



**AUDIO  
LABS**

## Die Vermessung der Tonart – klingt vermessen?

Meinard Müller

International Audio Laboratories Erlangen  
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Kolloquium für Prof. Auhagen  
Universität Halle-Wittenberg

8. Februar 2019



**Fraunhofer**  
IIS

### Group Members

- Christof Weiß
- Frank Zalkow
- Patricio López-Serrano
- Sebastian Rosenzweig
- Hendrik Schreiber



### Meinard Müller

- Mathematics (Diplom/Master)  
Computer Science (PhD)  
Information Retrieval (Habilitation)  
**Bonn University**
- Combinatorics (Postdoc)  
**Keio University, Japan**
- Senior Researcher  
**Max-Planck Institute, Saarland**
- Professor: Semantic Audio Processing  
**Erlangen-Nürnberg University**



### International Audio Laboratories Erlangen



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**Fraunhofer**  
IIS

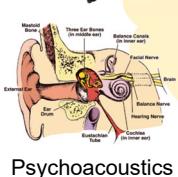


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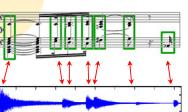
#### Audio Coding



Psychoacoustics



**Audio**

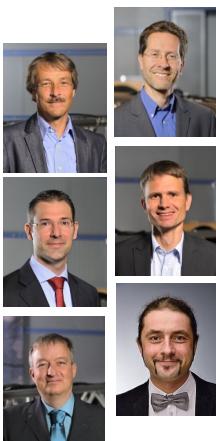


Music Processing

3D Audio

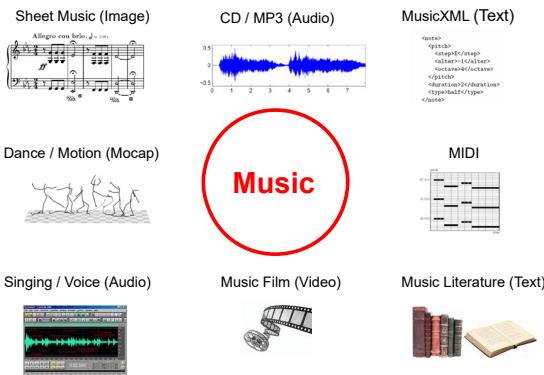
## AudioLabs – FAU

- Prof. Dr. Jürgen Herre  
Audio Coding
- Prof. Dr. Bernd Edler  
Audio Signal Analysis
- Prof. Dr. Meinard Müller  
Semantic Audio Processing
- Prof. Dr. Emanuël Habets  
Spatial Audio Signal Processing
- Prof. Dr. Frank Wefers  
Virtual Reality
- Dr. Stefan Turowski  
Coordinator AudioLabs-FAU

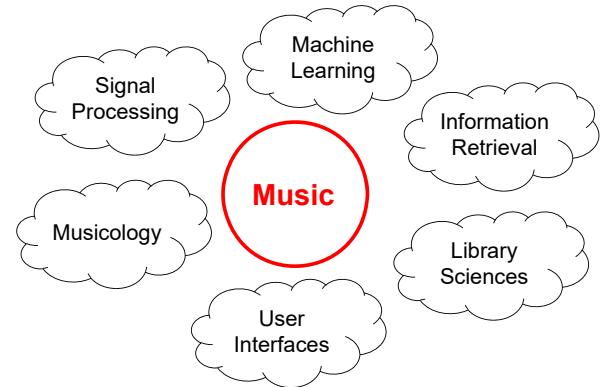


**Music**

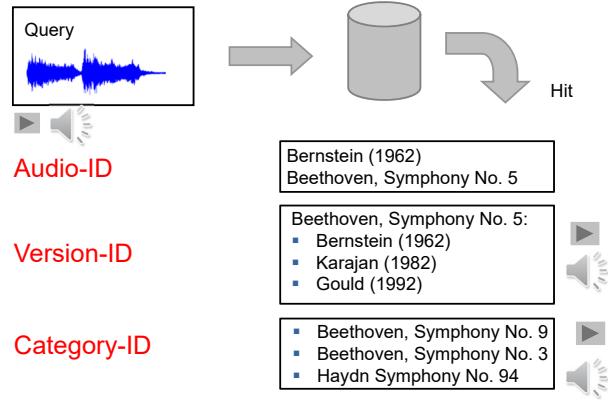
## Music Information Retrieval (MIR)



## Music Information Retrieval (MIR)

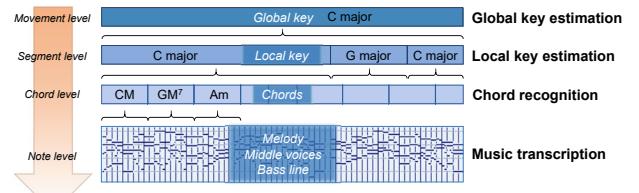


## Music Retrieval



## Harmony Analysis

- Different concepts
- Different temporal levels



## Harmony Analysis

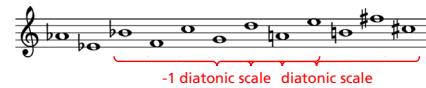
- Different concepts
- Different temporal levels



## Local Key Estimation

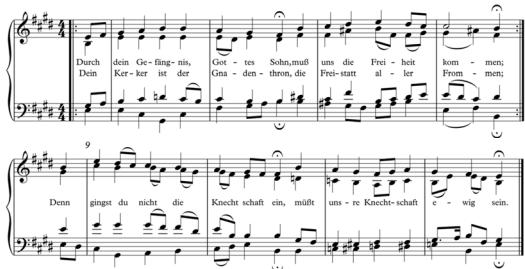
Assumption: Music based on **diatonic scales**

- Heptatonic scales
- Ordering of scales according to the circle of fifths
- Each scale consists of chain of six perfect fifth
- Fifth-neighboring scales share 6 of 7 notes



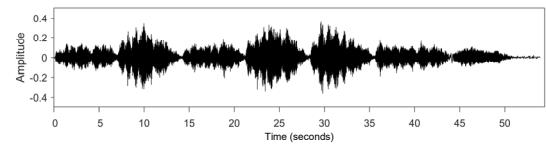
## Local Key Estimation

Example: J.S. Bach, Choral "Durch Dein Gefängnis" (*Johannespassion*)  
Score representation (piano reduction)



## Local Key Estimation

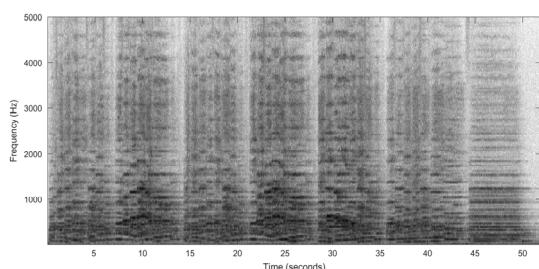
Example: J.S. Bach, Choral "Durch Dein Gefängnis" (*Johannespassion*)  
Audio recording (Scholars Baroque Ensemble, Naxos 1994)



Waveform

## Local Key Estimation

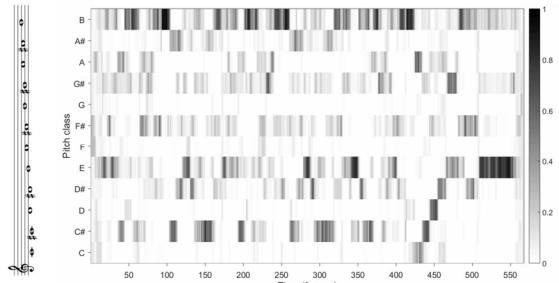
Example: J.S. Bach, Choral "Durch Dein Gefängnis" (*Johannespassion*)  
Audio recording (Scholars Baroque Ensemble, Naxos 1994)



Spectrogram

## Local Key Estimation

Example: J.S. Bach, Choral "Durch Dein Gefängnis" (*Johannespassion*)  
Audio recording (Scholars Baroque Ensemble, Naxos 1994)

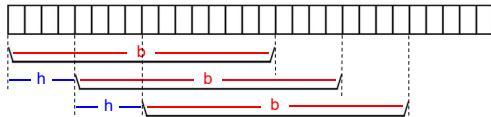


Chromagram

## Local Key Estimation

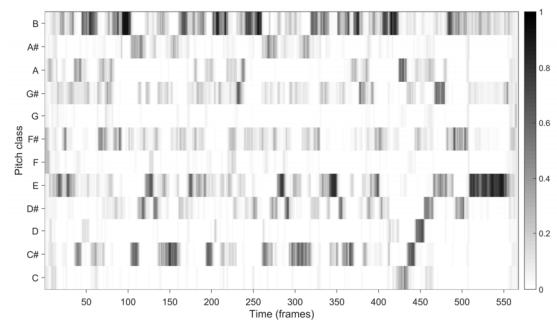
Summarize pitch class (chroma) content over a certain time period

- Feature smoothing
- Parameters: blocksize  $b$  and hopsize  $h$



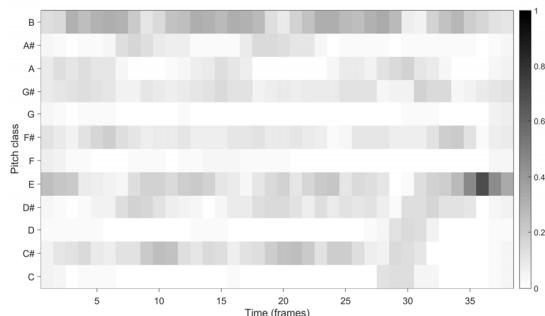
## Local Key Estimation

Chromagram



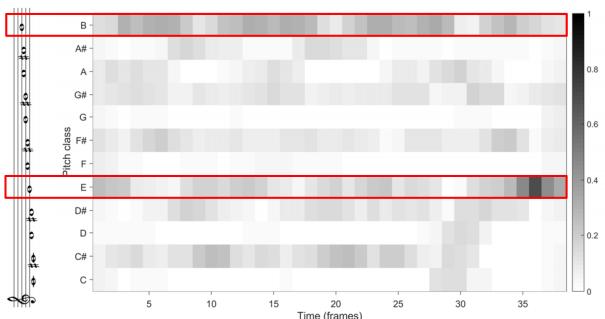
## Local Key Estimation

Chromagram after smoothing ( $b = 42, h = 15$ )



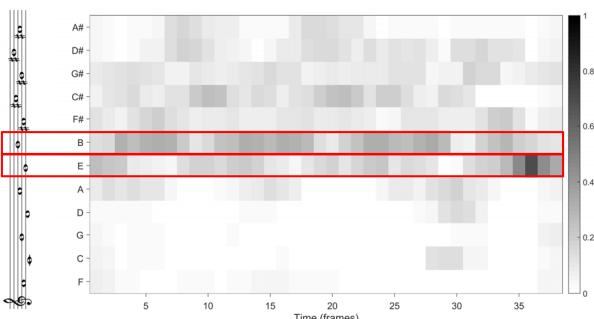
## Local Key Estimation

Arrange pitch classes according to **perfect fifth series**



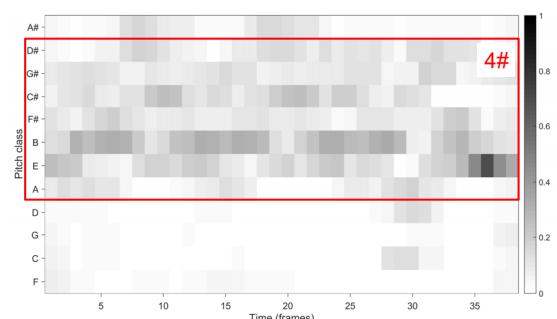
## Local Key Estimation

Arrange pitch classes according to **perfect fifth series**



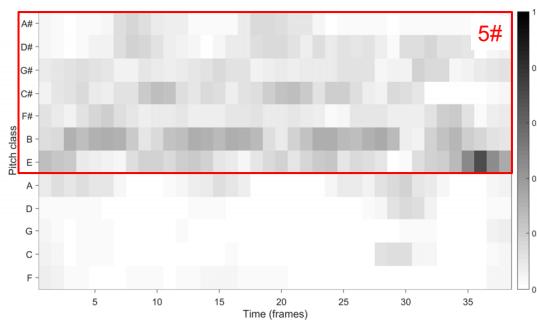
## Local Key Estimation

Summarize pitch class content according to **diatonic scales**



## Local Key Estimation

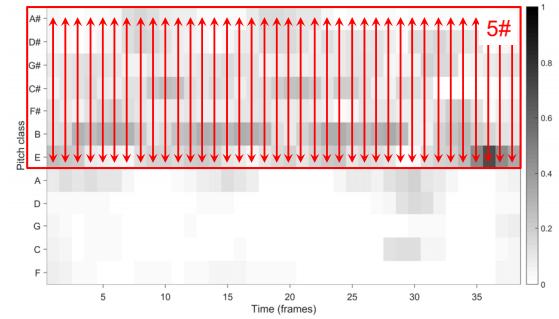
Summarize pitch class content according to **diatonic scales**



## Local Key Estimation

Summarize pitch class content according to **diatonic scales**

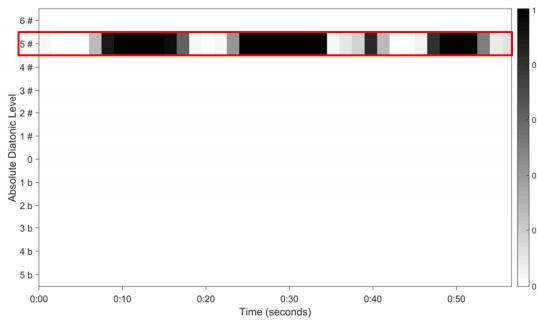
Multiply chroma values (in each column)



## Local Key Estimation

Summarize pitch class content according to **diatonic scales**

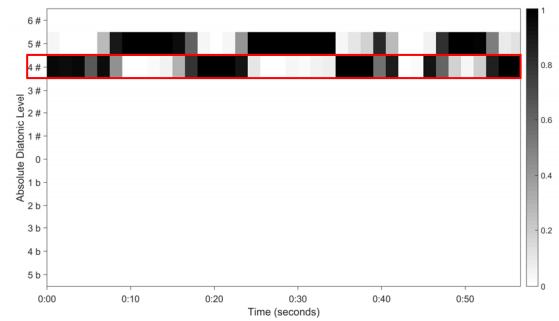
Multiply chroma values



## Local Key Estimation

Summarize pitch class content according to **diatonic scales**

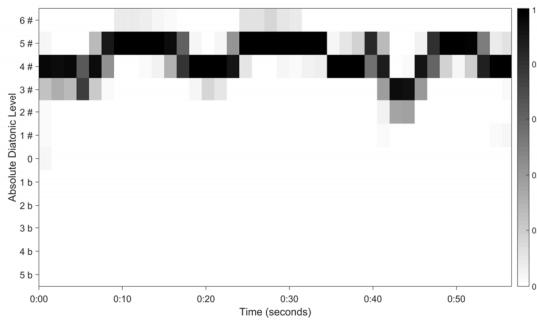
Multiply chroma values



## Local Key Estimation

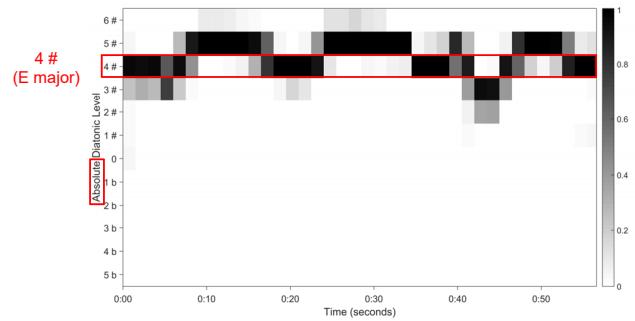
Summarize pitch class content according to **diatonic scales**

Multiply chroma values



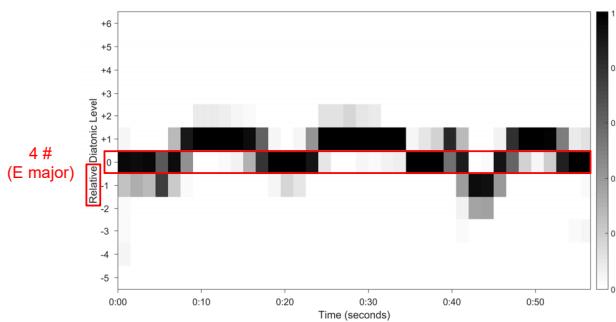
## Local Key Estimation

Normalize representation relative to **global key**



## Local Key Estimation

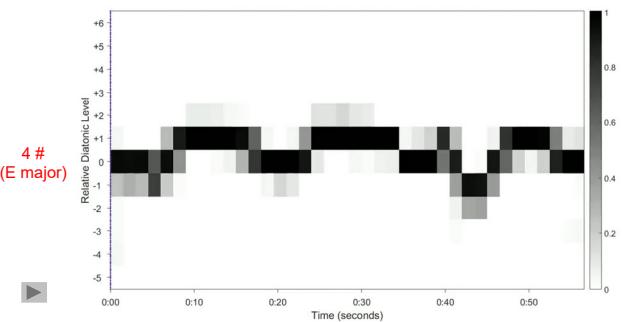
Normalize representation relative to **global key**



## Visualization of Diatonic Scales

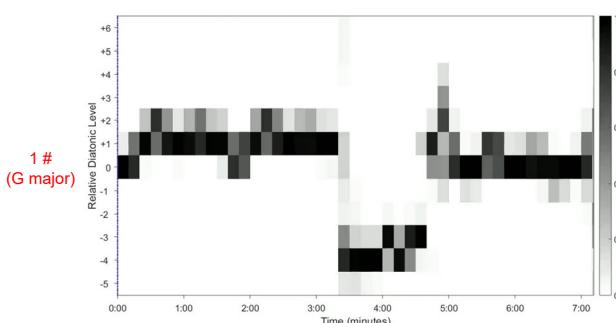
J.S. Bach: Choral "Durch Dein Gefängnis" (*Johannespassion*)

Recording: Scholars Baroque Ensemble, Naxos 1994



## Visualization of Diatonic Scales

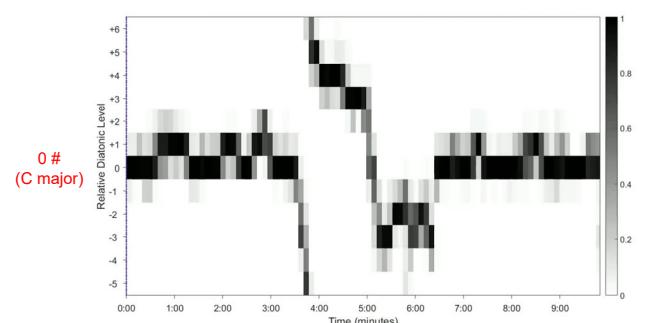
L. v. Beethoven: Piano Sonata No. 10 (Op. 14 Nr. 2), 1. Allegro  
Recording: Barenboim, EMI 1998



## Visualization of Diatonic Scales

R. Wagner, *Die Meistersinger von Nürnberg*, Vorspiel

Recording: Polish National Radio Symphony Orchestra, Naxos 1993



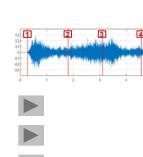
## Cooperation: Musicology

- Partner: Prof. Rainer Kleinertz  
Saarland University
- Duration: 2014 – 2018
- Objectives
  - Harmony-based structural analysis
  - Visualization techniques
  - Exploration of interdisciplinary research
- Application to Wagner's *Ring*



## Cross-Version Analysis

- 16 different versions (audio recordings)
- Measure annotations (manual for 3 versions, automatic for 13 versions)



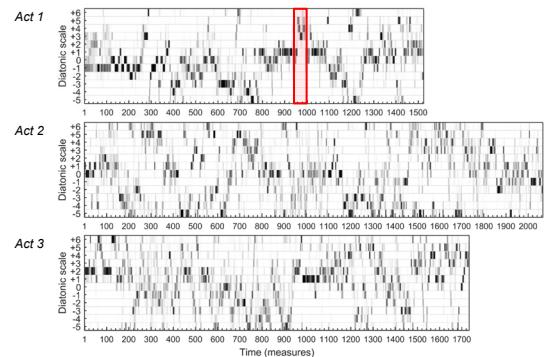
No.	Conductor	Recording	hh:mm:ss
1	Barenboim	1991–92	14:54:55
2	Boulez	1980–81	13:44:38
3	Böhm	1967–71	13:39:28
4	Furtwängler	1953	15:04:22
5	Haitink	1988–91	14:27:10
6	Janowski	1980–83	14:08:34
7	Karajan	1967–70	14:58:08
8	Keilberth/Furtwängler	1952–54	14:19:56
9	Krauss	1953	14:12:27
10	Levine	1987–89	15:21:52
11	Neuhold	1993–95	14:04:35
12	Sawallisch	1989	14:06:50
13	Solti	1958–65	14:36:58
14	Swarowsky	1968	14:56:34
15	Thielemann	2011	14:31:13
16	Weigle	2010–12	14:48:46

## Cross-Version Analysis

- Hypothesis:  
Harmonic characteristics should not depend on version
- Strategy:  
Use consistency of analysis results across different versions as indicator of "reliability" or "stability"
- Application:  
Visualize consistency with gray scheme

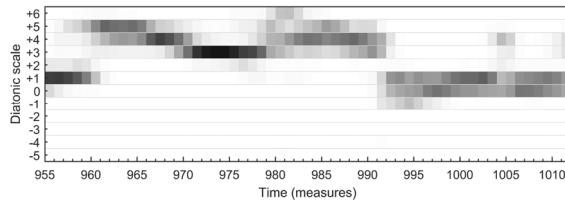
## Cross-Version Visualization

R. Wagner: WWV 86 B (*Die Walküre*)



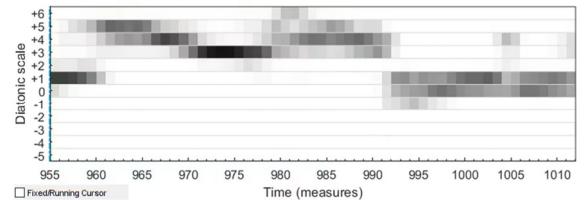
## Cross-Version Visualization

R. Wagner: WWV 86 B (*Die Walküre*)  
Act 1, measure 955–1012 (*Sieglinde's narration*)



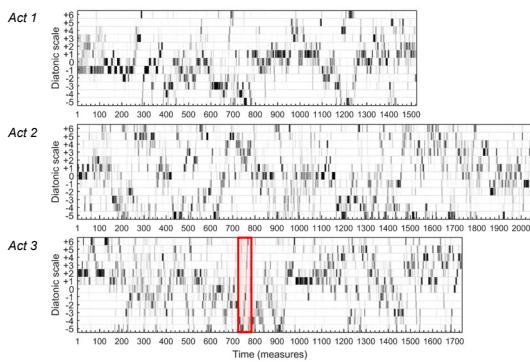
## Cross-Version Visualization

R. Wagner: WWV 86 B (*Die Walküre*)  
Act 1, measure 955–1012 (*Sieglinde's narration*)



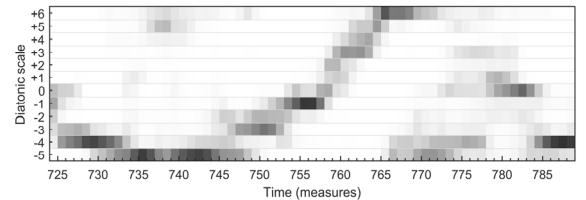
## Cross-Version Visualization

R. Wagner: WWV 86 B (*Die Walküre*)



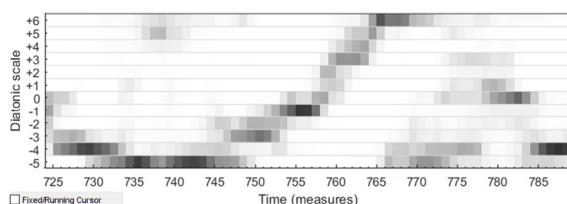
## Cross-Version Visualization

R. Wagner: WWV 86 B (*Die Walküre*)  
Act 3, measure 724–789 (*Wotan's punishment*)



## Cross-Version Visualization

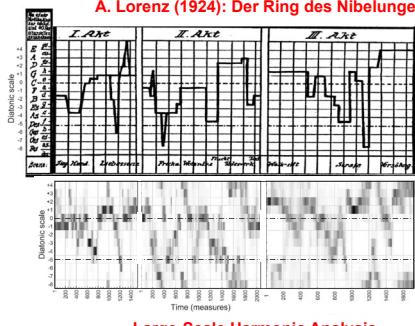
R. Wagner: WWV 86 B (*Die Walküre*)  
Act 3, measure 724–789 (*Wotan's punishment*)



## Cross-Version Visualization

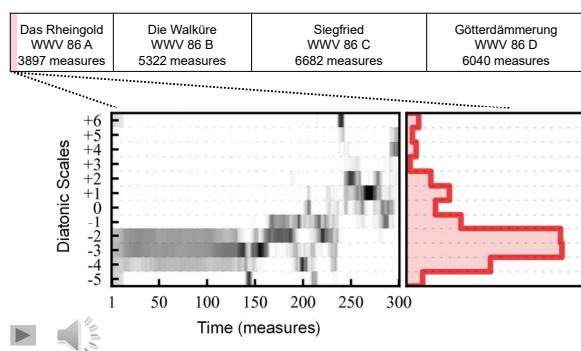
R. Wagner: WWV 86 B (*Die Walküre*)

A. Lorenz (1924): *Der Ring des Nibelungen*



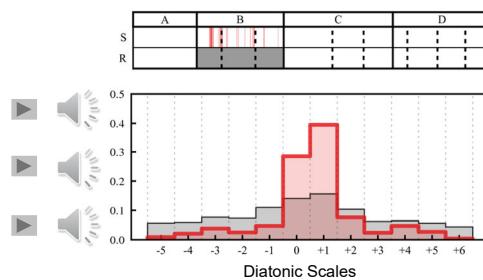
## Exploring Tonal-Dramatic Relationships

Tonal analysis representations and local histograms



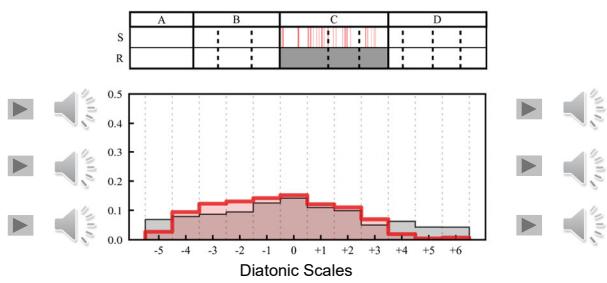
## Exploring Tonal-Dramatic Relationships

**Die Walküre – Sword motif**



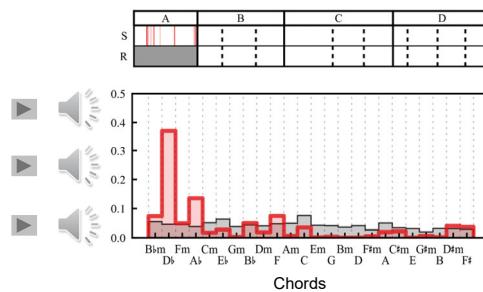
## Exploring Tonal-Dramatic Relationships

**Siegfried – Sword motif**



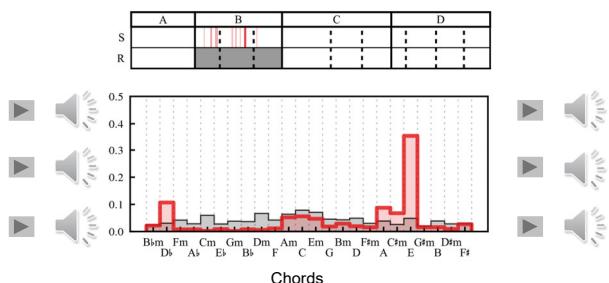
## Exploring Tonal-Dramatic Relationships

**Das Rheingold – Valhalla motif**



## Exploring Tonal-Dramatic Relationships

### Die Walküre – Valhalla motif



## Computational Analysis of Traditional Georgian Vocal Music



- Partner: Prof. Frank Scherbaum  
Potsdam University

Duration: 2018 – 2021

### Objectives

- Harmonic, tonal and performance analysis
- New sensors (larynx microphones)
- Digital humanities

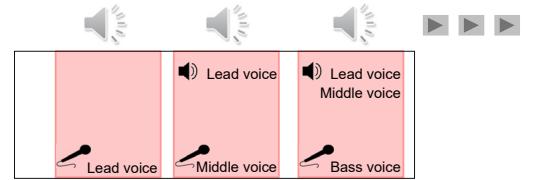
<https://www.audiolabs-erlangen.de/resources/MIR/2017-GeorgianMusic-Erkomaishvili>  
<https://www.audiolabs-erlangen.de/resources/MIR/2018-ISMIR-LBD-ThroatMics>

## Traditional Georgian Vocal Music

Which scale? Harmonic/melodic intervals? Singer interaction?

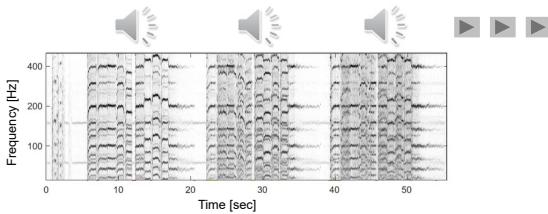


## Traditional Georgian Vocal Music



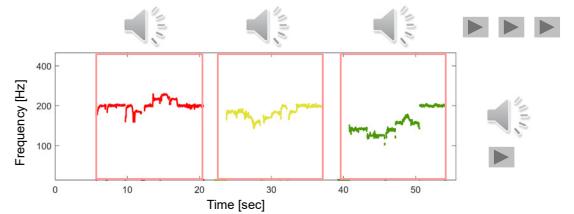
- Master chanter: Artem Erkomaishvili
- Recordings of 100 songs (1966)
- Example song: Da sulisatsa (#87)

## Traditional Georgian Vocal Music



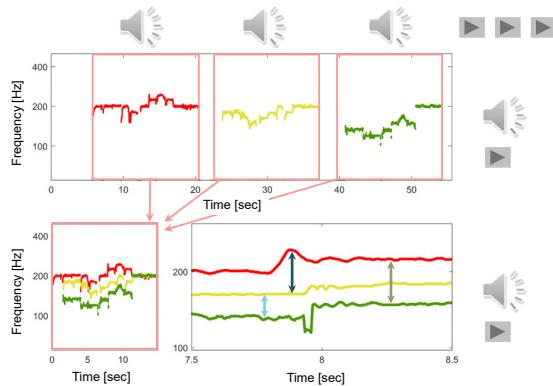
- Master chanter: Artem Erkomaishvili
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## Traditional Georgian Vocal Music

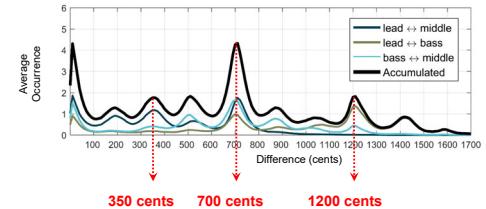


- Master chanter: Artem Erkomaishvili
- Recordings of 100 songs (1966)
- Example song: Da sulisatsa (#87)

## Traditional Georgian Vocal Music



## Traditional Georgian Vocal Music



## Automated Methods and Tools for Analyzing and Structuring Choral Music

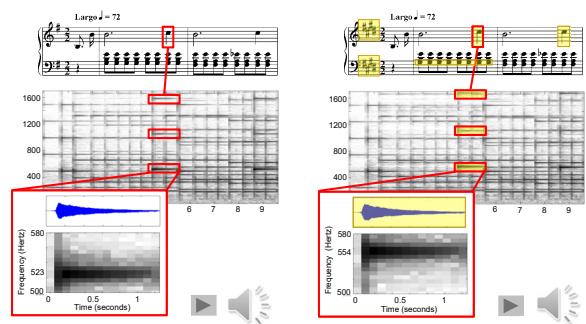
- Partner: Carus-Verlag
- Duration: 2018 – 2021
- Objectives
  - Navigation, visualization, sonification of musical structures
  - Practicability & applications (music education, musicology)
  - Web-based prototypes for interactive interfaces



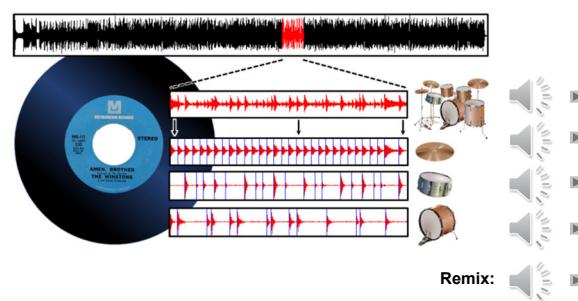
<https://www.audiolabs-erlangen.de/resources/MIR/2018-ISMIR-LBD-Carus>

## Score-Informed Audio Decomposition

Application: Audio editing

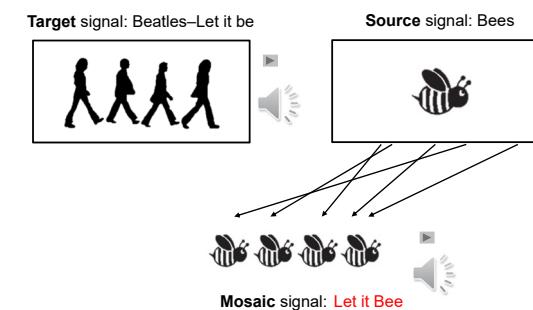


## Informed Drum-Sound Decomposition



Literature: [Dittmar/Müller, IEEE/ACM-TASLP 2016]  
Demo: <https://www.audiolabs-erlangen.de/resources/MIR/2016-IEEE-TASLP-DrumSeparation>

## Audio Mosaicing



Literature: [Driedger/Müller, ISMIR 2015]  
Demo: <https://www.audiolabs-erlangen.de/resources/MIR/2015-ISMIR-LetItBee>

## Motivic Similarity



Beethoven's Fifth (1st Mov.)



Beethoven's Fifth (3rd Mov.)



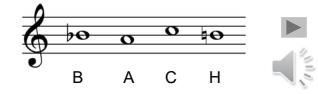
Beethoven's Appassionata



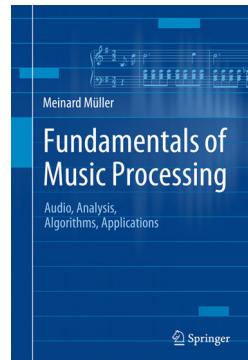
## Motivic Similarity

Var. 4: Vivace

## Motivic Similarity




## Book: Fundamentals of Music Processing



Meinard Müller  
**Fundamentals of Music Processing**  
 Audio, Analysis, Algorithms, Applications  
 483 p., 249 illus., hardcover  
 ISBN: 978-3-319-21944-8  
 Springer, 2015

Accompanying website:  
[www.music-processing.de](http://www.music-processing.de)

## Book: Fundamentals of Music Processing

Chapter	Music Processing Scenario
1	Music Representations
2	Fourier Analysis of Signals
3	Music Synchronization
4	Music Structure Analysis
5	Chord Recognition
6	Tempo and Beat Tracking
7	Content-Based Audio Retrieval
8	Musically Informed Audio Decomposition

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