Probabilistic approach over Decision Trees for problems with discrete data with a small number of instances 2017 — Norwich, UK

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Abstract

Bayesian classifiers are widely known for their optimality when attributes are independent given the class. This paper attempts to prove that small samples of discrete data with arbitrary dependencies are more accurately classified using a probabilistic approach over decision trees

Index Terms: Probabilistic, Naive Bayes, Decision Trees

1 Introduction

In machine learning a learner algorithm is given a set of training instances with their corresponding class labels, it then produces a classifier. The classifier takes unlabelled testing instances and assigns it to a class. Choosing the best suited algorithm specific to the sample set is not a trivial process.

Probabilistic classification is the application of approximating a joint distribution with a product distribution. Bayes rule is used to approximate the conditional probability of a given class label. Approaches such as *naive* Bayes are among the most popular classifiers used in the machine learning community, derived from generative probability models they are generally easy to understand and the induction of these classifiers is extremely fast, requiring only a single pass through the data if all attributes are discrete [1]. The *naive* Bayes classifier is the simplest of models in this paper, it assumes that all attributes are independent of each other given the context of the class. Although the *naive* assumption of independence is not true in terms of most sample sets, many papers such as [2] have proven that *naive* Bayes classification accuracy is very competitive when compared with more complex state-of-the-art algorithms.

$$P(A \mid B) = \frac{P(B \mid A) P(A)}{P(B)}$$

Decision trees classify instances by sorting them down the tree from the root to some leaf node which represents the classification of the given instance. Nodes specify a test of some attribute of the instance and each branch from that node corresponds to one of the possible values for this attribute. A given instance is classified moving down the tree, the attribute specific to that node is tested. Following down the branch corresponding to the value of the attribute in the given example, this is then repeated until a leaf node is reached and a classification is made.

Table 1: An example table.

| Data Set | Instances | Attributes |
|-----------------|-----------|------------|
| Breast Cancer | 284 | 10 |
| Ecoli | 223 | 10 |
| Glass | 141 | 6 |
| Haberman | 203 | 4 |
| Hayes Roth | 158 | 5 |
| Heart | 169 | 14 |
| Lymphography | 156 | 19 |
| Promoters | 104 | 58 |
| Shuttle Landing | 252 | 7 |
| Sonar | 137 | 61 |
| Thyroid | 142 | 6 |

2 Data Description

2.1 Sections

Section headings should be centred on the line, be in bold typeface, and only the first letter should be capitalised. Sub-headings are also in bold face, but appear flush left and are typeset in the base font size. Sub-sub-headings appear like sub-headings, except they are in italics and are not boldface. No more than 3 levels of headings are allowed.

2.2 Headers and Footers

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Itemised lists can be included in your document, but please check the indentation if you are not using LaTeX. An example itemized list with the correct formatting should look like the following:

- First list item.
- Second list item.
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2.3.1 List Depth

Please try not to use hierarchical lists, these look cluttered in two-column format. Keep lists to a single level of depth.

2.4 Figures

All figures must be centred on the column (or page, if the figure spans both columns). A figure caption should follow the figure

and be formatted like the example in Figure 1.

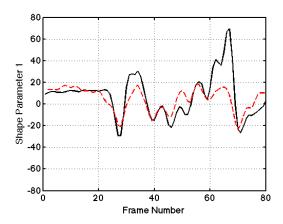


Figure 1: An example of a figure centred on a single column. The figure is not centred automatically. To centre the figure, use \centering within the figure environment.

Figures spanning multiple columns should appear either at the top or the bottom of the page. You can use the \figure* command to span a figure across both columns. An example is shown in Figure 2.

Figures should preferably be line drawings. The proceedings will not be produced in colour, so please do not rely on colour to distinguish between curves on a graphs, etc. You should check to ensure the figures print well on a good quality printer, and that there are no issues when colour figures are printed in grey-scale.

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2.5 Tables

Tables should be centred on a column if possible. There is no strict requirement on the style as this will largely depend on the content to be displayed. An example table is shown in Table 2, but this is provided for illustrative purposes only.

Table 2: An example table.

| Trial | Score | |
|-------|-------|--|
| 1 | 10 | |
| 2 | 12 | |
| 3 | 11 | |
| 4 | 9 | |
| 5 | 11 | |
| 6 | 10 | |
| | | |

Note, for tables the caption should be above the table, as shown in Table 2.

2.6 Equations

Equations should appear on a separate line, they should be centred and they should be numbered. Some examples are:

$$y = mx + c, (1)$$

which obviously is the equation of a straight-line of gradient m and intersecting the vertical axis at c. Another famous equation

with m and c is

$$E = mc^2. (2)$$

2.7 Fonts

You should use 9 point Times or Times Roman for the main text. All fonts should be embedded in the final PDF document.

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2.9 Supplementary Material

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3 Conclusions

The page limit is 4–6 pages. Please, please use LATEX to typeset your document. This will minimise any formatting headaches!

3.1 References

You must reference any papers you have had accepted or are under review here. Example references [?], audio-visual speech synthesis [?, ?], and audio-visual speech recognition [?, ?].

See the references section for the formatting of the references from different sources (conferences, journals, and books). The formatting of references follows the standard IEEE format, LaTeX users should download the IEEEtran bibliography format. References should be listed in order of citation.

References

- [1] R. Kohavi, "Scaling up the accuracy of naive-bayes classifiers: A decision-tree hybrid." in *KDD*, vol. 96. Citeseer, 1996, pp. 202–207.
- [2] P. Domingos and M. Pazzani, "On the optimality of the simple bayesian classifier under zero-one loss," *Machine learning*, vol. 29, no. 2, pp. 103–130, 1997.

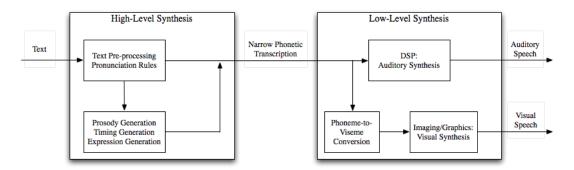


Figure 2: An example of a figure spanning both columns and centred on a page. Again, the figure is not centred automatically.