

Classification Rules Exercises

Master degree in Computer Science

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Exercise 1

- Consider a training set that contains 100 positive examples and 400 negative ones. Starting from the most general rule $\{\} \rightarrow +$, determine which of the following candidate rules
 - $r_1: A=a \rightarrow +$ (covers 4 positive and 1 negative examples)
 - $r_2: B=b \rightarrow +$ (covers 30 positive and 10 negative examples)
 - $r_3: C=c \rightarrow +$ (covers 100 positive and 90 negative examples)
- is the best according to:
 - (a) Rule accuracy: the number of examples r is consistent with over the number of examples covered by r
 - (b) FOIL's IG: $p_1 (\log_2 p_1 / (p_1 + n_1) - \log_2 p_0 / (p_0 + n_0))$

Exercise 1 - Solution

- r1: $A=a \rightarrow +$ (covers 4 positive and 1 negative example)
 - (a) Rule accuracy: $4/5 = 0.8$
 - (b) FOIL's IG: $p_0=100, n_0=400; p_1=4; n_1=1$
FOIL's IG = $p_1 (\log_2 p_1/(p_1+n_1) - \log_2 p_0/(p_0+n_0)) = 8$
- r2: $B=b \rightarrow +$ (covers 30 positive and 10 negative examples)
 - (a) Rule accuracy: $30/40 = 0.75$
 - (b) FOIL's IG: $p_0=100, n_0=400; p_1=30; n_1=10$
FOIL's IG = $p_1 (\log_2 p_1/(p_1+n_1) - \log_2 p_0/(p_0+n_0)) = 57.21$
- r3: $C=c \rightarrow +$ (covers 100 positive and 90 negative examples)
 - (a) Rule accuracy: $100/190 = 0.53$
 - (b) FOIL's IG: $p_0=100, n_0=400; p_1=100; n_1=90$
FOIL's IG = $p_1 (\log_2 p_1/(p_1+n_1) - \log_2 p_0/(p_0+n_0)) = 140$

Exercise 2

- Consider a binary classification problem with the following set of attributes and attribute values describing a second-hand car
 - Air Conditioner = {Working, Broken}
 - Engine = {Good, Bad}
 - Mileage = {High, Medium, Low}
 - Rust = {Yes, No}
- The target attribute is Value = {Low, High} – representing the value of the car
- Suppose a rule-based classifier produces the following rule set:
 1. Mileage=High \rightarrow Value=Low
 2. Mileage=Low \rightarrow Value=High
 3. Air Cond = Working, Engine=G \rightarrow Value=High
 4. Air Cond = Working, Engine=Bad \rightarrow Value=Low
 5. Air Cond = Broken \rightarrow Value = Low

Exercise 2

1. Answer the following questions:
 - (a) are the rules mutually exclusive?
 - (b) Is the rule set exhaustive?
 - (c) is ordering needed?
 - (d) is the default rule needed?
2. Define a condition for mutually exclusivity between two rules

Exercise 2 - Solution

1. Responses

- a. NO – for instance, <working, good, low, yes> triggers both rules 2 and 4.
- b. YES– the last 3 rules are able to classify any instance. Indeed, AirCond is either broken or working. In the former case, i.e., AirCond=broken, rule 5 is fired. Otherwise, either rule 3 or rule 4 is fired, depending on the value of Engine – in particular, rule 3 if Engine is good, and rule 4 otherwise.
- c. YES because of point a
- d. NO because of point b

Exercise 2 - Solution

2. condition for mutually exclusivity : two rules r1 and r2 are mutually exclusive if there is $A=a$ in the antecedent of r1, and $A=b$, with $b \neq a$, in the antecedent of r2, e.g.,
 - Air Cond = W, Engine=Good \rightarrow Value=High
 - Air Cond = W, Engine=Bad \rightarrow Value=Low