Multi-task Learning of Rhythmic and Tonal Properties in Music

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eingereicht von

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TU Informatics

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DIPLOMA THESIS

submitted in partial fulfillment of the requirements for the degree of

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in

Logic and Computation

by

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Vienna, 18th September, 2021   _____   _____
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Erklärung zur Verfassung der Arbeit

Peter Rjabcsenko, Bsc

Hiermit erkläre ich, dass ich diese Arbeit selbständig verfasst habe, dass ich die verwendeten Quellen und Hilfsmittel vollständig angegeben habe und dass ich die Stellen der Arbeit – einschließlich Tabellen, Karten und Abbildungen –, die anderen Werken oder dem Internet im Wortlaut oder dem Sinn nach entnommen sind, auf jeden Fall unter Angabe der Quelle als Entlehnung kenntlich gemacht habe.

Wien, 18. September 2021

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Peter Rjabcsenko

Danksagung

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Acknowledgements

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Kurzfassung

german placeholder

Abstract

The rapid growth of artificial intelligence has enabled its application to a myriad of tasks across varied fields of research. Advances in A.I. approaches to multimedia related tasks have piqued the interest of a wider general public and have entered the mainstream in forms of analytic applications, entertainment software and otherwise. The music domain is not an exception, methods for audio analysis and music generation, utilizing supervised machine learning, specifically deep learning models, are enjoying an increase in popularity due to their success compared to traditional handcrafted signal processing methods.

The goal of this thesis is to investigate the potential of a combined model for two music analysis tasks: beat tracking and chord recognition. The state of the art solutions for both of these problems heavily rely on deep learning, moreover multi-task approaches for some music analysis tasks have already been proven successful in the past. A joint deep learning model for beat tracking and chord recognition could benefit from data present for both tasks, since these problems do not exist in a theoretical vacuum and likely overlap in some way. Also sharing a model offers practical benefits like reduced training times and pooling of annotation resources which are expensive to produce for both beat tracking and chord recognition.

Contents

CHAPTER 1

Introduction

Enter your text here.

Additional Chapter

Enter your text here.

Introduction to LaTeX

Since LaTeX is widely used in academia and industry, there exists a plethora of freely accessible introductions to the language. Reading through the guide at `https://en.wikibooks.org/wiki/LaTeX` serves as a comprehensive overview for most of the functionality and is highly recommended before starting with a thesis in LaTeX.

3.1 Installation

A full LaTeX distribution consists not only of the binaries that convert the source files to the typeset documents, but also of a wide range of packages and their documentation. Depending on the operating system, different implementations are available as shown in Table 3.1. **Due to the large amount of packages that are in everyday use and due to their high interdependence, it is paramount to keep the installed distribution up to date.** Otherwise, obscure errors and tedious debugging ensue.

3.2 Editors

A multitude of TeX editors are available differing in their editing models, their supported operating systems and their feature sets. A comprehensive overview of editors can be

Distribution	Unix	Windows	MacOS
TeX Live	**yes**	yes	(yes)
MacTeX	no	no	**yes**
MikTeX	(yes)	**yes**	yes

Table 3.1: TeX/LaTeX distributions for different operating systems. Recomended choice in **bold**.

	Description
1	Scan for refs, toc/lof/lot/loa items and cites
2	Build the bibliography
3	Link refs and build the toc/lof/lot/loa
4	Link the bibliography
5	Build the glossary
6	Build the acronyms
7	Build the index
8	Link the glossary, acronyms, and the index
9	Link the bookmarks

	Command
1	`pdflatex.exe   example`
2	`bibtex.exe     example`
3	`pdflatex.exe   example`
4	`pdflatex.exe   example`
5	`makeindex.exe -t example.glg -s example.ist` `-o example.gls example.glo`
6	`makeindex.exe -t example.alg -s example.ist` `-o example.acr example.acn`
7	`makeindex.exe -t example.ilg -o example.ind example.idx`
8	`pdflatex.exe   example`
9	`pdflatex.exe   example`

Table 3.2: Compilation steps for this document. The following abbreviations were used: table of contents (toc), list of figures (lof), list of tables (lot), list of algorithms (loa).

found at the Wikipedia page `https://en.wikipedia.org/wiki/Comparison_of_TeX_editors`. TeXstudio (`http://texstudio.sourceforge.net/`) is recommended. Most editors support a synchronization of the generated document and the LATEX source by `Ctrl` clicking either on the source document or the generated document.

3.3   Compilation

Modern editors usually provide the compilation programs to generate Portable Document Format (PDF) documents and for most LATEX source files, this is sufficient. More advanced LATEX functionality, such as glossaries and bibliographies, needs additional compilation steps, however. It is also possible that errors in the compilation process invalidate intermediate files and force subsequent compilation runs to fail. It is advisable to delete intermediate files (`.aux`, `.bbl`, etc.), if errors occur and persist. All files that are not generated by the user are automatically regenerated. To compile the current document, the steps as shown in Table 3.2 have to be taken.

3.4 Basic Functionality

In this section, various examples are given of the fundamental building blocks used in a thesis. Many LaTeX commands have a rich set of options that can be supplied as optional arguments. The documentation of each command should be consulted to get an impression of the full spectrum of its functionality.

3.4.1 Floats

Two main categories of page elements can be differentiated in the usual LaTeX workflow: *(i)* the main stream of text and *(ii)* floating containers that are positioned at convenient positions throughout the document. In most cases, tables, plots, and images are put into such containers since they are usually positioned at the top or bottom of pages. These are realized by the two environments `figure` and `table`, which also provide functionality for cross-referencing (see Table 3.3 and Figure 3.1) and the generation of corresponding entries in the list of figures and the list of tables. Note that these environments solely act as containers and can be assigned arbitrary content.

3.4.2 Tables

A table in LaTeX is created by using a `tabular` environment or any of its extensions, e.g., `tabularx`. The commands `\multirow` and `\multicolumn` allow table elements to span multiple rows and columns.

Position		
Group	Abbrev	Name
Goalkeeper	GK	Paul Robinson
Defenders	LB	Lucus Radebe
	DC	Michael Duburry
	DC	Dominic Matteo
	RB	Didier Domi
Midfielders	MC	David Batty
	MC	Eirik Bakke
	MC	Jody Morris
Forward	FW	Jamie McMaster
Strikers	ST	Alan Smith
	ST	Mark Viduka

Table 3.3: Adapted example from the LaTeX guide at `https://en.wikibooks.org/wiki/LaTeX/Tables`. This example uses rules specific to the `booktabs` package and employs the multi-row functionality of the `multirow` package.

3.4.3 Images

An image is added to a document via the `\includegraphics` command as shown in Figure 3.1. The `\subcaption` command can be used to reference subfigures, such as Figure 3.1a and 3.1b.
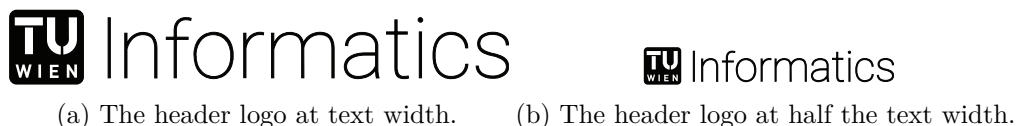

(a) The header logo at text width.   (b) The header logo at half the text width.

Figure 3.1: The header logo at different sizes.

3.4.4 Mathematical Expressions

One of the original motivation to create the TeX system was the need for mathematical typesetting. To this day, LaTeX is the preferred system to write math-heavy documents and a wide variety of functions aids the author in this task. A mathematical expression can be inserted inline as $\sum_{n=1}^{\infty} \frac{1}{n^2} = \frac{\pi^2}{6}$ outside of the text stream as

$$\sum_{n=1}^{\infty} \frac{1}{n^2} = \frac{\pi^2}{6}$$

or as numbered equation with

$$\sum_{n=1}^{\infty} \frac{1}{n^2} = \frac{\pi^2}{6}. \tag{3.1}$$

3.4.5 Pseudo Code

The presentation of algorithms can be achieved with various packages; the most popular are `algorithmic`, `algorithm2e`, `algorithmicx`, or `algpseudocode`. An overview is given at `https://tex.stackexchange.com/questions/229355`. An example of the use of the `alogrithm2e` package is given with Algorithm 3.1.

3.5 Bibliography

The referencing of prior work is a fundamental requirement of academic writing and well supported by LaTeX. The BibTeX reference management software is the most commonly used system for this purpose. Using the `\cite` command, it is possible to reference entries in a `.bib` file out of the text stream, e.g., as [Tur36]. The generation of the formatted bibliography needs a separate execution of `bibtex.exe` (see Table 3.2).

3.6 Table of Contents

The table of contents is automatically built by successive runs of the compilation, e.g., of `pdflatex.exe`. The command `\setsecnumdepth` allows the specification of the

---

Algorithm 3.1: Gauss-Seidel

    Input: A scalar ϵ, a matrix $\mathbf{A} = (a_{ij})$, a vector $\vec{b}$, and an initial vector $\vec{x}^{(0)}$

    Output: $\vec{x}^{(n)}$ with $\mathbf{A}\vec{x}^{(n)} \approx \vec{b}$

1 **for** $k \leftarrow 1$ **to** *maximum iterations* **do**

2   **for** $i \leftarrow 1$ **to** n **do**

3 $x_i^{(k)} = \frac{1}{a_{ii}} \left(b_i - \sum_{j<i} a_{ij} x_j^{(k)} - \sum_{j>i} a_{ij} x_j^{(k-1)} \right)$;

4   **end**

5   **if** $\left| \vec{x}^{(k)} - \vec{x}^{(k-1)} \right| < \epsilon$ **then**

6   **break for**;

7   **end**

8 **end**

9 **return** $\vec{x}^{(k)}$;

---

depth of the table of contents and additional entries can be added to the table of contents using \addcontentsline. The starred versions of the sectioning commands, i.e., \chapter*, \section*, etc., remove the corresponding entry from the table of contents.

3.7 Acronyms / Glossary / Index

The list of acronyms, the glossary, and the index need to be built with a separate execution of makeindex (see Table 3.2). Acronyms have to be specified with \newacronym while glossary entries use \newglossaryentry. Both are then used in the document content with one of the variants of \gls, such as \Gls, \glspl, or \Glspl. Index items are simply generated by placing \index{⟨*entry*⟩} next to all the words that correspond to the index entry ⟨*entry*⟩. Note that many enhancements exist for these functionalities and the documentation of the makeindex and the glossaries packages should be consulted.

3.8 Tips

Since TeX and its successors do not employ a What You See Is What You Get (WYSI-WYG) editing scheme, several guidelines improve the readability of the source content:

- Each sentence in the source text should start with a new line. This helps not only the user navigation through the text, but also enables revision control systems (e.g. Subversion (SVN), Git) to show the exact changes authored by different users. Paragraphs are separated by one (or more) empty lines.

- Environments, which are defined by a matching pair of \begin{name} and \end{name}, can be indented by whitespace to show their hierarchical structure.

- In most cases, the explicit use of whitespace (e.g. by adding `\hspace{4em}` or `\vspace{1.5cm}`) violates typographic guidelines and rules. Explicit formatting should only be employed as a last resort and, most likely, better ways to achieve the desired layout can be found by a quick web search.

- The use of bold or italic text is generally not supported by typographic considerations and the semantically meaningful `\emph{...}` should be used.

The predominant application of the LATEX system is the generation of PDF files via the PDFLATEX binaries. In the current version of PDFLATEX, it is possible that absolute file paths and user account names are embedded in the final PDF document. While this poses only a minor security issue for all documents, it is highly problematic for double blind reviews. The process shown in Table 3.4 can be employed to strip all private information from the final PDF document.

	Command
1	Rename the PDF document `final.pdf` to `final.ps`.
2	Execute the following command:

```
ps2pdf -dPDFSETTINGS#/prepress ^
 -dCompatibilityLevel#1.4 ^
 -dAutoFilterColorImages#false ^
 -dAutoFilterGrayImages#false ^
 -dColorImageFilter#/FlateEncode ^
 -dGrayImageFilter#/FlateEncode ^
 -dMonoImageFilter#/FlateEncode ^
 -dDownsampleColorImages#false ^
 -dDownsampleGrayImages#false ^
 final.ps final.pdf
```

On Unix-based systems, replace # with = and ^ with \.

Table 3.4: Anonymization of PDF documents.

3.9   Resources

3.9.1   Useful Links

In the following, a listing of useful web resources is given.

https://en.wikibooks.org/wiki/LaTeX An extensive wiki-based guide to LATEX.

http://www.tex.ac.uk/faq A (huge) set of Frequently Asked Questions (FAQ) about TEX and LATEX.

https://tex.stackexchange.com/ The definitive user forum for non-trivial LATEX-related questions and answers.

3.9.2   Comprehensive TeX Archive Network (CTAN)

The CTAN is the official repository for all TeX related material. It can be accessed via `https://www.ctan.org/` and hosts (among other things) a huge variety of packages that provide extended functionality for TeX and its successors. Note that most packages contain PDF documentation that can be directly accessed via CTAN.

In the following, a short, non-exhaustive list of relevant CTAN-hosted packages is given together with their relative path.

algorithm2e Functionality for writing pseudo code.

amsmath Enhanced functionality for typesetting mathematical expressions.

amssymb Provides a multitude of mathematical symbols.

booktabs Improved typesetting of tables.

enumitem Control over the layout of lists (`itemize`, `enumerate`, `description`).

fontenc Determines font encoding of the output.

glossaries Create glossaries and list of acronyms.

graphicx Insert images into the document.

inputenc Determines encoding of the input.

l2tabu A description of bad practices when using LaTeX.

mathtools Further extension of mathematical typesetting.

memoir The document class on upon which the `vutinfth` document class is based.

multirow Allows table elements to span several rows.

pgfplots Function plot drawings.

pgf/TikZ Creating graphics inside LaTeX documents.

subcaption Allows the use of subfigures and enables their referencing.

symbols/comprehensive A listing of around 5000 symbols that can be used with LaTeX.

voss-mathmode A comprehensive overview of typesetting mathematics in LaTeX.

xcolor Allows the definition and use of colors.

List of Figures

List of Tables

List of Algorithms

Index

Glossary

editor A text editor is a type of program used for editing plain text files.. 5

Acronyms

CTAN Comprehensive TeX Archive Network. 11

FAQ Frequently Asked Questions. 10

PDF Portable Document Format. 6, 10, 11, 15

SVN Subversion. 9

WYSIWYG What You See Is What You Get. 9

Bibliography

[Tur36] Alan Mathison Turing. On computable numbers, with an application to the entscheidungsproblem. *J. of Math*, 58:345–363, 1936.