

1

⑥

a) $N(x, c) = \sum_{n=1}^N \delta(x, x_n) \cdot \delta(c, c_n)$
 Normalizing with dividing with N : $N(x, c) = \frac{1}{N} \sum_{n=1}^N \delta(x, x_n) \cdot \delta(c, c_n)$

b) $pr(x) = \frac{1}{N} \sum_{n=1}^N \delta(x, x_n)$
 $pr(c) = \frac{1}{N} \sum_{n=1}^N \delta(c, c_n)$

c) $E = \frac{1}{N} \sum_{n=1}^N \left(\log q(x_n, c_n) + \sum_{c \neq c_n} \log [1 - q(x_n, c)] \right)$
 $= \frac{1}{N} \sum_{n=1}^N \sum_{c=1}^C \log [1 - \delta(c, c_n) - q(x_n, c)]$
 $= \frac{1}{N} \sum_{n=1}^N \sum_{c=1}^C$

2

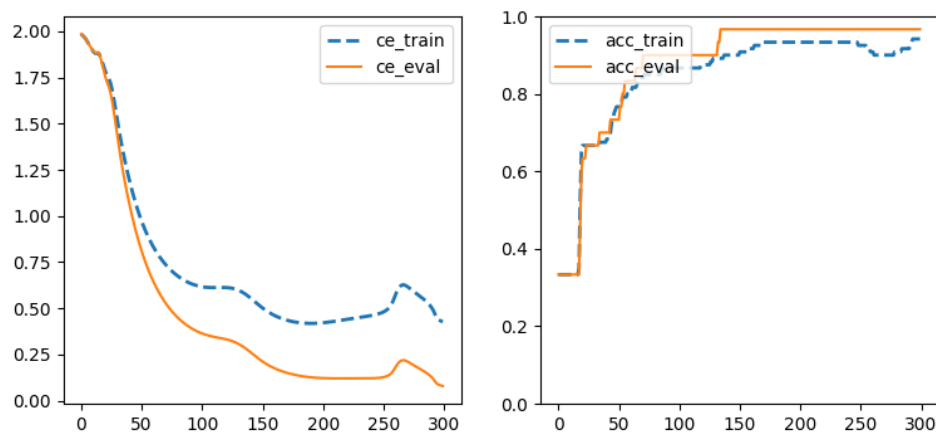
a-d)

e)

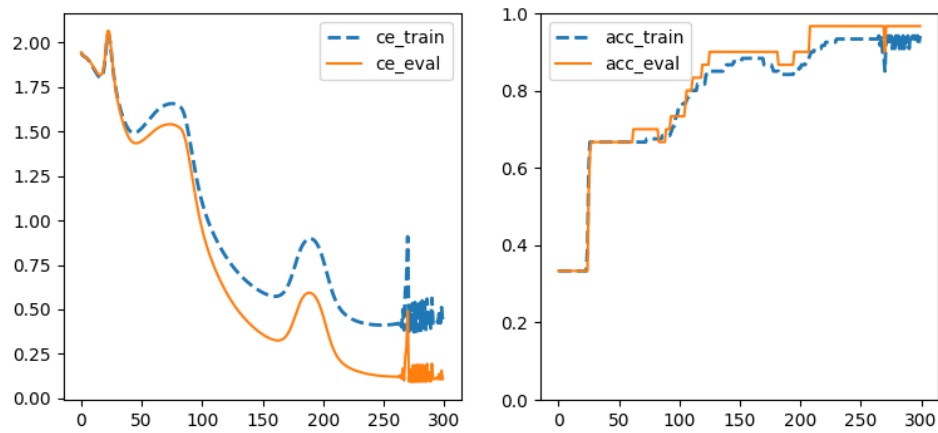
i. Works

ii.

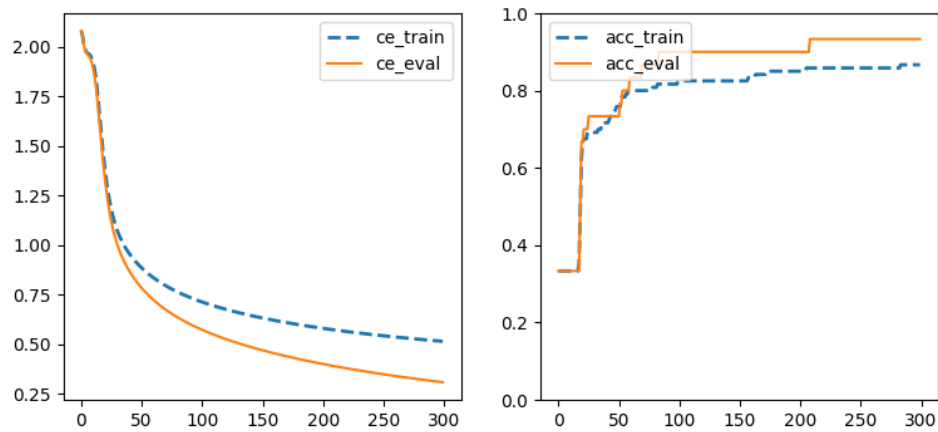
training:online layer:354 lr:0,1 epochs:300.png



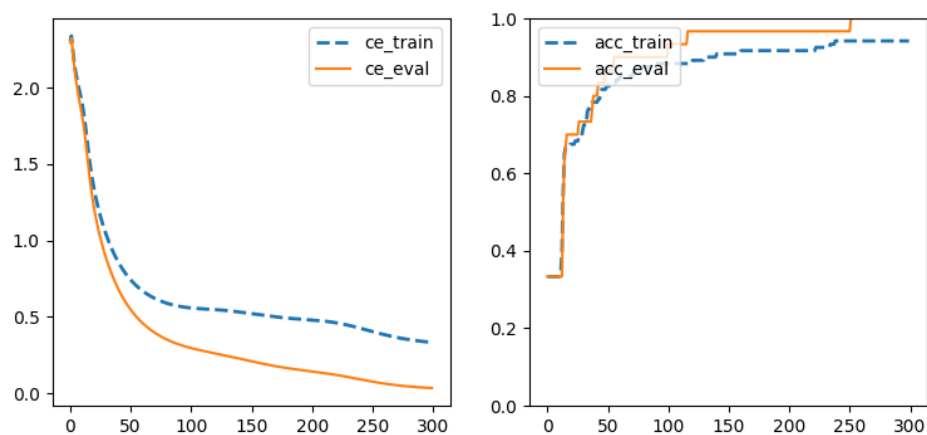
training:online layer:364 lr:0,1 epochs:300.png



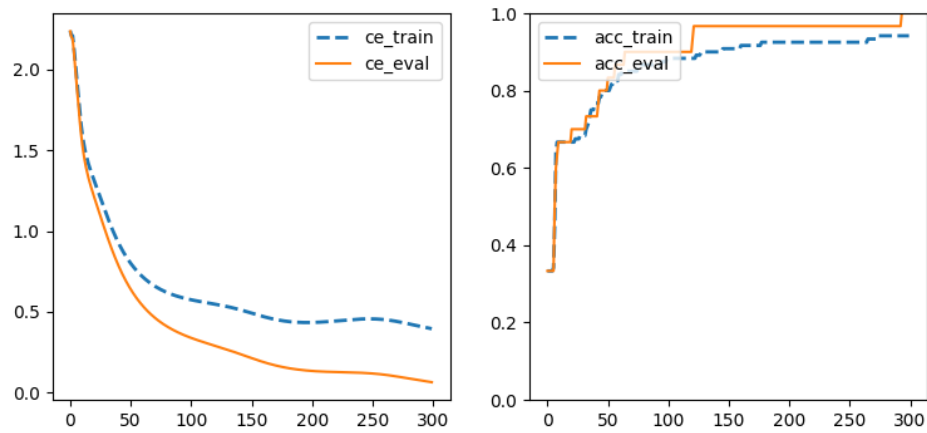
with random weights we sometimes do not learn. This makes the learning process inconsistent (maybe a reason: we are stuck in a local minimum).
training:online layer:354 lr:0,1 epochs:300.png



0 works ok.
training:online layer:354 lr:0,1 epochs:300 test:2.png



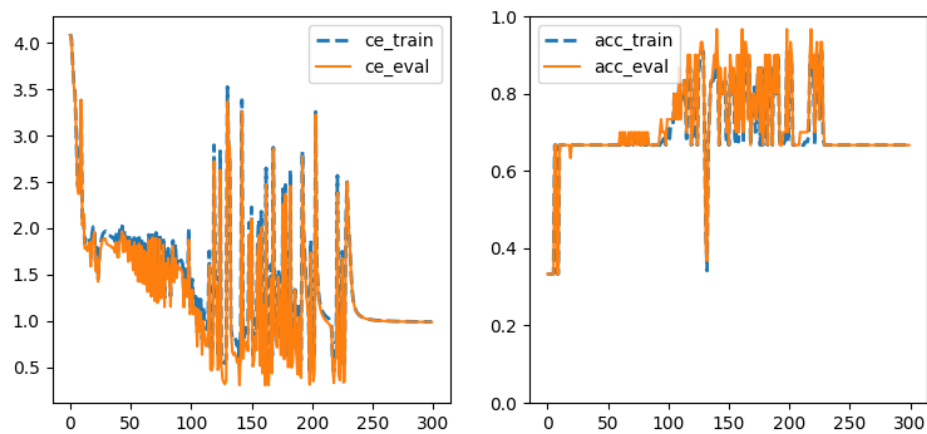
training:online layer:354 lr:0,1 epochs:300 test:1.png



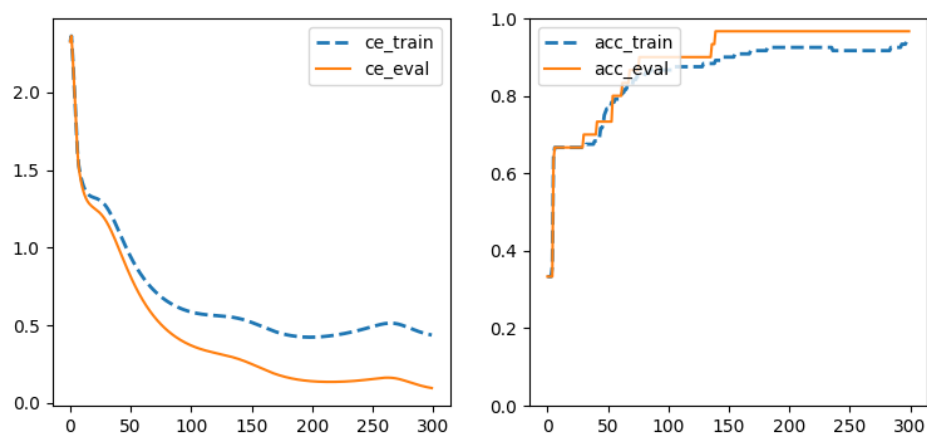
Best results we do have with normalized weights. we get an evaluation accuracy of up to 100% and the network always learns and is consistent. For detailed insight see the graphs

iii.Changing Learning Rate:

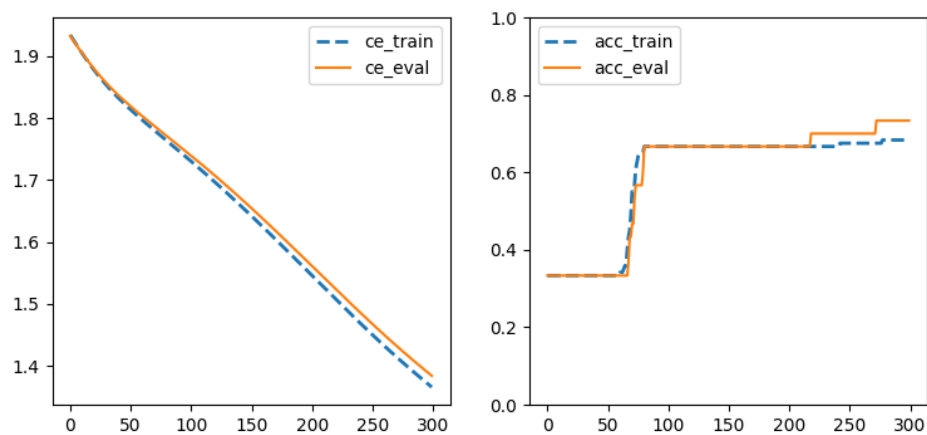
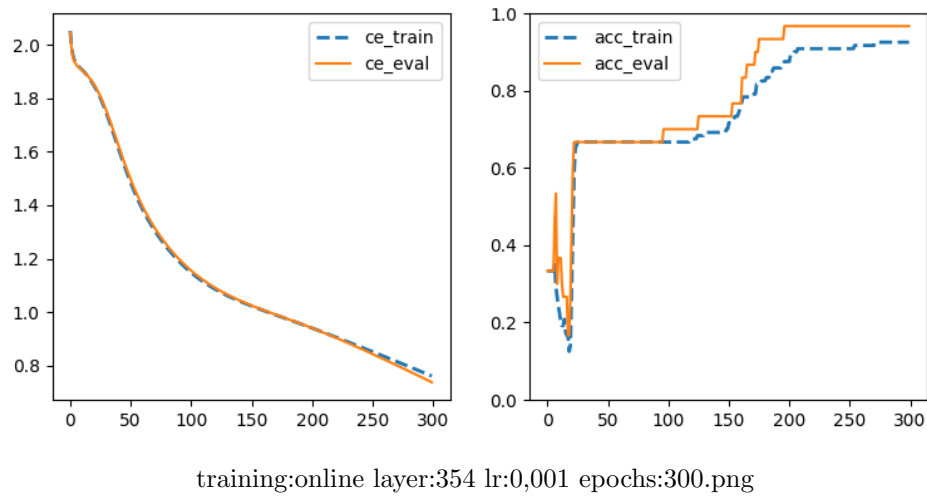
training:online layer:354 lr:0,4 epochs:300.png



training:online layer:354 lr:0,1 epochs:300.png

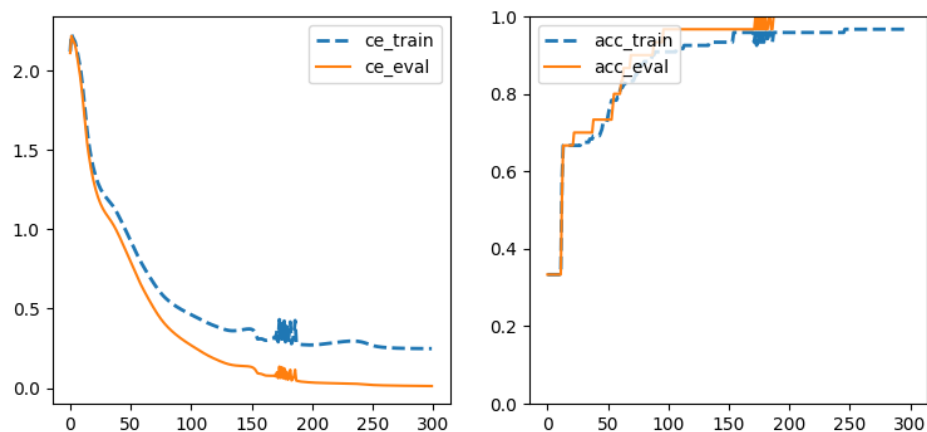


training:online layer:354 lr:0,01 epochs:300.png

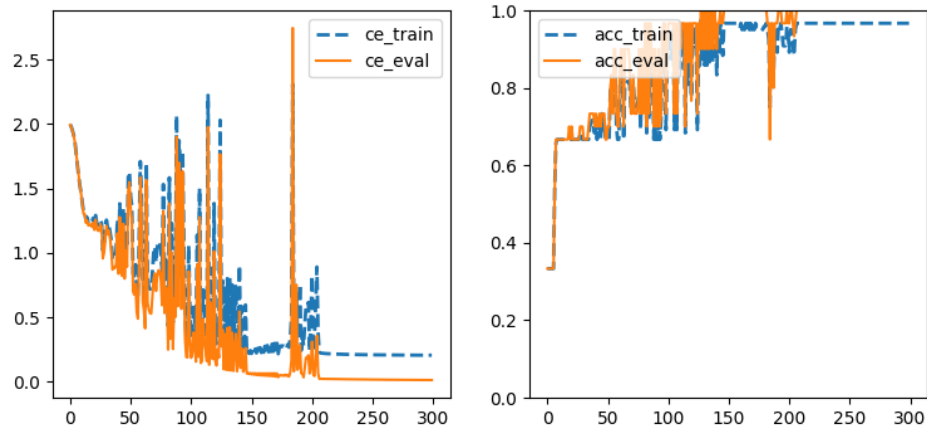


Lower learning rate makes learning curve smoother but we do not reach 100% success rate. With higher learning rate we faster reach the maximum of classification which is not that good (65%). Further the maximum is not stable but flips around a bit.

Changing Mini Batch Size:
training:batch4 layer:354 lr:0.1 epochs:300.png



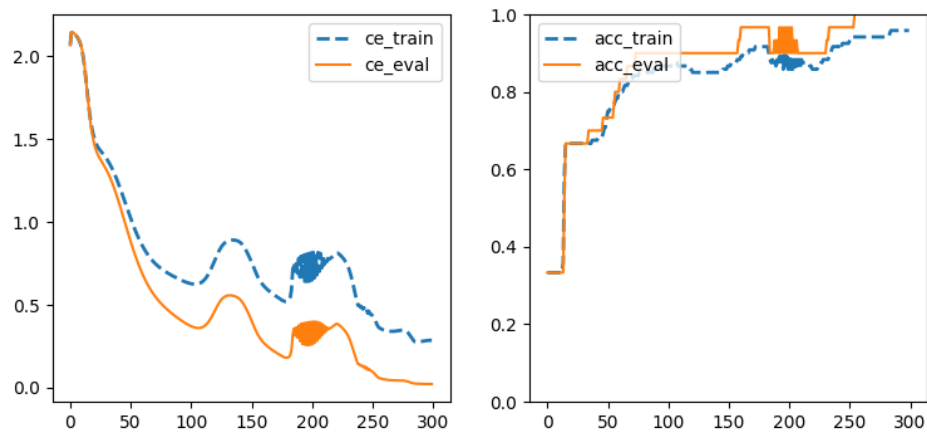
training:batch8 layer:354 lr:0,1 epochs:300.png



Higher batch size (8) improves learning speed. But curve is not as smooth as with only 4 as batch size.

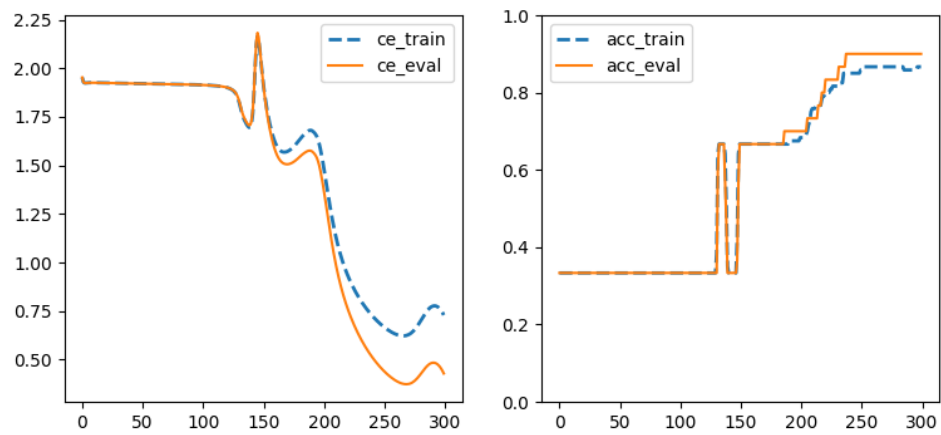
Changing Layer Size:

training:online layer:3554 lr:0,1 epochs:300.png



Second hidden layer makes two peaks in the learning curve.

training:online layer:384 lr:0,1 epochs:300.png



Hidden layer with 8 nodes, classification has only 90% and is slower.