Detection of human alertness using supervised learning

Anders Hørsted

Kongens Lyngby 2011 IMM

Technical University of Denmark Informatics and Mathematical Modelling Building 321, DK-2800 Kongens Lyngby, Denmark Phone +45 45253351, Fax +45 45882673 reception@imm.dtu.dk

Summary

This is the summary/abstract

Resumé

På dansk

Preface

This thesis was prepared at Informatics Mathematical Modelling, the Technical University of Denmark in partial fulfillment of the requirements for acquiring the Ph.D. degree in engineering.

The thesis deals with different aspects of mathematical modeling of systems using data and partial knowledge about the structure of the systems. The main focus is on extensions of non-parametric methods, but also stochastic differential equations and neural networks are considered.

The thesis consists of a summary report and a collection of ten research papers written during the period 1996–1999, and elsewhere published.

Lyngby, December 1999

Henrik Aalborg Nielsen

Acknowledgements

I thank my...

Contents

1	Introduction	1
	1.1 The competition	2
	1.1.1 Problemformulering	2
2	The Ford Challenge	3
	2.1 Other online machine learning competitions	3
	2.2 The ford competition	4
	2.2.1 The data set	4
3	Toolset	5
4	Data exploration	7
5	Recreating winning approach	9
6	Improving the winning approach	11
7	Other classification methods	13
8	Theory of classification	15
9	Discussion	17
10	Conclusion	19

x CONTENTS

Introduction

Igennem de sidste 30 år er computerens ydeevne vokset markant. Den forbedrede ydeevne har givet mulighed for at udføre statistisk dataanalyse, i et omfang der ikke tidligere har været muligt. En af de ting der er blevet mulighed for, er at programmere såkaldte "classifiers". Et godt eksempel på en classifier, er de programmer bankerne bruger til at opdage evt. snyd med kreditkort. Baseret på alle tidligere korttransaktioner, og viden om hvilke der var "falske" transaktioner, kan bankerne programmere en classifier, der med høj præcision kan forudsige om en ny transaktion er snyd eller ej.

Denne opgave tager udgangspunkt i en konkurrence på hjemmesiden kaggle.com. Konkurrencen er udbudt af Ford Motors og handler om at udvikle en classifier, der kan forudsige om en bilist er ved at blive ukoncentreret, mens han/hun kører bil. Til at udvikle denne classifier har Ford foretaget en række målinger på bilister, mens de kørte bil, og til hver måling er det blevet noteret om bilisten var opmærksom eller ej. Med udgangspunkt i disse målinger udarbejdes – ved brug af de mest gængse metoder – en række classifiers, og deres evne til at klassificere ny data sammenlignes.

2 Introduction

1.1 The competition

1.1.1 Problemformulering

I denne opgave vil jeg...

• ... bruge de mest gængse klassifikationsmodeller (nearest neighbour, logistic regression, neural networks og SVM) til at lave en classifier der (forhåbentlig) kan forudsige om en bilist er ved at falde i søvn.

- ... undersøge hvor stor indflydelse den indledende databehandling (feature selection og outlier removal) har på det endelige resultat.
- ... undersøge om classifieren kan forbedres ved at implementere en Hidden Markov Model, der tager hensyn til det temporale aspekt af data.
- ... implementere en ensemble classifier, der kombinerer resultatet af flere classifiers i én classifier.

The Ford Challenge

In this chapter, the ford competition that is the basis for this report, is introduced. Before introducing the ford challenge, a short overview of other online machine learning competitions is given. As part of introducing the ford competition, the kaggle.com website that hosted the ford competition is presented, and the data set used in the ford competition is described in detail. But as metioned the chapter starts with a short overview of other online machine learning competitions.

2.1 Other online machine learning competitions

To get a little perspective on the ford challenge, this section gives a short review of some past and present online machine learning competitions.

One of the most talked about competitions, may very well be the Netflix Prize. The Netflix competition was launched on October 2, 2006 and the aim of the competition was to predict how users would grade new movies, based on a large dataset of previous grades. Why did the Netflix Prize gather a lot of attention? First of all the grand prize was \$1M, which is a lot of money. And secondly the dataset was huge, consisting of 100,480,507 ratings given by 480,189 users, leaving room for a lot of interesting new techniques to be tested.

When the Netflix Prize was awarded, 5169 different teams had submitted at least one entry to the competition

2.2 The ford competition

2.2.1 The data set

Toolset

6 Toolset

$_{\text{Chapter}} \ 4$

Data exploration

Here I describe the various data exploration techniques I have used. Lots of nice graphs. PCA. Boxplots. Feature plots. Scatter Plots. Unique Values. Is it discrete, binary, continuous.

Recreating winning approach

Here I describe how I have tried to recreate the winning approach. How I measure performance. The problem that I do not have access to the test data set used by Inference. My results. The scikits.learn library that I have used.

Improving the winning approach

Here I try to improve the winning approach, by doing my own feature selection. Forward selection. Lasso. Cross validating with Lasso. Using window instead of running.

Other classification methods

Here I describe some alternatives to the logistic regression used by Inference. Hoping to get a result or two from SVM or Neural Network.

Theory of classification

Here I describe some general results about classification. Bayes error rate. No free lunch theorem. Ugly duckling theorem.

$_{\text{Chapter}} \ 9$

Discussion

Bla, bla, bla.

18 Discussion

Conclusion

More bla, bla, bla.

20 Conclusion

Bibliography

- [1] Mahmoud Abou-Nasr. Kaggle forum: Discrete or continuous values, 2011. URL http://www.kaggle.com/c/stayalert/forums/t/266/discrete-or-continuous-values/1635#post1635.
- [2] Mahmoud Abou-Nasr. Kaggle forum: About the parameter, 2011. URL http://www.kaggle.com/c/stayalert/forums/t/317/about-the-parameter/1861#post1861.
- [3] Christopher M. Bishop. Pattern Recognition and Machine Learning. Springer Science + Business Media LLC, 2006.
- [4] Kaggle.com. The ford challenge data files, 2011. URL http://www.kaggle.com/c/stayalert/Data.