

#### Technische Universität Berlin

Fakultät I - Geisteswissenschaften Fachgebiet Audiokommunikation Audiokommunikation und -technologie M.Sc.

# Self-Organizing Maps for Sound Corpus Organization

MASTER'S THESIS

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### Eidesstattliche Erklärung

Hiermit erkläre ich, dass ich die vorliegende Arbeit selbstständig und eigen-
händig sowie ohne unerlaubte fremde Hilfe und ausschließlich unter Verwen-
dung der aufgeführten Quellen und Hilfsmittel angefertigt habe.
Berlin, den February 7, 2019

Jonas	Μ	ar	g	ra	ıf									



Zusammenfassung	Die Zusammen	fassung auch au	f Deutsch.	

### Acknowledgements

This is where the thank yous go.

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1 Introduction 1

#### 1 Introduction

This is the Introduction. Here's a citation about Self-Organizing Maps (SOMs)(Kohonen, 1990).

- 1.1 Motivation and Problem Description
- 1.2 Aims and Objectives
- 1.3 Previous Work

2 Background 2

#### 2 Background

This is the Background section.

#### 2.1 Audio Feature Extraction

Make sure to quote Lerch (2012), Rawlinson et al. (2015), Rawlinson et al. (2019a), Mathieu et al. (2010) Mathieu et al. (2019).

- 2.1.1 Fundamentals
- 2.1.2 Audio Pre-Processing
- 2.1.3 Time-Domain Features
- **2.1.3.1 Root Mean Square (RMS)** measures the power of a signal (Lerch, 2012, p.73f). It describes sound intensity and is sometimes used as a simple measure for loudness (Rawlinson et al., 2019b) that does not take the nonlinearity of human hearing into account (Fletcher and Munson, 1933). It is calculated for an audio frame x consisting of n samples such that

$$v_{RMS} = \sqrt{\frac{\sum_{i=1}^{n} x(i)^2}{n}}.$$
 (1)

- 2.1.3.2 Zero-Crossing Rate (ZCR)
- 2.1.4 Frequency-Domain Features
- 2.1.4.1 Spectral Centroid
- 2.1.4.2 Spectral Flatness
- 2.1.4.3 Spectral Kurtosis
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- 2.1.4.7 Spectral Rolloff

2 Background 3

#### 2.1.5 Perceptual Features

#### 2.1.5.1 Loudness

### 2.2 Self-Organzing Map

Something about SOMs and also neurons have IDs.

3 Implementation 4

#### 3 Implementation

This is the Implementation.

3.1 Groundwork: CataRT Extension

#### 3.2 SOM Browser

4 Evaluation 5

#### 4 Evaluation

This is the Evaluation.

4.1 Measuring SOM-Induced Quantization

- 4.2 Online Sound Similarity Survey
- 4.3 Semistructured User Interviews

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### 5 Results

This is the Results section.

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#### 6 Discussion

This is the Discussion.

#### 6.1 Outlook

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# Appendices

#### A LaTeX Sources

The  $\LaTeX$  sources for this work can be found in XXX.

#### B Thesis Bibliography

The references used in this work can be found in XXX.

### Glossary

ID A name or number that identifies an object.

### Acronyms

SOM Self-Organizing Map.

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### Digital Resource

This page holds a data disk.