

Neural Network on fMRI 4 Regions

Lily Jiang (worked with Avery Clowes and Elias Wheatfall)

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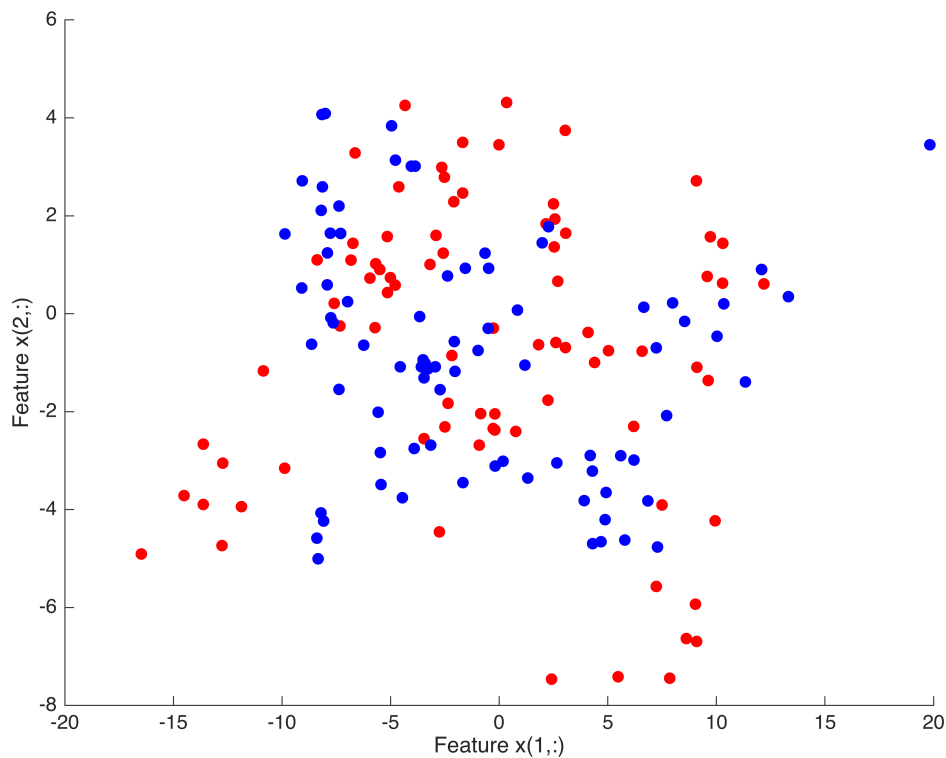
Task: Create your own neural network to analyze the data train4regions data. Pay attention to the dimensions and orientation of the data. You'll need `t` (the answers) to be numbers instead of categories (see the `trainIsFace` variable, which is a logical indicator of whether or not the trial is a face (1) or house (0)).

Configure variables and network

```
load('fMRI4regionsNN.mat');

t = trainIsFace;
x = train4regions;

% Plot data to get an overview
figure;
hold on;
plot(x(1,t==0),x(2,t==0),'r.','MarkerSize',20);
plot(x(1,t==1),x(2,t==1),'b.','MarkerSize',20);
xlabel('Feature x(1,:)');
ylabel('Feature x(2,:)');
hold off;
```



```
trainFcn = 'trainbr'; % trainlm and trainscg
hiddenLayerSize = [3];

net = patternnet(hiddenLayerSize,trainFcn);
net = configure(net,x,t);

% Divide data (note: only need valRatio for trainscg)
net.divideParam.trainRatio = 0.6;
net.divideParam.testRatio = 0.4;
```

Train the network using the train data

```
[net,tr] = train(net,x,t);
```

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```
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    this.PlotDisplayer.displayPlotIfOpen(plotData);
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Error in trainbr (line 67)
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Error in network/train (line 380)
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```

Network Diagram

Training Results

Training finished: Reached maximum mu 

Training Progress

| Unit | Initial Value | Stopped Value | Target Value |
|-------------------|---------------|---------------|--------------|
| Epoch | 0 | 129 | 1000 |
| Elapsed Time | - | 00:00:01 | - |
| Performance | 0.218 | 0.094 | 0 |
| Gradient | 0.1 | 0.0029 | 1e-07 |
| Mu | 0.005 | 5e+10 | 1e+10 |
| Effective # Param | 19 | 15.4 | 0 |
| Sum Squared P... | 24.8 | 121 | 0 |

Training Algorithms

Data Division: Random dividerand

Training: Bayesian Regularization trainbr

Performance: Mean Squared Error mse

Calculations: MEX

Training Plots

Performance

Training State

Error Histogram

Confusion

Receiver Operating Characteristic

Explore the network and the graphs that appear (training plots)

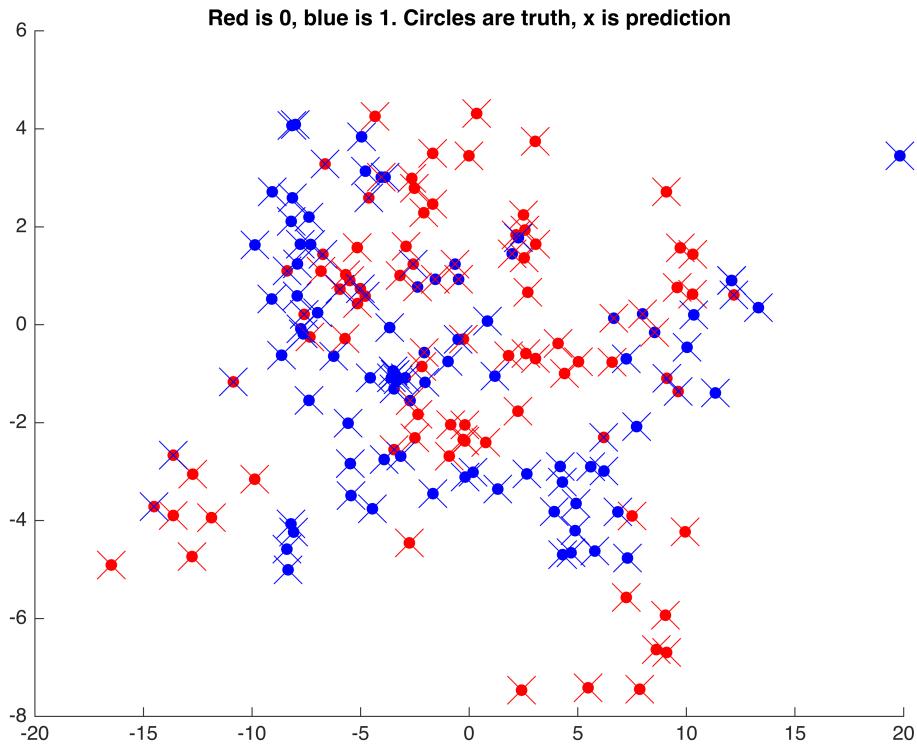
```
train_x = x;
output_y = net(train_x);
output_binary = double(output_y >= .5);

figure;
hold on;
plot(train_x(1,t==0),train_x(2,t==0),'r.','MarkerSize',20);
plot(train_x(1,t==1),train_x(2,t==1),'b.','MarkerSize',20);
```

```

plot(train_x(1,output_binary==0),train_x(2,output_binary==0),'rx','MarkerSize',20);
plot(train_x(1,output_binary==1),train_x(2,output_binary==1),'bx','MarkerSize',20);
hold off;
title('Red is 0, blue is 1. Circles are truth, x is prediction');

```

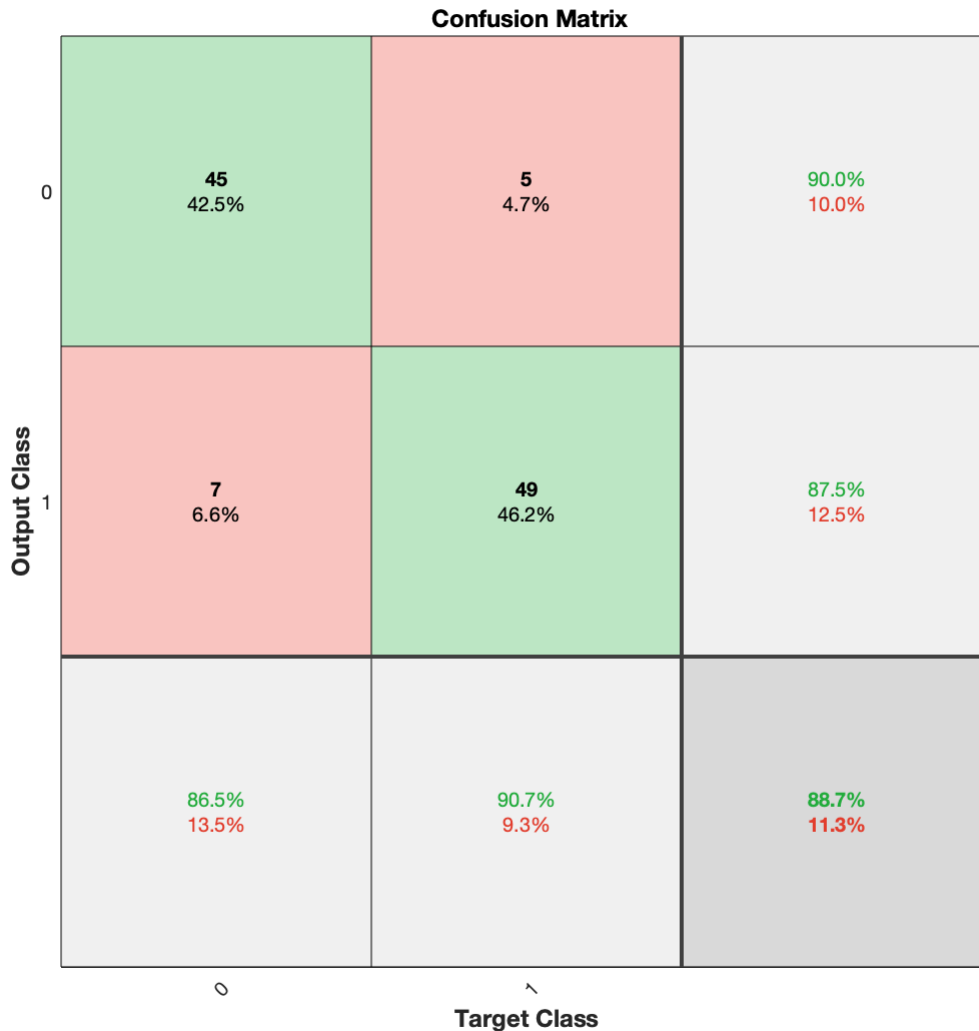


Calculate the accuracy and confusion matrix for the train data

```

plotconfusion(t(tr.trainInd), output_binary(tr.trainInd));

```



Accuracy: 84.9%

Test the network using the test data and calculate the accuracy and confusion matrix

```
t_test = testIsFace;
x_test = test4regions;

net_test = patternnet(hiddenLayerSize,trainFcn);
net_test = configure(net_test,x_test,t_test);

[net_test,tr_test] = train(net_test,x_test,t_test);
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```

Network Diagram

Training Results

Training finished: Reached minimum gradient ✓

Training Progress

| Unit | Initial Value | Stopped Value | Target Value |
|-------------------|---------------|---------------|--------------|
| Epoch | 0 | 46 | 1000 |
| Elapsed Time | - | 00:00:01 | - |
| Performance | 0.2 | 9.78e-10 | 0 |
| Gradient | 0.194 | 2.62e-08 | 1e-07 |
| Mu | 0.005 | 0.0005 | 1e+10 |
| Effective # Param | 19 | 10.1 | 0 |
| Sum Squared P... | 24.8 | 2.24e+03 | 0 |

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Data Division: Random dividerand

Training: Bayesian Regularization trainbr

Performance: Mean Squared Error mse

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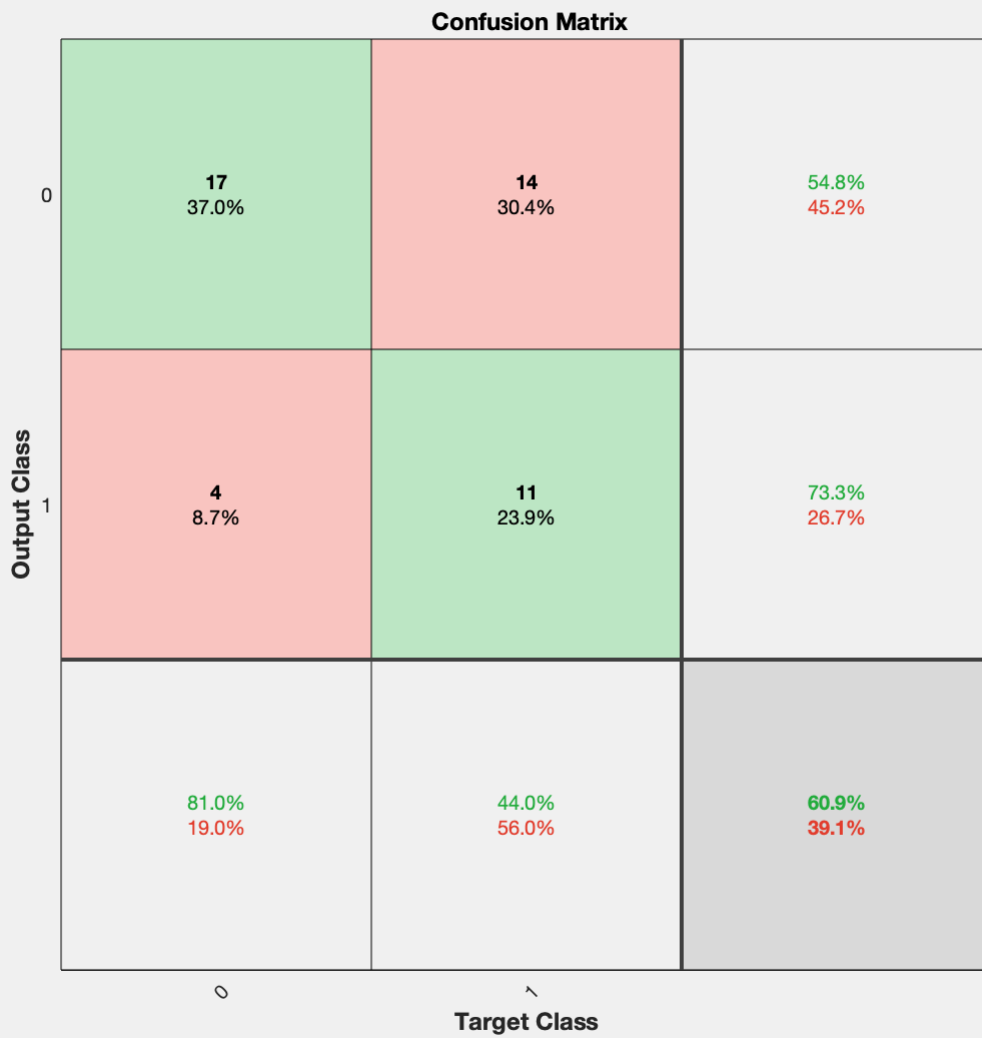
Confusion

Receiver Operating Characteristic

```
output_y_test = net(x_test);  
output_binary_test = double(output_y_test >= .5);
```

Get the confusion matrix:

```
plotconfusion(t_test(tr_test.trainInd),  
output_binary_test(tr_test.trainInd));
```



Accuracy: 60.9%