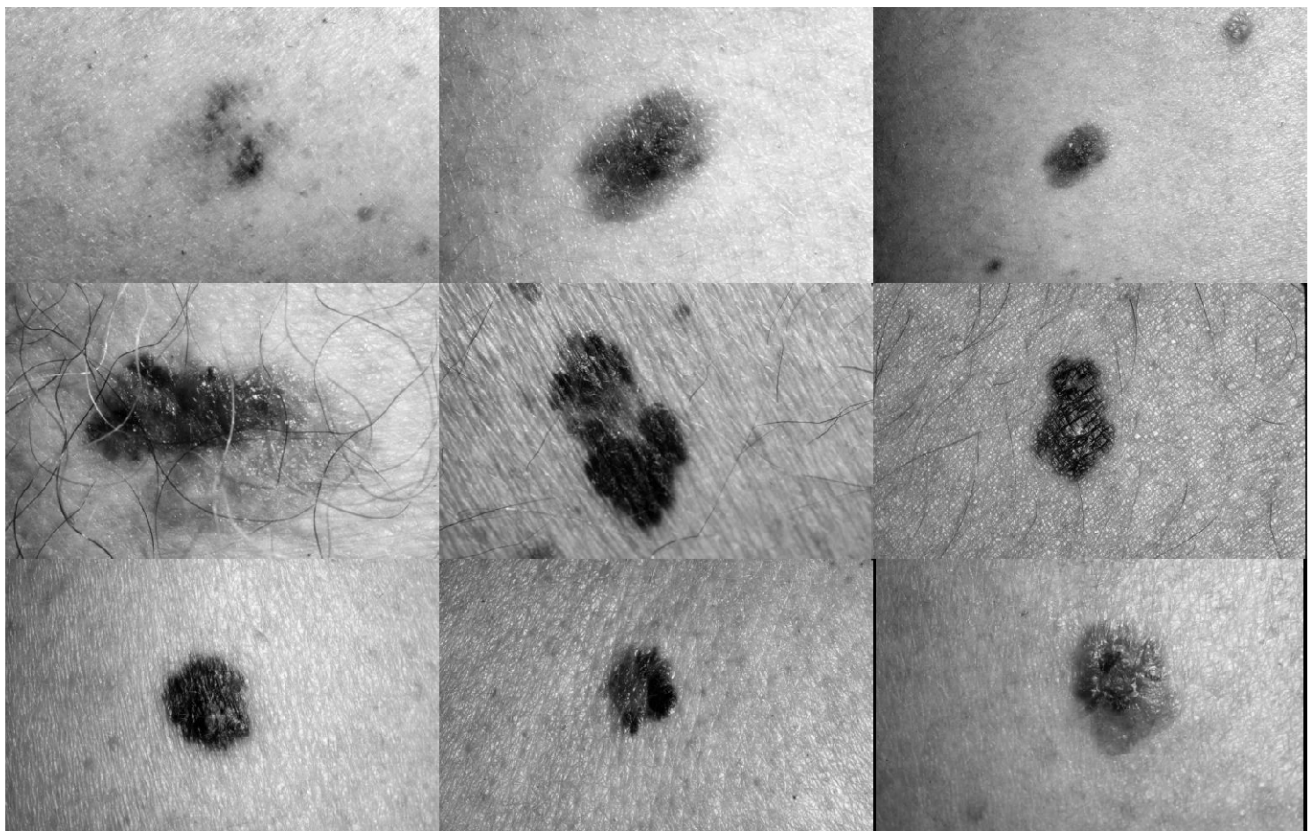


```
clc;  
close all;  
clear all  
% Read the image and corresponding threshold value from .csv file for training and testing  
trainingData = readtable("Train.csv");  
X_Train = trainingData.Name;  
testingData = readtable("Test.csv");  
X_Test = testingData.Name;
```

```
% Threshold value for testing and training  
Y_Train = trainingData.Value;  
Y_Test = testingData.Value;  
fn = X_Train{1};  
size(imread(fn));
```

```
% Display 9 sample images from the database  
imds = imageDatastore(X_Train(1:9));  
montage(imds)
```



```
trainds = augmentedImageDatastore([224 224],trainingData);  
testds = augmentedImageDatastore([224 224],testingData);
```

## %DTP-Net Layers

```
layers = [  
    imageInputLayer([224 224 1])  
    convolution2dLayer(3,8,'Padding','same')  
    convolution2dLayer(3,8,'Padding','same')  
    batchNormalizationLayer  
    reluLayer  
    maxPooling2dLayer(2,'Stride',2)  
    convolution2dLayer(3,16,'Padding','same')  
    convolution2dLayer(3,16,'Padding','same')  
    batchNormalizationLayer  
    reluLayer  
    maxPooling2dLayer(2,'Stride',2)  
    convolution2dLayer(3,32,'Padding','same')  
    convolution2dLayer(3,32,'Padding','same')  
    batchNormalizationLayer  
    reluLayer  
    maxPooling2dLayer(2,'Stride',2)  
    convolution2dLayer(3,64,'Padding','same')  
    convolution2dLayer(3,64,'Padding','same')  
    batchNormalizationLayer  
    reluLayer  
    maxPooling2dLayer(2,'Stride',2)  
    convolution2dLayer(3,128,'Padding','same')  
    convolution2dLayer(3,128,'Padding','same')  
    batchNormalizationLayer  
    reluLayer  
    convolution2dLayer(3,256,'Padding','same')  
    batchNormalizationLayer  
    reluLayer  
    dropoutLayer(0.2)  
    fullyConnectedLayer(1)  
    regressionLayer];
```

```
options = trainingOptions("sgdm","MaxEpochs",150,"InitialLearnRate",0.0001,'Shuffle','every-epoch',  
    'MiniBatchSize',64)
```

```
options =  
    TrainingOptionsSGDM with properties:
```

```
        Momentum: 0.9000  
    InitialLearnRate: 1.0000e-04  
    LearnRateSchedule: 'none'  
    LearnRateDropFactor: 0.1000  
    LearnRateDropPeriod: 10  
        L2Regularization: 1.0000e-04  
    GradientThresholdMethod: 'l2norm'  
        GradientThreshold: Inf  
        MaxEpochs: 150  
        MiniBatchSize: 64  
        Verbose: 1
```

```

        VerboseFrequency: 50
        ValidationData: []
    ValidationFrequency: 50
    ValidationPatience: Inf
        Shuffle: 'every-epoch'
        CheckpointPath: ''
        CheckpointFrequency: 1
    CheckpointFrequencyUnit: 'epoch'
    ExecutionEnvironment: 'auto'
        WorkerLoad: []
        OutputFcn: []
        Plots: 'none'
        SequenceLength: 'longest'
        SequencePaddingValue: 0
    SequencePaddingDirection: 'right'
        DispatchInBackground: 0
    ResetInputNormalization: 1
    BatchNormalizationStatistics: 'population'
        OutputNetwork: 'last-iteration'

```

```

% options = trainingOptions("sgdm","MaxEpochs",500,"InitialLearnRate",0.0001, ...
%     'ValidationData',{validds,YValid},'ValidationFrequency',10, ...
%     'MiniBatchSize',8,'Plots','training-progress')

% miniBatchSize = 128;
% validationFrequency = floor(numel(YTrain)/miniBatchSize);
% options = trainingOptions('sgdm', ...
%     'MiniBatchSize',miniBatchSize, ...
%     'MaxEpochs',30, ...
%     'InitialLearnRate',1e-3, ...
%     'LearnRateSchedule','piecewise', ...
%     'LearnRateDropFactor',0.1, ...
%     'LearnRateDropPeriod',20, ...
%     'Shuffle','every-epoch', ...
%     'ValidationData',{testds,YTrain}, ...
%     'ValidationFrequency',validationFrequency, ...
%     'Plots','training-progress', ...
%     'Verbose',false);

```

### %Train the DTP-Net

```
ccnet = trainNetwork(trainds,layers,options)
```

Training on single GPU.

Initializing input data normalization.

Epoch	Iteration	Time Elapsed (hh:mm:ss)	Mini-batch RMSE	Mini-batch Loss	Base Learning Rate
1	1	00:00:25	120.00	7199.5	1.0000e-04
1	50	00:00:46	26.10	340.5	1.0000e-04
2	100	00:01:19	20.91	218.6	1.0000e-04
3	150	00:01:51	21.26	225.9	1.0000e-04
3	200	00:02:12	30.24	457.3	1.0000e-04

4	250	00:02:44	23.98	287.5	1.0000e-04
5	300	00:03:17	27.63	381.6	1.0000e-04
5	350	00:03:44	18.04	162.7	1.0000e-04
6	400	00:04:19	21.49	230.8	1.0000e-04
7	450	00:04:54	21.21	224.9	1.0000e-04
8	500	00:05:28	17.06	145.5	1.0000e-04
8	550	00:05:48	23.39	273.5	1.0000e-04
9	600	00:06:24	16.75	140.2	1.0000e-04
10	650	00:07:00	21.18	224.4	1.0000e-04
10	700	00:07:22	20.61	212.4	1.0000e-04
11	750	00:07:55	14.55	105.8	1.0000e-04
12	800	00:08:29	16.74	140.2	1.0000e-04
12	850	00:08:49	16.24	131.8	1.0000e-04
13	900	00:09:21	20.38	207.7	1.0000e-04
14	950	00:09:55	16.13	130.1	1.0000e-04
15	1000	00:10:27	18.19	165.4	1.0000e-04
15	1050	00:10:52	15.35	117.8	1.0000e-04
16	1100	00:11:26	15.07	113.6	1.0000e-04
17	1150	00:11:59	17.14	146.9	1.0000e-04
17	1200	00:12:21	19.83	196.6	1.0000e-04
18	1250	00:12:56	16.62	138.1	1.0000e-04
19	1300	00:13:29	16.54	136.8	1.0000e-04
20	1350	00:14:05	15.38	118.3	1.0000e-04
20	1400	00:14:26	15.06	113.4	1.0000e-04
21	1450	00:15:00	15.89	126.2	1.0000e-04
22	1500	00:15:34	13.46	90.5	1.0000e-04
22	1550	00:15:55	14.41	103.9	1.0000e-04
23	1600	00:16:30	20.08	201.7	1.0000e-04
24	1650	00:17:02	13.97	97.5	1.0000e-04
24	1700	00:17:22	14.05	98.8	1.0000e-04
25	1750	00:17:56	15.62	122.0	1.0000e-04
26	1800	00:18:29	19.85	197.1	1.0000e-04
27	1850	00:19:06	15.67	122.7	1.0000e-04
27	1900	00:19:26	14.37	103.3	1.0000e-04
28	1950	00:20:00	18.43	169.8	1.0000e-04
29	2000	00:20:35	15.87	125.9	1.0000e-04
29	2050	00:20:56	13.35	89.2	1.0000e-04
30	2100	00:21:26	13.20	87.2	1.0000e-04
31	2150	00:21:57	15.07	113.5	1.0000e-04
31	2200	00:22:18	14.78	109.3	1.0000e-04
32	2250	00:22:53	19.06	181.6	1.0000e-04
33	2300	00:23:20	18.95	179.6	1.0000e-04
34	2350	00:23:45	12.14	73.6	1.0000e-04
34	2400	00:24:00	20.26	205.2	1.0000e-04
35	2450	00:24:22	14.61	106.7	1.0000e-04
36	2500	00:24:44	14.72	108.4	1.0000e-04
36	2550	00:25:00	15.78	124.6	1.0000e-04
37	2600	00:25:21	17.79	158.2	1.0000e-04
38	2650	00:25:43	12.36	76.3	1.0000e-04
39	2700	00:26:04	12.68	80.4	1.0000e-04
39	2750	00:26:19	15.07	113.5	1.0000e-04
40	2800	00:26:42	15.49	120.0	1.0000e-04
41	2850	00:27:04	15.21	115.6	1.0000e-04
41	2900	00:27:19	12.82	82.2	1.0000e-04
42	2950	00:27:40	14.44	104.2	1.0000e-04
43	3000	00:28:02	11.99	71.8	1.0000e-04
43	3050	00:28:18	11.99	71.9	1.0000e-04
44	3100	00:28:40	11.24	63.2	1.0000e-04
45	3150	00:29:01	12.75	81.3	1.0000e-04
46	3200	00:29:23	12.54	78.7	1.0000e-04
46	3250	00:29:38	10.38	53.9	1.0000e-04
47	3300	00:30:00	13.23	87.5	1.0000e-04
48	3350	00:30:22	16.12	130.0	1.0000e-04
48	3400	00:30:37	15.04	113.1	1.0000e-04

49	3450	00:30:58	15.60	121.7	1.0000e-04
50	3500	00:31:19	14.23	101.2	1.0000e-04
50	3550	00:31:35	16.99	144.3	1.0000e-04
51	3600	00:31:56	13.63	92.8	1.0000e-04
52	3650	00:32:18	14.12	99.7	1.0000e-04
53	3700	00:32:39	12.64	79.9	1.0000e-04
53	3750	00:32:55	16.50	136.1	1.0000e-04
54	3800	00:33:17	17.13	146.7	1.0000e-04
55	3850	00:33:39	16.60	137.7	1.0000e-04
55	3900	00:33:54	10.02	50.2	1.0000e-04
56	3950	00:34:15	13.24	87.6	1.0000e-04
57	4000	00:34:38	12.79	81.8	1.0000e-04
58	4050	00:34:59	13.14	86.3	1.0000e-04
58	4100	00:35:15	13.73	94.3	1.0000e-04
59	4150	00:35:37	10.30	53.0	1.0000e-04
60	4200	00:35:58	9.66	46.7	1.0000e-04
60	4250	00:36:14	13.90	96.6	1.0000e-04
61	4300	00:36:35	15.09	113.8	1.0000e-04
62	4350	00:36:57	14.81	109.7	1.0000e-04
62	4400	00:37:12	15.76	124.2	1.0000e-04
63	4450	00:37:33	10.67	56.9	1.0000e-04
64	4500	00:37:55	11.69	68.3	1.0000e-04
65	4550	00:38:16	12.01	72.1	1.0000e-04
65	4600	00:38:31	8.12	33.0	1.0000e-04
66	4650	00:38:52	9.89	48.9	1.0000e-04
67	4700	00:39:14	14.33	102.6	1.0000e-04
67	4750	00:39:29	8.81	38.8	1.0000e-04
68	4800	00:39:51	11.60	67.3	1.0000e-04
69	4850	00:40:12	14.44	104.3	1.0000e-04
70	4900	00:40:33	9.13	41.7	1.0000e-04
70	4950	00:40:48	10.83	58.7	1.0000e-04
71	5000	00:41:09	7.94	31.5	1.0000e-04
72	5050	00:41:30	10.37	53.8	1.0000e-04
72	5100	00:41:46	8.83	39.0	1.0000e-04
73	5150	00:42:07	15.56	121.0	1.0000e-04
74	5200	00:42:28	10.83	58.6	1.0000e-04
74	5250	00:42:43	12.35	76.3	1.0000e-04
75	5300	00:43:07	9.94	49.4	1.0000e-04
76	5350	00:43:30	8.48	36.0	1.0000e-04
77	5400	00:43:53	9.51	45.3	1.0000e-04
77	5450	00:44:09	15.43	119.0	1.0000e-04
78	5500	00:44:30	10.21	52.1	1.0000e-04
79	5550	00:44:52	11.61	67.4	1.0000e-04
79	5600	00:45:07	8.71	38.0	1.0000e-04
80	5650	00:45:28	8.39	35.2	1.0000e-04
81	5700	00:45:50	8.49	36.1	1.0000e-04
81	5750	00:46:06	11.51	66.2	1.0000e-04
82	5800	00:46:27	9.96	49.6	1.0000e-04
83	5850	00:46:48	12.15	73.8	1.0000e-04
84	5900	00:47:09	12.59	79.3	1.0000e-04
84	5950	00:47:24	9.86	48.6	1.0000e-04
85	6000	00:47:52	10.37	53.8	1.0000e-04
86	6050	00:48:15	9.75	47.5	1.0000e-04
86	6100	00:48:31	13.21	87.3	1.0000e-04
87	6150	00:48:52	9.28	43.1	1.0000e-04
88	6200	00:49:14	11.13	62.0	1.0000e-04
89	6250	00:49:36	8.10	32.8	1.0000e-04
89	6300	00:49:51	14.92	111.3	1.0000e-04
90	6350	00:50:12	9.60	46.1	1.0000e-04
91	6400	00:50:34	10.46	54.7	1.0000e-04
91	6450	00:50:51	12.38	76.6	1.0000e-04
92	6500	00:51:14	7.07	25.0	1.0000e-04
93	6550	00:51:37	6.39	20.4	1.0000e-04
93	6600	00:51:53	8.16	33.3	1.0000e-04

94	6650	00:52:15	11.49	66.0	1.0000e-04
95	6700	00:52:36	11.40	65.0	1.0000e-04
96	6750	00:52:58	7.83	30.6	1.0000e-04
96	6800	00:53:14	7.70	29.6	1.0000e-04
97	6850	00:53:35	8.71	38.0	1.0000e-04
98	6900	00:53:57	8.29	34.4	1.0000e-04
98	6950	00:54:12	10.66	56.8	1.0000e-04
99	7000	00:54:33	8.49	36.0	1.0000e-04
100	7050	00:54:54	10.57	55.9	1.0000e-04
100	7100	00:55:09	6.89	23.7	1.0000e-04
101	7150	00:55:30	8.74	38.2	1.0000e-04
102	7200	00:55:51	8.96	40.2	1.0000e-04
103	7250	00:56:12	8.97	40.3	1.0000e-04
103	7300	00:56:27	10.09	50.9	1.0000e-04
104	7350	00:56:48	9.61	46.2	1.0000e-04
105	7400	00:57:10	7.44	27.7	1.0000e-04
105	7450	00:57:25	10.12	51.2	1.0000e-04
106	7500	00:57:47	12.70	80.7	1.0000e-04
107	7550	00:58:09	9.48	45.0	1.0000e-04
108	7600	00:58:30	7.87	31.0	1.0000e-04
108	7650	00:58:46	7.43	27.6	1.0000e-04
109	7700	00:59:07	8.78	38.5	1.0000e-04
110	7750	00:59:28	9.41	44.3	1.0000e-04
110	7800	00:59:44	9.62	46.3	1.0000e-04
111	7850	01:00:05	7.97	31.8	1.0000e-04
112	7900	01:00:26	10.08	50.8	1.0000e-04
112	7950	01:00:41	8.36	35.0	1.0000e-04
113	8000	01:01:02	8.17	33.4	1.0000e-04
114	8050	01:01:22	8.43	35.6	1.0000e-04
115	8100	01:01:43	6.94	24.1	1.0000e-04
115	8150	01:01:58	8.61	37.1	1.0000e-04
116	8200	01:02:24	8.17	33.4	1.0000e-04
117	8250	01:02:45	8.32	34.7	1.0000e-04
117	8300	01:03:00	9.05	41.0	1.0000e-04
118	8350	01:03:21	8.19	33.5	1.0000e-04
119	8400	01:03:42	6.66	22.2	1.0000e-04
120	8450	01:04:03	6.72	22.6	1.0000e-04
120	8500	01:04:23	7.27	26.5	1.0000e-04
121	8550	01:04:44	8.52	36.3	1.0000e-04
122	8600	01:05:05	4.62	10.7	1.0000e-04
122	8650	01:05:20	5.39	14.5	1.0000e-04
123	8700	01:05:41	8.48	36.0	1.0000e-04
124	8750	01:06:01	9.24	42.6	1.0000e-04
124	8800	01:06:17	6.57	21.6	1.0000e-04
125	8850	01:06:37	7.65	29.2	1.0000e-04
126	8900	01:06:58	5.75	16.5	1.0000e-04
127	8950	01:07:19	6.76	22.9	1.0000e-04
127	9000	01:07:34	6.57	21.6	1.0000e-04
128	9050	01:07:55	10.22	52.2	1.0000e-04
129	9100	01:08:16	6.95	24.2	1.0000e-04
129	9150	01:08:31	5.84	17.1	1.0000e-04
130	9200	01:08:52	7.00	24.5	1.0000e-04
131	9250	01:09:12	6.69	22.4	1.0000e-04
131	9300	01:09:28	7.96	31.7	1.0000e-04
132	9350	01:09:48	7.62	29.1	1.0000e-04
133	9400	01:10:09	12.98	84.3	1.0000e-04
134	9450	01:10:30	6.36	20.2	1.0000e-04
134	9500	01:10:45	7.92	31.3	1.0000e-04
135	9550	01:11:05	6.86	23.5	1.0000e-04
136	9600	01:11:26	6.18	19.1	1.0000e-04
136	9650	01:11:41	6.27	19.7	1.0000e-04
137	9700	01:12:02	5.62	15.8	1.0000e-04
138	9750	01:12:23	5.71	16.3	1.0000e-04
139	9800	01:12:44	7.27	26.4	1.0000e-04

139	9850	01:12:59	8.49	36.1	1.0000e-04
140	9900	01:13:20	6.30	19.9	1.0000e-04
141	9950	01:13:41	8.12	33.0	1.0000e-04
141	10000	01:13:56	5.66	16.0	1.0000e-04
142	10050	01:14:16	4.88	11.9	1.0000e-04
143	10100	01:14:37	6.01	18.1	1.0000e-04
143	10150	01:14:52	7.31	26.7	1.0000e-04
144	10200	01:15:13	5.69	16.2	1.0000e-04
145	10250	01:15:34	9.71	47.1	1.0000e-04
146	10300	01:15:54	5.62	15.8	1.0000e-04
146	10350	01:16:09	7.43	27.6	1.0000e-04
147	10400	01:16:30	4.81	11.6	1.0000e-04
148	10450	01:16:51	9.50	45.1	1.0000e-04
148	10500	01:17:06	11.22	62.9	1.0000e-04
149	10550	01:17:27	6.55	21.4	1.0000e-04
150	10600	01:17:48	9.70	47.0	1.0000e-04
150	10650	01:18:03	9.32	43.5	1.0000e-04

Training finished: Max epochs completed.

ccnet =

SeriesNetwork with properties:

Layers: [31x1 nnet.cnn.layer.Layer]

InputNames: {'imageinput'}

OutputNames: {'regressionoutput'}

% Prediction of Threshold value using the trained DTP-Net

Train\_Predicted = predict(ccnet,trainds);

Test\_Predicted = predict(ccnet,testds);

% Error estimation

Train\_predictionError = Y\_Train - Train\_Predicted;

Test\_predictionError = Y\_Test - Test\_Predicted;

% Evalaution for training data

Train\_Pred\_mae = errperf(Y\_Train,Train\_Predicted,'mae')

Train\_Pred\_mae = *single*

5.1116

Train\_Pred\_mse = errperf(Y\_Train,Train\_Predicted,'mse')

Train\_Pred\_mse = *single*

40.5576

Train\_Pred\_rmse = errperf(Y\_Train,Train\_Predicted,'rmse')

Train\_Pred\_rmse = *single*

6.3685

%Train\_Pred\_mare = errperf(Y\_Train,Train\_Predicted,'mare')

%Train\_Pred\_msre = errperf(Y\_Train,Train\_Predicted,'msre')

%Train\_Pred\_rmsre = errperf(Y\_Train,Train\_Predicted,'rmsre')

%Train\_Pred\_mape = errperf(Y\_Train,Train\_Predicted,'mape')

```
%Train_Pred_mspe = errperf(Y_Train,Train_Predicted,'mspe')
%Train_Pred_rmspe = errperf(Y_Train,Train_Predicted,'rmspe')
```

```
% Evalaution for test data
```

```
Test_Pred_mae = errperf(Y_Test,Test_Predicted,'mae')
```

```
Test_Pred_mae = single
```

```
6.2166
```

```
Test_Pred_mse = errperf(Y_Test,Test_Predicted,'mse')
```

```
Test_Pred_mse = single
```

```
48.8017
```

```
Test_Pred_rmse = errperf(Y_Test,Test_Predicted,'rmse')
```

```
Test_Pred_rmse = single
```

```
6.9858
```

```
% Test_Pred_mare = errperf(Y_Test,Test_Predicted,'mare')
% Test_Pred_msre = errperf(Y_Test,Test_Predicted,'msre')
% Test_Pred_rmsre = errperf(Y_Test,Test_Predicted,'rmsre')
% Test_Pred_mape = errperf(Y_Test,Test_Predicted,'mape')
% Testn_Pred_mspe = errperf(Y_Test,Test_Predicted,'mspe')
% Test_Pred_rmspe = errperf(Y_Test,Test_Predicted,'rmspe')
```

```
% Scatter plot for training phase
```

```
figure
```

```
scatter(Y_Train,Train_Predicted,'+')
```

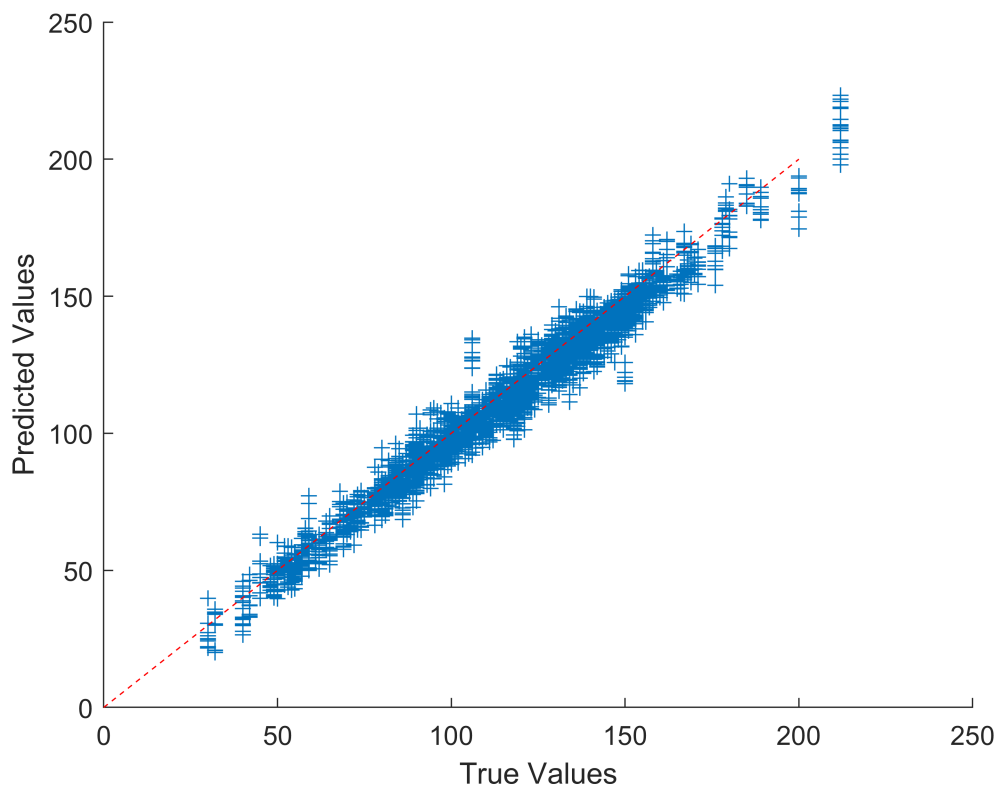
```
xlabel("True Values")
```

```
ylabel("Predicted Values")
```

```
hold on
```

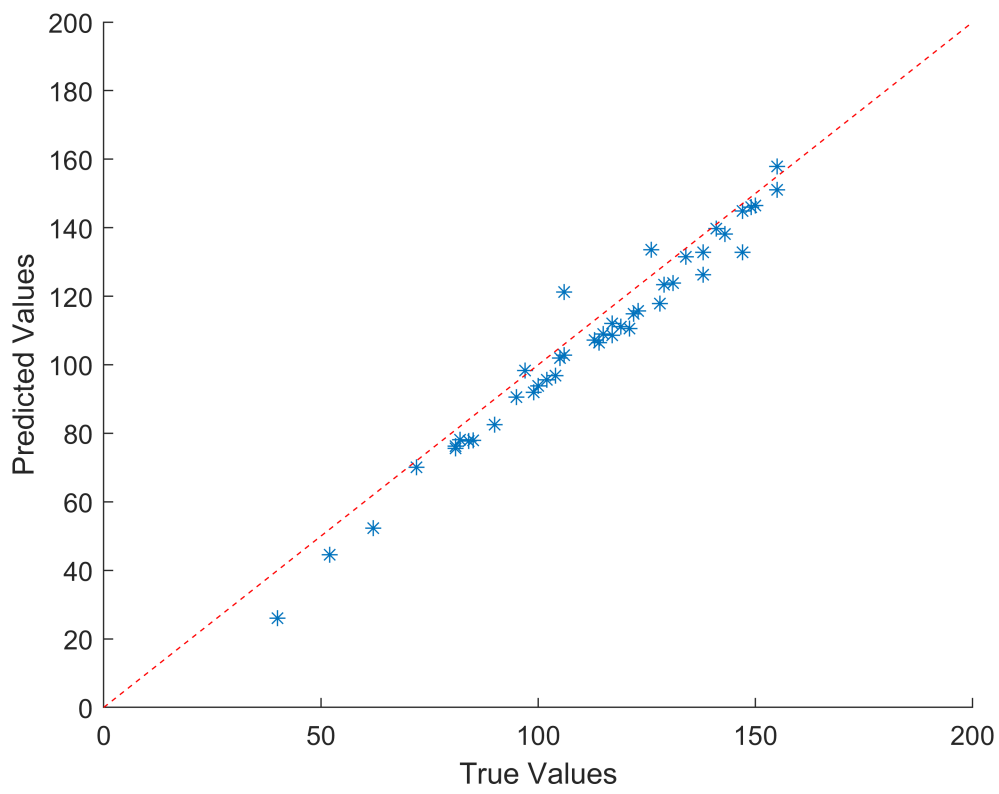
```
plot([0 200], [0 200],'r--')
```





```
% Scatter plot for testing phase
figure
scatter(Y_Test,Test_Predicted, '*')
xlabel("True Values")
ylabel("Predicted Values")

hold on
plot([0 200], [0 200], 'r--')
```



`%ccnet.Layers`