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

```
warning off images:imshow:magnificationMustBeFitForDockedFigure
perm = randperm(numel(labelsTrain), 25);
subset = imgDataTrain(:,:,1,perm);
montage(subset)
```



```
1.1
    2
                                     20 5\mathrm{x}5 convolutions with stride [1 \, 1] and padding [0 \, 0 \, 0]
             Convolution
        1.1
             ReLU
                                     ReLU
        . .
                                     2 \times 2 max pooling with stride [2 2] and padding [0 0 0 0]
    4
             Max Pooling
        1.1
    5
             Fully Connected
                                     10 fully connected layer
        . .
             Softmax
                                     softmax
        1.1
             Classification Output
                                     crossentropyex
Training on single CPU.
Initializing image normalization.
           Iteration | Time Elapsed | Mini-batch | Mini-batch | Base Learning
                           (hh:mm:ss)
                                           Accuracy |
                                                           Loss
       1 |
                               00:00:02 |
                                                 7.09% |
                                                               4.0873 |
                                                                                 0.0100 |
       8 |
                    50 I
                               00:01:48 |
                                                10.30% |
                                                                 NaN
                                                                                 0.0100
      15 I
                   100 |
                               00:03:34 |
                                                10.11% |
                                                                  NaN |
                                                                                 0.0100
      22 |
                   150 |
                               00:05:20 |
                                                 9.88% |
                                                                  NaN |
                                                                                 0.0100
       29 I
                   200 |
                               00:07:06 |
                                                 9.18% |
                                                                  NaN |
                                                                                 0.0100
       30 |
                   210 |
                               00:07:27 |
                                                 9.63% |
                                                                  NaN |
                                                                                 0.0100
```

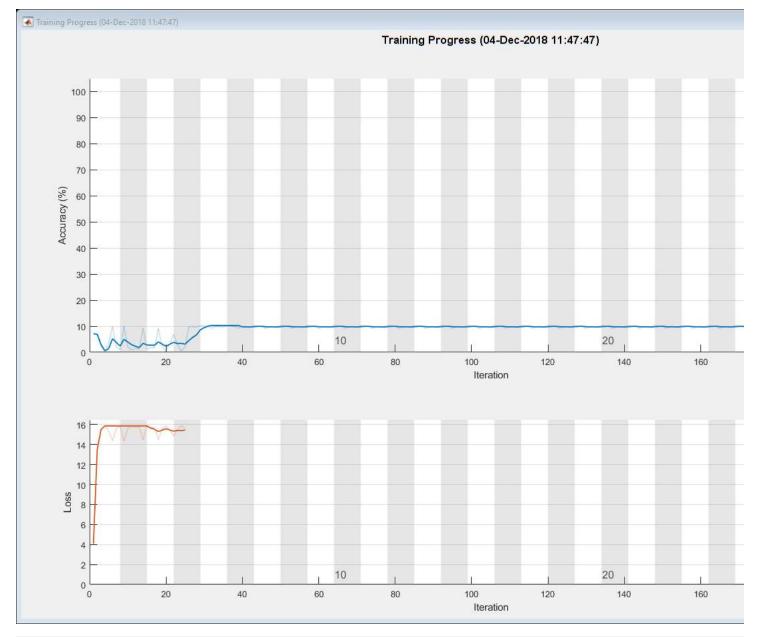
 $28 \times 28 \times 1$ images with 'zerocenter' normalization

testAccuracy =

0

1

Image Input



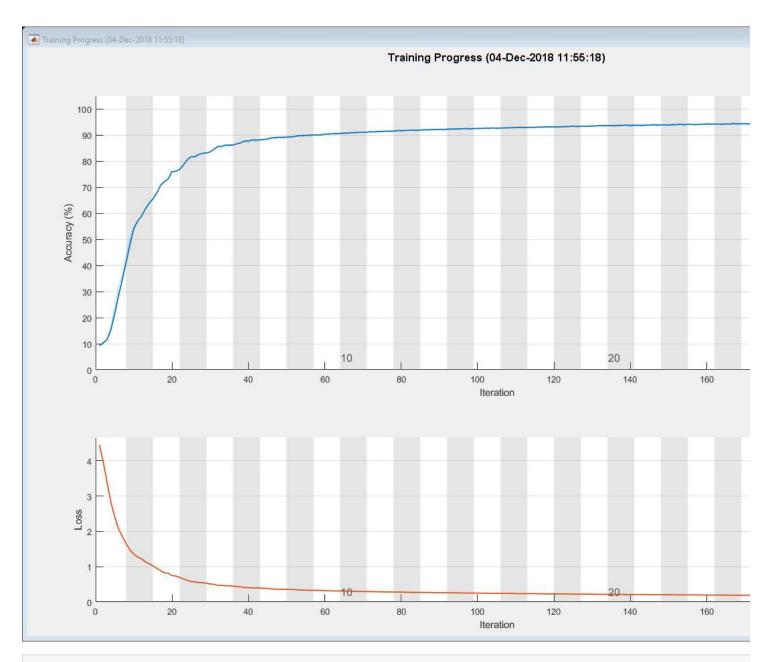
```
options = trainingOptions( 'sgdm',...
    'MiniBatchSize', miniBatchSize,...
    'Plots', 'training-progress',...
    'InitialLearnRate', 0.0001);
net = trainNetwork(imgDataTrain, labelsTrain, layers, options);
```

Training on single CPU.
Initializing image normalization.

	Epoch		Iteration		Time Elapsed		Mini-batch	1	Mini-batch	1	Base Learning
-1				1	(hh:mm:ss)	1	Accuracy	1	Loss	1	Rate
- 1											
- 1	1		1	1	00:00:02	1	9.28%	\perp	4.4432	1	1.0000e-04
- 1	8		50	1	00:01:54	1	89.27%	1	0.3591	1	1.0000e-04
-	15	1	100	1	00:03:49	1	92.65%	1	0.2571	1	1.0000e-04
-1	22	1	150	1	00:05:42	1	93.71%	1	0.2079	1	1.0000e-04
-	29	1	200	1	00:07:35	1	95.07%	1	0.1727	1	1.0000e-04
-	30	ı	210	1	00:07:58	1	94.54%	1	0.1777	1	1.0000e-04
- 1											

testAccuracy =

0.9523



```
layers = [
     ers = [
imageInputLayer([28 28 1])
convolution2dLayer(3,16,'Padding',1)
batchNormalizationLayer
     reluLayer
     maxPooling2dLayer(2,'Stride',2)
```

```
convolution2dLayer(3,32,'Padding',1)
batchNormalizationLayer
reluLayer
maxPooling2dLayer(2,'Stride',2)
convolution2dLayer(3,64,'Padding',1)
batchNormalizationLayer
reluLayer
fullyConnectedLayer(10)
softmaxLayer
classificationLayer];
options = trainingOptions('sgdm',...
'MiniBatchSize', miniBatchSize,...
'Plots', 'training-progress');
net = trainNetwork(imgDataTrain, labelsTrain, layers, options);

predLabelsTest = net.classify(imgDataTest) / numel(labelsTest)
```

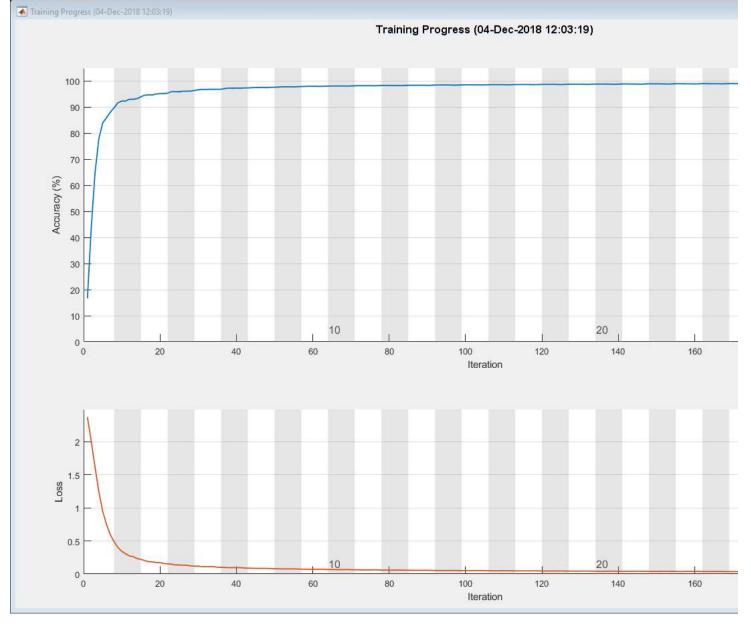
Training on single CPU.

Initializing image normalization.

-1	Epoch	1	Iteration	1	Time Elapsed		Mini-batch	1	Mini-batch		Base Learning	
		1		1	(hh:mm:ss)	1	Accuracy	1	Loss	1	Rate	
- 1:										==		
-1	1	1	1	1	00:00:05	1	16.67%	1	2.3717		0.0100	
	8	1	50	1	00:04:22	-	97.68%	1	0.0760		0.0100	
-1	15	1	100		00:08:43		98.62%	1	0.0545		0.0100	
-	22	1	150	1	00:13:04	1	98.83%	1	0.0389		0.0100	
1	29		200	1	00:17:25	1	99.11%	1	0.0364		0.0100	
-1	30	1	210	1	00:18:17		99.29%	1	0.0301		0.0100	
1:										==		

testAccuracy =

0.9888



```
[x,y]=meshgrid(unique(labelsTest), unique(labelsTest));
Pred=repmat(reshape(predLabelsTest,1,1,[]), numel(unique(labelsTest)), numel(unique(labelsTest)));
Actual=repmat(reshape(labelsTest,1,1,[]), numel(unique(labelsTest)), numel(unique(labelsTest)));
Confusion_Matrix=sum((((Actual==y)+(Pred==x))==2),3)
```

Confusion_Matrix =

```
Columns 1 through 6
```

0	0	0	1	0	973
0	0	1	1	1133	0
0	2	1	1021	3	1
3	0	999	3	0	0
0	976	0	0	0	0
885	0	3	0	0	2
2	1	0	2	2	8
0	0	1	8	4	0
1	1	0	2	0	3
4	6	2	0	1	2

Columns 7 through 10

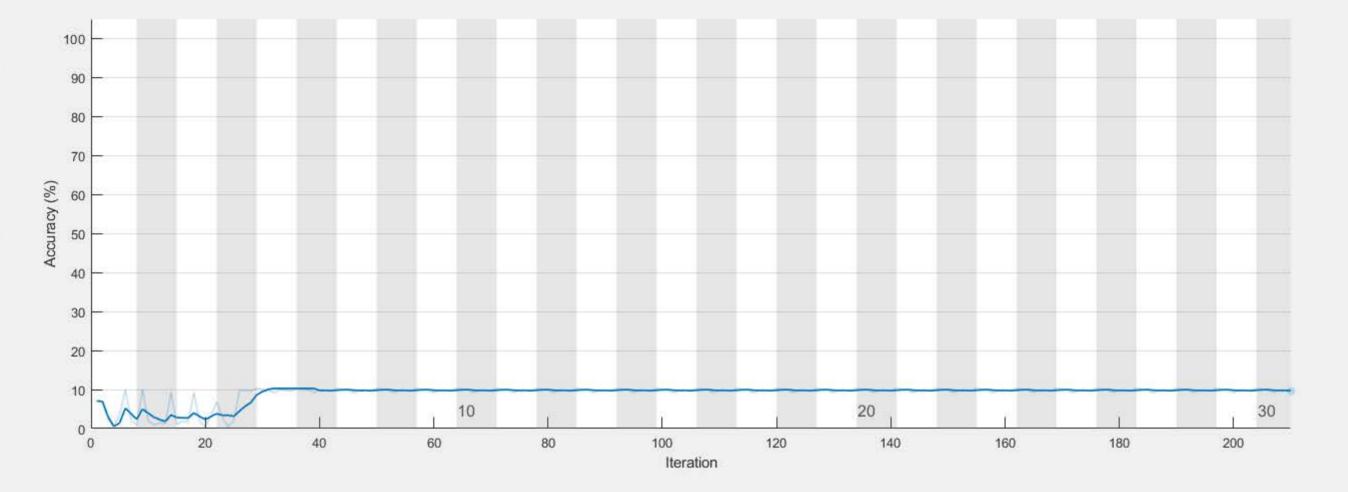
3	1	2	0
0	0	0	0
0	4	0	0
0	3	1	1
0	0	2	4
1	1	0	0
940	0	3	0
0	1011	2	2

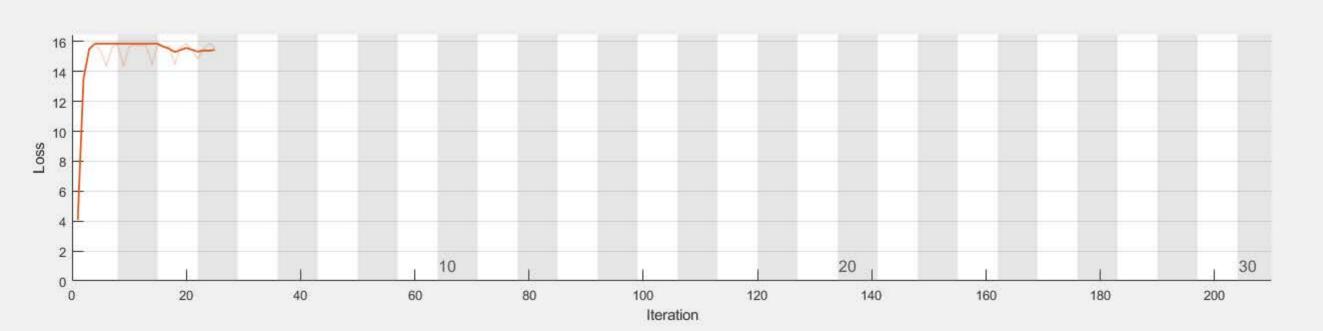
1 0 963 3 0 4 3 987

Published with MATLAB® R2018a

■ Training Progress (04-Dec-2018 11:47:47)

Training Progress (04-Dec-2018 11:47:47)





Results

Validation accuracy: N/A

Training finished: Reached final iteration

Training Time

Start time: 04-Dec-2018 11:47:47

7 min 27 sec Elapsed time:

Training Cycle

30 of 30 Epoch: 210 of 210 Iteration:

Iterations per epoch: Maximum iterations: 210

Validation

N/A Frequency: Patience: N/A

Other Information

Hardware resource: Single CPU Learning rate schedule: Constant 0.01

Learning rate:

i Learn more



Loss

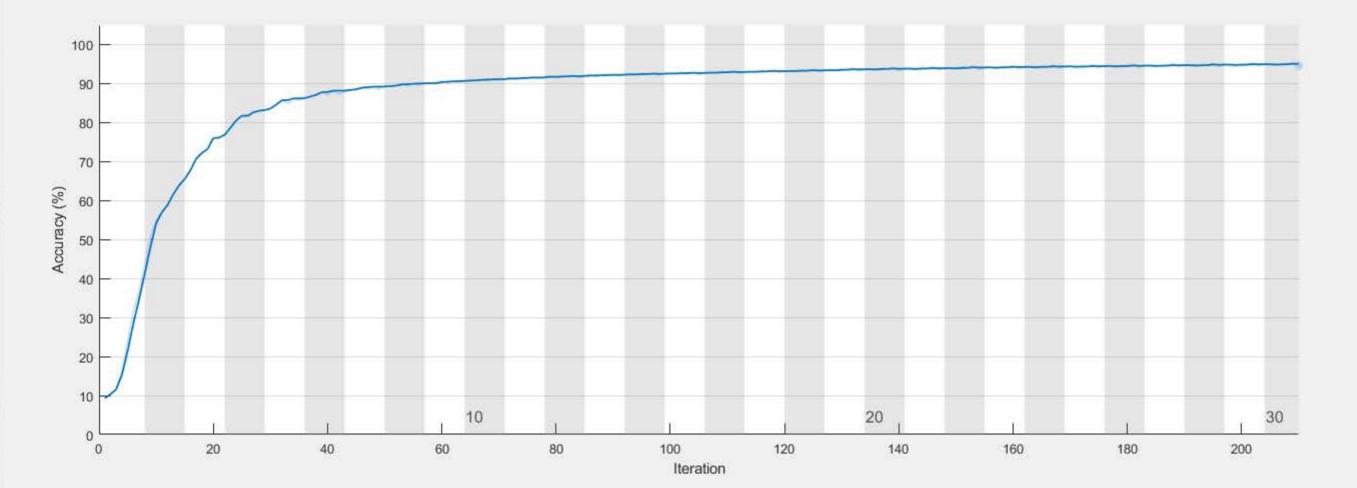
Training (smoothed)

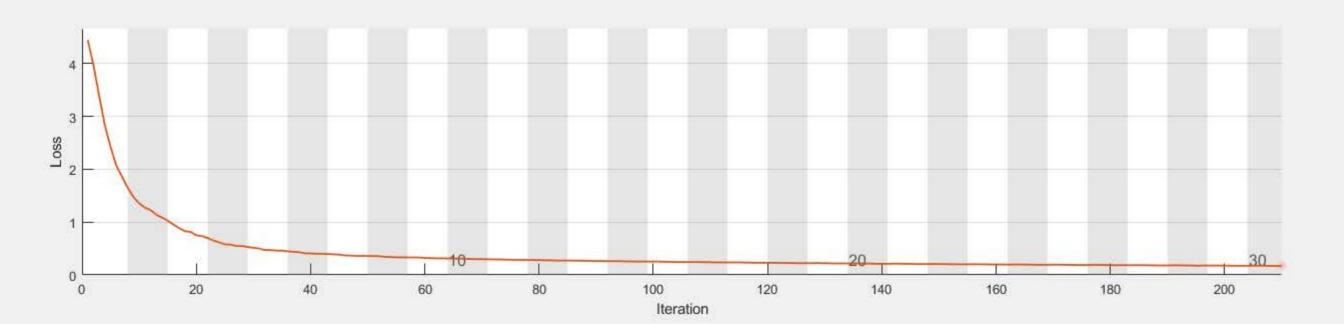
Training

— — ● — — Validation

■ Training Progress (04-Dec-2018 11:55:18)

Training Progress (04-Dec-2018 11:55:18)





Results

Validation accuracy: N/A

Training finished: Reached final iteration

Training Time

Start time:

04-Dec-2018 11:55:18

Elapsed time: 7 min 58 sec

Training Cycle

Epoch: 30 of 30 Iteration: 210 of 210

Iterations per epoch: 7
Maximum iterations: 210

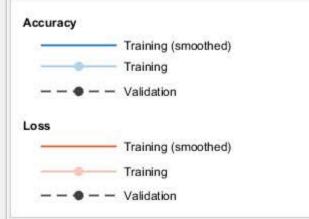
Validation

Frequency: N/A
Patience: N/A

Other Information

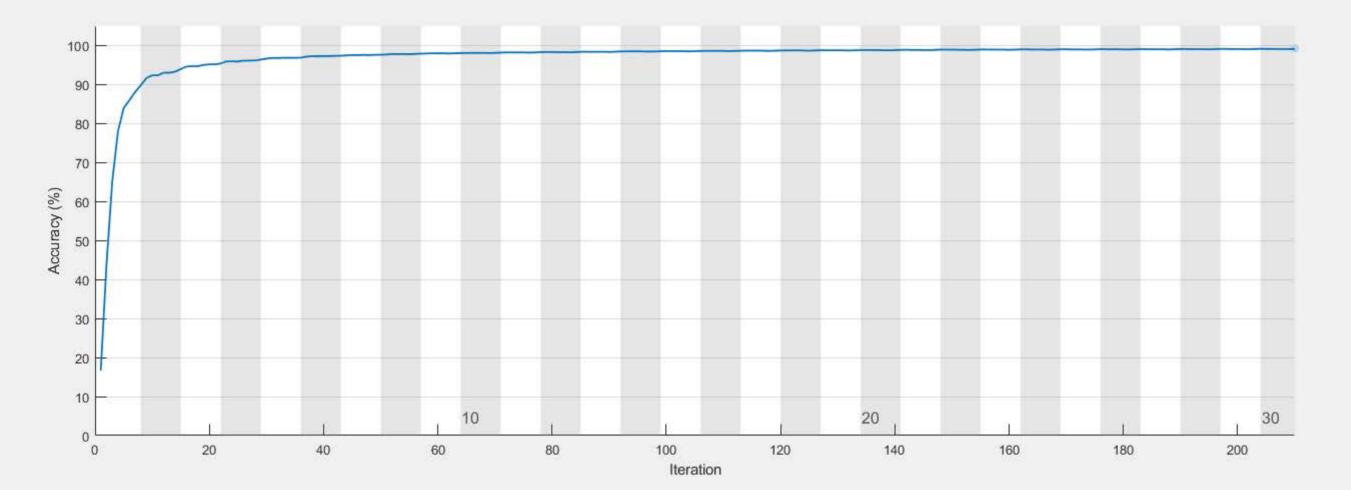
Hardware resource: Single CPU
Learning rate schedule: Constant
Learning rate: 0.0001

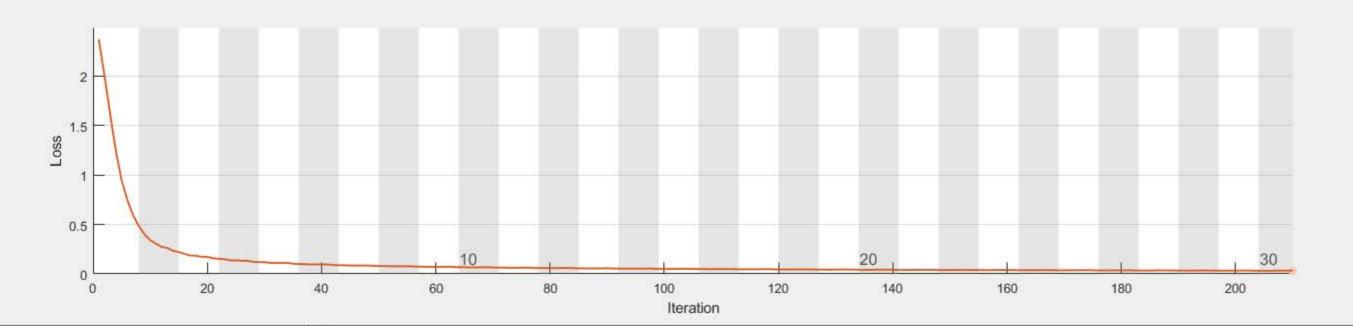
1 Learn more



▲ Training Progress (04-Dec-2018 12:03:19)

Training Progress (04-Dec-2018 12:03:19)





Results

Validation accuracy: N/A

Training finished: Reached final iteration

Training Time

Start time:

04-Dec-2018 12:03:19

35

Elapsed time: 18 min 17 sec

Training Cycle

Epoch: 30 of 30 Iteration: 210 of 210

Iterations per epoch: 7
Maximum iterations: 210

Validation

Frequency: N/A
Patience: N/A

Other Information

Hardware resource: Single CPU
Learning rate schedule: Constant
Learning rate: 0.01

arming rate.

Learn more

