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Bachelor's thesis

# Probabilistic algorithms for computing the LTS estimate

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March 4, 2019

# Acknowledgements THANKS to everybody

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| In Prague on March 4 | , 2019 |  |
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#### **Abstrakt**

V několika větách shrňte obsah a přínos této práce v českém jazyce.

Klíčová slova LTS odhad, lineÃarnÃŋ regrese, optimalizace, nejmenÅaÃŋ usekanÃľ ÄDtvrece, metoda nejmenÅaÃŋch ÄDtvercÅŕ, outliers

#### **Abstract**

The least trimmed squares (LTS) method is a robust version of the classical method of least squares used to find an estimate of coefficients in the linear regression model. Computing the LTS estimate is known to be NP-hard, and hence suboptimal probabilistic algorithms are used in practice.

**Keywords** LTS, linear regressin, robust estimator, least trimmed squares, ordinary least squares, outliers, outliers detection

#### **Contents**

| In           | $\operatorname{trod}_{1}$ | uction                | 1  |
|--------------|---------------------------|-----------------------|----|
| 1            | The                       | Least trimmed squares | 3  |
|              | 1.1                       | Robust statistics     | 3  |
|              | 1.2                       | Description           | 3  |
|              | 1.3                       | Computation           | 3  |
| 2            | Alg                       | orithms               | 5  |
|              | 2.1                       | FAST-LTS              | 5  |
|              | 2.2                       | Exact algorithm       | 6  |
|              | 2.3                       | Feasible solution     | 6  |
|              | 2.4                       | MMEA                  | 6  |
|              | 2.5                       | Branch and bound      | 6  |
|              | 2.6                       | Adding row            | 6  |
| 3            | Exp                       | periments             | 7  |
|              | 3.1                       | Data                  | 7  |
|              | 3.2                       | Performance           | 7  |
|              | 3.3                       | Outlier detection     | 7  |
| Co           | onclu                     | sion                  | 9  |
| Bi           | bliog                     | graphy                | 11 |
| $\mathbf{A}$ | Dat                       | asets                 | 13 |
| В            | Con                       | stants of anclosed CD | 15 |

# List of Figures

## Introduction

# CHAPTER 1

#### The Least trimmed squares

- 1.0.1 Objective function
- 1.0.1.1 something
- 1.1 Robust statistics
- 1.2 Description
- 1.3 Computation

#### **Algorithms**

#### 2.1 FAST-LTS

In this section we'll describe FAST-LTS algorithm and it's main properties. The main idea of this algorithm is based on the fact that from one approximation of the algorithm we can compute another which can have lower objective function.

Thoerem 1: [1] Let w0 ... wp be the LTS estimate. for each data sample we can compute —y-wx—

Hlavni myslenka tohoto algoritmu spociva ve faktu,

Vyberte si Åąablonu podle druhu prÃące (bakalÃąÅŹskÃą, diplomovÃą), jazyka (ÄDeÅątina, angliÄDtina) a kÃşdovÃąnÃŋ (ASCII, UTF-8, ISO-8859-2 neboli latin2 a nebo Windows-1250).

V Ä DeskÃľ variantÄŻ naleznete Åą<br/>ablony v souborech pojmenovanà · ch ve formÃątu prÃące\_kÃşdovÃąnÃŋ.<br/>tex. Typ prÃące mÅŕÅ"e bà · t:

**BP** bakalÃąÅŹskÃą prÃące,

**DP** diplomovÃą (magisterskÃą) prÃące.

KÃṣdovÃạnÃŋ zdrojovÃľho souboru (Þ́TĒX), ve kterÃľm chcete psÃạt, mÅŕÅ "e bà · t:

UTF-8 kÃşdovÃanÃŋ Unicode,

ISO-8859-2 latin2,

Windows-1250 znakovÃą sada 1250 Windows.

V pÅŹÃŋpadÄŻ nejistoty ohlednÄŻ kÃşdovÃąnÃŋ doporuÄDujeme nÃąsledujÃŋcÃŋ postup:

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#### 2. Algorithms

- 2. V opaÄDnÃľm pÅŹÃŋpadÄŻ postupujte dÃąle podle toho, jak÷ operaÄDnÃŋ systÃľm pouÅ"ÃŋvÃąte:
  - v pÅŹÃŋpadÄŻ Windows pouÅ"ijte Åąablonu pro kÃşdovÃąnÃŋ Windows-1250,
  - jinak zkuste pouÅ"Ãŋt Åąablonu pro kÃşdovÃạnÃŋ ISO-8859-2.

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- 2.2 Exact algorithm
- 2.3 Feasible solution
- 2.4 MMEA
- 2.5 Branch and bound
- 2.6 Adding row

# Chapter 3

## **Experiments**

- 3.1 Data
- 3.2 Performance
- 3.3 Outlier detection

#### **Conclusion**

# **Bibliography**

[1] Rybicka, J. LaTeX pro začátečníky. Brno: Konvoj, third edition, ISBN 80-7302-049-1.

APPENDIX **A** 

#### **Datasets**

 ${\bf GUI}$  Graphical user interface

**XML** Extensible markup language

 $_{\text{APPENDIX}}$  B

## **Contents of enclosed CD**

| r   | readme.txt         | the file with CD contents description   |
|-----|--------------------|---|
| _ ( | exe                | the directory with executables          |
| :   | src                | the directory of source codes           |
|     | wbdcm              | implementation sources                  |
|     | thesisthe director | ory of LATEX source codes of the thesis |
| -   | text               | the thesis text directory               |
| 1   | thesis.pdf         | the thesis text in PDF format           |
|     | _                  | the thesis text in PS format            |