



# Machine Learning for Media Technology - exam

## Haberman's Survival Data Set

BY NICKLAS OLSEN

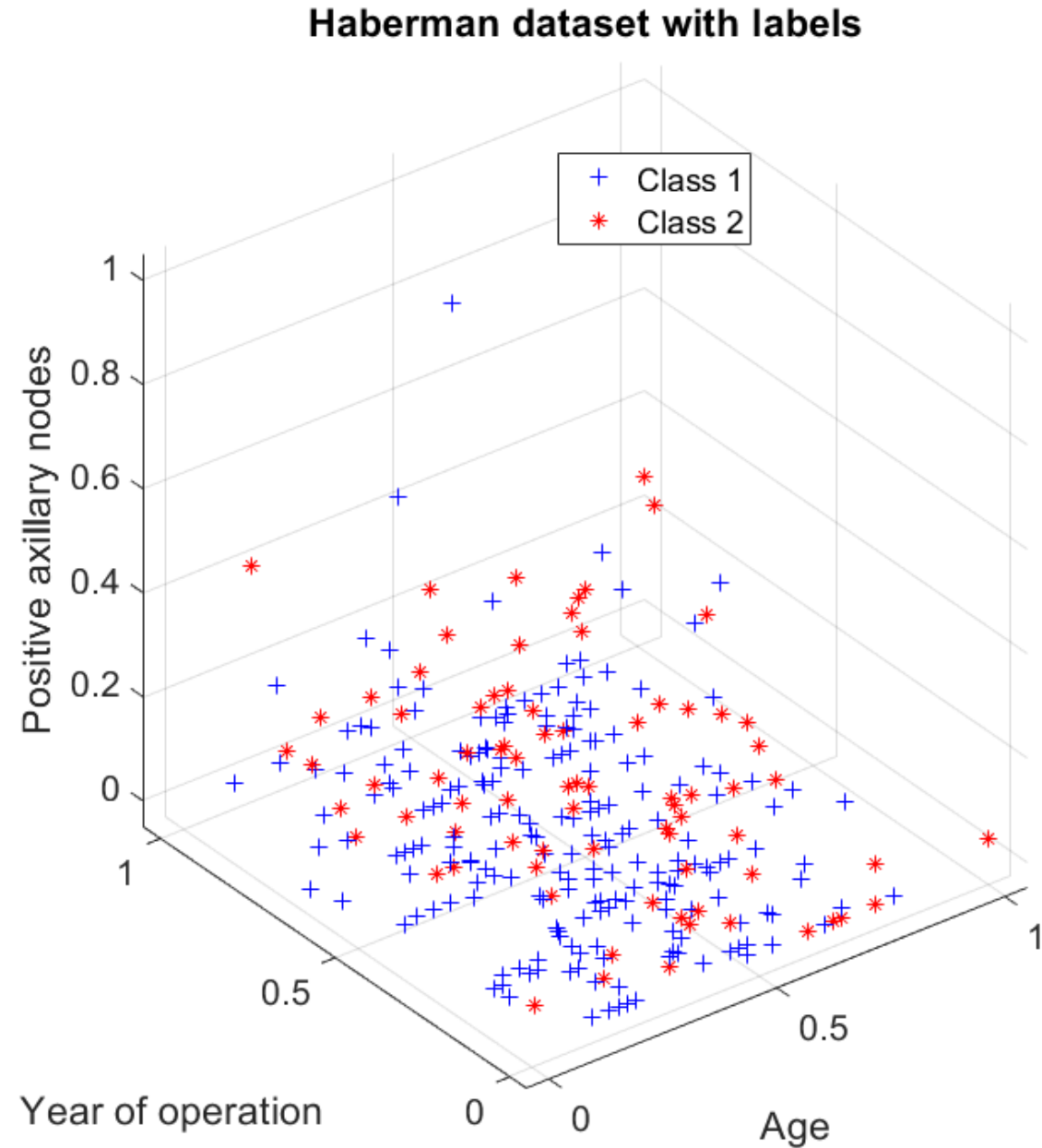


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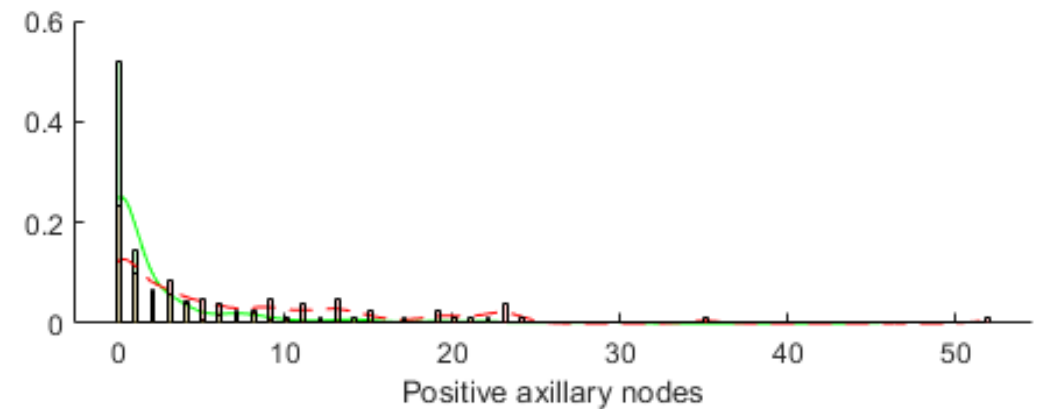
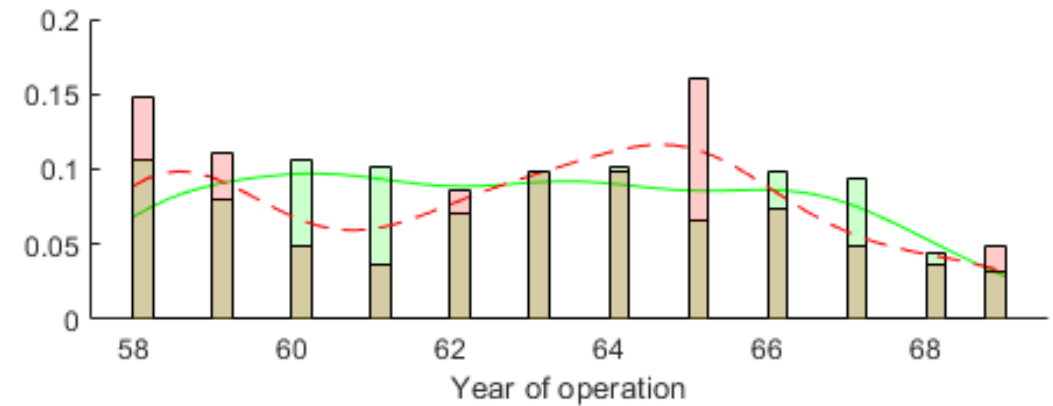
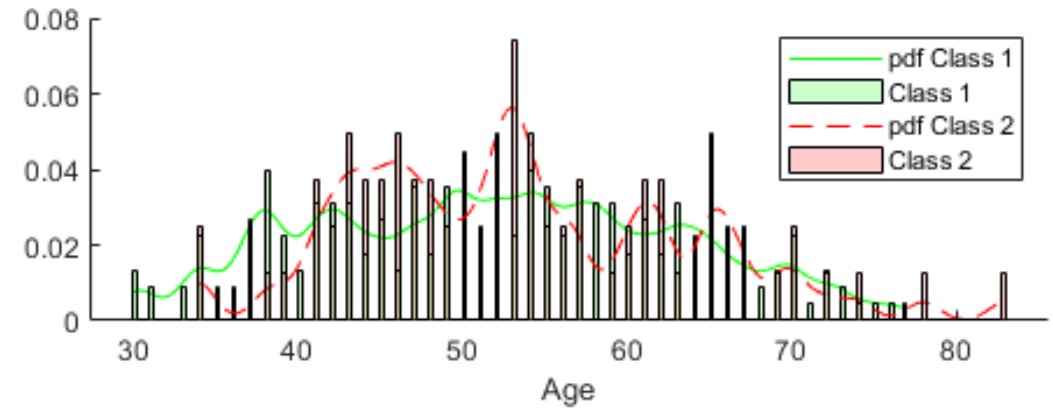
# DATA

- ▶ 306 entries
- ▶ 3 Features:
  - ▶ Age
  - ▶ Year of operation
  - ▶ Positive Axillary nodes
- ▶ 2 Classes:
  1. The patient survived 5 years or longer
  2. The patient died within 5 years



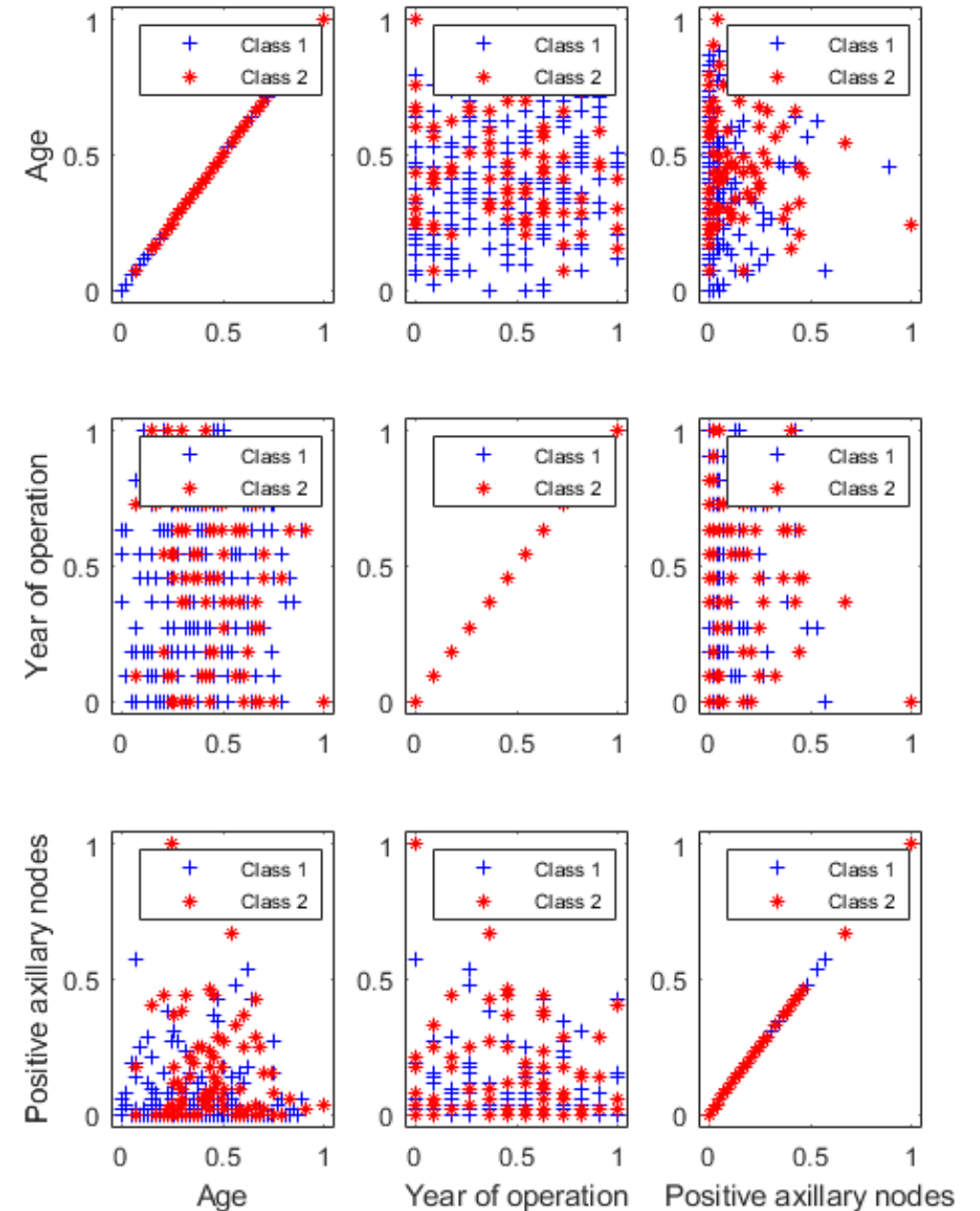
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# DATA ANALYSIS

- Amount
- Means
- Min/Max
- Quantiles
- Distributions
  - Priors
  - Covariances

	Age	Year of operation	Positive axillary nodes	
Survived				
count	225	225	225	3
mean	52.018	62.862	2.791	1
std	11.012	3.223	5.870	
min	30.000	58.000	0.000	
25%	43.000	60.000	0.000	
50%	52.000	63.000	0.000	
75%	60.000	66.000	3.000	2
max	77.000	69.000	46.000	
Died				
count	81	81	81	3
mean	53.679	62.827	7.457	1
std	10.167	3.342	9.186	
min	34.000	58.000	0.000	
25%	46.000	59.000	1.000	
50%	53.000	63.000	4.000	
75%	61.000	65.000	11.250	
max	83.000	69.000	52.000	



# DATA ANALYSIS

- Amount
- Means
- Min/Max
- Quantiles
- Distributions
  - Priors
  - Covariances

Priors =

0.7353	0.2647
--------	--------

Covariances\_matrices(:, :, 1) =

0.0432	0.0108	-0.0020
0.0108	0.0858	0.0012
-0.0020	0.0012	0.0127

Covariances\_matrices(:, :, 2) =

0.0368	-0.0095	-0.0032
-0.0095	0.0923	-0.0038
-0.0032	-0.0038	0.0312



# Feature selection

[Age, Year of operation, Positive axillary nodes]

- Inter/intra class distance

- For each possible subset permutation

$$J_{INTER/INTRA} = trace(\mathbf{S}_w^{-1} \mathbf{S}_b)$$

[1,2,3]  
0.2514

[1,2]  
0.0121

[1,3]  
0.2510

[2,3]  
0.2283

[1]  
0.0118

[2]  
0.000058

[3]  
0.2283



# Feature selection (visual inspection)

- How do these results correlate with an visual inspection of each feature?

[1,2,3]  
0.2514

[1,2]  
0.0121

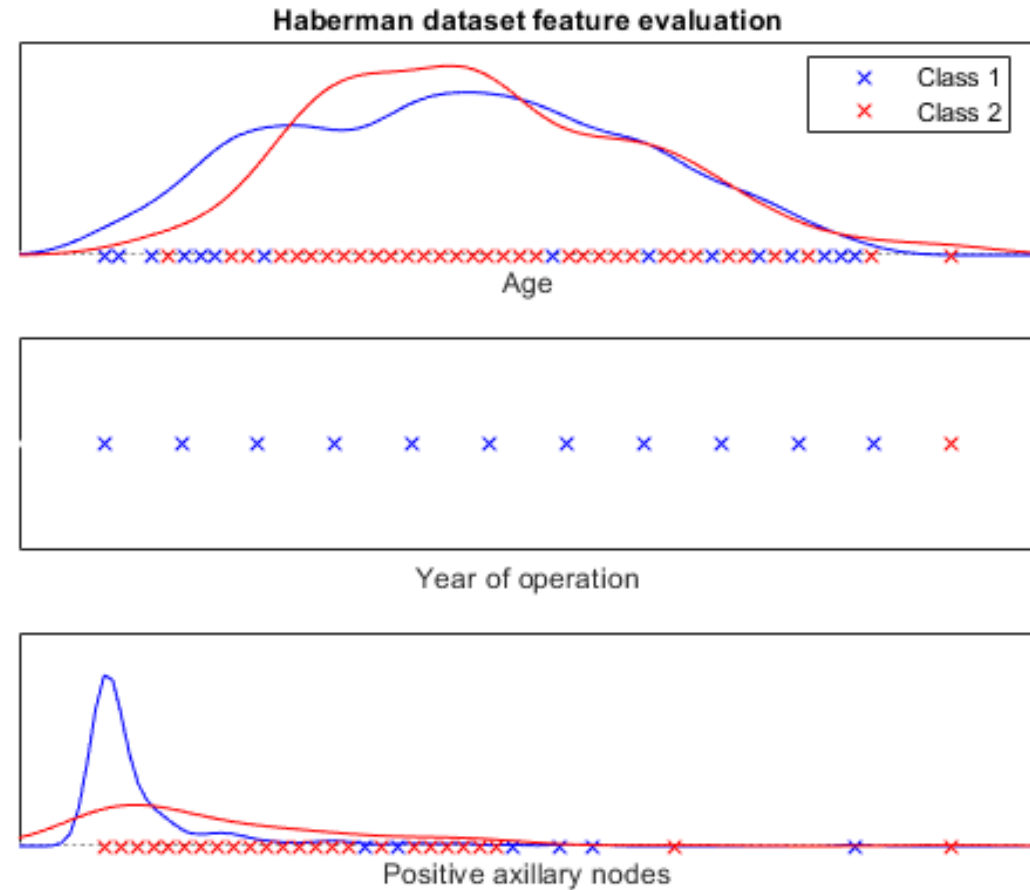
[1,3]  
0.2510

[2,3]  
0.2283

[1]  
0.0118

[2]  
0.000058

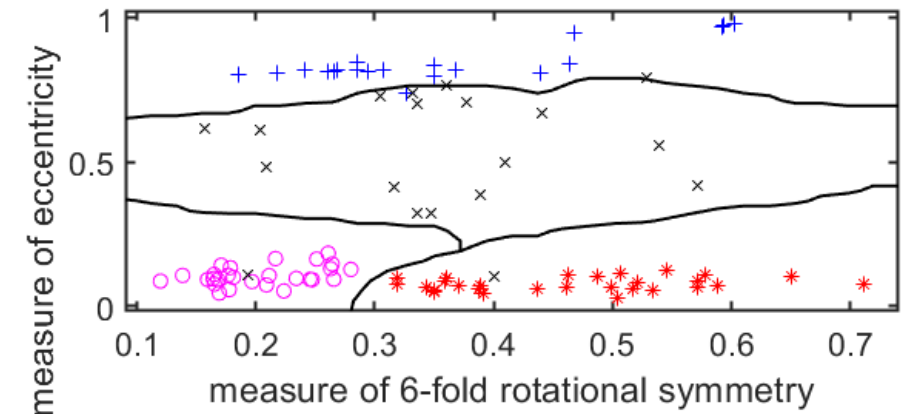
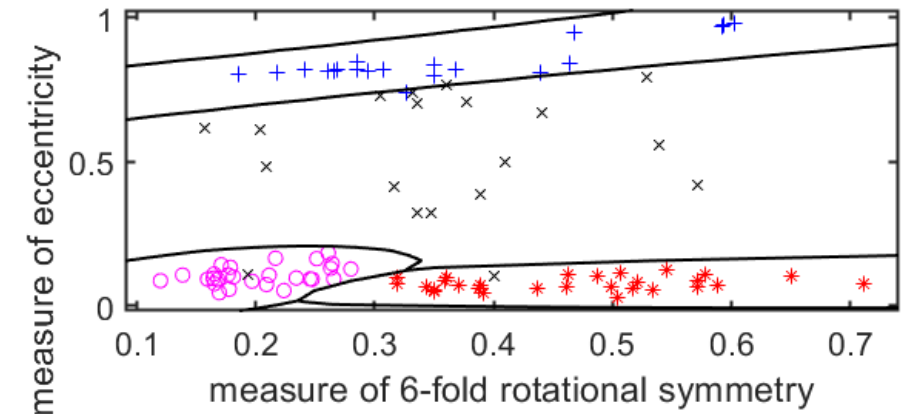
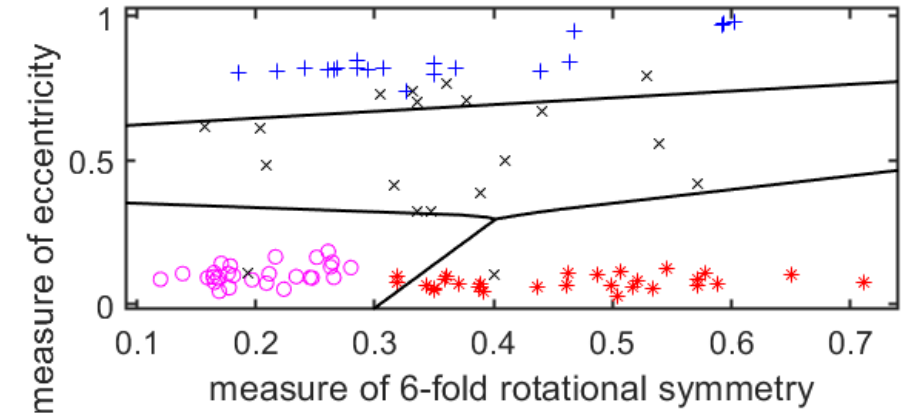
[3]  
0.2283





# Training

- With these results
  - Hard for any classifier to classify with high precision
- Evaluate the following classifiers:
  - Linear classifier (ldc)
    - Clearly not cut out for such a task
  - Quadratic classifier (qdc)
    - Has potential
  - Nearest Neighbor Classifier (knnc)
    - Has potential





# Results

## ➤ Best subset

### ➤ Cross validation:

- › qdc: [3] → 0.236842
- › ldc: [3] → 0.233083
- › knnc:[3] → 0.221805

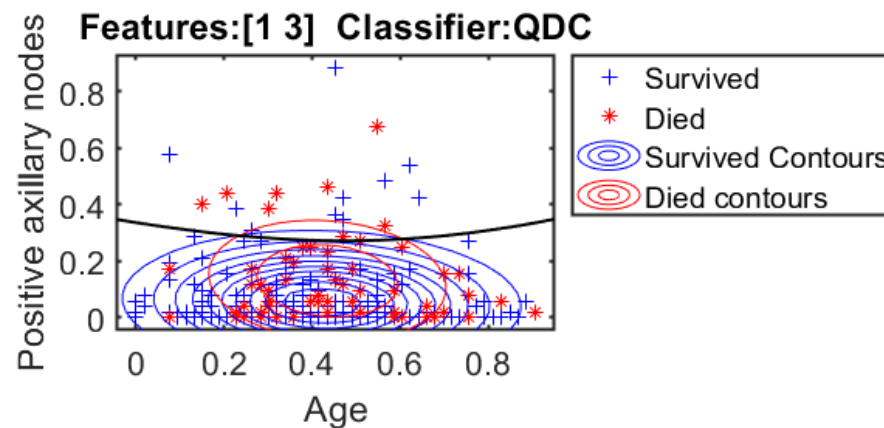
### ➤ Performance estimation (testc):

- › qdc: [3] → 0.35
- › ldc: [3] → 0.375
- › knnc: [1,3] → 0.45



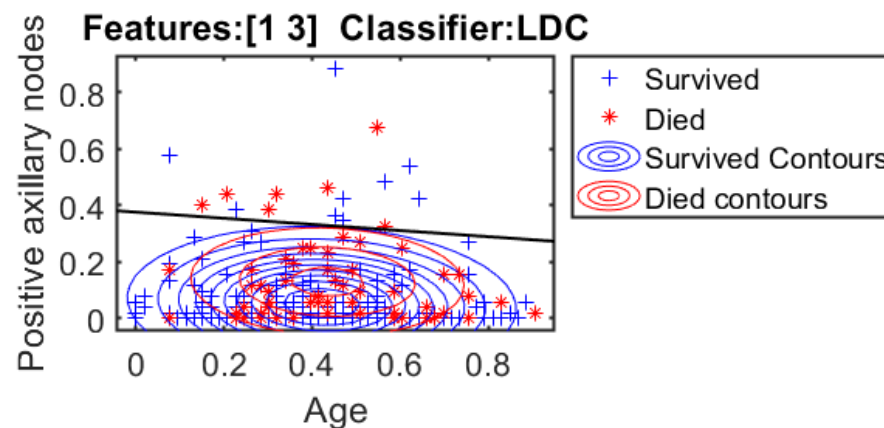
# [1,3]

- ▶ ldc
  - ▶ Decision boundary plot
  - ▶ Confusion matrix
  - ▶ ROC plot
- ▶ qdc
  - ▶ Decision boundary plot
  - ▶ Confusion matrix
  - ▶ ROC plot
- ▶ knnc
  - ▶ Decision boundary plot
  - ▶ Confusion matrix
  - ▶ ROC plot



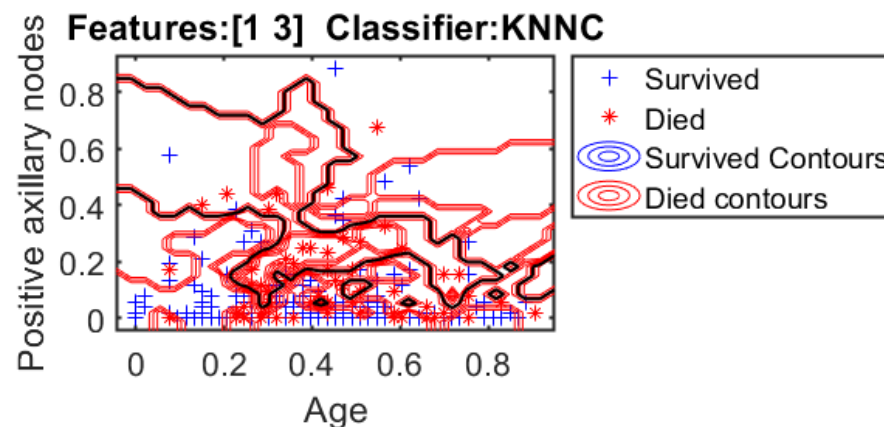
Subset:[1,3] Method: QDC

True Labels \ Estimated Labels	1	2
1	20	0
2	14	6



Subset:[1,3] Method: LDC

True Labels \ Estimated Labels	1	2
1	20	0
2	15	5

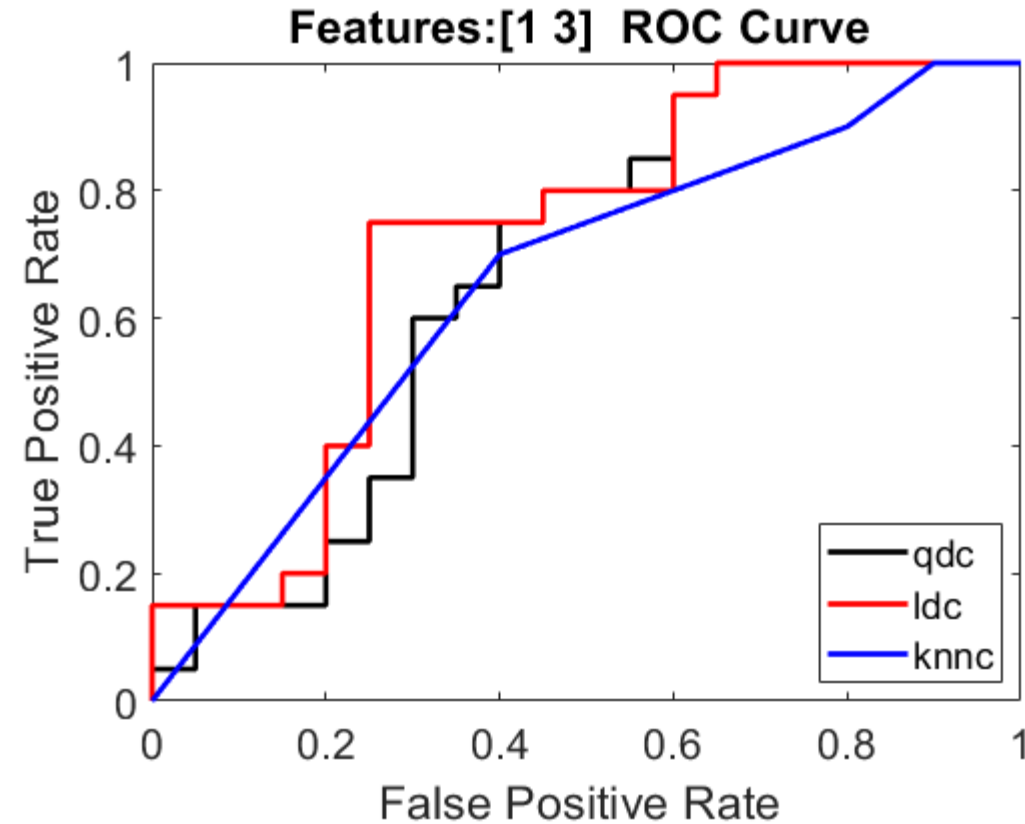


Subset:[1,3] Method: KNNC

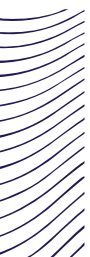
True Labels \ Estimated Labels	1	2
1	18	2
2	16	4

# [1,3]

- ldc
  - Decision boundary plot
  - Confusion matrix
  - ROC plot
- qdc
  - Decision boundary plot
  - Confusion matrix
  - ROC plot
- knnc
  - Decision boundary plot
  - Confusion matrix
  - ROC plot



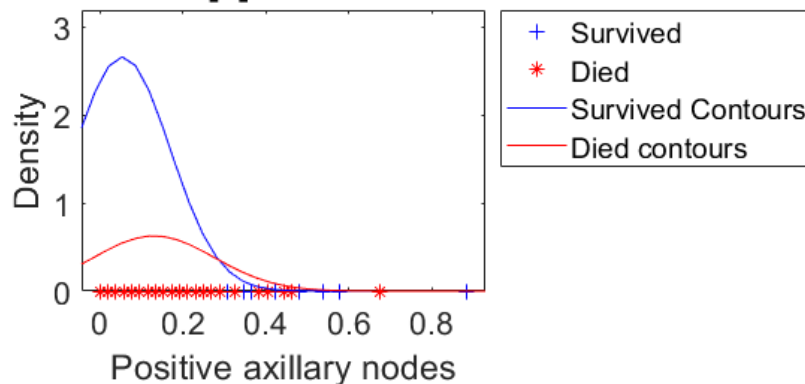




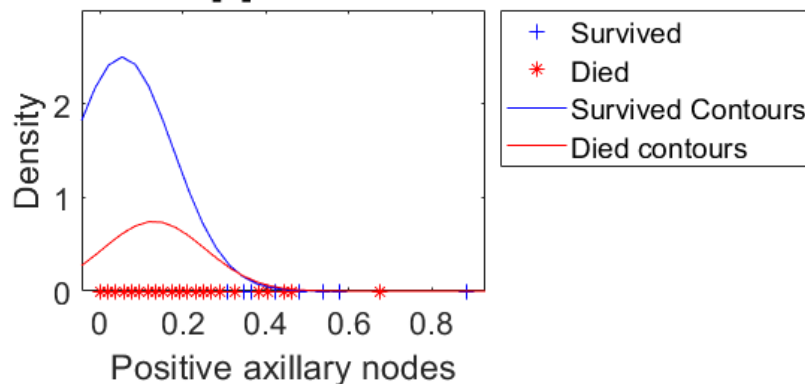
# [3]

- ▶ ldc
  - ▶ Contour plot
  - ▶ Confusion matrix
  - ▶ ROC plot
- ▶ qdc
  - ▶ Contour plot
  - ▶ Confusion matrix
  - ▶ ROC plot
- ▶ knnc
  - ▶ Contour plot
  - ▶ Confusion matrix
  - ▶ ROC plot

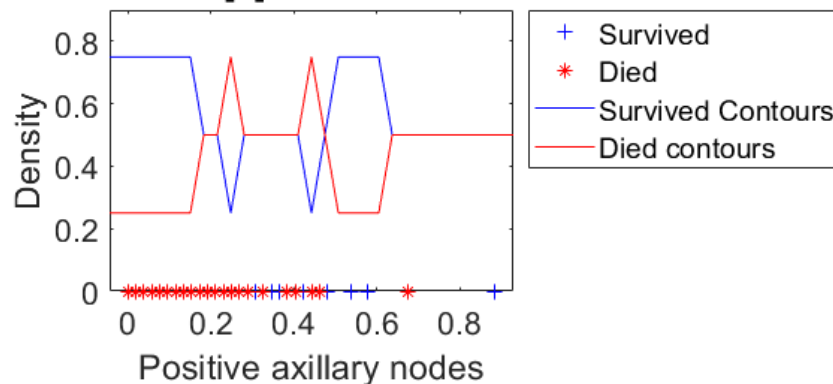
Features:[3] Classifier:QDC



Features:[3] Classifier:LDC



Features:[3] Classifier:KNNC



Subset:[3] Method: QDC

True Labels	1	2
	20	0
1	14	6
2		
Estimated Labels		

Subset:[3] Method: LDC

True Labels	1	2
	20	0
1	15	5
2		
Estimated Labels		

Subset:[3] Method: KNNC

True Labels	1	2
	18	2
1	18	2
2		
Estimated Labels		

# [3]

- ldc
  - Contour plot
  - Confusion matrix
  - ROC plot
- qdc
  - Contour plot
  - Confusion matrix
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- knnc
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