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**FACULTY  
OF INFORMATION  
TECHNOLOGY  
CTU IN PRAGUE**

Master's thesis

# **Exploring use of non-negative matrix factorization for lossy audio compression**

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February 18, 2019



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## Acknowledgements

TODO



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# Abstrakt

TODO

**Klíčová slova** TODO

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# Abstract

Non-negative matrix factorization has been successfully applied in various scenarios, mostly for analyzing large chunks of data and finding patterns in them for later use. Due to the nature of NMF, it has also seen some use in the field of image compression.

The purpose of this thesis is to research possible uses of non-negative matrix factorization in the problem of audio compression. A reference audio encoder and decoder using NMF will be implemented and various experiments using this encoder will be conducted. The results will be measured and compared to existing audio compressing solutions.

**Keywords** lossy, audio, compression, processing, nmf, encoding



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# Introduction

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Part I

Background



# Digital audio



# **Non-negative matrix factorization**



## Part II

# Audio compression using NMF





## **Design**

### **3.1 State of the art**



# Implementation

4.1 Encoder

4.2 Decoder



# Evaluation



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## Conclusion





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## Acronyms

**todo** TODO



## Contents of enclosed CD

	readme.txt .....	the file with CD contents description
	exe .....	the directory with executables
	src .....	the directory of source codes
	wbdcm .....	implementation sources
	thesis .....	the directory of $\text{\LaTeX}$ source codes of the thesis
	text .....	the thesis text directory
	thesis.pdf .....	the thesis text in PDF format
	thesis.ps .....	the thesis text in PS format