
New NN test, Train/Dev/Test Split

```
In[1252]:= ABMInputsV2 = Import[
  "/Users/thorsilver/Downloads/SocialCareOptimisation/ABM-for-social-care/
    lptau10round2_GEMSA_inputs.csv"];

ABMOutputsV2 = Import[
  "/Users/thorsilver/Downloads/SocialCareOptimisation/ABM-for-social-care/
    lptau10round2_GEMSA_outputs.csv"];
ABMOutputsV2 = Function[x, x/1000] /@ ABMOutputsV2;
ABMAssocV2 = AssociationThread[ABMInputsV2 → Flatten[ABMOutputsV2]];
ABMnewDataV2 = Dataset[ABMAssocV2];
ABMNormalV2 = Normal[ABMAssocV2];
ABMNormalRandom = RandomSample[ABMNormalV2];
ABMtrainv2 = TakeDrop[ABMNormalV2, 320];
ABMtestv2 = ABMtrainv2[[2]];
ABMtraining = ABMtrainv2[[1]];
trainDevSplit = TakeDrop[ABMtraining, 256];
finalTrain = trainDevSplit[[1]];
finalDev = trainDevSplit[[2]];
finaltest = ABMtestv2;
```

```
In[1265]:= Length[finalTrain]
Length[finalDev]
Length[finaltest]
```

Out[1265]= 256


Out[1266]= 64

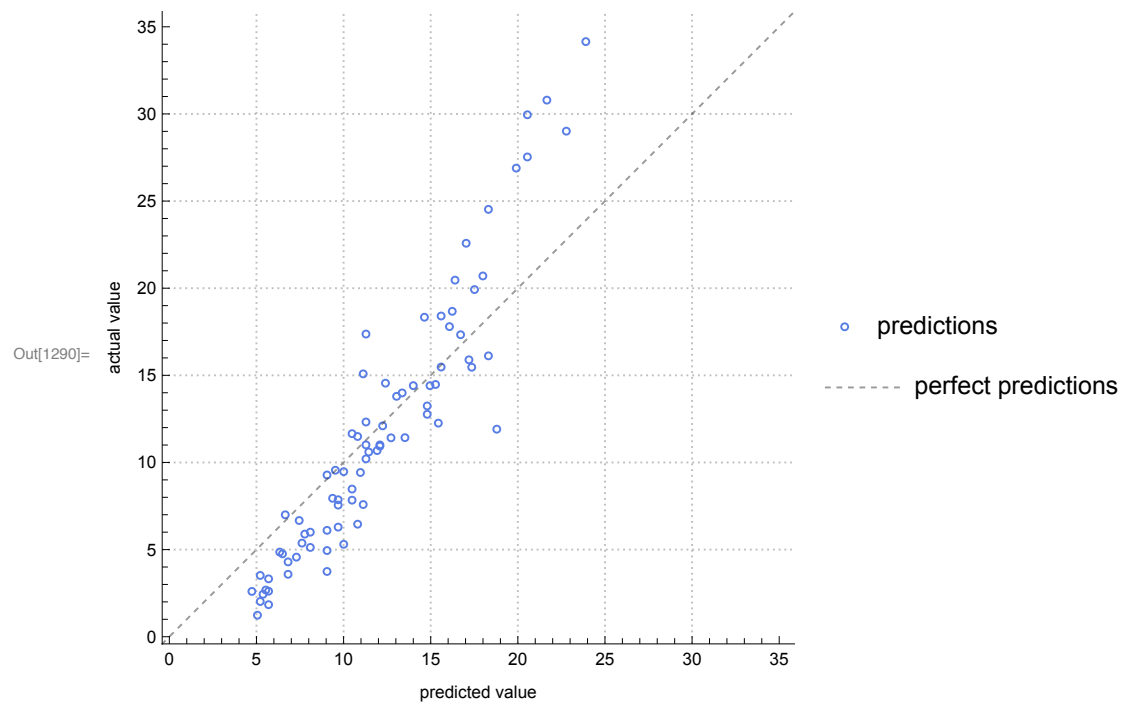
Out[1267]= 80

```
In[1268]:= pRFv2 = Predict[finalTrain, Method → "RandomForest"]
```

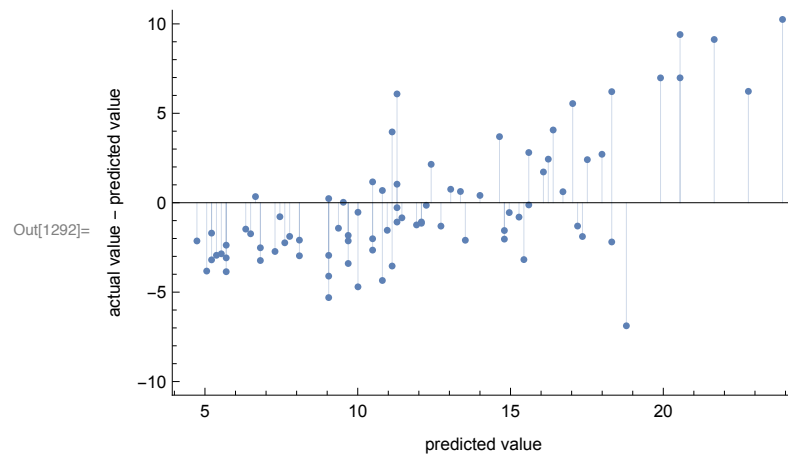
Out[1268]= PredictorFunction[ Input type: Mixed (number: 10)
Method: RandomForest]

```
In[1289]:= pmRFv2 = PredictorMeasurements[pRFv2, finaltest]
pmRFv2["ComparisonPlot"]
pmRFv2["MeanSquare"]
pmRFv2["ResidualPlot"]
Information[pRFv2]
```

Out[1289]= PredictorMeasurementsObject[ Predictor: RandomForest
Number of test examples: 80]



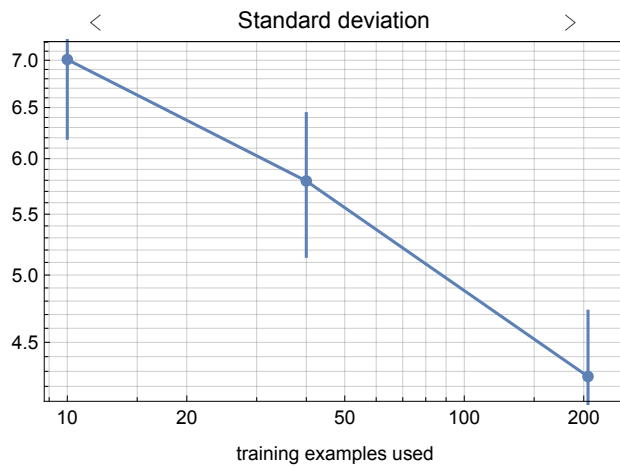
Out[1291]= 12.0599



Predictor information

Data type	Mixed (number: 10)
Standard deviation	4.27 ± 0.46
Method	RandomForest
Single evaluation time	4.33 ms/example
Batch evaluation speed	52. examples/ms
Loss	2.88 ± 0.092
Model memory	238. kB
Training examples used	256 examples
Training time	397. ms

Out[1293]=



In[1273]:=

```
pXGTV2 = Predict[finalTrain, Method → "GradientBoostedTrees"]
```

Out[1273]=

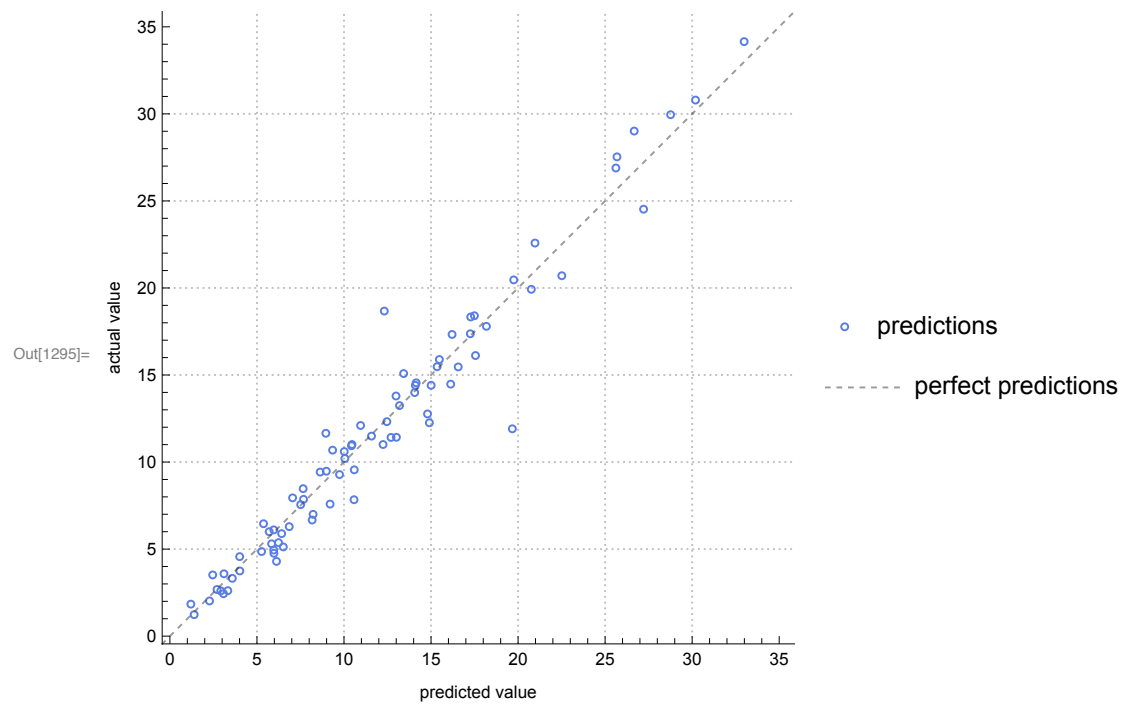
```
PredictorFunction[  Input type: Mixed (number: 10)  
Method: GradientBoostedTrees]
```

In[1294]:=

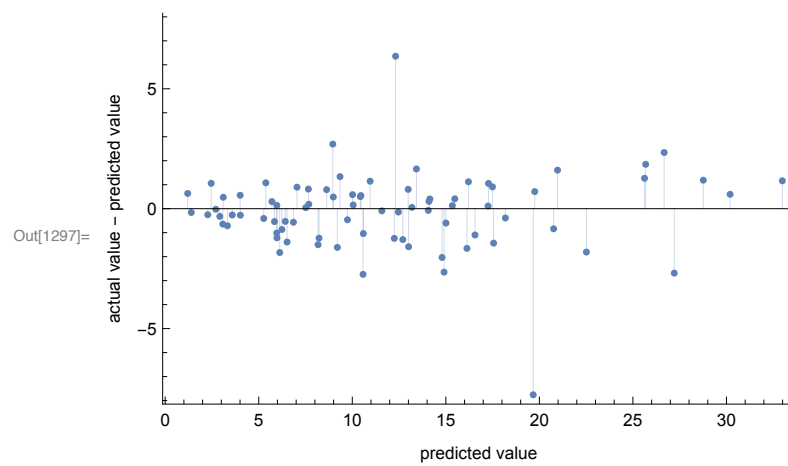
```
pmXGTV2 = PredictorMeasurements[pXGTV2, finaltest]
pmXGTV2["ComparisonPlot"]
pmXGTV2["MeanSquare"]
pmXGTV2["ResidualPlot"]
Information[pXGTV2]
```

Out[1294]=

```
PredictorMeasurementsObject[  Predictor: GradientBoostedTrees  
Number of test examples: 80]
```

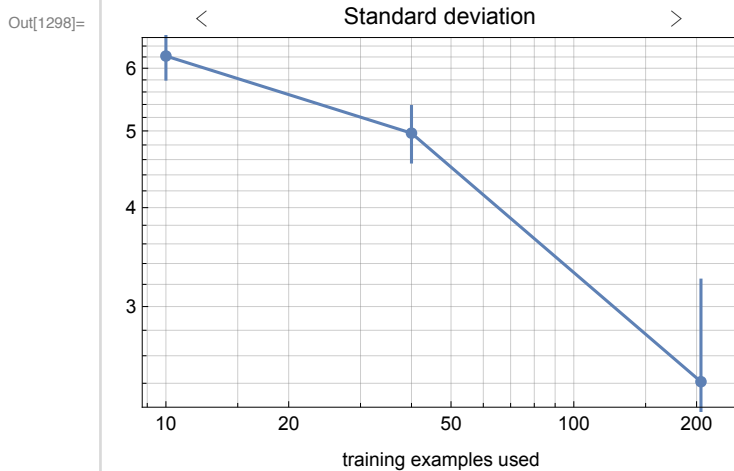


Out[1296]= 2.52565



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.41 ± 0.83
Method	GradientBoostedTrees
Single evaluation time	3.8 ms/example
Batch evaluation speed	43.8 examples/ms
Loss	3.77 ± 1.0
Model memory	391. kB
Training examples used	256 examples
Training time	1.47 s



```
In[1278]:= pNNv2 = Predict[finalTrain, Method →
{"NeuralNetwork", "NetworkDepth" → 3, "NetworkType" → "FullyConnected",
"L2Regularization" → 0.05, MaxTrainingRounds → 16 000}]
```

Out[1278]= PredictorFunction[


 Input type: Mixed (number: 10)
 Method: NeuralNetwork

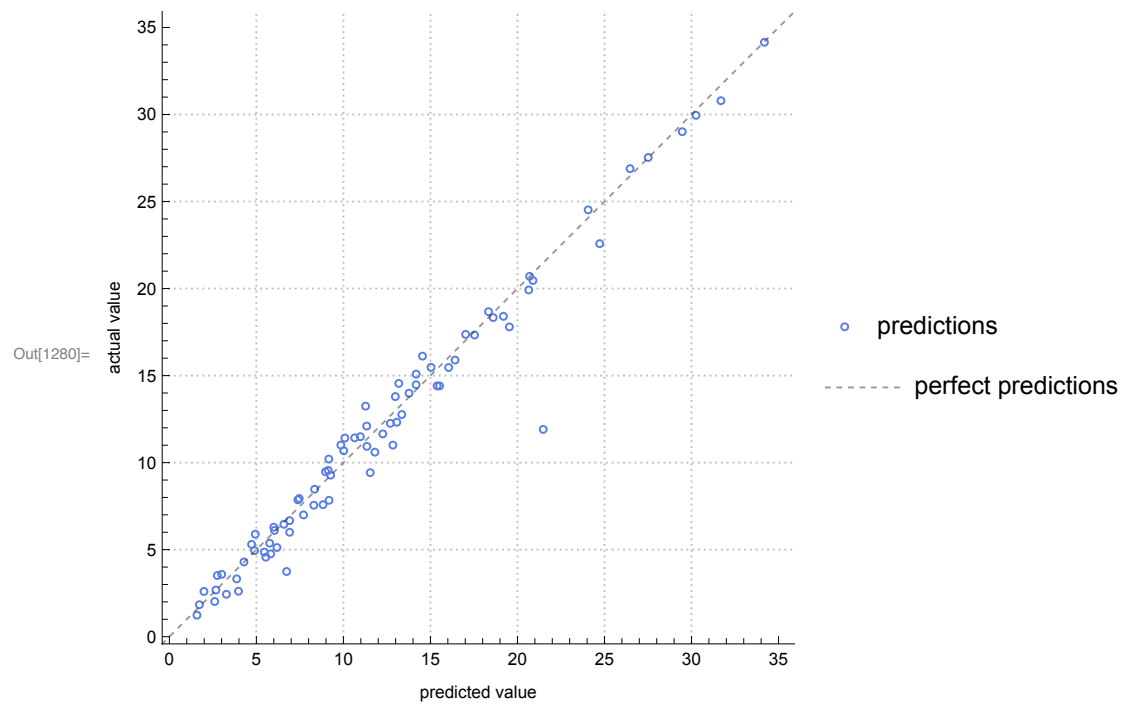
]

```
In[1279]:= pmNNv2 = PredictorMeasurements[pNNv2, finaltest]
pmNNv2["ComparisonPlot"]
pmNNv2["MeanSquare"]
pmNNv2["ResidualPlot"]
Information[pNNv2]
```

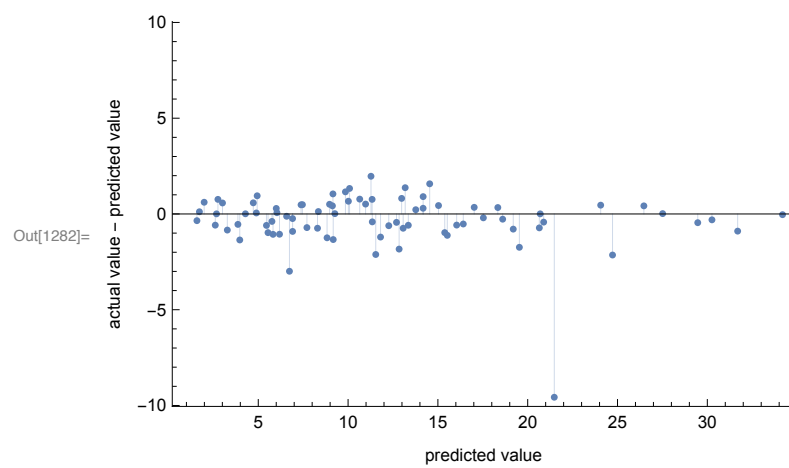
Out[1279]= PredictorMeasurementsObject[


 Predictor: NeuralNetwork
 Number of test examples: 80

]

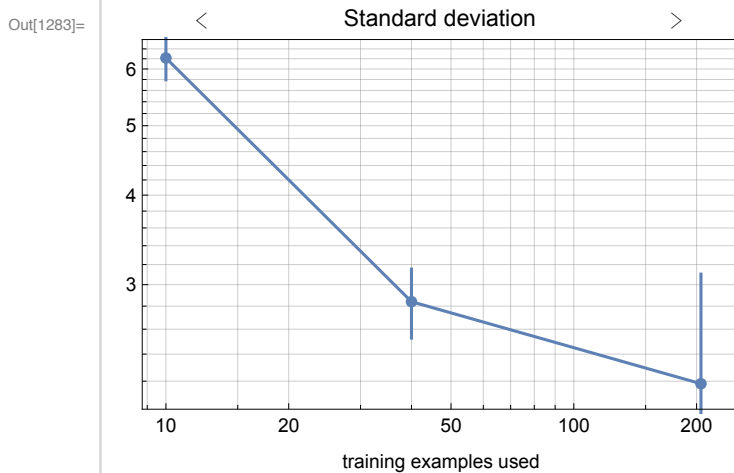


Out[1281]= 1.96365



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.18 ± 0.92
Method	NeuralNetwork
Single evaluation time	2.16 ms/example
Batch evaluation speed	46.7 examples/ms
Loss	1.87 ± 0.22
Model memory	246. kB
Training examples used	256 examples
Training time	1 min 23 s



```

In[1299]:= pGPEv2 = Predict[finalTrain, Method → "GaussianProcess"]
pmGPEv2 = PredictorMeasurements[pGPEv2, finaltest]
pmGPEv2["ComparisonPlot"]
pmGPEv2["MeanSquare"]
pmGPEv2["ResidualPlot"]
Information[pGPEv2]

```


Out[1299]= PredictorFunction[



Input type: Mixed (number: 10)
 Method: GaussianProcess

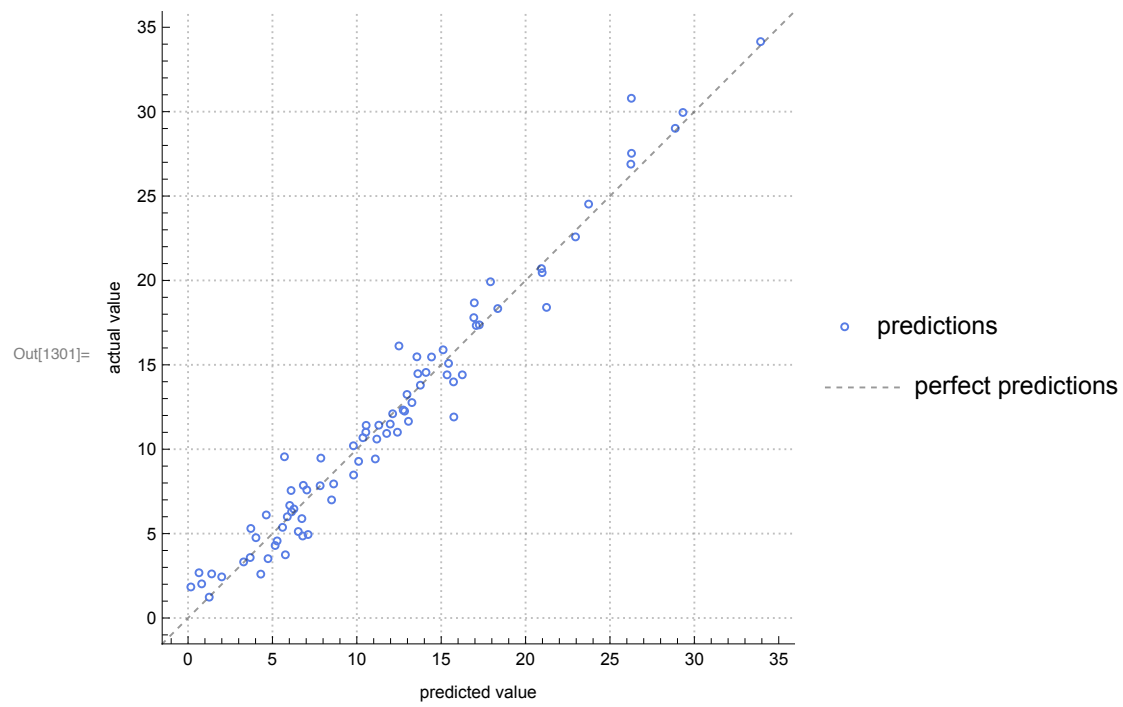
]

Out[1300]= PredictorMeasurementsObject[

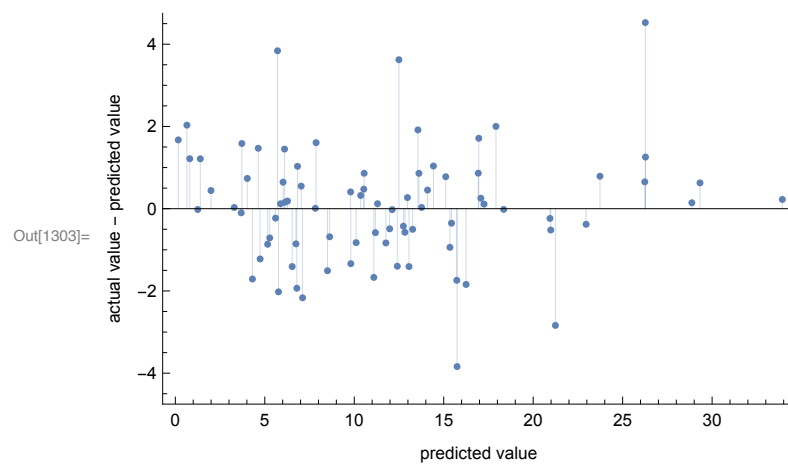


Predictor: GaussianProcess
 Number of test examples: 80

]

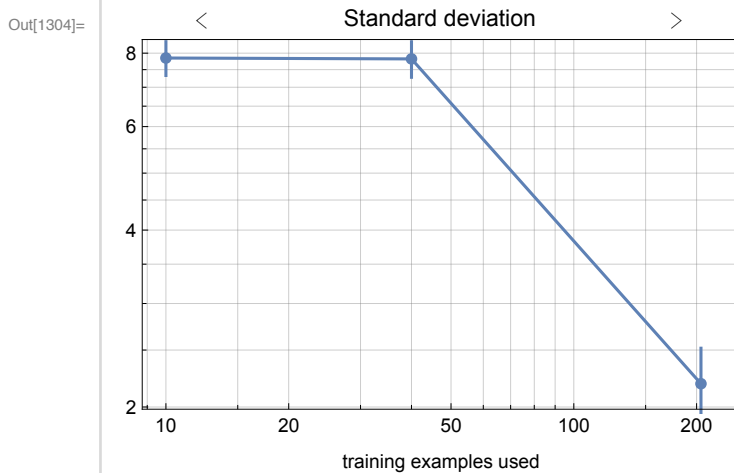


Out[1302]= 1.92845



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.19 ± 0.33
Method	GaussianProcess
Single evaluation time	3.95 ms/example
Batch evaluation speed	25.7 examples/ms
Loss	1.97 ± 0.12
Model memory	548. kB
Training examples used	256 examples
Training time	2.97 s




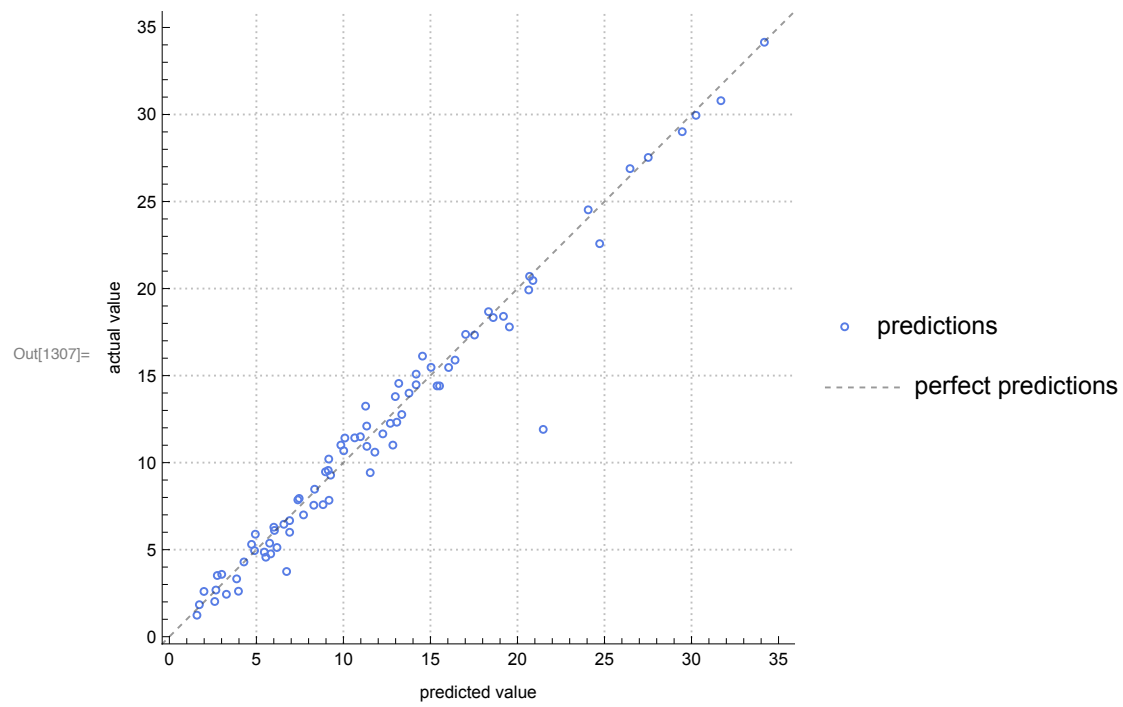
```

In[1305]:= pNNv3 = Predict[finalTrain, Method →
  {"NeuralNetwork", "NetworkDepth" → 3, "NetworkType" → "FullyConnected",
    "L2Regularization" → 0.05, MaxTrainingRounds → 24 000}]
pmNNv3 = PredictorMeasurements[pNNv3, finaltest]
pmNNv3["ComparisonPlot"]
pmNNv3["MeanSquare"]
pmNNv3["ResidualPlot"]
Information[pNNv3]

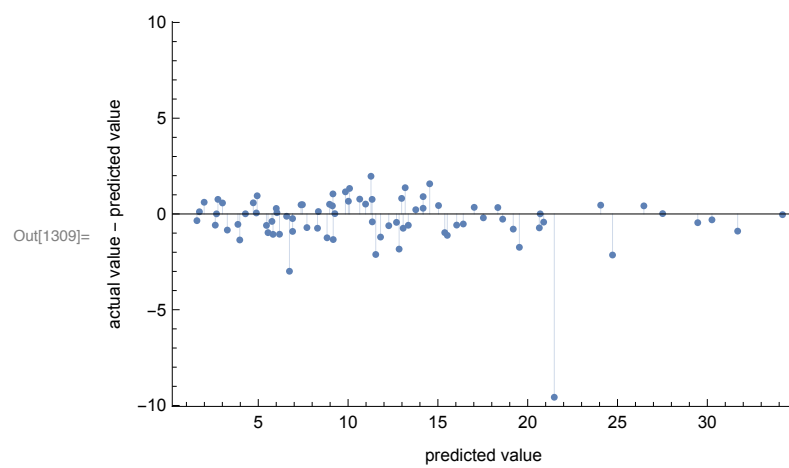
```

Out[1305]= PredictorFunction[ Input type: Mixed (number: 10)
Method: NeuralNetwork]

Out[1306]= PredictorMeasurementsObject[ Predictor: NeuralNetwork
Number of test examples: 80]

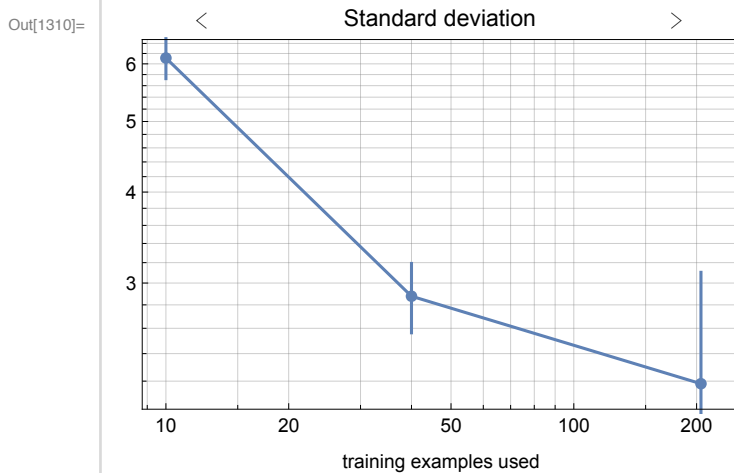


Out[1308]= 1.96365



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.18 ± 0.92
Method	NeuralNetwork
Single evaluation time	2.31 ms/example
Batch evaluation speed	45.4 examples/ms
Loss	1.87 ± 0.22
Model memory	246. kB
Training examples used	256 examples
Training time	2 min 8 s



```

In[1311]:= pDTv2 = Predict[finalTrain, Method → "DecisionTree"]
pmDTv2 = PredictorMeasurements[pDTv2, finaltest]
pmDTv2["ComparisonPlot"]
pmDTv2["MeanSquare"]
pmDTv2["ResidualPlot"]
Information[pDTv2]

```


Out[1311]= PredictorFunction[



Input type: Mixed (number: 10)
 Method: DecisionTree

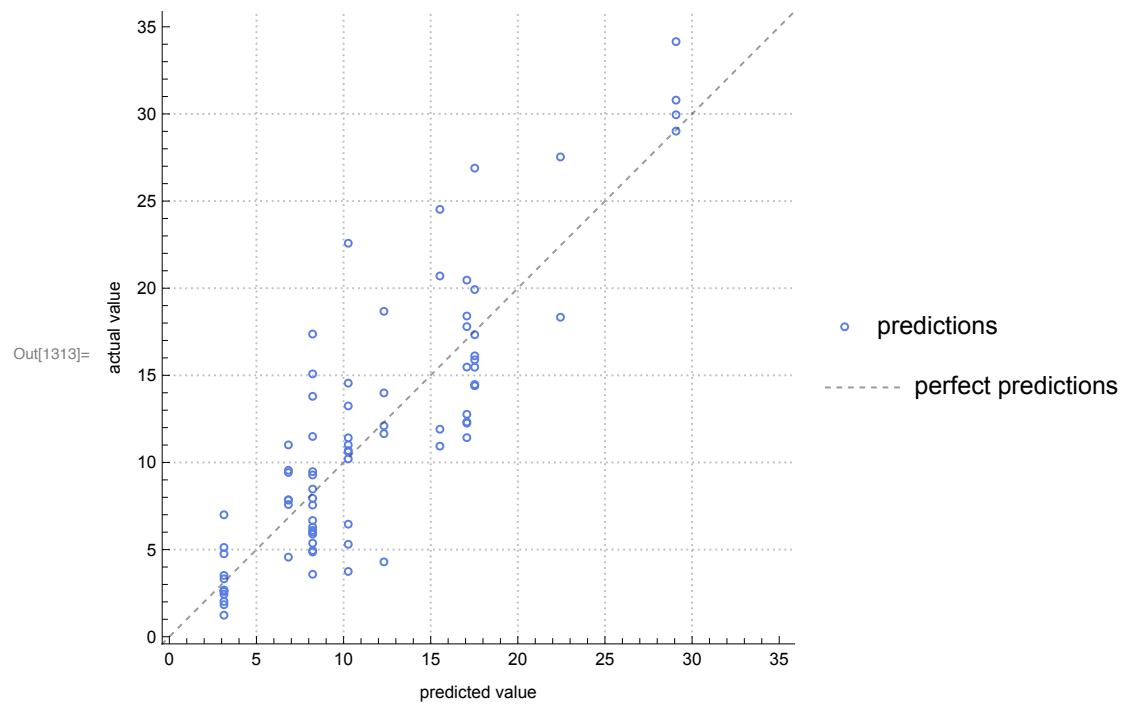
]

Out[1312]= PredictorMeasurementsObject[

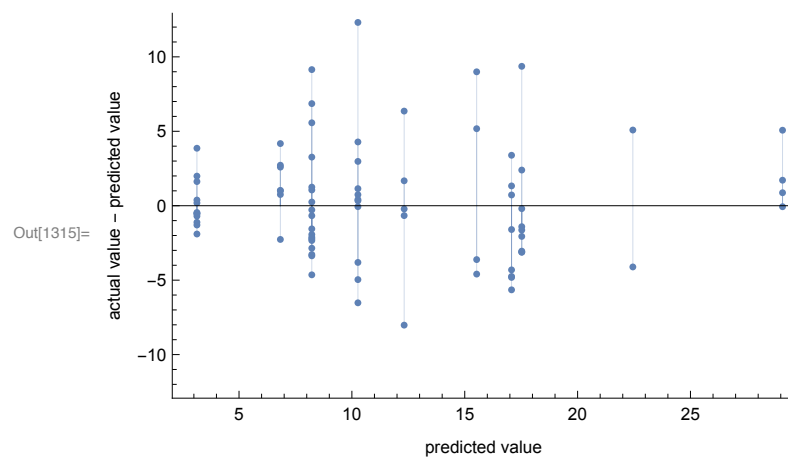


Predictor: DecisionTree
 Number of test examples: 80

]

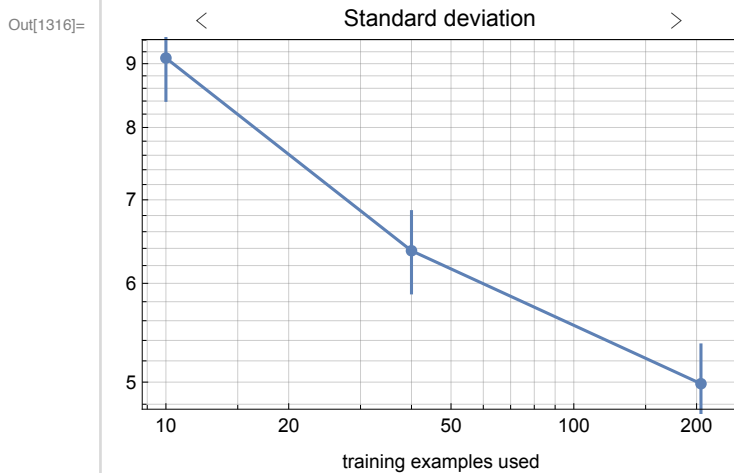


Out[1314]= 14.3214



Predictor information

Data type	Mixed (number: 10)
Standard deviation	4.99 ± 0.37
Method	DecisionTree
Single evaluation time	1.32 ms/example
Batch evaluation speed	305. examples/ms
Loss	3.01 ± 0.13
Model memory	147. kB
Training examples used	256 examples
Training time	355. ms




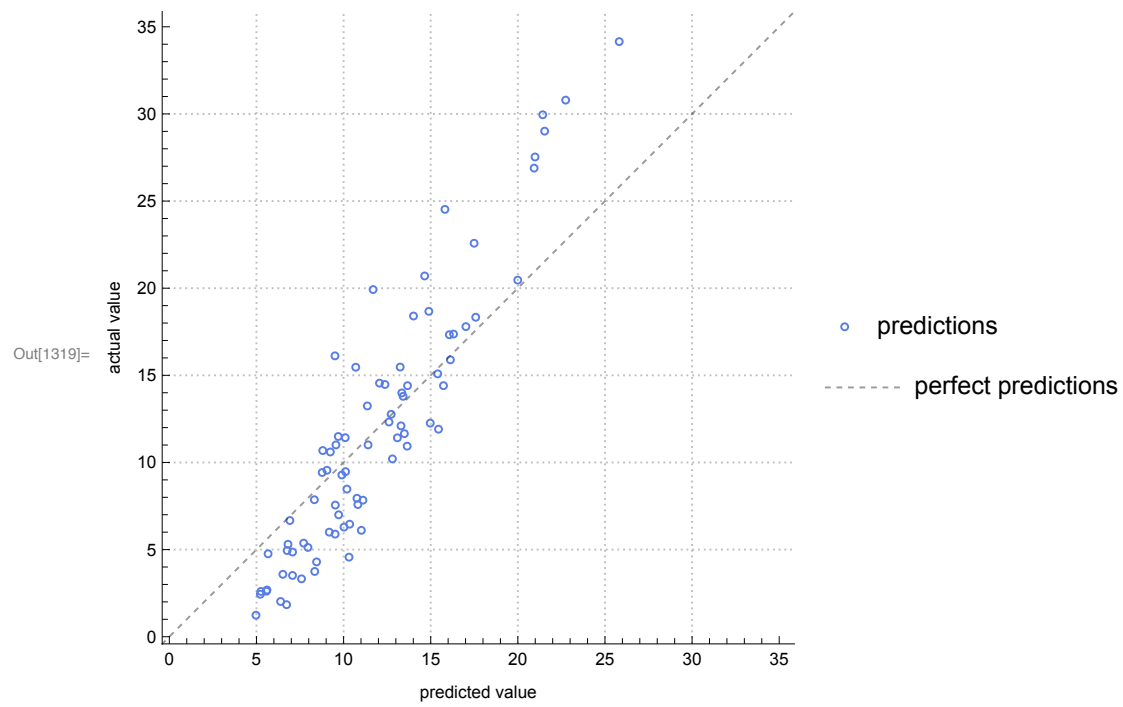
```

In[1317]:= pNearestv2 = Predict[finalTrain, Method → "NearestNeighbors"]
pmNearestv2 = PredictorMeasurements[pNearestv2, finaltest]
pmNearestv2["ComparisonPlot"]
pmNearestv2["MeanSquare"]
pmNearestv2["ResidualPlot"]
Information[pNearestv2]

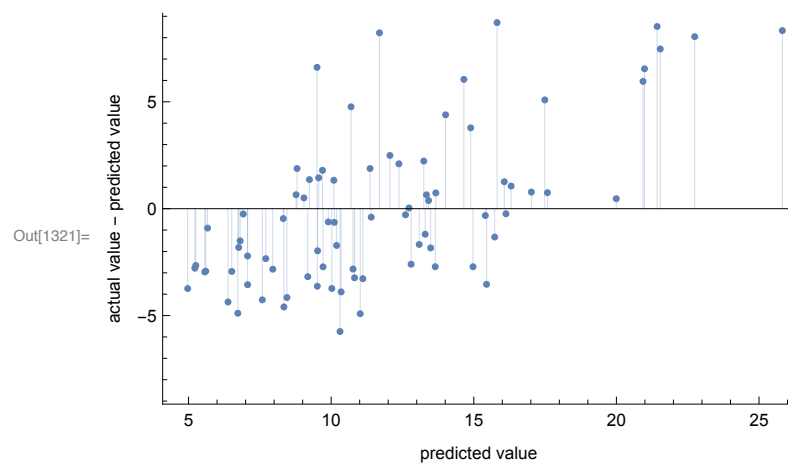
```

Out[1317]= PredictorFunction[ Input type: Mixed (number: 10)
Method: NearestNeighbors]

Out[1318]= PredictorMeasurementsObject[ Predictor: NearestNeighbors
Number of test examples: 80]



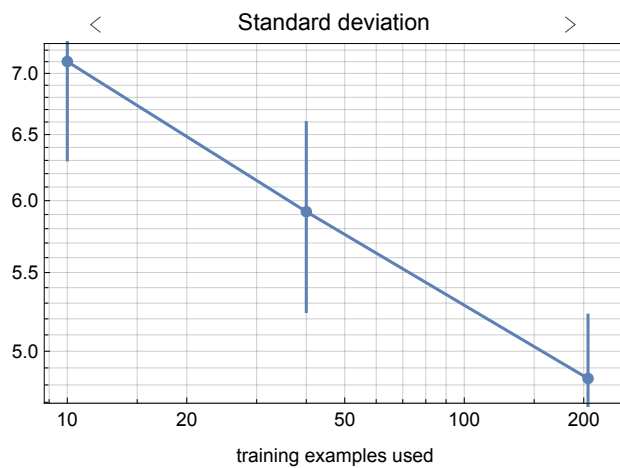
Out[1320]= 13.4224



Predictor information

Data type	Mixed (number: 10)
Standard deviation	4.84 ± 0.39
Method	NearestNeighbors
Single evaluation time	1.28 ms/example
Batch evaluation speed	86.2 examples/ms
Loss	3.02 ± 0.045
Model memory	171. kB
Training examples used	256 examples
Training time	350. ms

Out[1322]=




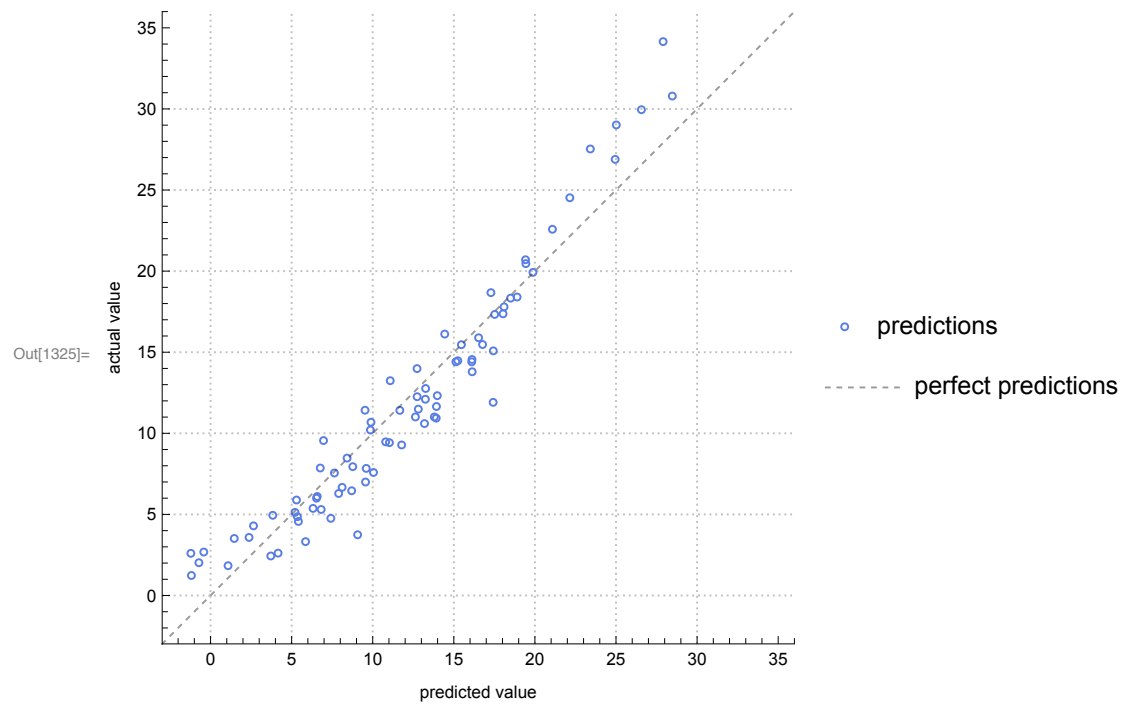
```

In[1323]:= pLRv2 = Predict[finalTrain, Method → "LinearRegression"]
pmLRv2 = PredictorMeasurements[pLRv2, finaltest]
pmLRv2["ComparisonPlot"]
pmLRv2["MeanSquare"]
pmLRv2["ResidualPlot"]
Information[pLRv2]

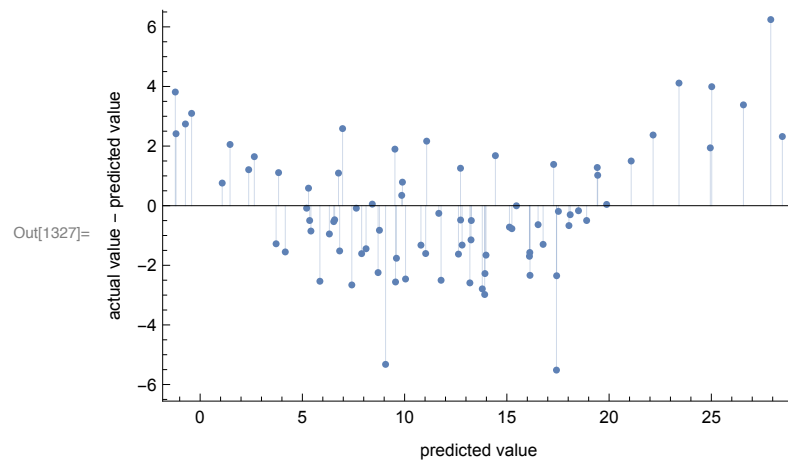
```

Out[1323]= PredictorFunction [ Input type: Mixed (number: 10)
Method: LinearRegression]

Out[1324]= PredictorMeasurementsObject [ Predictor: LinearRegression
Number of test examples: 80]

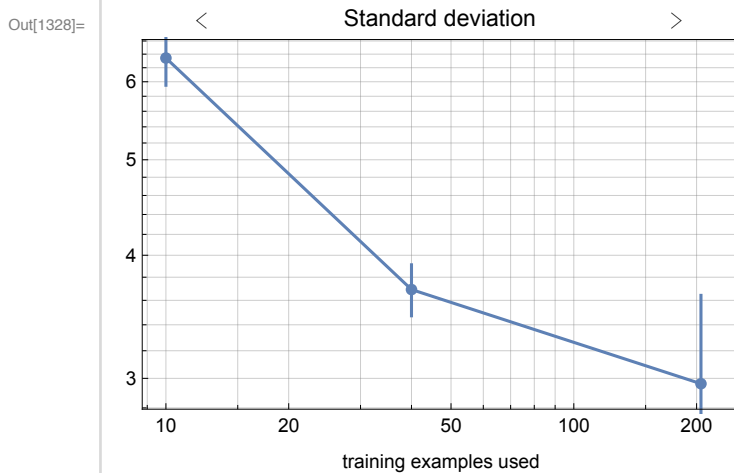


Out[1326]= 4.374



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.96 ± 0.68
Method	LinearRegression
Single evaluation time	1.54 ms/example
Batch evaluation speed	234. examples/ms
Loss	2.42 ± 0.12
Model memory	281. kB
Training examples used	256 examples
Training time	1.43 s




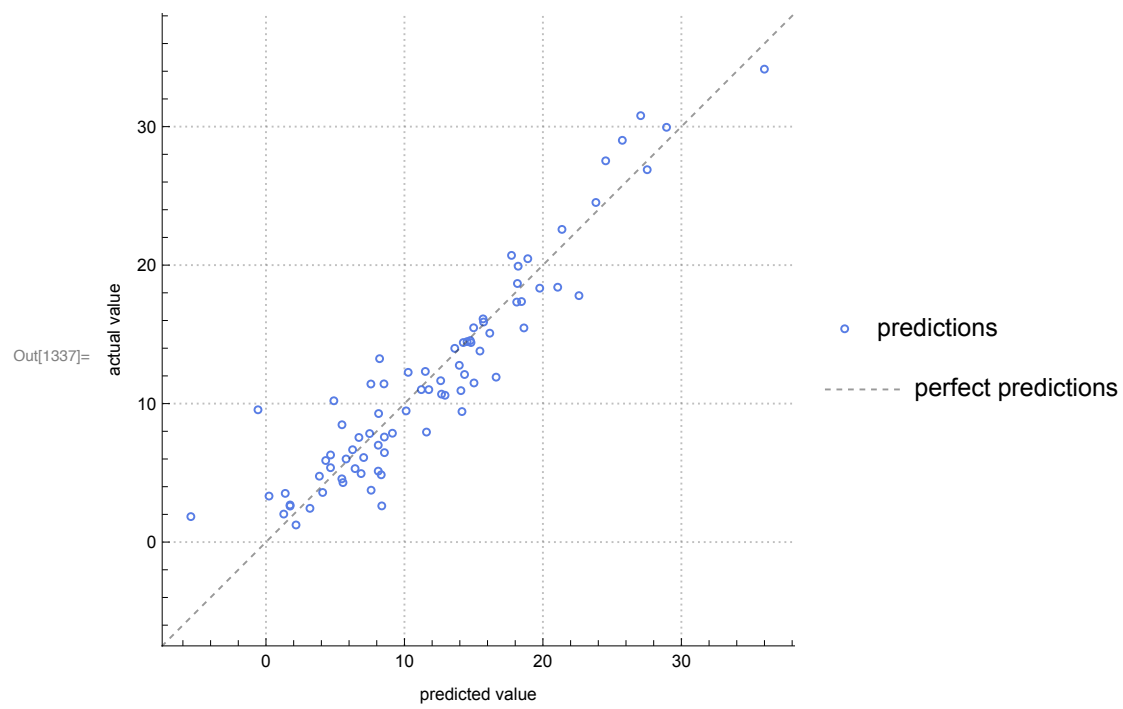
```

In[1335]:= pNNnoReg = Predict[finalTrain, Method → {"NeuralNetwork", "NetworkDepth" → 3,
            "NetworkType" → "FullyConnected", MaxTrainingRounds → 24 000}]
pmNNnoReg = PredictorMeasurements[pNNnoReg, finaltest]
pmNNnoReg["ComparisonPlot"]
pmNNnoReg["MeanSquare"]
pmNNnoReg["ResidualPlot"]
Information[pNNnoReg]

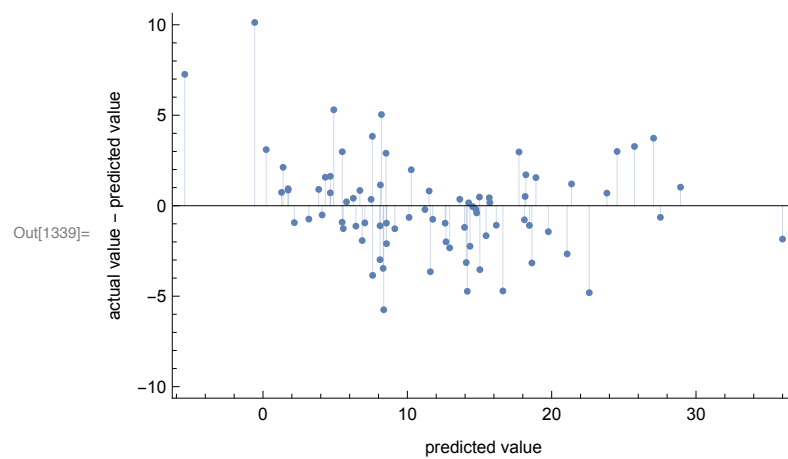
```

Out[1335]= PredictorFunction [ Input type: Mixed (number: 10)
Method: NeuralNetwork]

Out[1336]= PredictorMeasurementsObject [ Predictor: NeuralNetwork
Number of test examples: 80]



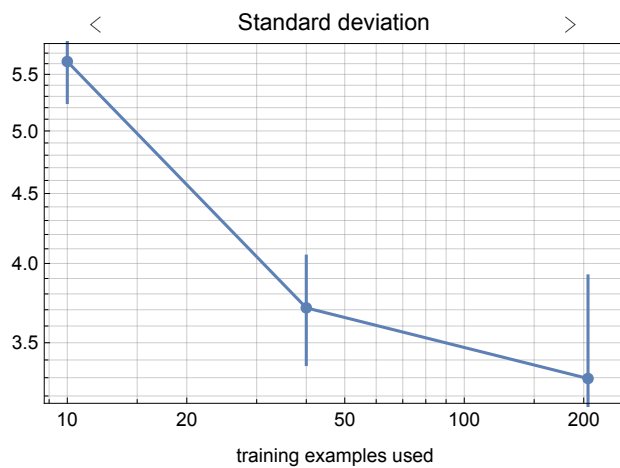
Out[1338]= 6.99146



Predictor information

Data type	Mixed (number: 10)
Standard deviation	3.30 ± 0.62
Method	NeuralNetwork
Single evaluation time	2.26 ms/example
Batch evaluation speed	46.9 examples/ms
Loss	2.57 ± 0.14
Model memory	246. kB
Training examples used	256 examples
Training time	2 min 4 s

Out[1340]=



```

In[1341]:= pNN2layer = Predict[finalTrain, Method →
  {"NeuralNetwork", "NetworkDepth" → 2, "NetworkType" → "FullyConnected",
    "L2Regularization" → 0.05, MaxTrainingRounds → 24 000}]
pmNN2layer = PredictorMeasurements[pNN2layer, finaltest]
pmNN2layer["ComparisonPlot"]
pmNN2layer["MeanSquare"]
pmNN2layer["ResidualPlot"]
Information[pNN2layer]

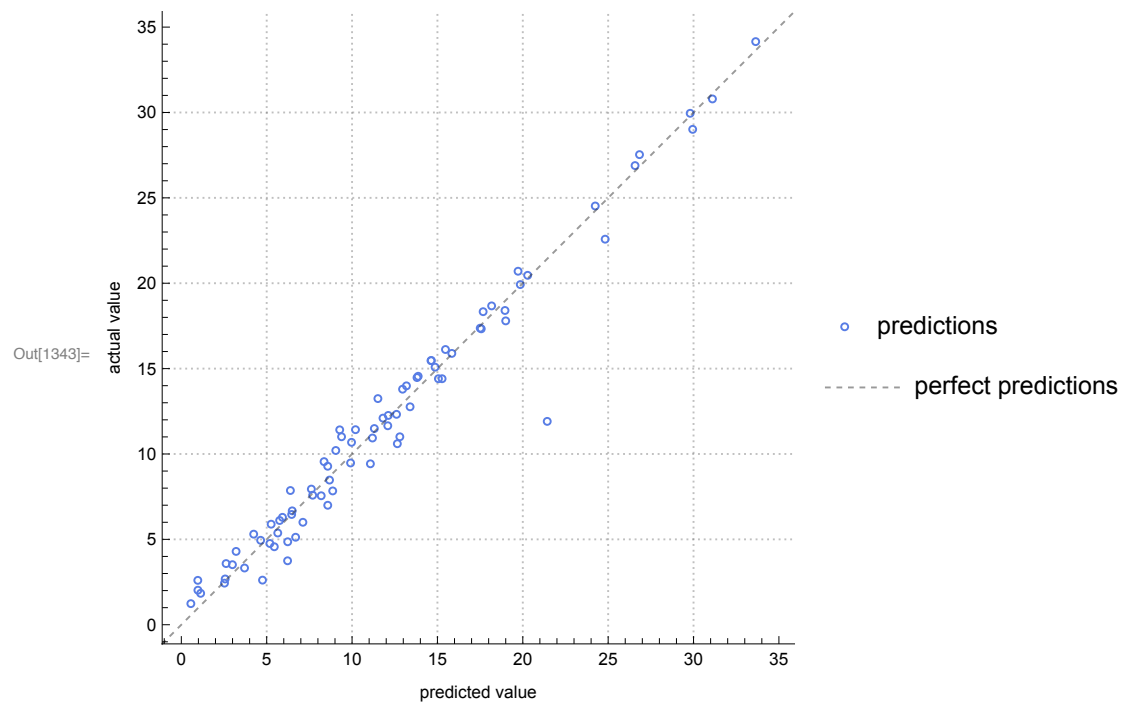
```

Out[1341]=

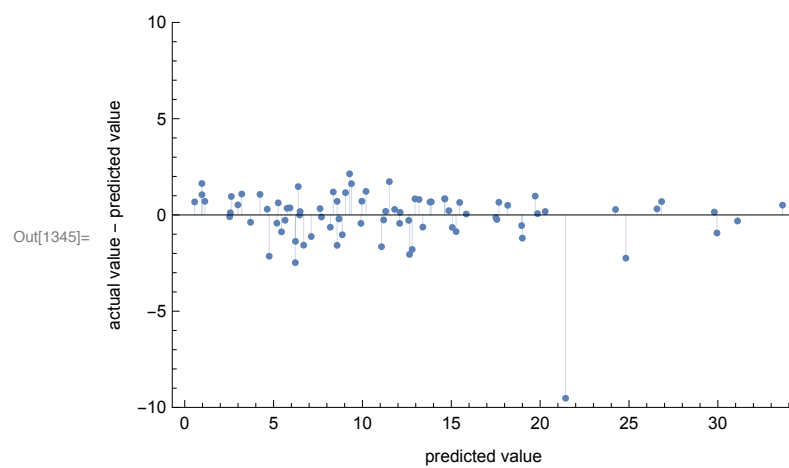
PredictorFunction [ Input type: Mixed (number: 10)
Method: NeuralNetwork]

Out[1342]=

PredictorMeasurementsObject [ Predictor: NeuralNetwork
Number of test examples: 80]



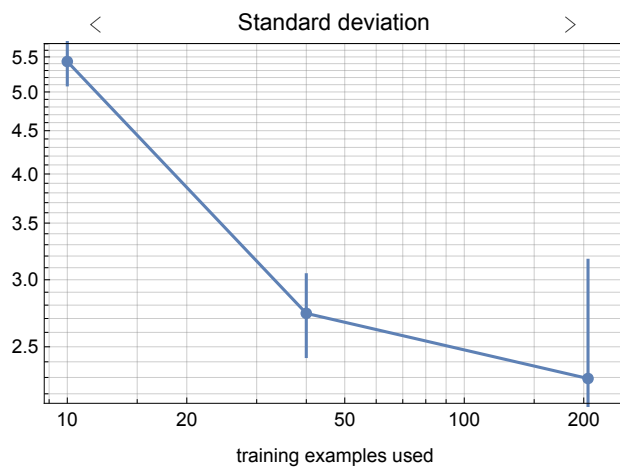
Out[1344]= 2.07432



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.29 ± 0.87
Method	NeuralNetwork
Single evaluation time	2.13 ms/example
Batch evaluation speed	52.9 examples/ms
Loss	2.08 ± 0.28
Model memory	226. kB
Training examples used	256 examples
Training time	1 min 55 s

Out[1346]=



```

In[1347]:= pNN4layer = Predict[finalTrain, Method →
  {"NeuralNetwork", "NetworkDepth" → 4, "NetworkType" → "FullyConnected",
    "L2Regularization" → 0.05, MaxTrainingRounds → 24 000}]
pmNN4layer = PredictorMeasurements[pNN4layer, finaltest]
pmNN4layer["ComparisonPlot"]
pmNN4layer["MeanSquare"]
pmNN4layer["ResidualPlot"]
Information[pNN4layer]

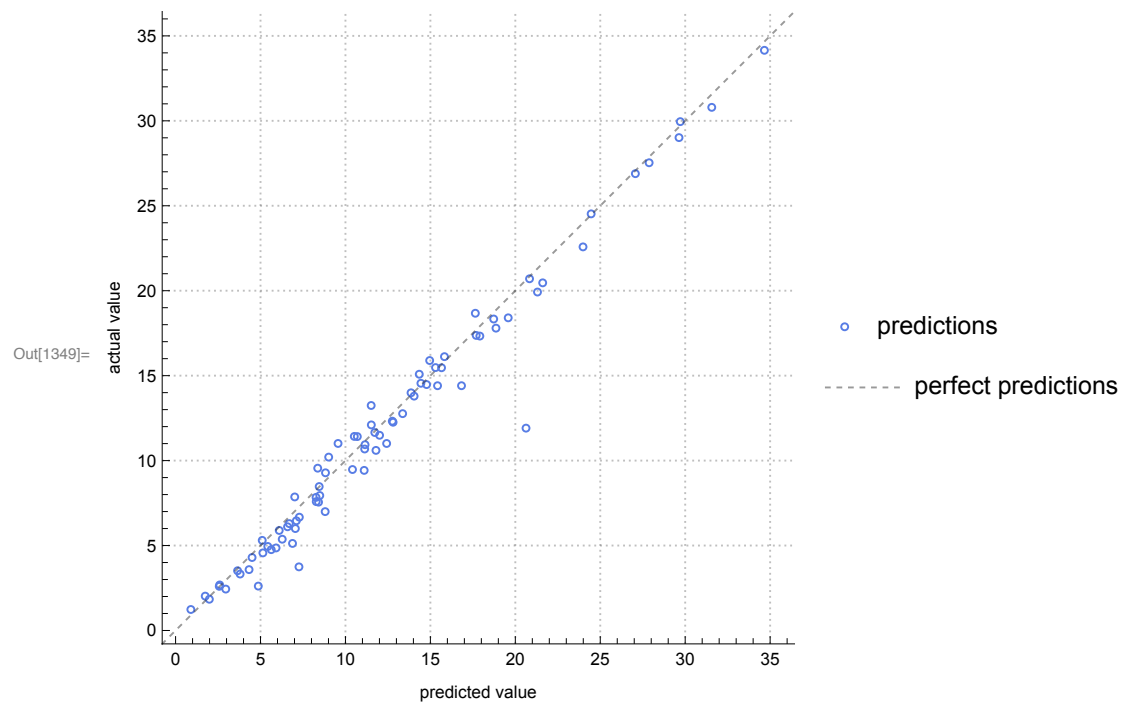
```

Out[1347]=

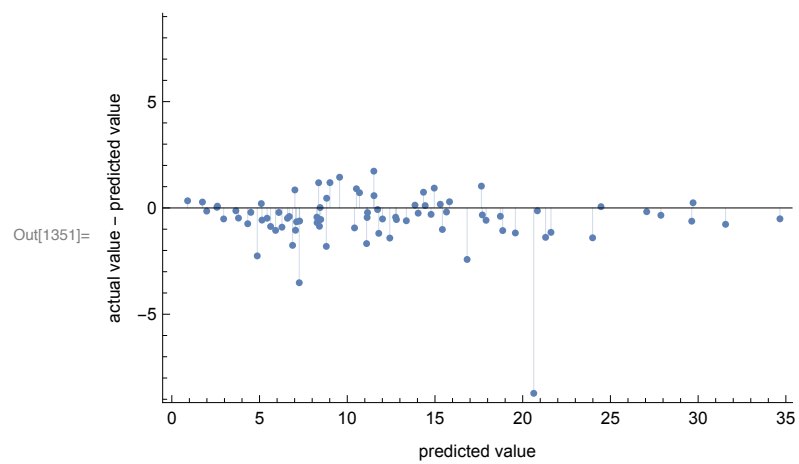
PredictorFunction [ Input type: Mixed (number: 10)
Method: NeuralNetwork]

Out[1348]=

PredictorMeasurementsObject [ Predictor: NeuralNetwork
Number of test examples: 80]



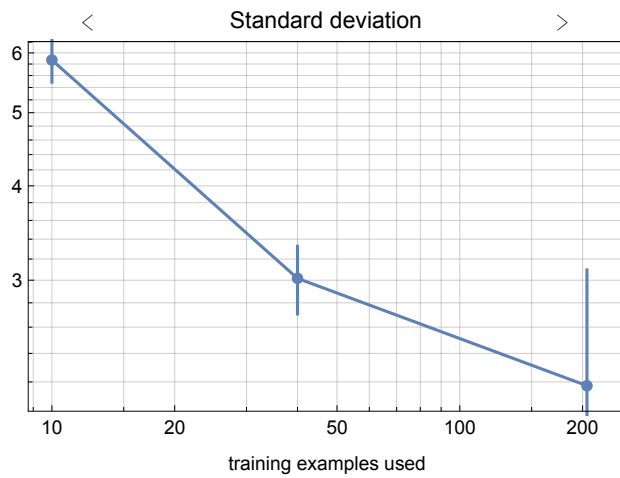
Out[1350]= 1.83864



Predictor information

Data type	Mixed (number: 10)
Standard deviation	2.17 ± 0.92
Method	NeuralNetwork
Single evaluation time	2.17 ms/example
Batch evaluation speed	46.9 examples/ms
Loss	1.88 ± 0.20
Model memory	260. kB
Training examples used	256 examples
Training time	2 min 9 s


Out[1352]=



```

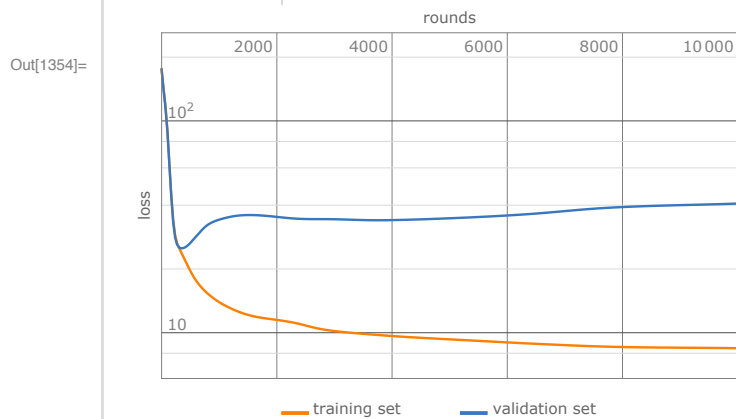
In[1353]:= netSimple400v2 = NetChain[{10, BatchNormalizationLayer[],
    Tanh, 30, 30, 30, 30, 30, BatchNormalizationLayer[], Tanh, 1}]
trainedNetSimple400v2 = NetTrain[netSimple400v2, finalTrain,
    All, ValidationSet → finaltest, MaxTrainingRounds → 10 000,
    Method → {"ADAM", "LearningRate" → 0.0005, "L2Regularization" → 0.3}]

```

Out[1353]= NetChain[
 Input port: array
 Output port: vector (size: 1)
 Number of layers: 10
]

NetTrain Results

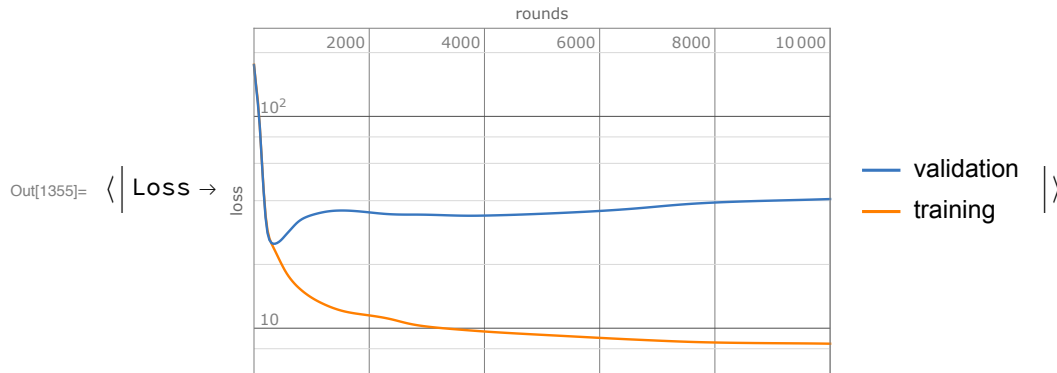
summary	batches: 40 000, rounds: 10 000, time: 45s, examples/s: 57 164
data	training examples: 256, validation examples: 80, processed examples: 2 560 000, skipped examples: 0
method	ADAM optimizer, batch size 64, CPU
round	loss: 8.45
validation	loss: 4.07×10^1




```

In[1355]:= trainedNetSimple400v2["FinalPlots"]
trainedNetSimple400v2["TotalTrainingTime"]
trainedNetSimple400v2["RoundMeasurements"]
best = trainedNetSimple400v2["BestValidationRound"]
trainedNetSimple400v2["ValidationLossList"][[best]]
NetInformation[trainedNetSimple400v2["TrainedNet"], "MXNetNodeGraphPlot"]
NetInformation[trainedNetSimple400v2["TrainedNet"], "SummaryGraphic"]

```

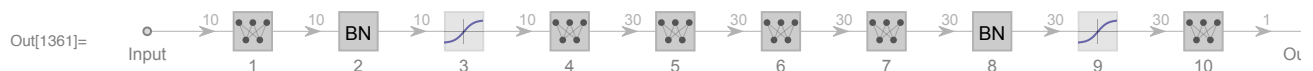
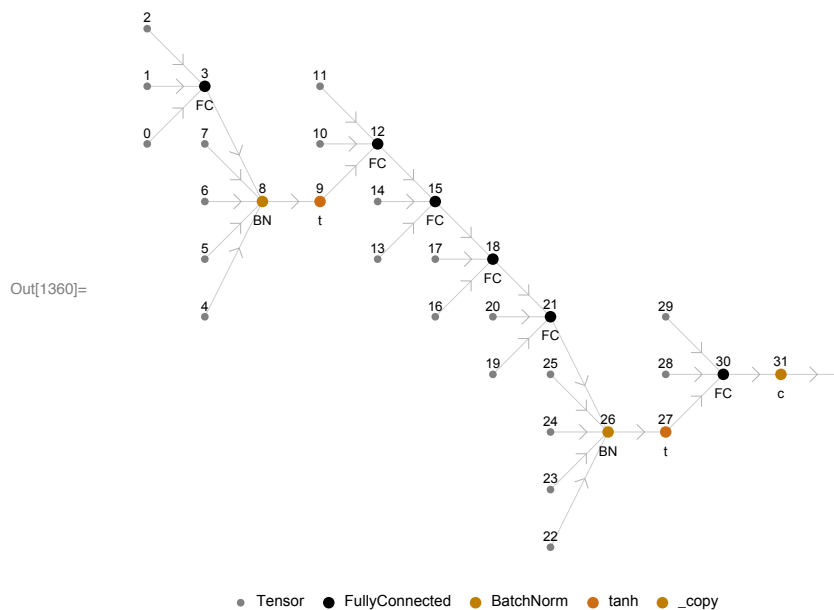


Out[1356]= 44.7837

Out[1357]= $\langle \text{Loss} \rightarrow 8.44841 \rangle$

Out[1358]= 380


Out[1359]= 25.0069

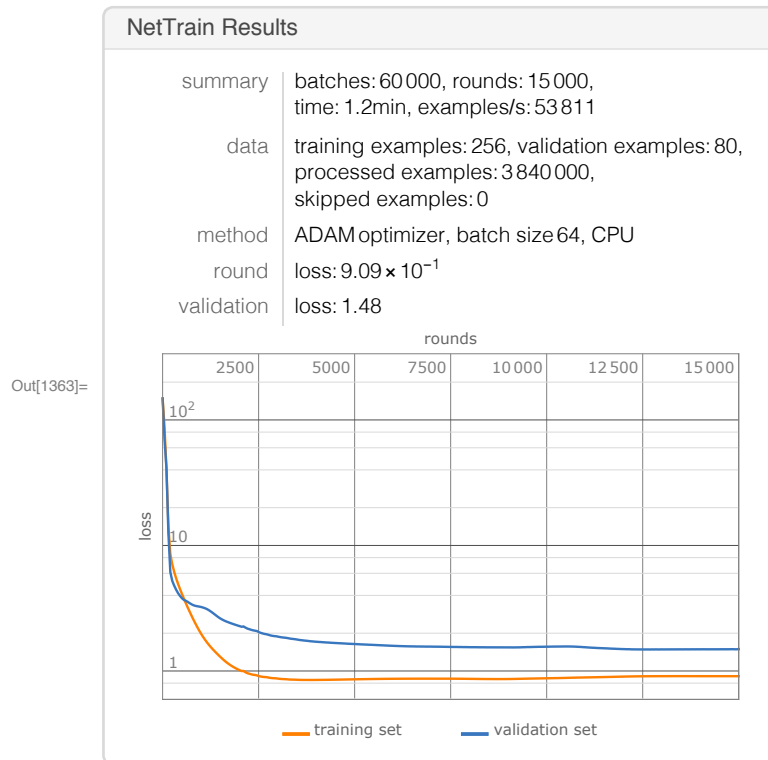


```

In[1362]:= netSimple400v3 = NetChain[{BatchNormalizationLayer[],
    Tanh, 50, 50, 50, 50, 50, 50, BatchNormalizationLayer[], Tanh, 1}]
trainedNetSimple400v3 = NetTrain[netSimple400v3, finalTrain,
    All, ValidationSet → finaltest, MaxTrainingRounds → 15 000,
    Method → {"ADAM", "LearningRate" → 0.0005, "L2Regularization" → 0.05}]

```

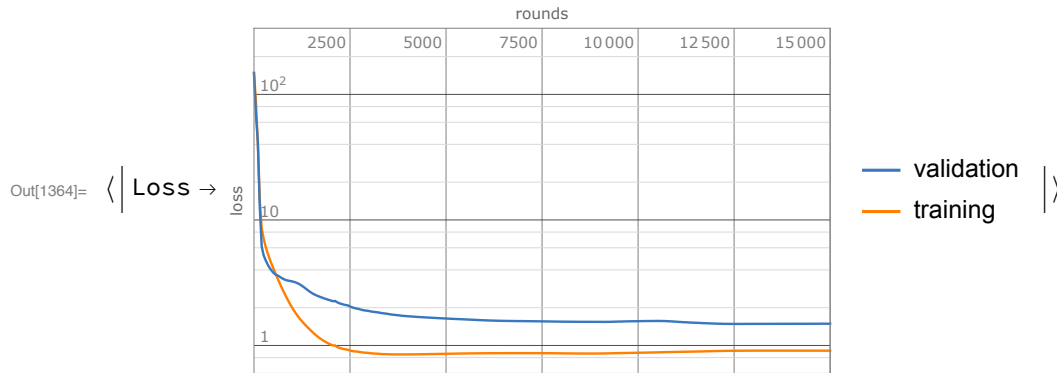
Out[1362]= NetChain[
 uninitialized
 Input port: array of rank ≥ 1
 Output port: vector (size: 1)
 Number of layers: 11
]



```

In[1364]:= trainedNetSimple400v3["FinalPlots"]
trainedNetSimple400v3["TotalTrainingTime"]
trainedNetSimple400v3["RoundMeasurements"]
best = trainedNetSimple400v3["BestValidationRound"]
trainedNetSimple400v3["ValidationLossList"][[best]]
NetInformation[trainedNetSimple400v3["TrainedNet"], "MXNetNodeGraphPlot"]
NetInformation[trainedNetSimple400v3["TrainedNet"], "SummaryGraphic"]

```

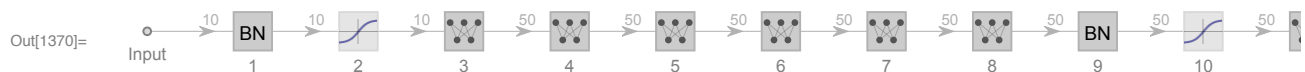


Out[1365]= 71.3604

Out[1366]= $\langle \text{Loss} \rightarrow 0.908735 \rangle$

Out[1367]= 12 853

Out[1368]= 1.46082



```
In[1371]:= netSimple400v4 = NetChain[{BatchNormalizationLayer[],  
    Tanh, 50, 50, 50, 50, 50, BatchNormalizationLayer[], Tanh, 1}]  
trainedNetSimple400v4 = NetTrain[netSimple400v4, finalTrain,  
    All, ValidationSet -> finaltest, MaxTrainingRounds -> 15 000,  
    Method -> {"ADAM", "LearningRate" -> 0.0005, "L2Regularization" -> 0.05}]
```

Out[1371]= NetChain[

uninitialized

Input port:

array of rank ≥ 1

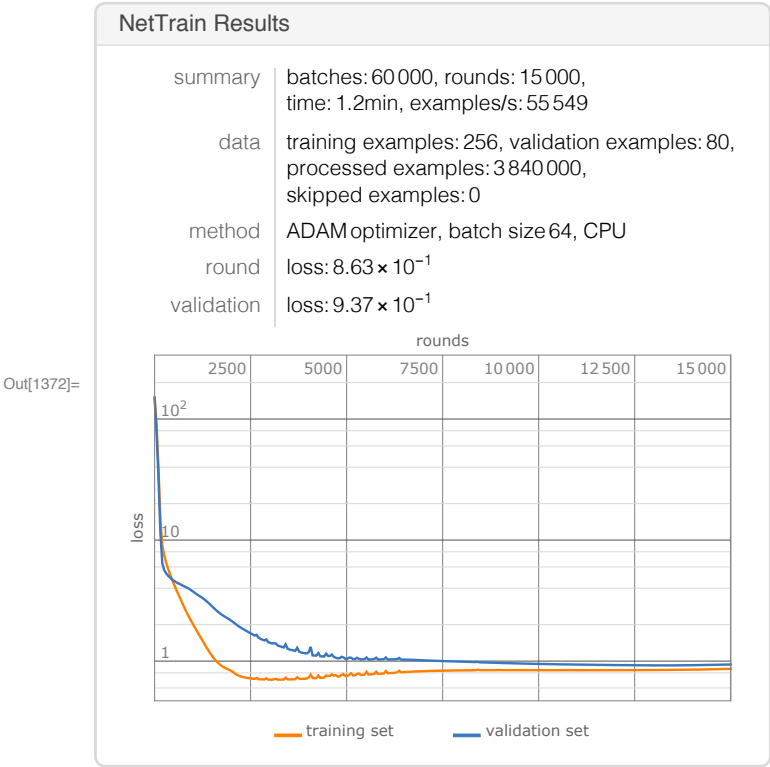
Output port:

vector (size: 1)

Number of layers:

10

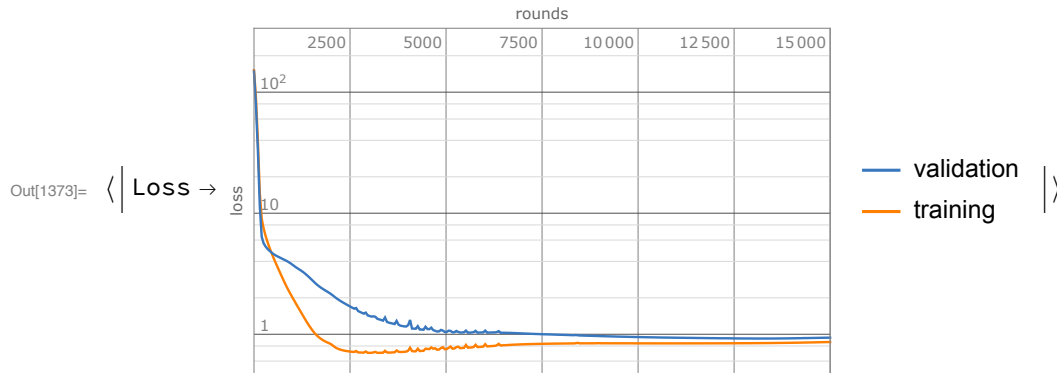
]



```

In[1373]:= trainedNetSimple400v4["FinalPlots"]
trainedNetSimple400v4["TotalTrainingTime"]
trainedNetSimple400v4["RoundMeasurements"]
best = trainedNetSimple400v4["BestValidationRound"]
trainedNetSimple400v4["ValidationLossList"][[best]]
NetInformation[trainedNetSimple400v4["TrainedNet"], "MXNetNodeGraphPlot"]
NetInformation[trainedNetSimple400v4["TrainedNet"], "SummaryGraphic"]

```

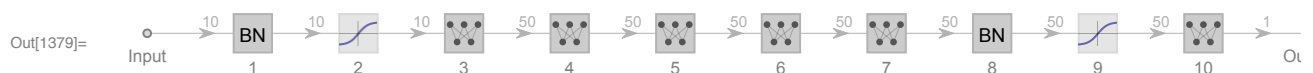
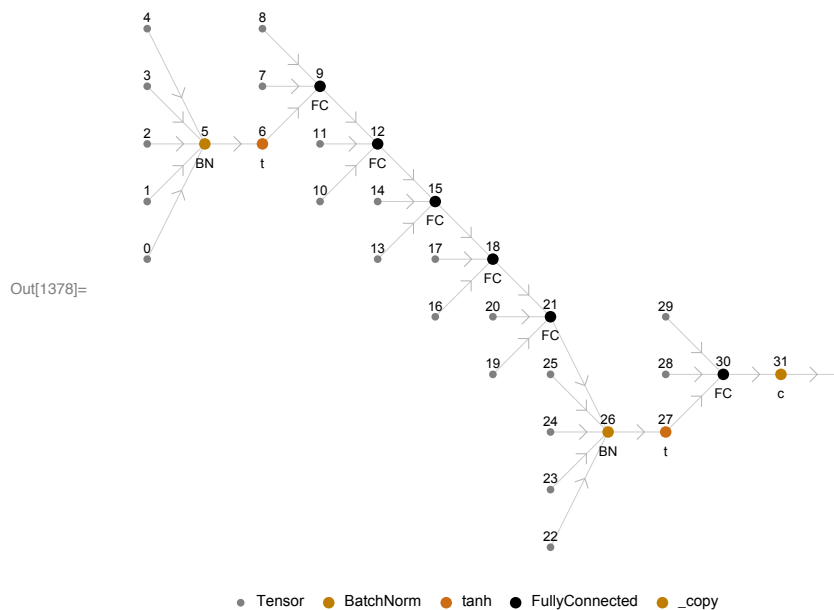


Out[1374]= 69.128

Out[1375]= $\langle \text{Loss} \rightarrow 0.863038 \rangle$

Out[1376]= 13 218

Out[1377]= 0.919938



```
In[1380]:= netSimple400v5 = NetChain[{BatchNormalizationLayer[],  
    Tanh, 50, 50, 50, 50, 50, 50, BatchNormalizationLayer[], Tanh, 1}]  
trainedNetSimple400v5 = NetTrain[netSimple400v5, finalTrain,  
    All, ValidationSet -> finaltest, MaxTrainingRounds -> 15 000,  
    Method -> {"ADAM", "LearningRate" -> 0.0005, "L2Regularization" -> 0.05}]
```

Out[1380]= NetChain[

uninitialized

Input port:

array of rank ≥ 1

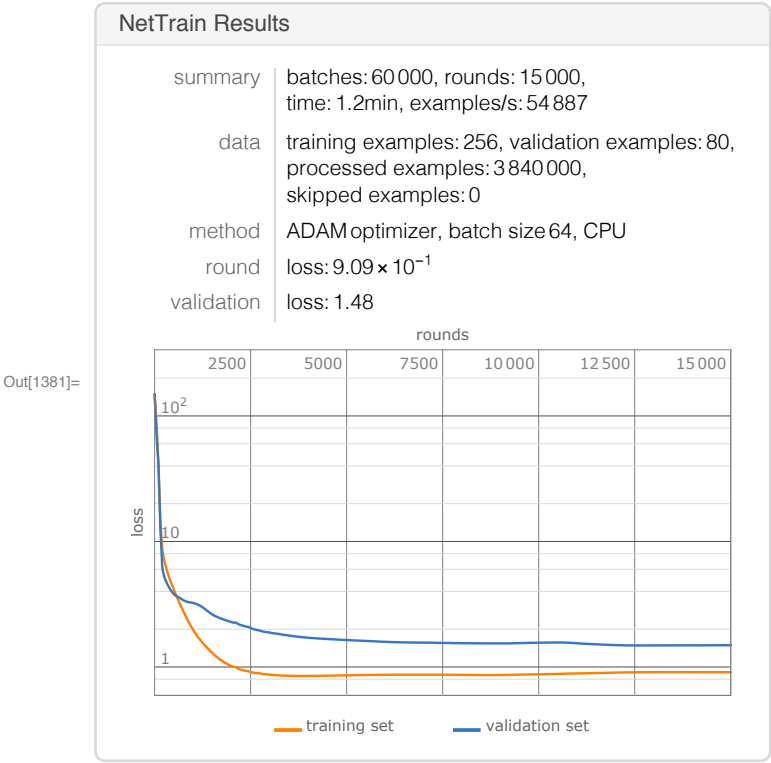
Output port:

vector (size: 1)

Number of layers:

11

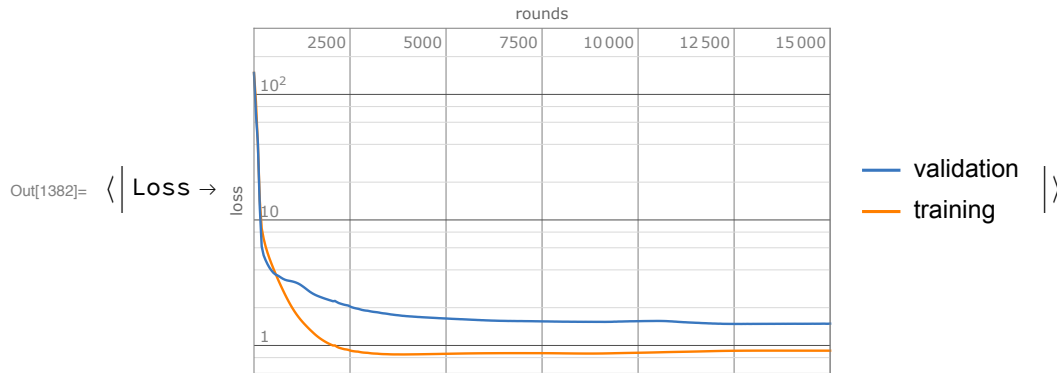
]



```

In[1382]:= trainedNetSimple400v5["FinalPlots"]
trainedNetSimple400v5["TotalTrainingTime"]
trainedNetSimple400v5["RoundMeasurements"]
best = trainedNetSimple400v5["BestValidationRound"]
trainedNetSimple400v5["ValidationLossList"][[best]]
NetInformation[trainedNetSimple400v5["TrainedNet"], "MXNetNodeGraphPlot"]
NetInformation[trainedNetSimple400v5["TrainedNet"], "SummaryGraphic"]

```

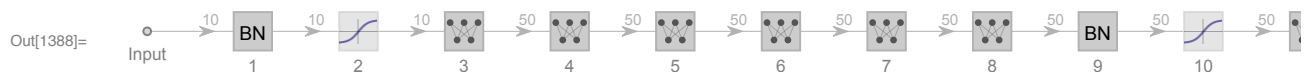


Out[1383]= 69.9616

Out[1384]= $\langle \text{Loss} \rightarrow 0.908735 \rangle$

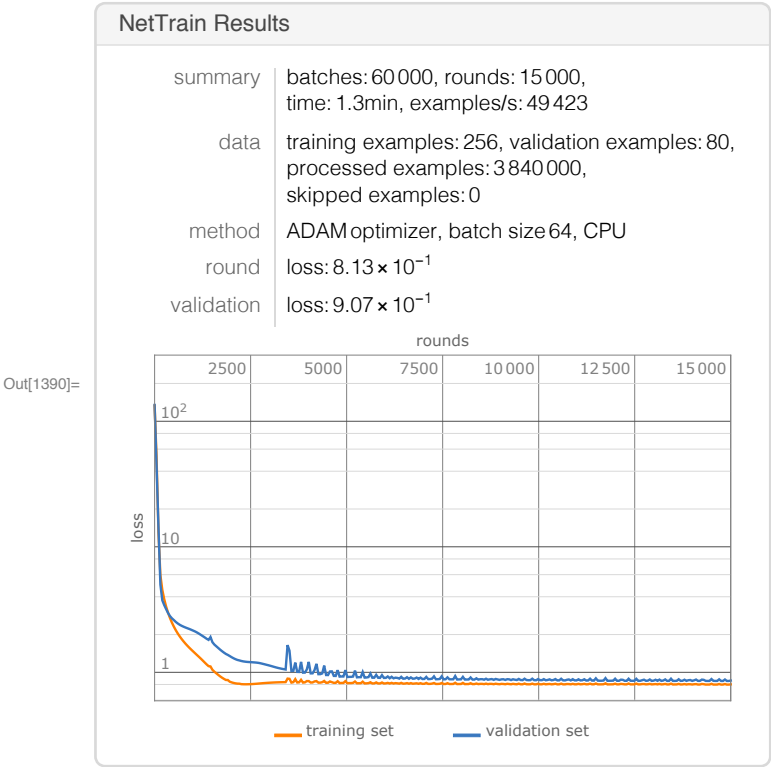
Out[1385]= 12 853

Out[1386]= 1.46082



```
In[1389]:= netSimple400v6 = NetChain[{BatchNormalizationLayer[], Tanh,
    100, 100, 100, 100, 100, BatchNormalizationLayer[], Tanh, 1}]
trainedNetSimple400v6 = NetTrain[netSimple400v6, finalTrain,
    All, ValidationSet -> finaltest, MaxTrainingRounds -> 15 000,
    Method -> {"ADAM", "LearningRate" -> 0.0005, "L2Regularization" -> 0.05}]
```

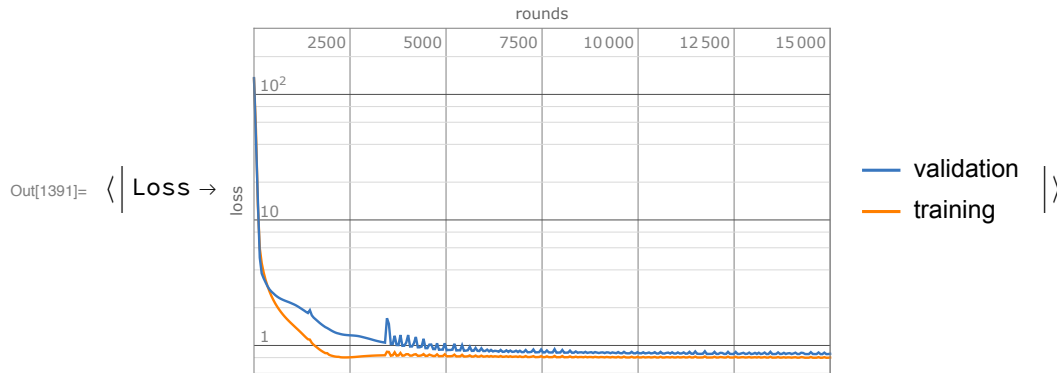
Out[1389]= NetChain[ Input port: array of rank ≥ 1
Output port: vector (size: 1)
Number of layers: 10]




```

In[1391]:= trainedNetSimple400v6["FinalPlots"]
trainedNetSimple400v6["TotalTrainingTime"]
trainedNetSimple400v6["RoundMeasurements"]
best = trainedNetSimple400v6["BestValidationRound"]
trainedNetSimple400v6["ValidationLossList"][[best]]
NetInformation[trainedNetSimple400v6["TrainedNet"], "MXNetNodeGraphPlot"]
NetInformation[trainedNetSimple400v6["TrainedNet"], "SummaryGraphic"]

```

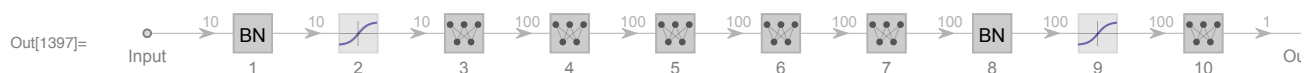
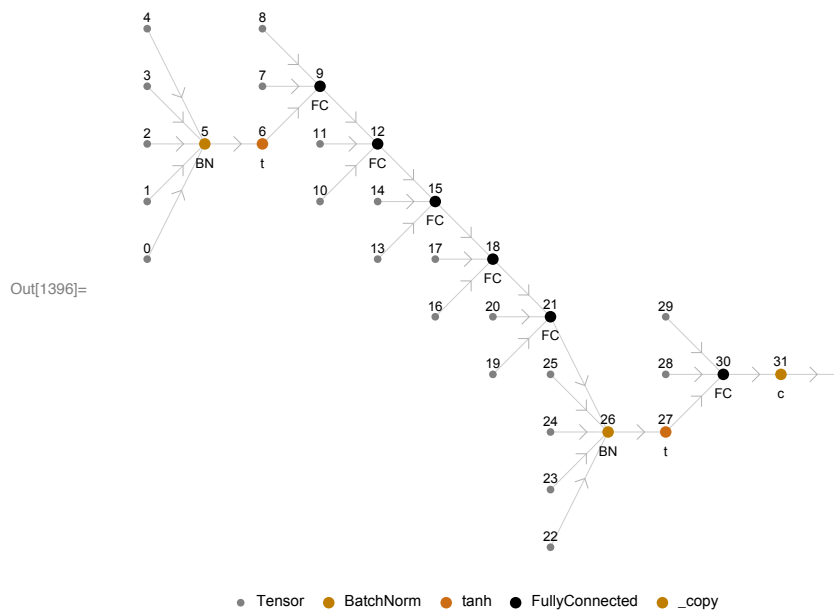


Out[1392]= 77.6971

Out[1393]= $\langle \text{Loss} \rightarrow 0.812835 \rangle$

Out[1394]= 14 281


Out[1395]= 0.827167

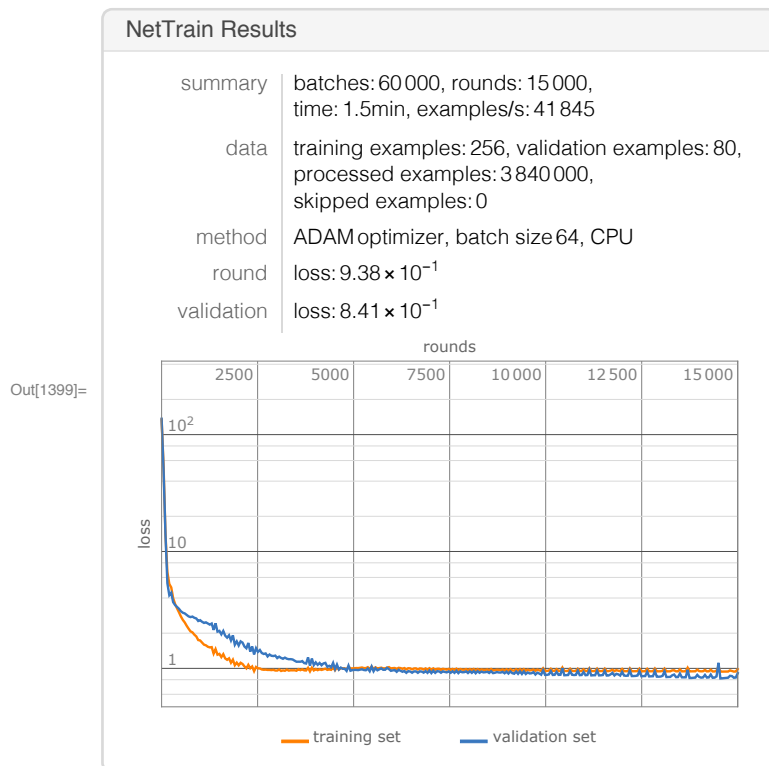


```

In[1398]:= netSimple400v7 = NetChain[{BatchNormalizationLayer[], Tanh,
    100, 100, 100, 100, 100, 100, BatchNormalizationLayer[], Tanh, 1}]
trainedNetSimple400v7 = NetTrain[netSimple400v7, finalTrain,
    All, ValidationSet → finaltest, MaxTrainingRounds → 15 000,
    Method → {"ADAM", "LearningRate" → 0.0005, "L2Regularization" → 0.05}]

```

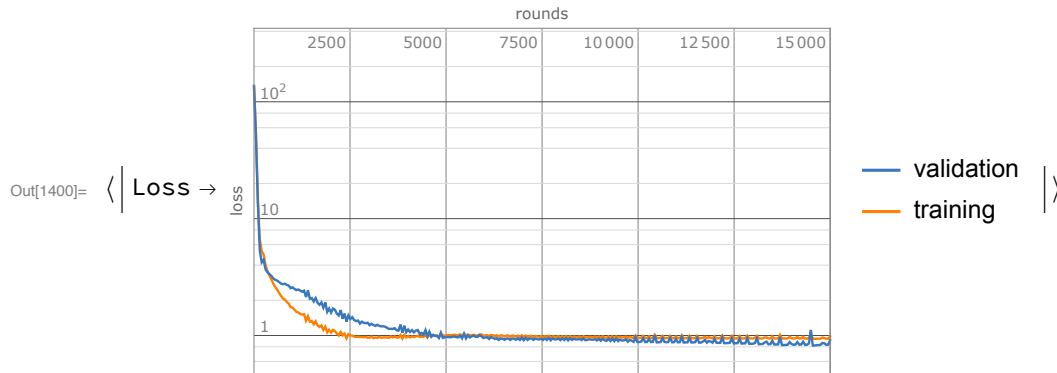
Out[1398]= NetChain[
 Input port: array of rank ≥ 1
 Output port: vector (size: 1)
 Number of layers: 11
]



```

In[1400]:= trainedNetSimple400v7["FinalPlots"]
trainedNetSimple400v7["TotalTrainingTime"]
trainedNetSimple400v7["RoundMeasurements"]
best = trainedNetSimple400v7["BestValidationRound"]
trainedNetSimple400v7["ValidationLossList"][[best]]
NetInformation[trainedNetSimple400v7["TrainedNet"], "MXNetNodeGraphPlot"]
NetInformation[trainedNetSimple400v7["TrainedNet"], "SummaryGraphic"]

```



Out[1401]= 91.7673

Out[1402]= $\langle \text{Loss} \rightarrow 0.937657 \rangle$

Out[1403]= 13 707

Out[1404]= 0.760799

