

# Data Mining and Knowledge Discovery

## Knowledge Discovery and Knowledge Management in e-Science

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Practice, 2008/11/12

# ROC space exercise

# Simple mushroom dataset

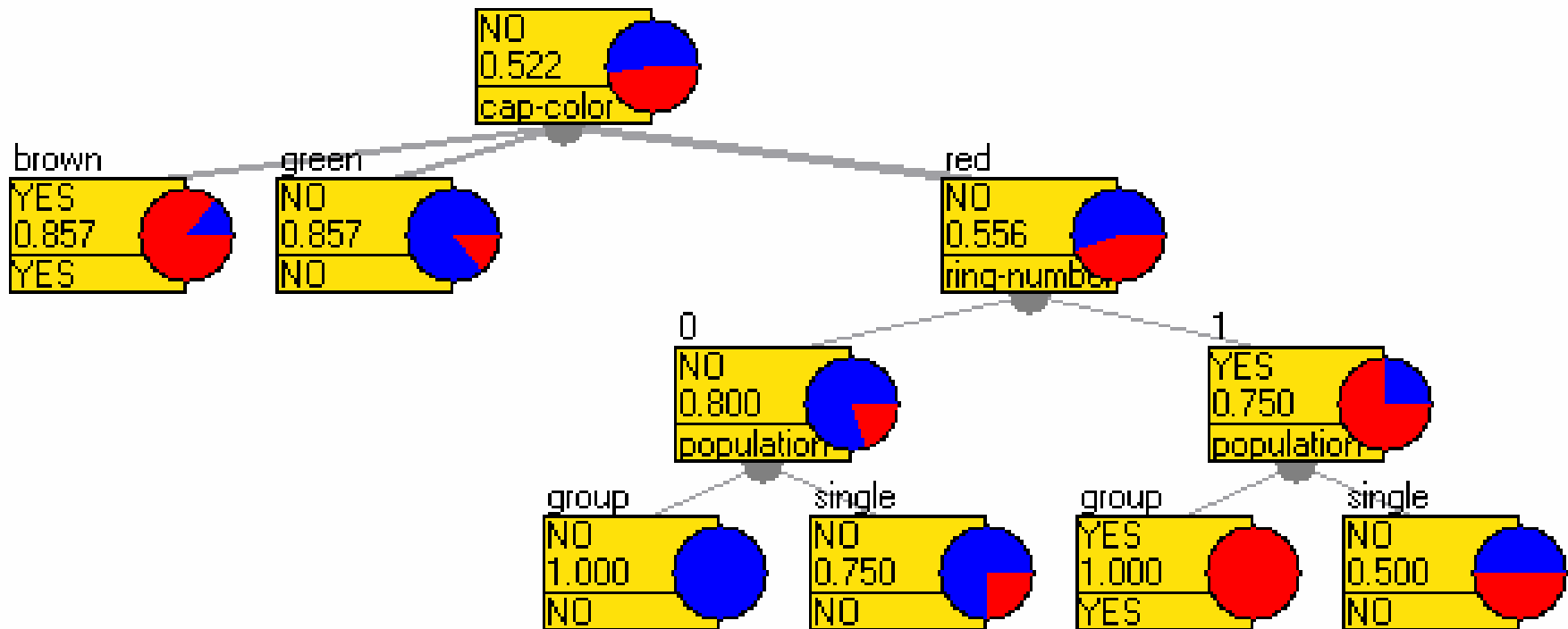
Train set

cap-color	ring-number	population	EDIBLE
red	1	single	YES
green	1	group	NO
brown	1	single	YES
brown	1	single	YES
brown	1	single	YES
brown	1	single	YES
red	1	single	NO
red	0	group	NO
green	0	group	NO
green	0	single	NO
green	0	single	NO
red	1	group	YES
red	1	group	YES
brown	1	group	YES
brown	0	single	YES
brown	0	single	NO
green	0	group	NO
green	0	group	NO
red	0	single	NO
red	0	single	YES
red	0	single	NO
green	0	group	YES
red	0	single	NO

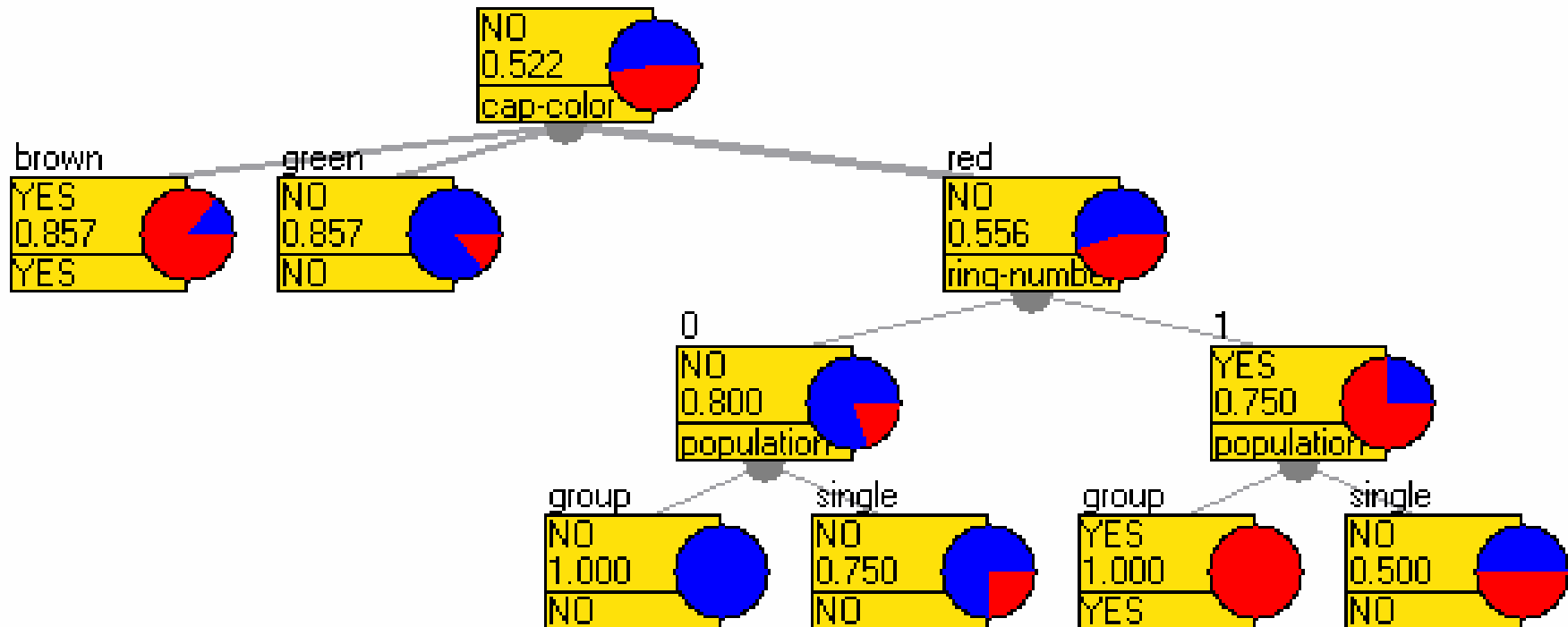
Test set

cap-color	ring-number	population	EDIBLE
brown	1	single	NO
green	0	group	NO
red	1	single	YES
red	0	group	NO
red	1	group	YES

# Decision tree induced on the train set



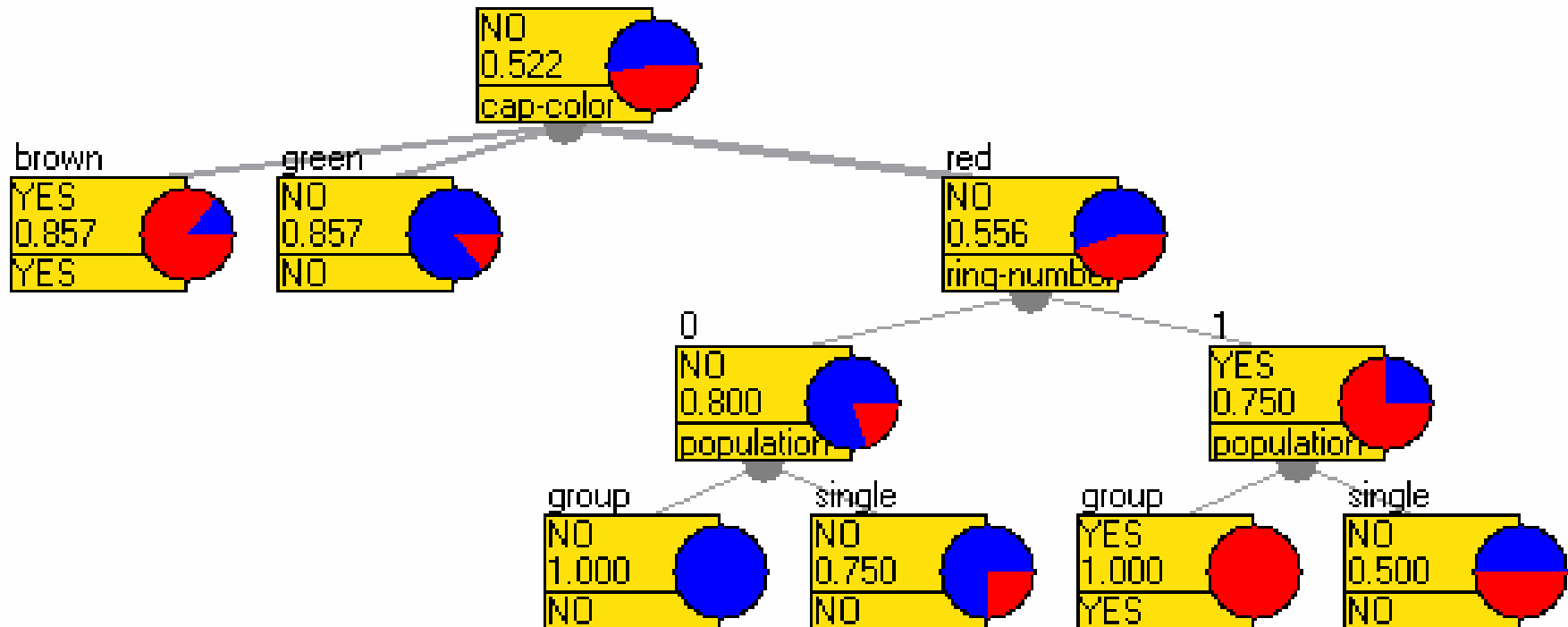
# Confusion matrix



cap-color	ring-number	population	EDIBLE	DT1
brown	1	single	NO	
green	0	group	NO	
red	1	single	YES	
red	0	group	NO	
red	1	group	YES	

	Predicted YES	Predicted NO
Actual YES		
Actual NO		

# Confusion matrix



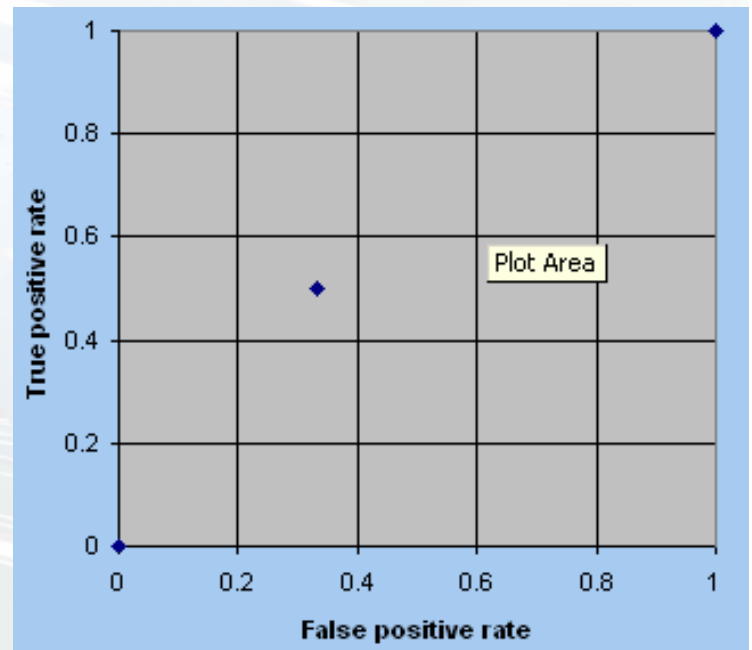
cap-color	ring-number	population	EDIBLE	DT1
brown	1	single	NO	YES
green	0	group	NO	NO
red	1	single	YES	NO
red	0	group	NO	NO
red	1	group	YES	YES

	Predicted YES	Predicted NO
Actual YES	1	1
Actual NO	1	2

# ROC space

	Predicted YES	Predicted NO
Actual YES	1	1
Actual NO	1	2

- True positive rate =  
= # true positives / # all positives =  
= TPr =  $1/2$
- False positive rate =  
= # false positives / # all negatives =  
= FPr =  $1/3$



# ROC space 2

- Classifier “always YES”

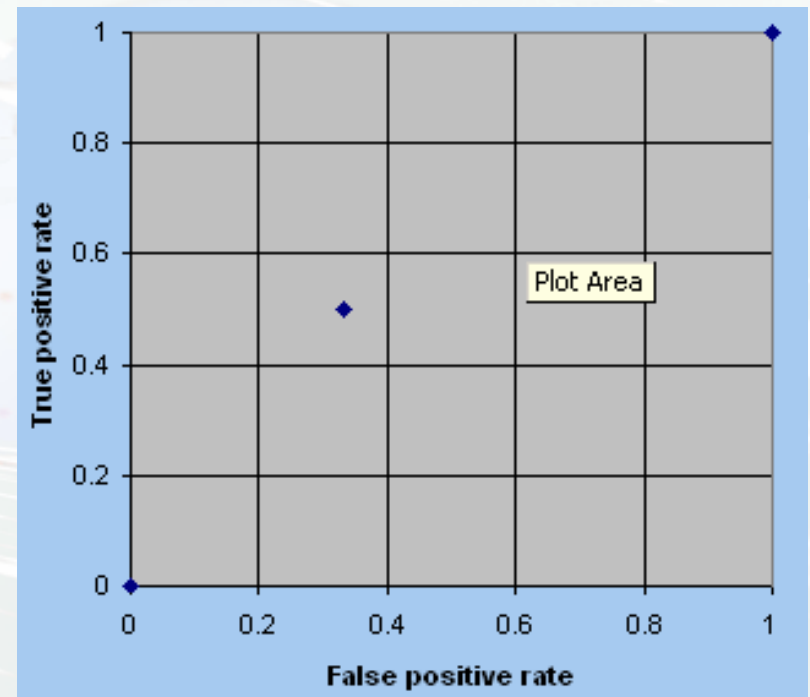
	Predicted YES	Predicted NO
Actual YES	2	0
Actual NO	3	0

- Classifier “always NO”

	Predicted YES	Predicted NO
Actual YES	0	2
Actual NO	0	3

- $TPr = 0$
- $FPr = 0$

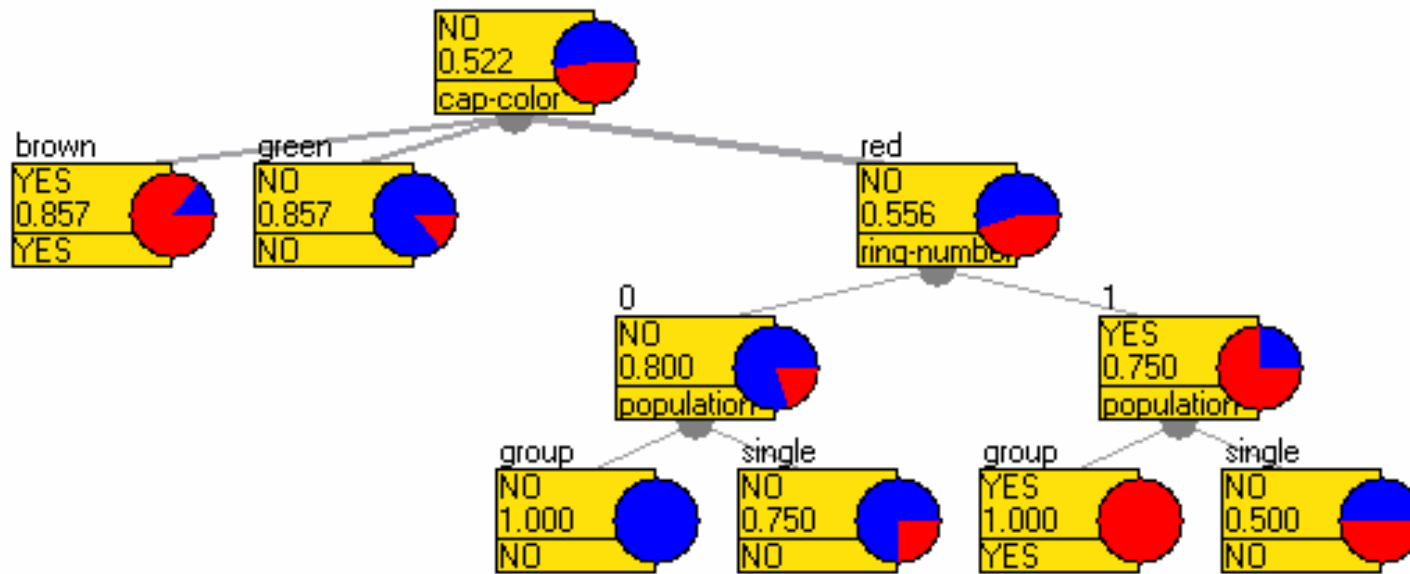
- $TPr = 1$
- $FPr = 1$





# Confusion matrix 2:

A mushroom is edible if the model is at least 90% sure of this

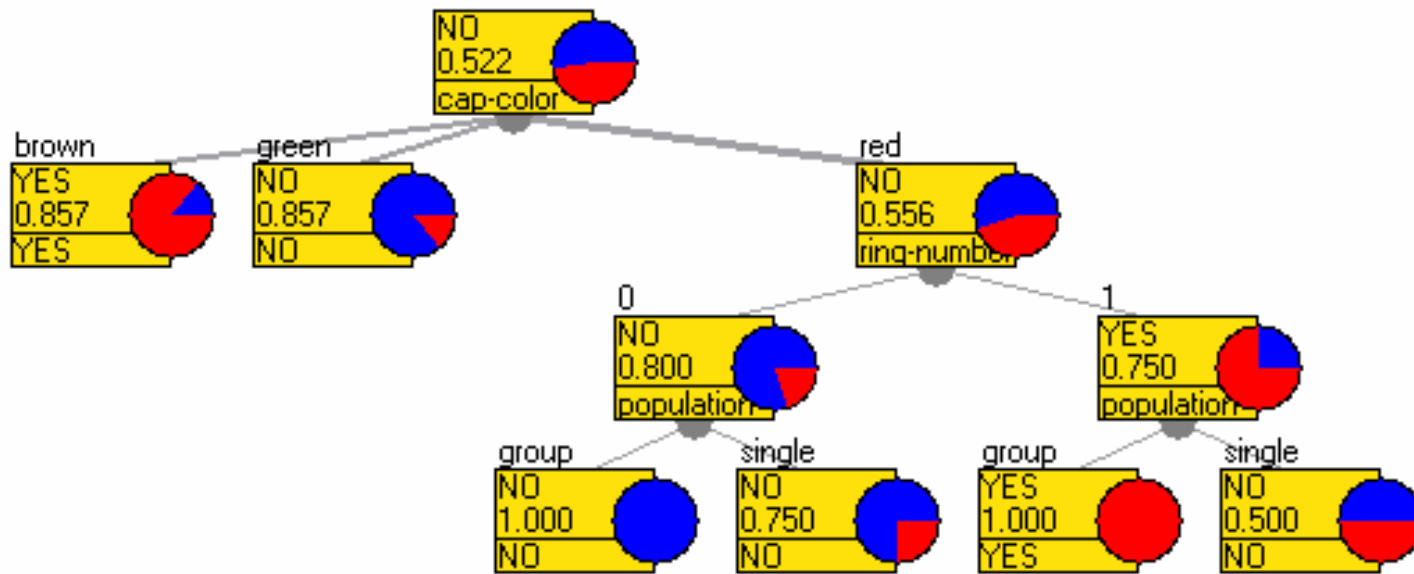


cap-color	ring-number	population	EDIBLE	DT2
brown	1	single	NO	
green	0	group	NO	
red	1	single	YES	
red	0	group	NO	
red	1	group	YES	

	Predicted YES	Predicted NO
Actual YES		
Actual NO		

# Confusion matrix 2:

A mushroom is edible if the model is at least 90% sure of this



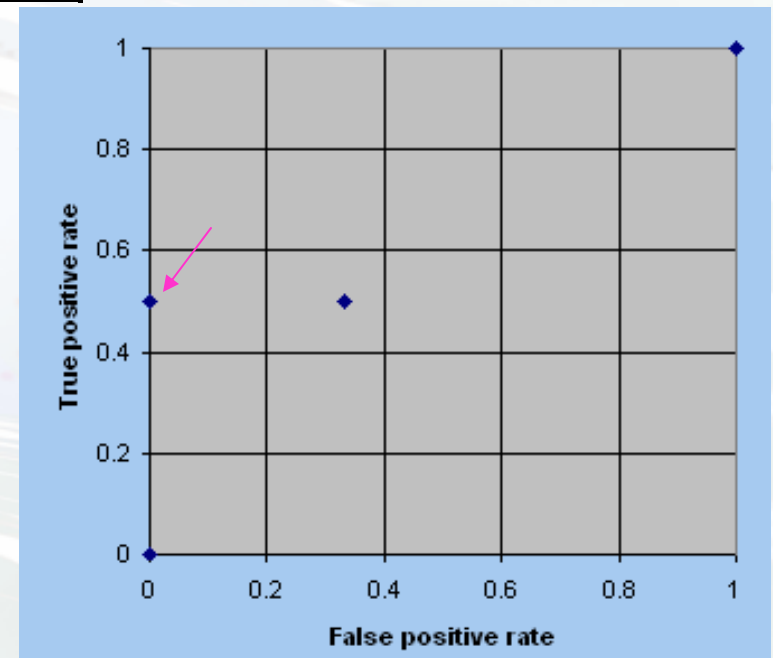
cap-color	ring-number	population	EDIBLE	DT2
brown	1	single	NO	NO
green	0	group	NO	NO
red	1	single	YES	NO
red	0	group	NO	NO
red	1	group	YES	YES

	Predicted YES	Predicted NO
Actual YES	1	1
Actual NO	0	3

# ROC space

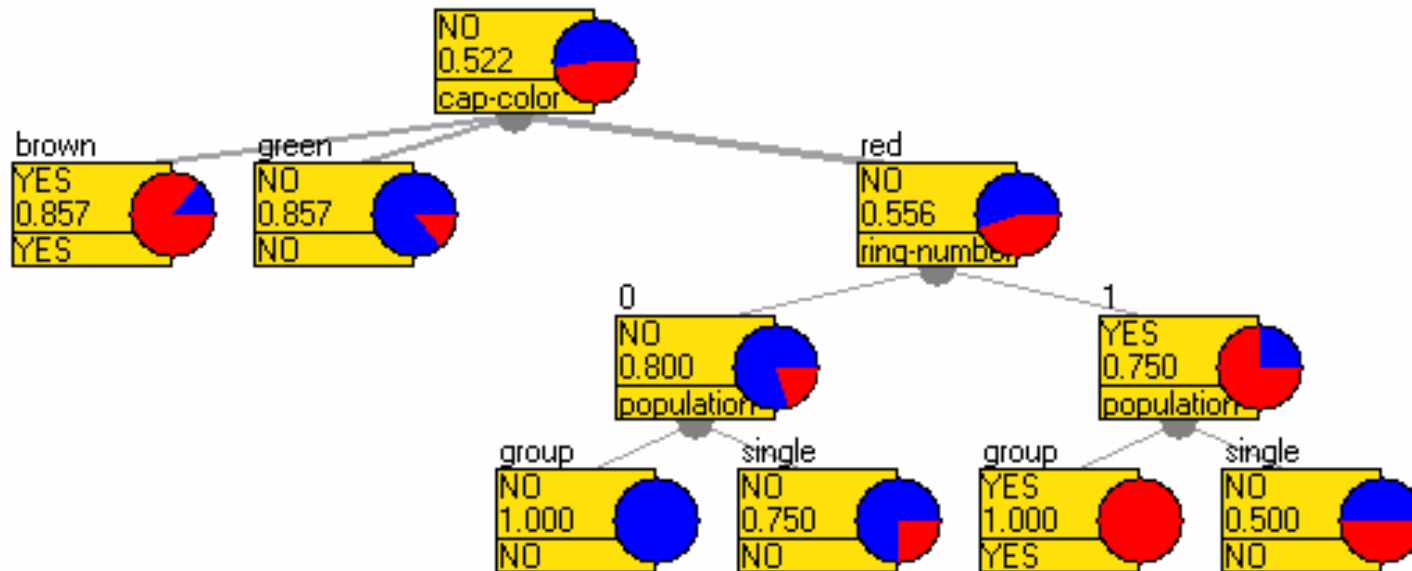
	Predicted YES	Predicted NO
Actual YES	1	1
Actual NO	0	3

- True positive rate  $TPr = 1/2$
- False positive rate  $FPr = 0$



# Confusion matrix 3:

A mushroom is edible if the model is at least 20% sure of this

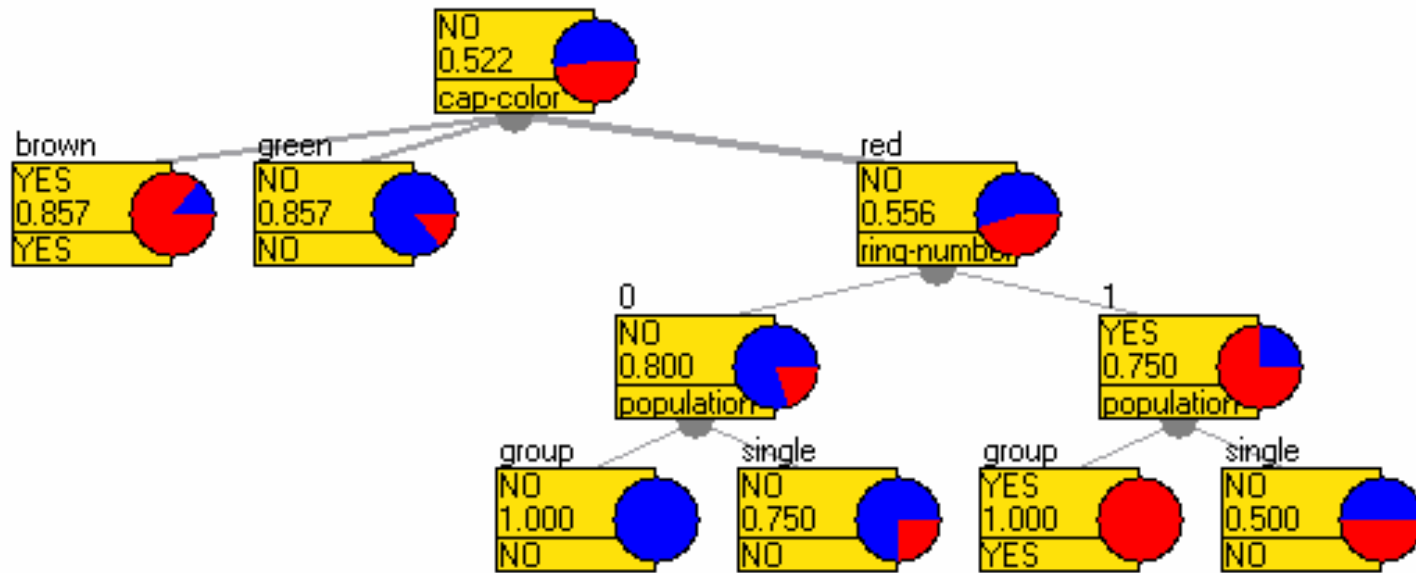


cap-color	ring-number	population	EDIBLE	DT3
brown	1	single	NO	
green	0	group	NO	
red	1	single	YES	
red	0	group	NO	
red	1	group	YES	

	Predicted YES	Predicted NO
Actual YES		
Actual NO		

# Confusion matrix 3:

A mushroom is edible if the model is at least 20% sure of this



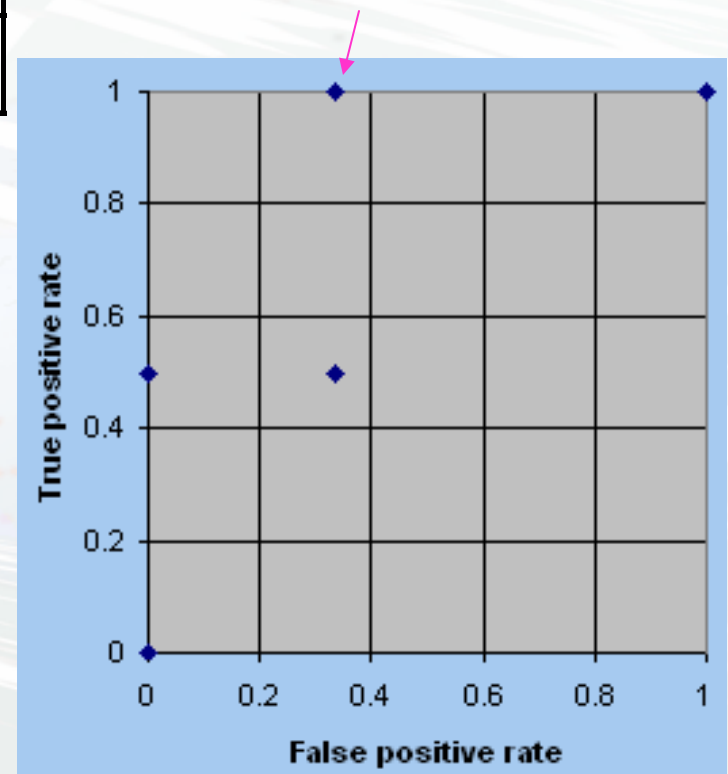
cap-color	ring-number	population	EDIBLE	DT3 (20%)
brown	1	single	NO	YES
green	0	group	NO	NO
red	1	single	YES	YES
red	0	group	NO	NO
red	1	group	YES	YES

	Predicted YES	Predicted NO
Actual YES	2	0
Actual NO	1	2

# ROC space

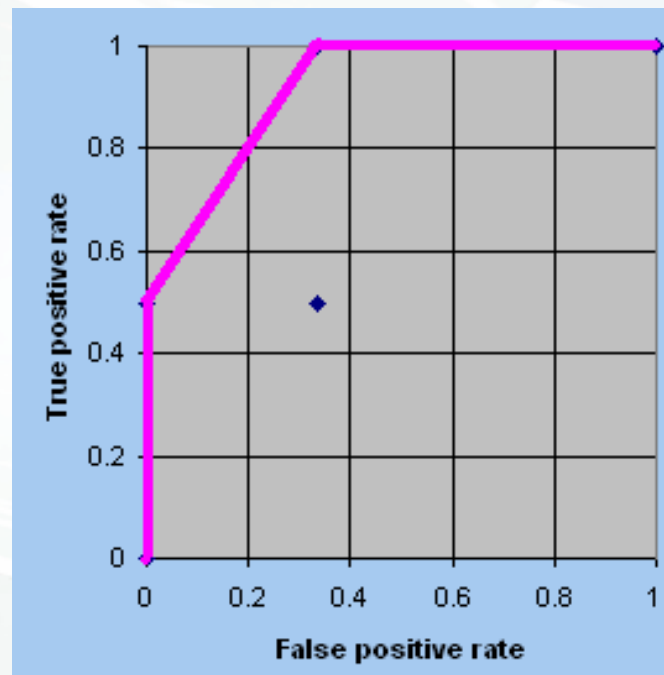
	Predicted YES	Predicted NO
Actual YES	2	0
Actual NO	1	2

- True positive rate  $TPr = 1$
- False positive rate  $FPr = 1/3$



# ROC convex hull

cap-color	ring-number	population	EDIBLE	DT1 (50%)	DT2 (90%)	DT3 (20%)	YES	NO
brown	1	single	NO	YES	NO	YES	YES	NO
green	0	group	NO	NO	NO	NO	YES	NO
red	1	single	YES	NO	NO	YES	YES	NO
red	0	group	NO	NO	NO	NO	YES	NO
red	1	group	YES	YES	YES	YES	YES	NO



# AUC – Area Under Curve

$$\begin{aligned} \text{AUC} &= \\ &= (0.5+1)/2 * 1/3 + 2/3 \\ &= 0.917 \end{aligned}$$

