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# Home Assignment 2 - FFR135

## Artificial Neural Networks

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## Loading the dataset from MNIST

```
clc;
clear;
clear all;

[xTrain, tTrain, xValid, tValid, xTest, tTest] = LoadMNIST(3);

Preparing MNIST data...
MNIST data preparation complete.
```

## Convolutional neural network 1

```
% Options to train the network using stochastic gradient descent

options = trainingOptions('sgdm', ...
    'Momentum', 0.9, ...
    'MaxEpochs', 60, ...
    'InitialLearnRate', 0.001, ...
    'MiniBatchSize', 8192, ...
    'Shuffle', 'every-epoch', ...
    'ValidationData', {xValid, tValid}, ...
    'ValidationFrequency', 30, ...
    'ValidationPatience', 5, ...
    'Plots', 'training-progress');

% Layout of the layers
layers = [
    imageInputLayer([28 28 1])

    convolution2dLayer(5, 20, 'stride', 1, 'Padding', 1, 'WeightsInitializer', 'narrow-normal')

    reluLayer
```

```

maxPooling2dLayer(2,'Stride',2)

fullyConnectedLayer(100,'WeightsInitializer','narrow-normal')

reluLayer

fullyConnectedLayer(10,'WeightsInitializer','narrow-normal')
softmaxLayer

classificationLayer];

% Training the network
network_1 = trainNetwork(xTrain, tTrain, layers, options);

% Computing the scores
[prediction_train_1, scores_train_1] = classify(network_1, xTrain);
[prediction_valid_1, scores_valid_1] = classify(network_1, xValid);
[prediction_test_1, scores_test_1] = classify(network_1, xTest);

% Classification errors obtained on the training, validation, and
test sets sets
Classification_train_1 = classification_error(tTrain,
prediction_train_1);
Classification_valid_1 = classification_error(tValid,
prediction_valid_1);
Classification_test_1 = classification_error(tTest,
prediction_test_1);

Training on single CPU.
Initializing input data normalization.
/
=====
/ Epoch / Iteration / Time Elapsed / Mini-batch / Validation
/ Mini-batch / Validation / Base Learning /
/ / (hh:mm:ss) / Accuracy / Accuracy
/ Loss / Loss / Rate /
/
=====
/ 1 / 1 / 00:00:06 / 7.68% / 8.57%
/ 2.3240 / 2.3136 / 0.0010 /
/ 5 / 30 / 00:01:30 / 87.79% / 88.05%
/ 0.4298 / 0.4352 / 0.0010 /
/ 9 / 50 / 00:02:20 / 90.94% /
/ 0.3035 / / 0.0010 /
/ 10 / 60 / 00:02:52 / 92.59% / 92.30%
/ 0.2588 / 0.2639 / 0.0010 /
/ 15 / 90 / 00:04:22 / 94.02% / 94.19%
/ 0.2020 / 0.1978 / 0.0010 /
/ 17 / 100 / 00:04:48 / 94.95% /
/ 0.1749 / / 0.0010 /
/ 20 / 120 / 00:05:40 / 95.72% / 95.49%
/ 0.1478 / 0.1615 / 0.0010 /
/ 25 / 150 / 00:07:03 / 96.81% / 96.21%
/ 0.1219 / 0.1372 / 0.0010 /

```

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/	30	/	180	/	00:08:32	/	96.90%	/	96.79%
/	0.1095	/	0.1175	/	0.0010	/			
/	34	/	200	/	00:09:25	/	97.23%	/	
/	0.0952	/		/	0.0010	/			
/	35	/	210	/	00:09:54	/	97.29%	/	97.17%
/	0.0942	/	0.1045	/	0.0010	/			
/	40	/	240	/	00:11:16	/	97.45%	/	97.46%
/	0.0845	/	0.0947	/	0.0010	/			
/	42	/	250	/	00:11:45	/	97.75%	/	
/	0.0809	/		/	0.0010	/			
/	45	/	270	/	00:12:44	/	98.11%	/	97.54%
/	0.0700	/	0.0882	/	0.0010	/			
/	50	/	300	/	00:14:09	/	97.90%	/	97.63%
/	0.0692	/	0.0827	/	0.0010	/			
/	55	/	330	/	00:15:36	/	98.35%	/	97.80%
/	0.0644	/	0.0774	/	0.0010	/			
/	59	/	350	/	00:16:35	/	98.17%	/	
/	0.0588	/		/	0.0010	/			
/	60	/	360	/	00:17:05	/	98.24%	/	97.78%
/	0.0583	/	0.0755	/	0.0010	/			

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## Convolutional neural network 1

% Options to train the network using stochastic gradient descent

```
options = trainingOptions('sgdm', ...
    'Momentum', 0.9, ...
    'InitialLearnRate', 0.01, ...
    'MaxEpochs', 30, ...
    'MiniBatchSize', 8192, ...
    'Shuffle', 'every-epoch', ...
    'ValidationData', {xValid, tValid}, ...
    'ValidationFrequency', 30, ...
    'ValidationPatience', 5, ...
    'Plots', 'training-progress');
```

% Layout of the layers

```
layers = [
    imageInputLayer([28 28 1])

    convolution2dLayer(3, 20, 'stride', 1, 'Padding', 1, 'WeightsInitializer', 'narrow-normal')
    batchNormalizationLayer
    reluLayer

    maxPooling2dLayer(2, 'Stride', 2)

    convolution2dLayer(3, 30, 'stride', 1, 'Padding', 1, 'WeightsInitializer', 'narrow-normal')
```

```

batchNormalizationLayer
reluLayer

maxPooling2dLayer(2,'Stride',2)

convolution2dLayer(3,50,'stride',1,'Padding',1,'WeightsInitializer','narrow-
normal')
batchNormalizationLayer
reluLayer

fullyConnectedLayer(10,'WeightsInitializer','narrow-normal')
softmaxLayer

classificationLayer];

% Training the network
network_2 = trainNetwork(xTrain, tTrain, layers, options);

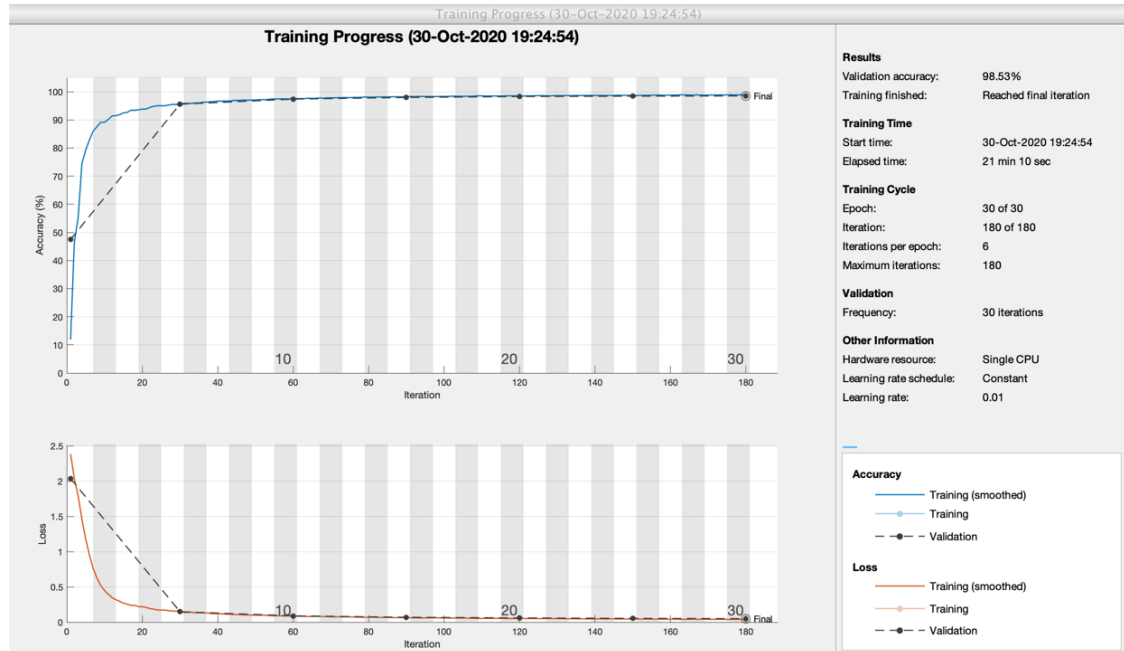
% Computing the scores
[prediction_train_2, scores_train_2] = classify(network_2, xTrain);
[prediction_valid_2, scores_valid_2] = classify(network_2, xValid);
[prediction_test_2, scores_test_2] = classify(network_2, xTest);

% Classification errors obtained on the training, validation, and
test sets sets
Classification_train_2 = classification_error(tTrain,
prediction_train_2);
Classification_valid_2 = classification_error(tValid,
prediction_valid_2);
Classification_test_2 = classification_error(tTest,
prediction_test_2);

Training on single CPU.
Initializing input data normalization.
/
=====
/ Epoch / Iteration / Time Elapsed / Mini-batch / Validation
/ Mini-batch / Validation / Base Learning /
/ / (hh:mm:ss) / Accuracy / Accuracy
/ Loss / Loss / Rate /
/
=====
/ 1 / 1 / 00:00:09 / 11.89% / 47.48%
/ 2.3843 / 2.0371 / 0.0100 /
/ 5 / 30 / 00:03:25 / 95.58% / 95.58%
/ 0.1523 / 0.1499 / 0.0100 /
/ 9 / 50 / 00:05:30 / 97.07% /
/ 0.1048 / / 0.0100 /
/ 10 / 60 / 00:06:33 / 97.62% / 97.39%
/ 0.0837 / 0.0914 / 0.0100 /
/ 15 / 90 / 00:11:29 / 98.40% / 97.99%
/ 0.0655 / 0.0709 / 0.0100 /
=====

```

/	17	/	100	/	00:12:41	/	98.29%	/
/	0.0608	/		/	0.0100	/		
/	20	/	120	/	00:14:53	/	98.51%	98.32%
/	0.0588	/	0.0617	/	0.0100	/		
/	25	/	150	/	00:17:54	/	98.61%	98.45%
/	0.0474	/	0.0554	/	0.0100	/		
/	30	/	180	/	00:21:07	/	98.95%	98.55%
/	0.0413	/	0.0514	/	0.0100	/		



## Saving the network

```
save network_1;
```

```
save network_2;
```

## Classification error function

```
function C = classification_error(target, outputs)
length_valset = size(target,1);
C = 1 / length_valset * sum(outputs ~= target);
end
```

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