



Universiteit Utrecht

[Faculty of Science
Information and Computing Sciences]

Music generation and manipulation

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Sound and Music Technology
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Overview

- Different contexts for automatic generation
 - computer as supporting tool for composer
 - computer as testing tool for researchers
 - computer as interactive musical instrument
 - computer as instrument within educational/health context
 - automatic generation for games



Example



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Example



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Informatik und Mathematik
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www.wzwm.uni-wuerzburg.de

History

- Process of composing itself often almost algorithmical
 - Example: canon
 - Explained by: Justin Henry Rubin, University of Minnesota Duluth

<http://www.d.umn.edu/~jrubin1/JHR%20Canonic%20Examples2ab.htm>



University of Minnesota

[Faculty of Science
Engineering and Computing Sciences]
University of Minnesota

History

- Composing as constraint-based “programming”
 - Example: Palestrina counterpoint, described in Johann Joseph Fux: *Gradus ad Parnassum* (1725)
 - *Palestrina Pal* (by Anna Huang, 2005): automatic rule checker
 - Constraint programming in music (Truchet & Assayag, 2011), IRCAM in Paris, for supporting composer



History

■ Musical dice game

■ Johan Philipp Kirnberger, 1757

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WÜRFEL-MENUETT

Johann Philipp Kirnberger
(1757)

1 2 3 4 5 6 7 8

9 10 11 12 13 14 15 16

17 18 19 20 21 22 23 24



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History

■ Musical dice game

■ Johan Philipp Kirnberger, 1757

<https://www.youtube.com/watch?v=fK2MCXpDWB4>

<https://www.youtube.com/watch?v=9Zdg6Ec4mVw>



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www.fwi.uni-bayreuth.de

History

- Musical dice game

- Johan Philipp Kirnberger, 1757

<https://www.youtube.com/watch?v=fK2MCXpDWB4>

<https://www.youtube.com/watch?v=9Zdg6Ec4mVw>

- Joris de Man, game music composer, ISMIR 2010



History

■ Babbages' Analytical engine

- First fully-automatic calculating machine
- conceived in 1834, designed to evaluate any mathematical formula; part of the machine was completed before Babbage's death in 1871
- checkout Science Museum London



History

■ Ada Lovelace on Babbages' Analytical engine:

- Supposing, for instance, that the fundamental relations of pitched sound in the signs of harmony and of musical composition were susceptible of such expression and adaptations, the **engine might compose elaborate and scientific pieces of music of any degree of complexity or extent**"
- Lovelace's notes became one of the critical documents to inspire Alan Turing's work on the first modern computers in the 1940s. (<http://findingada.com/about/who-was-ada/>)



History

■ Iannis Xenakis

- "Formalized music", 1963
- Stochastic methods for composing
- Not fully automated, computer has aided the composition process
- <https://www.youtube.com/watch?v=qIGDMMN1IQI>

■ Mario Baroni & Carlo Jacoboni: Proposal for a Grammar of Melody: The Bach Chorales, 1978

■ Kemal Ebcioglu: CHORAL (1986)

- Rule-based approach to produce Chorals in the style of Bach



Recent examples

■ Francois Pachet: Continuator

- Computer as interactive musical instrument
- combines techniques from interactive and automatic learning systems.
- learns and interactively plays with a user in the user's style.
- based on a Markov model of musical styles



Recent examples

■ Francois Pachet: Continuator

<https://www.francoispachet.fr/continuator/>

<https://www.youtube.com/watch?v=cHKcq0D5EY4>

<https://www.youtube.com/watch?v=ynPWOMzossI>



Recent examples

■ Gerard Assayag & Shlomo Dubnov: Factor oracle improvisation

■ Factor oracle

- efficient data structure, used to model recombination aspect of musical improvisation
- <http://recherche.ircam.fr/equipes/repmus/MachineImpro/>

■ Variable markov models

- Based on “Factor oracle: A new structure for pattern matching. In: SOFSEM’99: Theory and Practice of Informatics, LNCS, vol. 1725, pp. 295–310. Springer Berlin / Heidelberg, Milovy, Czech Republic (1999)”



Recent examples

- Dorien Herremans and Elaine Chew: MorpheuS (2016)



Most recent example

- Dorien Herremans and Elaine Chew: MorpheuS (2016)
 - Dagstuhl stimulus talk, March 2016

Why don't we listen to automatically generated music?

⇒ Long-term structure



MorpheuS

Composing music = combinatorial optimization problem

- Decide on which notes
- Objective: fit a style/structure
- Solved by metaheuristic such as variable neighbourhood search



Constraints: tension and patterns

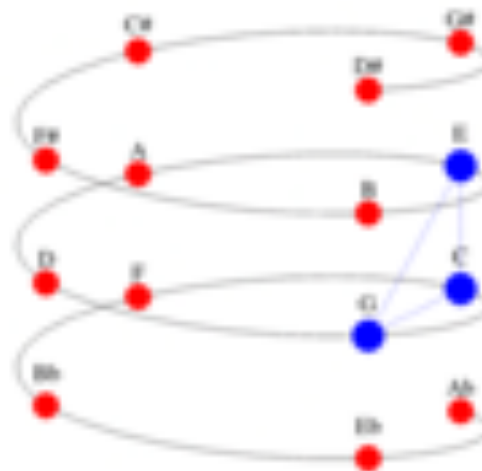
- 1 Structural constraints
 - Global structure
 - Tension profile
 - Pattern detection



Tonal tension

The spiral array, a 3D mathematical model for tonality

The Spiral Array (Chew, 2000) with a C major chord:



→ 3 aspects of tonal tension

<https://www.youtube.com/watch?v=bLNiuCqeno>

<https://vimeo.com/151142022>

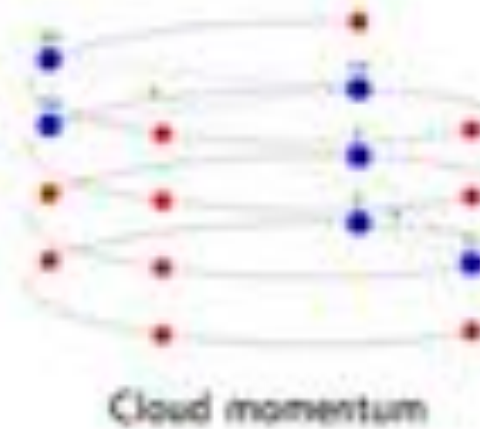
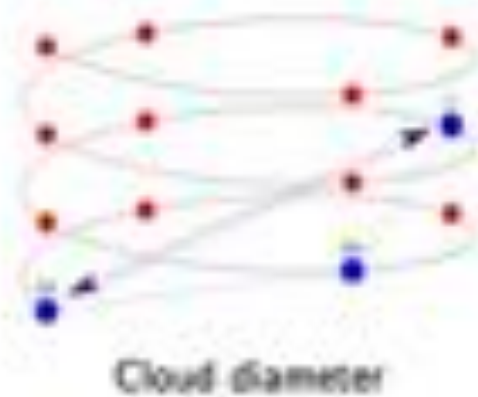


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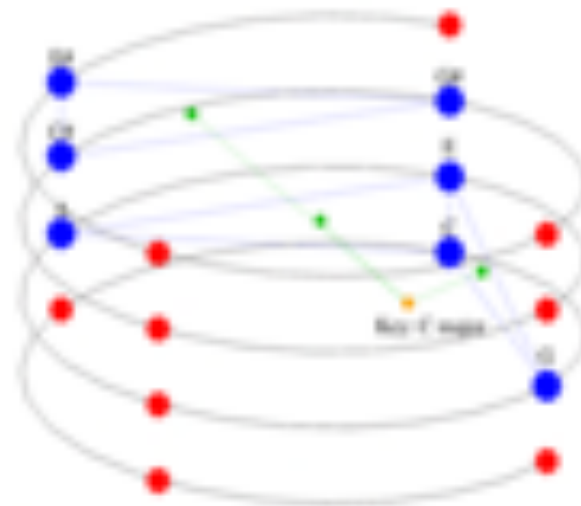
Tonal tension

3 aspects of tonal tension



Tonal tension

3 aspects of tonal tension



Tensile strain (distance to key)

Tonal tension

Tension profiles – soft constraints



(a) Cloud diameter



(b) Cloud momentum



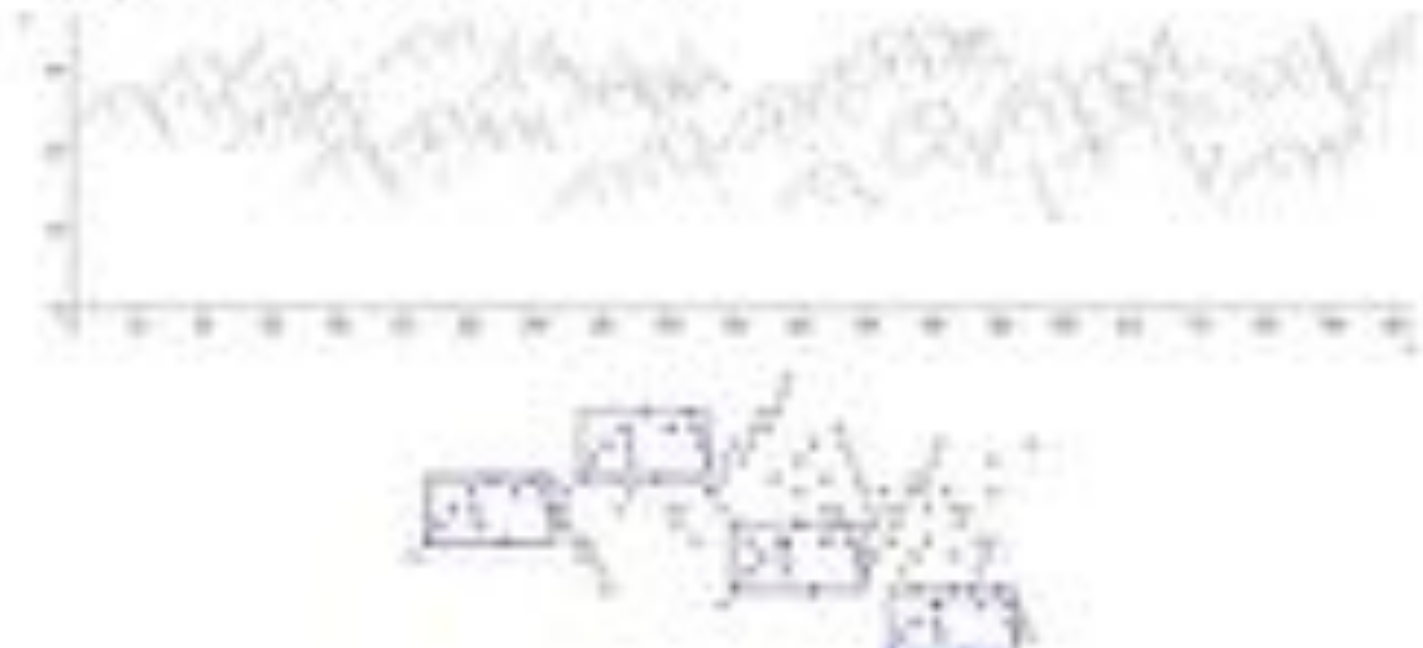
(c) Tensile strain



Pattern

Pattern detection

- Compression algorithm: COSIATEC (Meredith, 2003)
- Point set representation of a piece
- Computes a compressed encoding of the piece
→ maximal translatable patterns

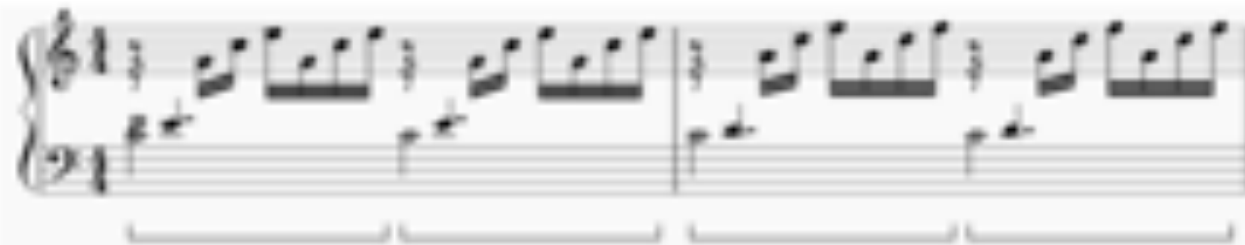


Generation

Putting it all together: MorpheuS

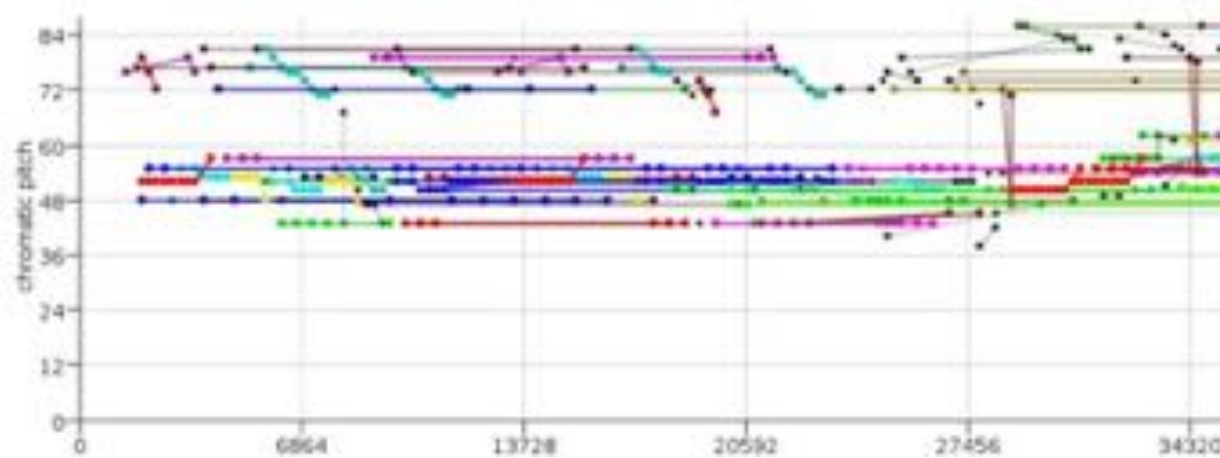
- Problem: find pitches
- Objective: match tension profile to template
- Hard constraint: detected patterns

⇒ Test: Bach 1st Prelude:



Generation

Preliminary results: pattern detection



Generation

Preliminary results: random starting piece

JOHANN SEBASTIAN BACH

Andante (♩ = 60)

Dm7(b9)

G7(b9)

C



Generation

Preliminary results: fit in tension profile & patterns

Andante (♩ = 60)



MorpheuS

■ <http://dorienherremans.com/morpheus>



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www.utwente.nl

Deep Learning

- Bob Sturm – Folk RNN (student presentation)
- BachBot | Creative AI for Classical Music
- DeepBach: harmonization in the style of Bach generated using deep learning (Francois Pachet)



Companies

- Jukedeck (London), first merged with Bytedance, now with TikTok
 - AI compositions for videos
- Melodrive (Berlin)
 - Music for interactive media
 - Demos



Conclusion

- Lots of different usages for automatic compositions!
- Type of approach depends on the goal
 - Do you want an interactive system for a composer?
 - Example: IRCAM@Paris
 - Do you want a fully-automated version (like for videos or games)?
 - Examples: Jukedeck, Melodrove
 - Do you want to accompany someone (e.g. Solo instrument)



Exam

- Material: lectures and papers discussed in the class room
- Mixture of open questions and specific questions
 - E.g. “choose a specific musical feature and describe what information is extracted from a musical document with this feature for what purpose” (though the exam questions will be more specific than this example)
- Symbolic vs. Audio: differences? what can be achieved in what domain?
- Typical challenges, errors and ways of evaluation for a specific computational task (e.g. Corpus analysis, chord recognition)
- Application of your knowledge



Exam

- Find document "Exam_Examplequestions" in Google drive, with example questions



Example questions

■ **Example question:** *Basic representation of musical content in digitized music files*

- a. Please name and give a 1-phrase description of the two different basic representations of digitized musical content.
- b. For each representation describe one context in sound and music technology in which it is usually employed. Briefly describe one concrete application scenario for each.



Example questions

- **Example question 2:** *Computational modeling of music similarity*
- In the context of music classification in Music Information Retrieval (MIR), the computational modeling of *music similarity* plays a crucial role.
 - a. Name three different types of similarity information extracted from digitized music files in MIR for computing similarity between musical pieces. Give a short description on how this information is used for computing similarity (2 sentences per type of information).
 - b. Name and briefly describe 2 different challenges of modeling similarity in music.
 - c. Choose one accepted method for computing similarity named in 2 a) and describe the steps involved. Typically we expect 4-6 different steps.



Exam

- Find document "Answers_Examplequestions" in Google drive, with example answers



Next lecture

- Michiel Kamp: Department of musicology
- Games: how is music composed to achieve what effects?

