0.93  
step 700, entropy loss: 0.296232, l2\_loss: 3096.433594, total loss: 0.420090  
0.94  
step 800, entropy loss: 0.177566, l2\_loss: 3096.433350, total loss: 0.301424  
0.95  
step 900, entropy loss: 0.125355, l2\_loss: 3096.464844, total loss: 0.249213  
0.97  
step 1000, entropy loss: 0.101101, l2\_loss: 3096.473877, total loss: 0.224960  
0.99  
0.9566  
step 1100, entropy loss: 0.146978, l2\_loss: 3096.460693, total loss: 0.270836  
0.95  
step 1200, entropy loss: 0.122043, l2\_loss: 3096.454834, total loss: 0.245901  
0.97  
step 1300, entropy loss: 0.158982, l2\_loss: 3096.438477, total loss: 0.282839  
0.97  
step 1400, entropy loss: 0.125706, l2\_loss: 3096.381104, total loss: 0.249561  
0.95  
step 1500, entropy loss: 0.127103, l2\_loss: 3096.344971, total loss: 0.250957  
0.96  
step 1600, entropy loss: 0.134086, l2\_loss: 3096.304932, total loss: 0.257938  
0.98  
step 1700, entropy loss: 0.078360, l2\_loss: 3096.268555, total loss: 0.202210  
1.0  
step 1800, entropy loss: 0.080246, l2\_loss: 3096.218750, total loss: 0.204094  
0.98  
step 1900, entropy loss: 0.081333, l2\_loss: 3096.165039, total loss: 0.205179  
0.99  
step 2000, entropy loss: 0.099289, l2\_loss: 3096.099854, total loss: 0.223133  
0.98  
0.9707  
step 2100, entropy loss: 0.042365, l2\_loss: 3096.008057, total loss: 0.166205  
1.0  
step 2200, entropy loss: 0.045788, l2\_loss: 3095.942871, total loss: 0.169625  
0.99  
step 2300, entropy loss: 0.046375, l2\_loss: 3095.884521, total loss: 0.170211  
1.0  
step 2400, entropy loss: 0.050057, l2\_loss: 3095.775879, total loss: 0.173888  
1.0  
step 2500, entropy loss: 0.213412, l2\_loss: 3095.652832, total loss: 0.337238

0.98  
step 2600, entropy loss: 0.044951, l2\_loss: 3095.570068, total loss: 0.168774  
1.0  
step 2700, entropy loss: 0.113245, l2\_loss: 3095.483398, total loss: 0.237065  
0.96  
step 2800, entropy loss: 0.082331, l2\_loss: 3095.388916, total loss: 0.206146  
0.98  
step 2900, entropy loss: 0.053906, l2\_loss: 3095.284180, total loss: 0.177717  
0.98  
step 3000, entropy loss: 0.059039, l2\_loss: 3095.184814, total loss: 0.182846  
1.0  
0.9778

效果有所提升，继续调整。

4. 减小卷积核高度和宽度，调整为 [4, 4]

运行结果：

step 100, entropy loss: 1.750786, l2\_loss: 3074.357422, total loss: 1.965991  
0.73  
step 200, entropy loss: 0.616157, l2\_loss: 3076.067139, total loss: 0.831481  
0.87  
step 300, entropy loss: 0.385049, l2\_loss: 3076.653809, total loss: 0.600415  
0.94  
step 400, entropy loss: 0.300062, l2\_loss: 3076.840820, total loss: 0.515441  
0.95  
step 500, entropy loss: 0.312332, l2\_loss: 3076.846680, total loss: 0.527711  
0.93  
step 600, entropy loss: 0.333244, l2\_loss: 3076.790039, total loss: 0.548619  
0.93  
step 700, entropy loss: 0.217016, l2\_loss: 3076.673340, total loss: 0.432383  
0.95  
step 800, entropy loss: 0.386022, l2\_loss: 3076.558105, total loss: 0.601381  
0.93  
step 900, entropy loss: 0.056532, l2\_loss: 3076.386963, total loss: 0.271879  
1.0  
step 1000, entropy loss: 0.330344, l2\_loss: 3076.225098, total loss: 0.545679  
0.92  
0.9535  
step 1100, entropy loss: 0.180340, l2\_loss: 3076.010742, total loss: 0.395661  
0.94  
step 1200, entropy loss: 0.217335, l2\_loss: 3075.837402, total loss: 0.432643  
0.95  
step 1300, entropy loss: 0.134846, l2\_loss: 3075.642822, total loss: 0.350141  
0.97  
step 1400, entropy loss: 0.194546, l2\_loss: 3075.429688, total loss: 0.409826  
0.95

step 1500, entropy loss: 0.158567, l2\_loss: 3075.213379, total loss: 0.373832  
0.98  
step 1600, entropy loss: 0.136977, l2\_loss: 3074.950195, total loss: 0.352224  
0.98  
step 1700, entropy loss: 0.161638, l2\_loss: 3074.709961, total loss: 0.376867  
0.98  
step 1800, entropy loss: 0.088245, l2\_loss: 3074.474121, total loss: 0.303458  
1.0  
step 1900, entropy loss: 0.124861, l2\_loss: 3074.239258, total loss: 0.340058  
0.97  
step 2000, entropy loss: 0.197836, l2\_loss: 3073.986084, total loss: 0.413015  
0.95  
0.9667  
step 2100, entropy loss: 0.161862, l2\_loss: 3073.736084, total loss: 0.377023  
0.97  
step 2200, entropy loss: 0.124641, l2\_loss: 3073.447510, total loss: 0.339782  
0.97  
step 2300, entropy loss: 0.087380, l2\_loss: 3073.209229, total loss: 0.302504  
0.99  
step 2400, entropy loss: 0.167305, l2\_loss: 3072.937988, total loss: 0.382410  
0.96  
step 2500, entropy loss: 0.093710, l2\_loss: 3072.674316, total loss: 0.308797  
0.97  
step 2600, entropy loss: 0.111491, l2\_loss: 3072.392090, total loss: 0.326558  
0.98  
step 2700, entropy loss: 0.144210, l2\_loss: 3072.102783, total loss: 0.359257  
0.97  
step 2800, entropy loss: 0.065900, l2\_loss: 3071.821289, total loss: 0.280928  
0.99  
step 2900, entropy loss: 0.076941, l2\_loss: 3071.546875, total loss: 0.291949  
0.99  
step 3000, entropy loss: 0.079311, l2\_loss: 3071.277344, total loss: 0.294301  
0.98  
0.9767

5. 结果差别不大，尝试调整卷积核和神经元数量，增加一倍

运行结果：

step 100, entropy loss: 0.523903, l2\_loss: 12288.213867, total loss: 1.384079  
0.91  
step 200, entropy loss: 0.596091, l2\_loss: 12287.519531, total loss: 1.456218  
0.83  
step 300, entropy loss: 0.347491, l2\_loss: 12286.343750, total loss: 1.207535  
0.95  
step 400, entropy loss: 0.191921, l2\_loss: 12285.023438, total loss: 1.051872  
0.95  
step 500, entropy loss: 0.133618, l2\_loss: 12283.667969, total loss: 0.993475



0.98  
step 600, entropy loss: 0.177202, l2\_loss: 12282.270508, total loss: 1.036961  
0.95  
step 700, entropy loss: 0.113485, l2\_loss: 12280.831055, total loss: 0.973143  
0.99  
step 800, entropy loss: 0.153801, l2\_loss: 12279.405273, total loss: 1.013359  
0.95  
step 900, entropy loss: 0.052813, l2\_loss: 12277.944336, total loss: 0.912269  
1.0  
step 1000, entropy loss: 0.146940, l2\_loss: 12276.464844, total loss: 1.006293  
0.97  
0.9586  
step 1100, entropy loss: 0.151878, l2\_loss: 12274.969727, total loss: 1.011125  
0.98  
step 1200, entropy loss: 0.041367, l2\_loss: 12273.504883, total loss: 0.900512  
1.0  
step 1300, entropy loss: 0.130705, l2\_loss: 12272.010742, total loss: 0.989746  
0.98  
step 1400, entropy loss: 0.145203, l2\_loss: 12270.517578, total loss: 1.004139  
0.98  
step 1500, entropy loss: 0.153846, l2\_loss: 12268.981445, total loss: 1.012675  
0.98  
step 1600, entropy loss: 0.085029, l2\_loss: 12267.492188, total loss: 0.943754  
0.99  
step 1700, entropy loss: 0.104557, l2\_loss: 12265.948242, total loss: 0.963173  
1.0  
step 1800, entropy loss: 0.171715, l2\_loss: 12264.438477, total loss: 1.030226  
0.96  
step 1900, entropy loss: 0.075895, l2\_loss: 12262.889648, total loss: 0.934298  
1.0  
step 2000, entropy loss: 0.098639, l2\_loss: 12261.345703, total loss: 0.956933  
1.0  
0.9775  
step 2100, entropy loss: 0.099836, l2\_loss: 12259.805664, total loss: 0.958022  
0.99  
step 2200, entropy loss: 0.110878, l2\_loss: 12258.273438, total loss: 0.968957  
0.97  
step 2300, entropy loss: 0.085663, l2\_loss: 12256.696289, total loss: 0.943632  
0.98  
step 2400, entropy loss: 0.086304, l2\_loss: 12255.136719, total loss: 0.944164  
0.99  
step 2500, entropy loss: 0.059527, l2\_loss: 12253.578125, total loss: 0.917278  
1.0  
step 2600, entropy loss: 0.028112, l2\_loss: 12252.019531, total loss: 0.885753  
1.0

step 2700, entropy loss: 0.106691, l2\_loss: 12250.431641, total loss: 0.964221  
0.99

step 2800, entropy loss: 0.051075, l2\_loss: 12248.843750, total loss: 0.908494  
1.0

step 2900, entropy loss: 0.081621, l2\_loss: 12247.258789, total loss: 0.938929  
0.99

step 3000, entropy loss: 0.028166, l2\_loss: 12245.669922, total loss: 0.885363  
1.0  
0.9812