

```
clear;
clc;
close all
```

LOADING DATASET

```
filename='Explant_ResponseGroup_Allprot_DEGs.xlsx';
% note: duplicated gene removed from Allprot dat.

tbl_exp_dat=readtable(filename,...
    'Sheet','DEG expression');

tbl_target_class=readtable(filename,...
    'Sheet','Target labels');

tbl_deg_pval=readtable(filename,...
    'Sheet','DEG pvals');

% expression data (to be normalized)
exp_dat_raw=table2array(tbl_exp_dat(:,2:end));
% gene names (input variable)
gene_name=tbl_exp_dat.GeneName;
% target labels (output labels)
class_label_dat = table2array(tbl_target_class);
% p-value (just for inform)
p_val=tbl_deg_pval.DEGs_Pval;

% drug response --> class labels
class_label = zeros(3,size(class_label_dat,2));
class_label(1,ismember(class_label_dat,{'NR'})) = 1;
class_label(2,ismember(class_label_dat,{'RD'})) = 1;
class_label(3,ismember(class_label_dat,{'PR'})) = 1;
```

Expression data normalization

predictor = expression data (normalized)

```
tmp_min = repmat(min(exp_dat_raw)',1,size(exp_dat_raw,2));
tmp_max = repmat(max(exp_dat_raw)',1,size(exp_dat_raw,2));
predictor = (exp_dat_raw - tmp_min)./(tmp_max - tmp_min);
```

RUN THE SIMULATION

```
No_cross_val = 50;
No_sample = size(predictor,2);

% random sampling for train (80%) and test (20%)
for ii = 1:No_cross_val
    rng(ii); % random number seed for reproducibility
    [train_sample_idx(ii,:),~,test_sample_idx(ii,:)] = dividerand(No_sample,0.8,0.0,0.2);
end
```

```

nd1 = No_cross_val;

parfor idx1 = 1:nd1

    disp(idx1)

    % copy variables for par
    predictor_par = predictor;
    train_sample_idx_par = train_sample_idx;
    test_sample_idx_par = test_sample_idx;
    class_label_par = class_label;

    % random sampling for training an test
    train_idx=train_sample_idx_par(idx1,:);
    test_idx=test_sample_idx_par(idx1,:);

    % Train & Test data
    predictor_train = predictor_par(:,train_idx); % training input
    predictor_test = predictor_par(:,test_idx); % test input

    class_label_train = class_label_par(:,train_idx);
    class_label_true = class_label_par(:,test_idx);

    rng(idx1)
    net = patternnet(10);
    net.trainParam.showWindow = false;
    net.divideParam.trainRatio = 100/100;
    net.divideParam.valRatio = 0/100;
    net.divideParam.testRatio = 00/100;
    net = train(net,predictor_train,class_label_train,...
        'useGPU','no');
    tmp_class_label_prd_par = sim(net,predictor_test);
    class_label_pred_par(:,idx1) = tmp_class_label_prd_par;

    [~,class_label_pred_index(:,idx1)] = max(tmp_class_label_prd_par);
    [~,class_label_true_index(:,idx1)] = max(class_label_true);

end

```

1
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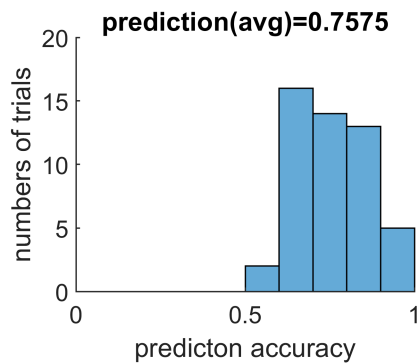
```
% [m,order] = confusionmat(class_label_true_index(:),class_label_pred_index(:));  
% score= sum(diag(m)/length(class_label_pred_index(:)))
```

post-processing

```
parfor idx1 = 1:nd1  
  
    [cmat,~] = confusionmat(class_label_true_index(:,idx1),class_label_pred_index(:,idx1));  
    score_mat(idx1)= sum(diag(cmat)/length(class_label_true_index(:,idx1)));  
  
end  
  
avg_prediction_acc = mean(score_mat);
```

Plot a distribution of curve for prediction accuracy

```
figure('Position',[680 796 308 182])  
  
pbaspect([4 3 1]/4)  
edges = [0:0.1:1];  
histogram(score_mat,edges)  
title(strcat('prediction(average)=',num2str(mean(score_mat))))  
xlabel('prediction accuracy'),ylabel('numbers of trials')  
pbaspect([4 3 1]/4)  
box off
```



confusion matrix

```
[cfm,order] = confusionmat(class_label_true_index(:),class_label_pred_index(:));
```

```
tmp_class_label_true_index = cell(size(class_label_true_index(:)));
tmp_class_label_true_index(ismember(class_label_true_index(:),1)) = {'NR'};
tmp_class_label_true_index(ismember(class_label_true_index(:),2)) = {'RD'};
tmp_class_label_true_index(ismember(class_label_true_index(:),3)) = {'PR'};
```

```
tmp_class_label_pred_index = cell(size(class_label_pred_index(:)));
tmp_class_label_pred_index(ismember(class_label_pred_index(:),1)) = {'NR'};
tmp_class_label_pred_index(ismember(class_label_pred_index(:),2)) = {'RD'};
tmp_class_label_pred_index(ismember(class_label_pred_index(:),3)) = {'PR'};
```

figure

```
cm = confusionchart(tmp_class_label_true_index(:),tmp_class_label_pred_index(:), ...
    'ColumnSummary','column-normalized', ... % 'column-normalized' % 'total-normalized'
    'RowSummary','row-normalized'); % 'row-normalized'
```

True Class	NR	148	21	9	83.1%	16.9%
	PR	27	44	15	51.2%	48.8%
	RD	11	14	111	81.6%	18.4%
		79.6%	55.7%	82.2%		
		20.4%	44.3%	17.8%		
		NR	PR	RD		
		Predicted Class				

ROC curves

```

class_label_true_binary = zeros(3,size(class_label_true_index(:),1));
class_label_true_binary(1,ismember(class_label_true_index(:),1)) = 1;
class_label_true_binary(2,ismember(class_label_true_index(:),2)) = 1;
class_label_true_binary(3,ismember(class_label_true_index(:),3)) = 1;

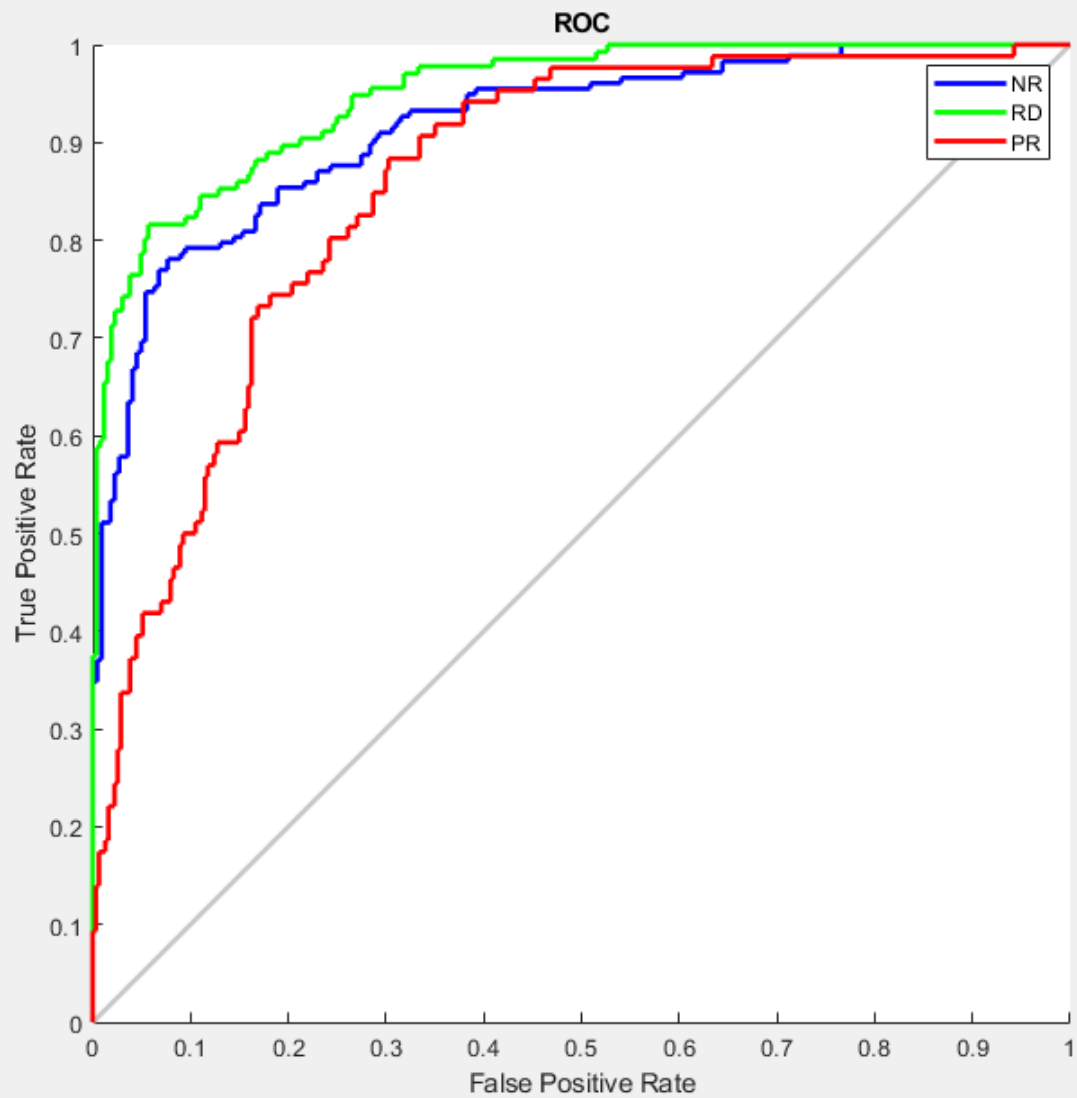
class_label_pred_probability = [];
for ii = 1:size(class_label_pred_par,3)

    class_label_pred_probability = [class_label_pred_probability class_label_pred_par(:, :, ii)];

end

[tp, fpr, thresholds] = roc(class_label_true_binary, class_label_pred_probability);
figure('position', [610 599 249 291])
plotroc(class_label_true_binary, class_label_pred_probability)
axesUserData = get(gca, 'userdata');
legend(axesUserData.lines, 'NR', 'RD', 'PR');

```



```
% class_label(1,ismember(response_dat_0',{'RD'})) = 1;  
% class_label(2,ismember(response_dat_0',{'NR'})) = 1;  
% class_label(3,ismember(response_dat_0',{'PR'})) = 1;
```