

Rhythm Tree Rewriting

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general perspective

music symbolic representations

in particular traditional western music notation

processing of tree structured representations

general long term goal: symbolic MIR problems

<http://music-ir.org/mirex>

- querying bases of music scores
- transformations,
- melodic similarity detection,
- genre classification, recommendation,
- detection of repetitions, automatic segmentation, musicological analysis

one particular target application: [rhythm transcription](#)

target application

rhythm transcription: automatic generation of notation

plan of the talk

- context: computer assisted (Music) composition
- problem: rhythm transcription
- data structure: rhythm trees
- term rewriting approach
- weighted tree automata

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Assisted Composition

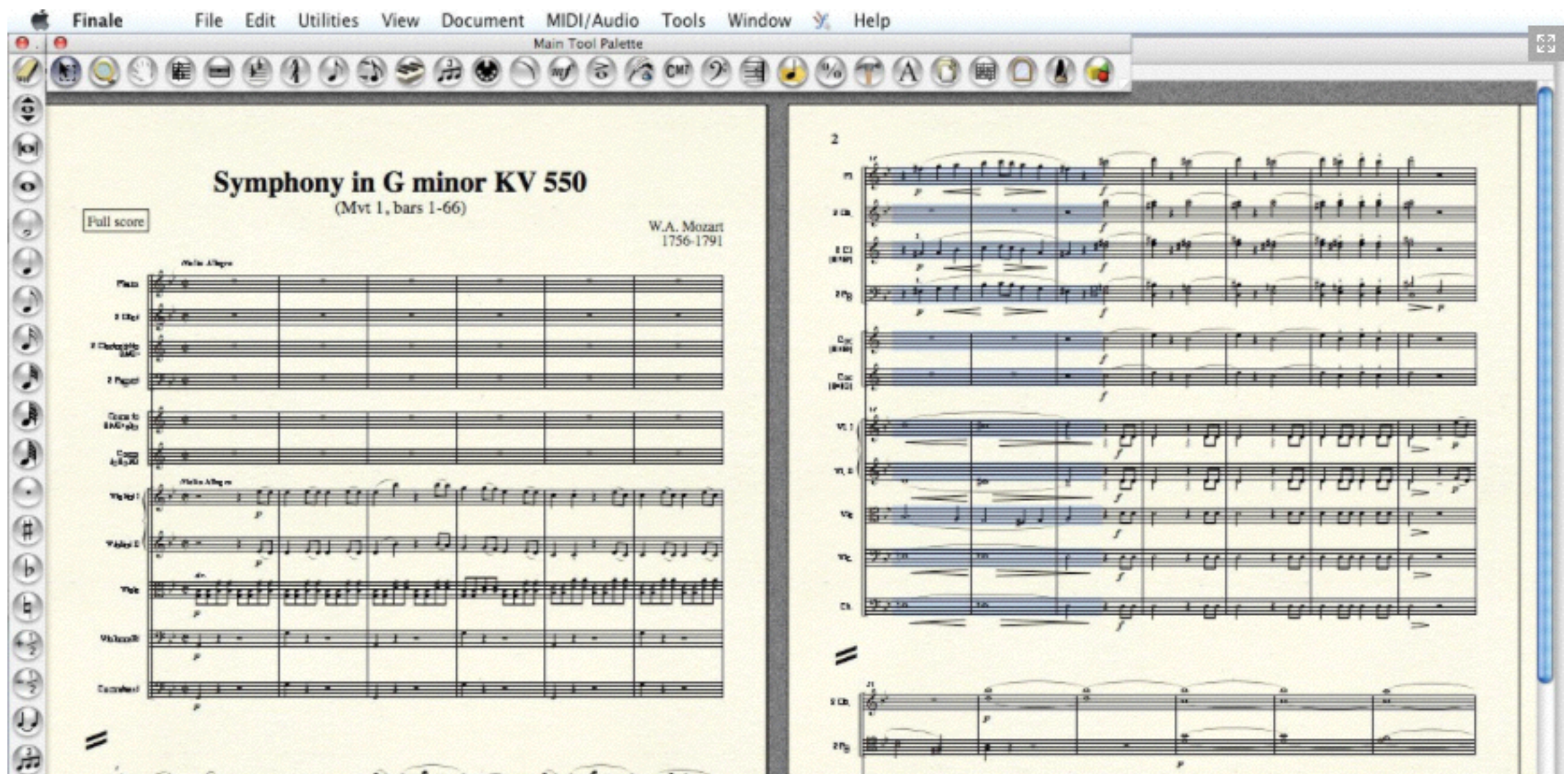
hardware and software tools for authoring music,
production of music scores

music notation editors

score printing

import/export MIDI and MusicXML

- [Finale](#) (MakeMusic)
- [Sibelius](#) (Avid)

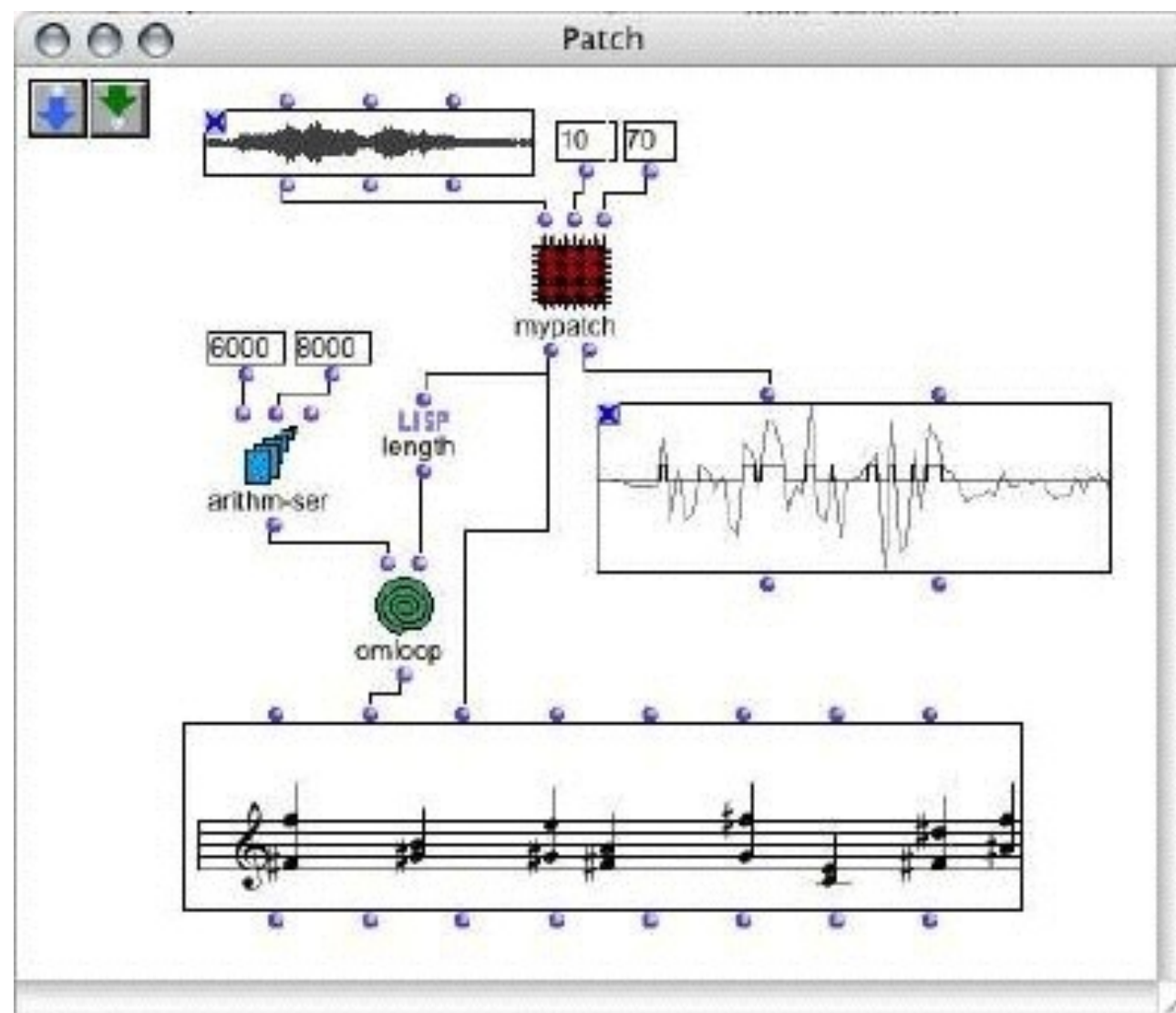


algorithmic composition environments

solving musical problems

visual programming languages based on Lisp

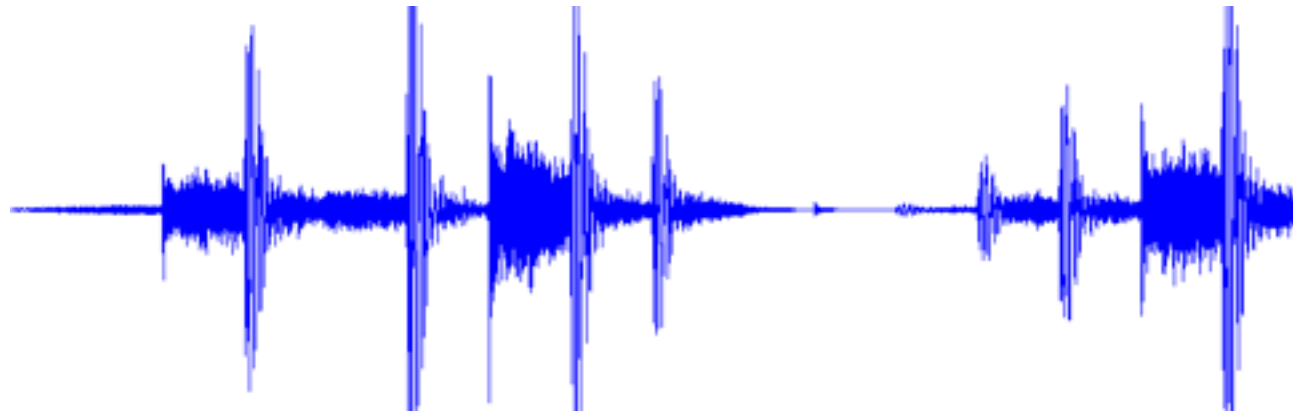
- [PWGL](#) (Sibelius Academy)
- [OpenMusic](#) (Ircam)



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Automatic Music Transcription

automatic music transcription: goal



(71, 0.0) (74, 1.18) (46, 1.73) (52, 2.09) (5



acoustical recording
(audio file)

symbolic timed trace
(MIDI file, piano roll)

notation
(MusicXML...)

automatic music transcription: tasks

pitch tracking

onset detection

beat tracking

tempo/metric extraction

structural segmentation

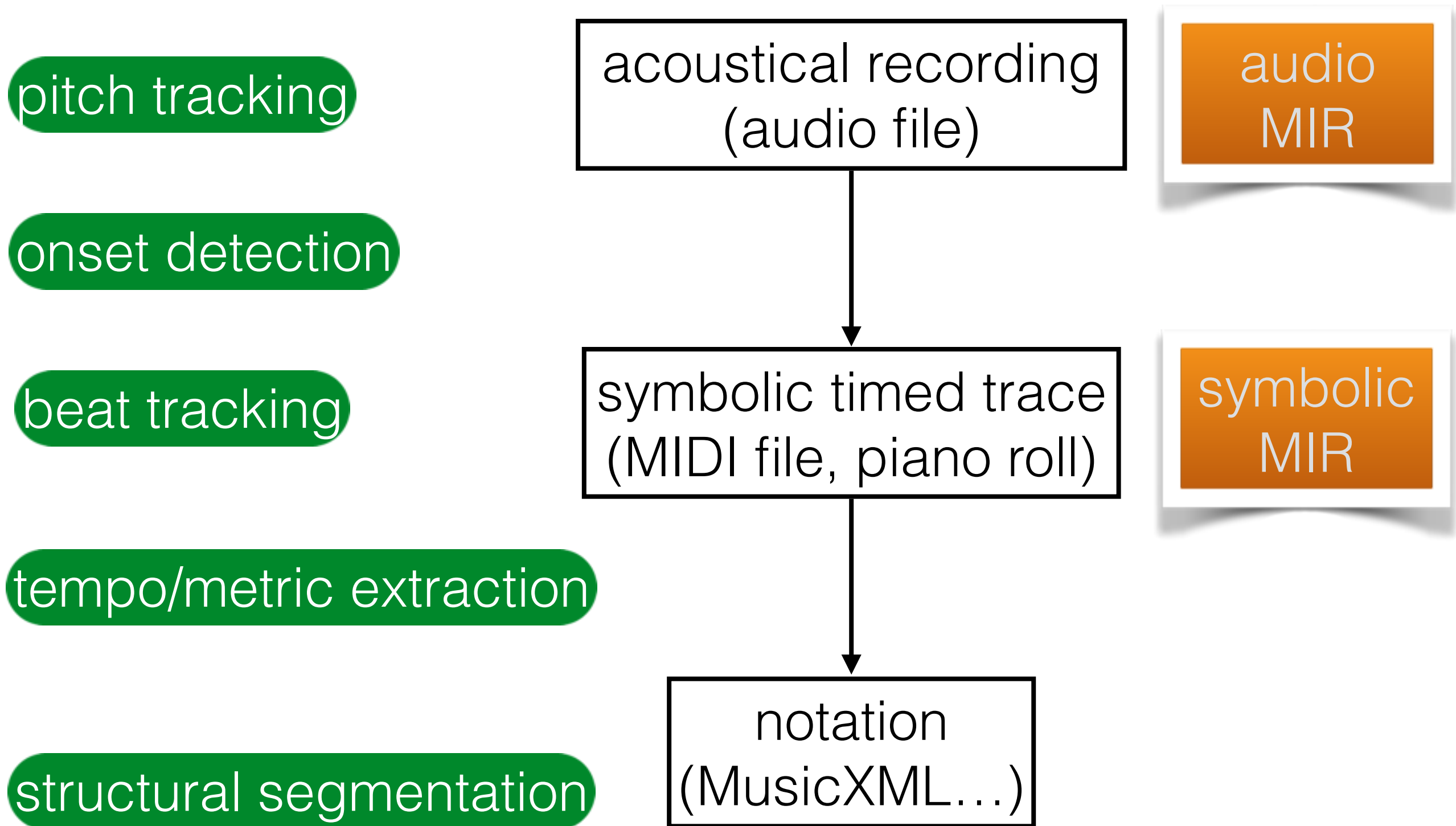
acoustical recording
(audio file)

audio
MIR

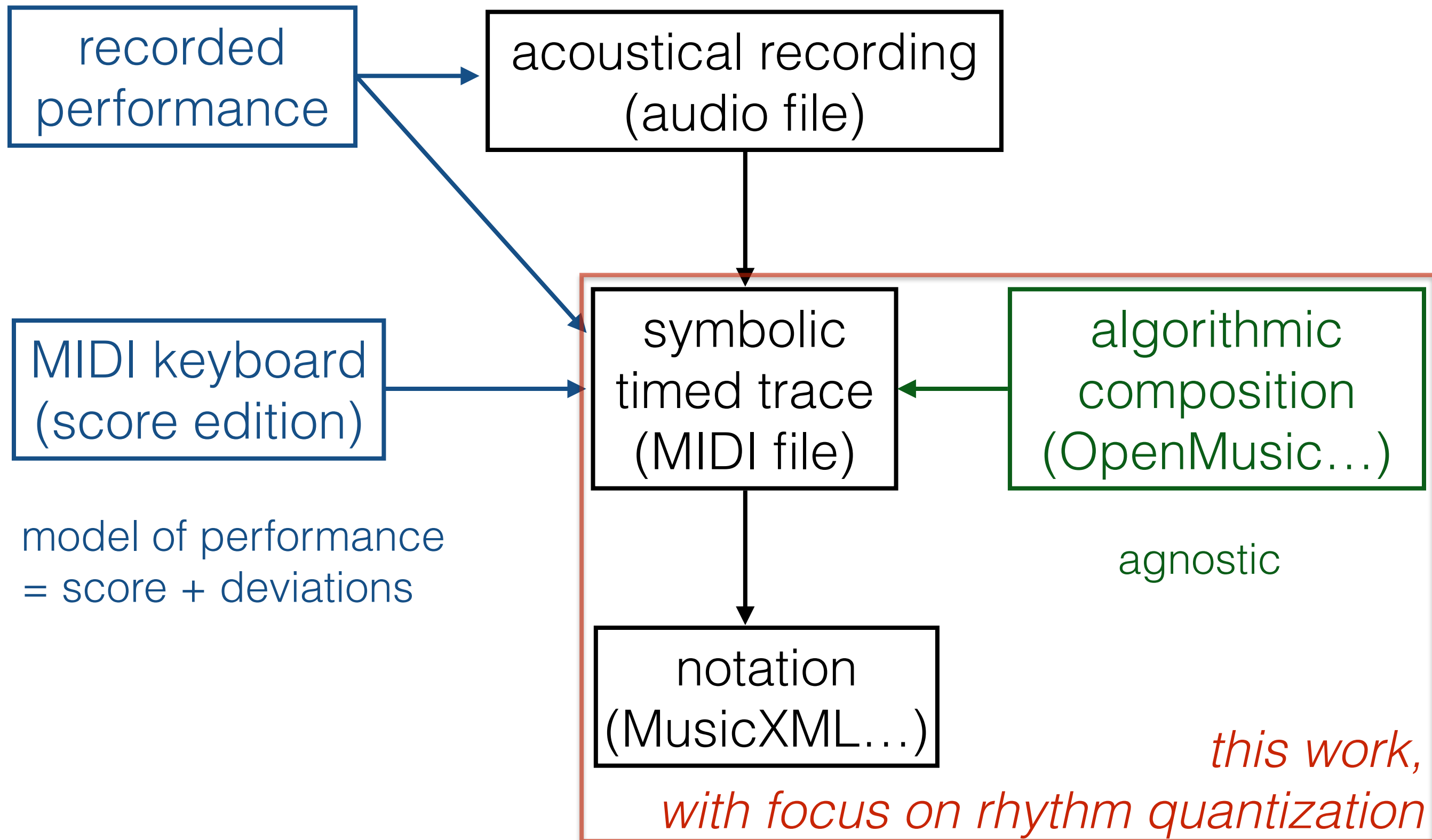
symbolic timed trace
(MIDI file, piano roll)

symbolic
MIR

notation
(MusicXML...)



automatic music transcription: applications

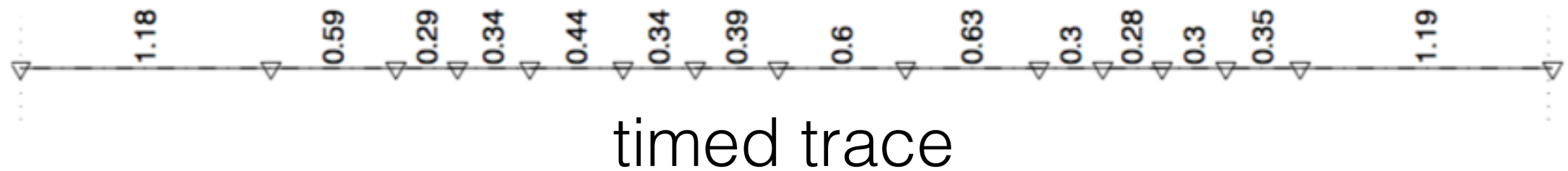


rhythm quantization (symbolic)

1. **segmentation** of the input timed trace
each segment with constant tempo
or known acceleration
2. identification of tempo / **beat positions**
3. **local quantization** on each segment
(*on-the-beat quantization*)

- input: one segment = timed trace:
sequence ***s*** of pairs (onset,duration) in \mathbf{R}^2 (ms)
- output: sequence ***t*** of pairs (onset, kind), with
 - onsets in ***D***, small discrete set
(admissible subdivisions of beat)
 - kind = 'note' or 'silence'
 - number of 'notes' = $|\mathbf{s}|$

rhythm quantization : measures of quality



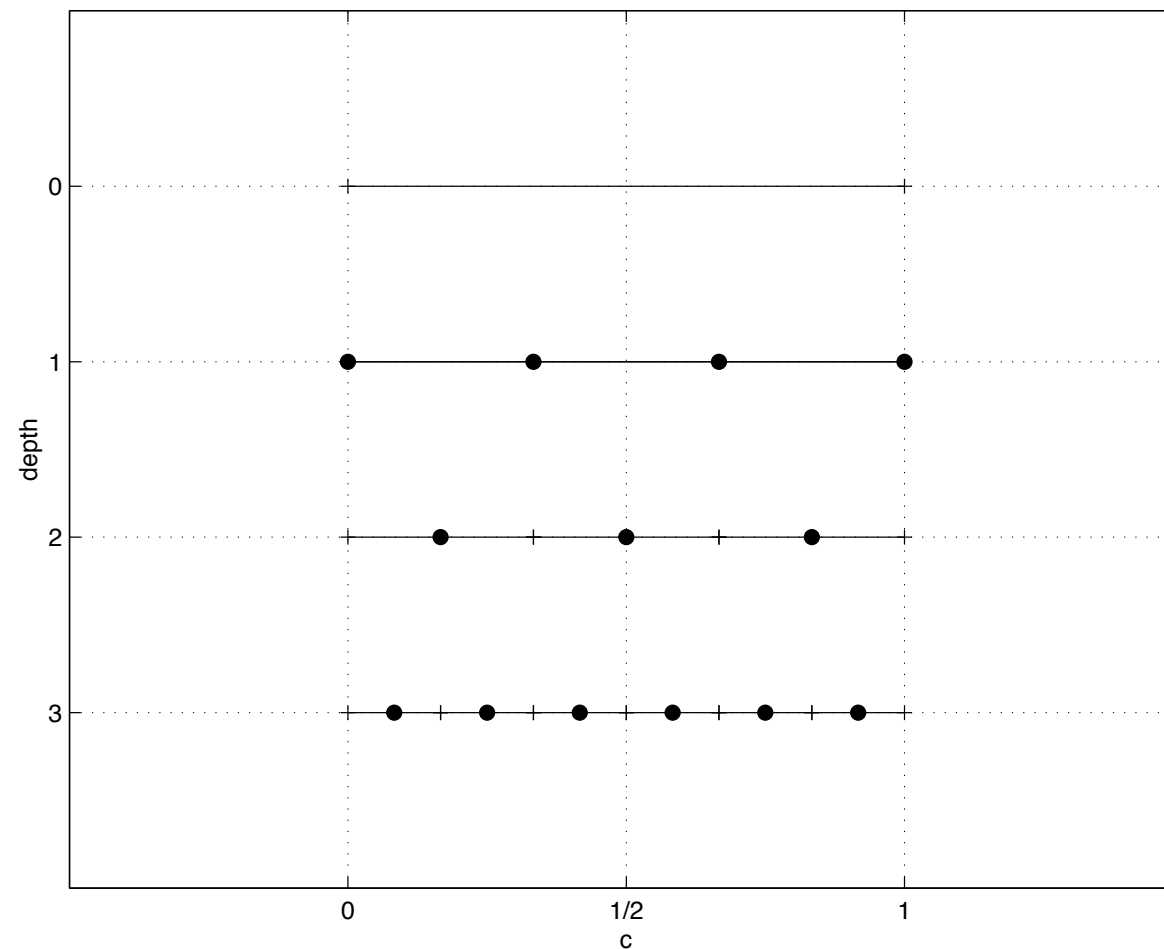
alignment to grid

Longuet-Higgins

Mental Processes: Studies in Cognitive Science, 1987

Desain, Honing, de Rijk

Quantization of musical time
Music and Connectionism, MIT Press 1991

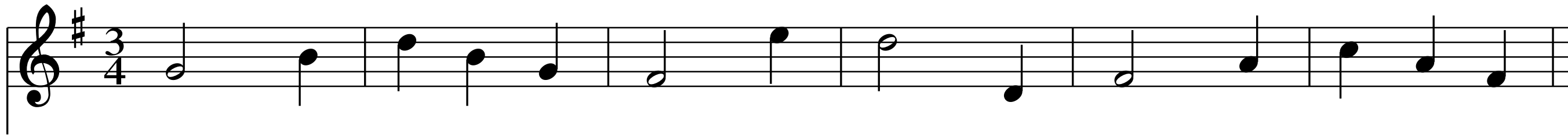


grid of depth 3 and subdivision schema (3, 2, 2)

choice of the grid

according to depth, number of divisions...
with user parameters or heuristics

which grid for this?



which grid for that?

Sub
-56

Vln

3/8

pp

mf

f

mp

p

ff

more gliss.

Sub
-56

heuristics for grid selection

Pressing, Lawrence

Transcribe: A comprehensive autotranscription program
ICMC 1993

Agon, Assayag, Fineberg, Rueda

Kant: A critique of pure quantization
ICMC 1994

Meudic

OMquantify
PhD Ircam, 2005

- given a predefined set T of template grids (user parameters)
- align the input segment \mathbf{s} to grids of T
- select the best grid $g \in T$ according to distance to \mathbf{s}
- return alignment of \mathbf{s} to g (converted to a score)

local quantization workflow

OMquantify

- generation of several grids
- select best grid g (according to 3 distances)
- align input seq. \mathbf{s} to g
- convert the alignment into **OpenMusic Rhythm Tree** return as score

RT based approaches

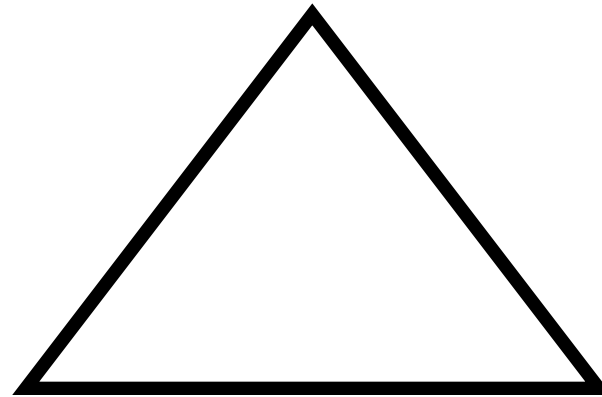
- convert input seq. \mathbf{s} into RT
- computations on RT(s)
- return RT result as score

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Rhythm Trees

rhythms and durations

rhythmic values
(fractions of the period)
= symbolic notation

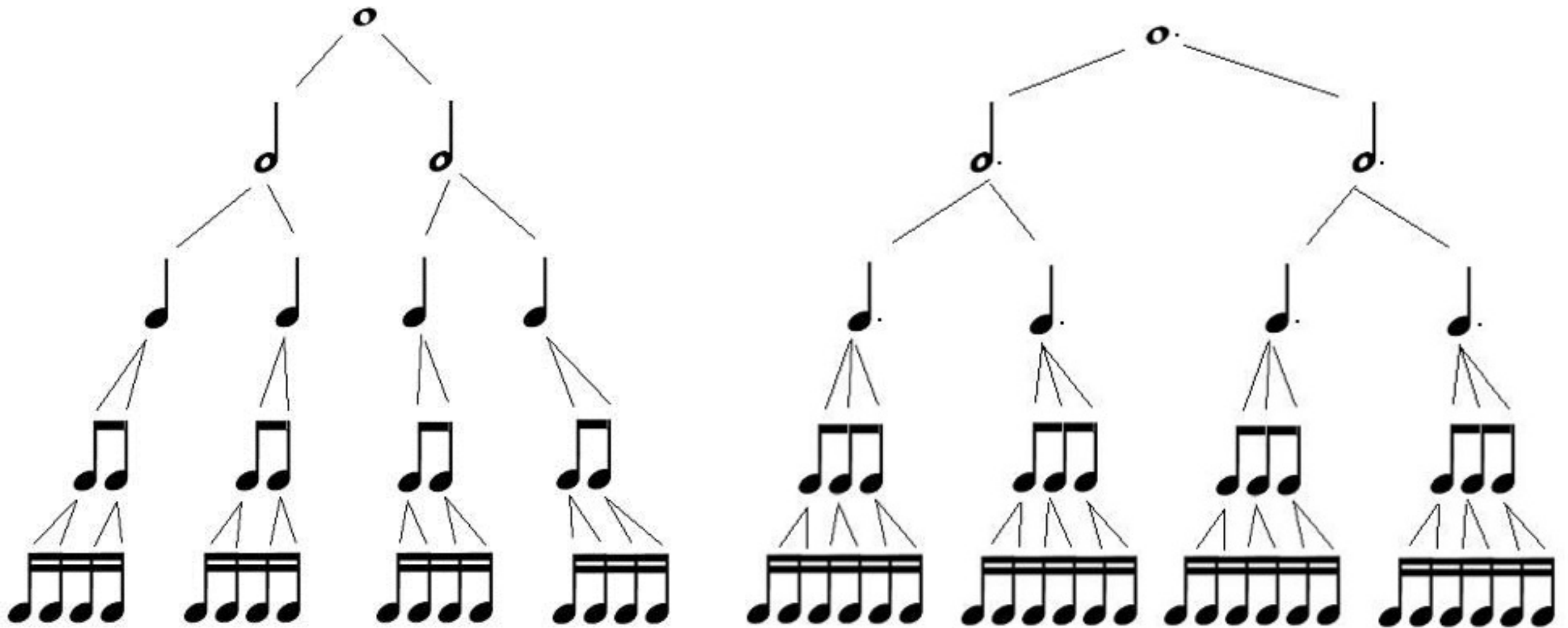


tempo (frequency)

durations (ms)

rhythm trees (RT)

in traditional western music notation:
durations are defined by recursive subdivisions of units



rhythm CF grammars

Lee

The rhythmic interpretation of simple musical sequences
Musical Structure and Cognition, 1985

$$\frac{3}{4} \rightarrow \text{♩} \cdot \mid - \cdot \mid \frac{1}{4} + \frac{1}{4} + \frac{1}{4}$$

$$\frac{1}{4} \rightarrow \text{♩} \mid \text{♩} \mid \frac{1}{8} + \frac{1}{8}$$

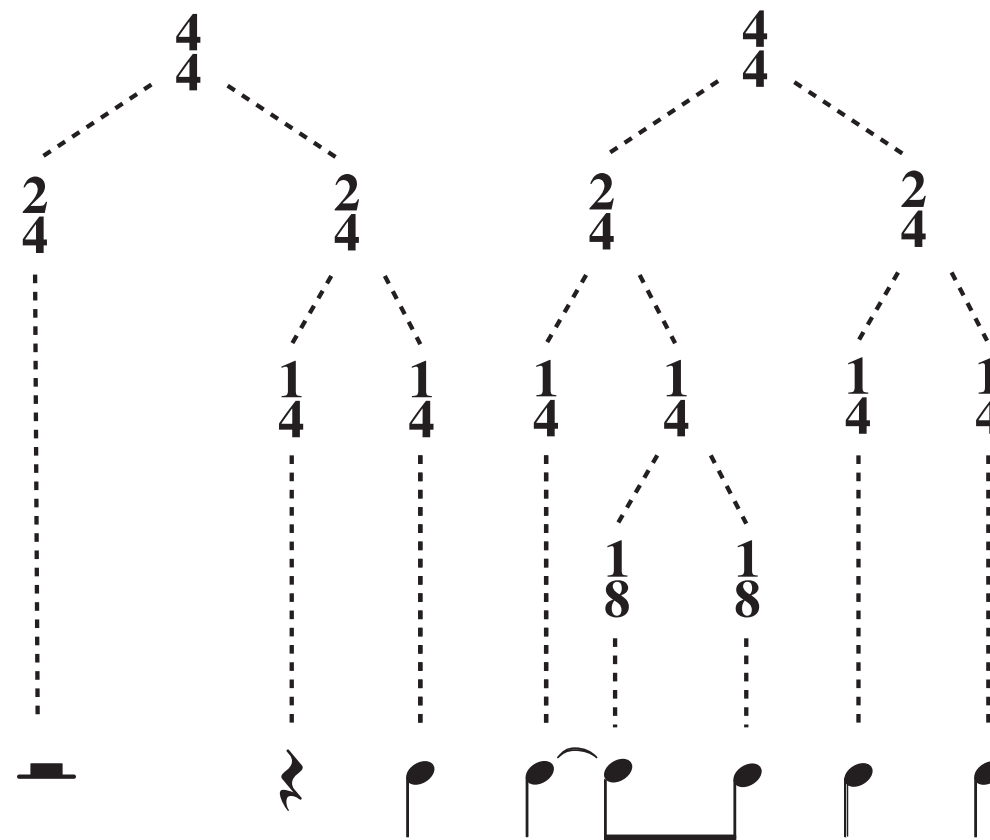
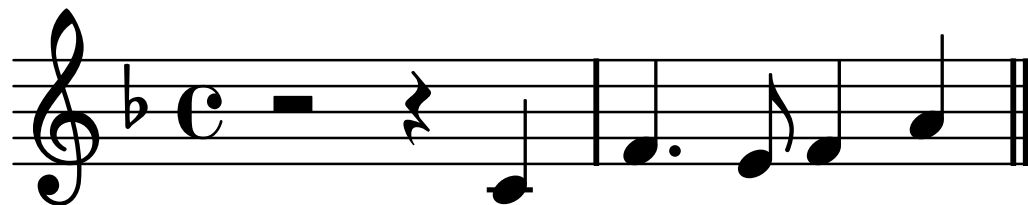
$$\frac{1}{8} \rightarrow \text{♩} \mid \text{♪} \mid \dots$$

$$\text{C} \rightarrow \text{♩} \mid - \mid \frac{2}{4} + \frac{2}{4}$$

$$\frac{2}{4} \rightarrow \text{♩} \mid - \mid \frac{1}{4} + \frac{1}{4}$$

$$\frac{1}{4} \rightarrow \text{♩} \mid \text{♩} \mid \frac{1}{8} + \frac{1}{8}$$

$$\frac{1}{8} \rightarrow \text{♩} \mid \text{♪} \mid \dots$$



OM rhythm trees (OMRT)

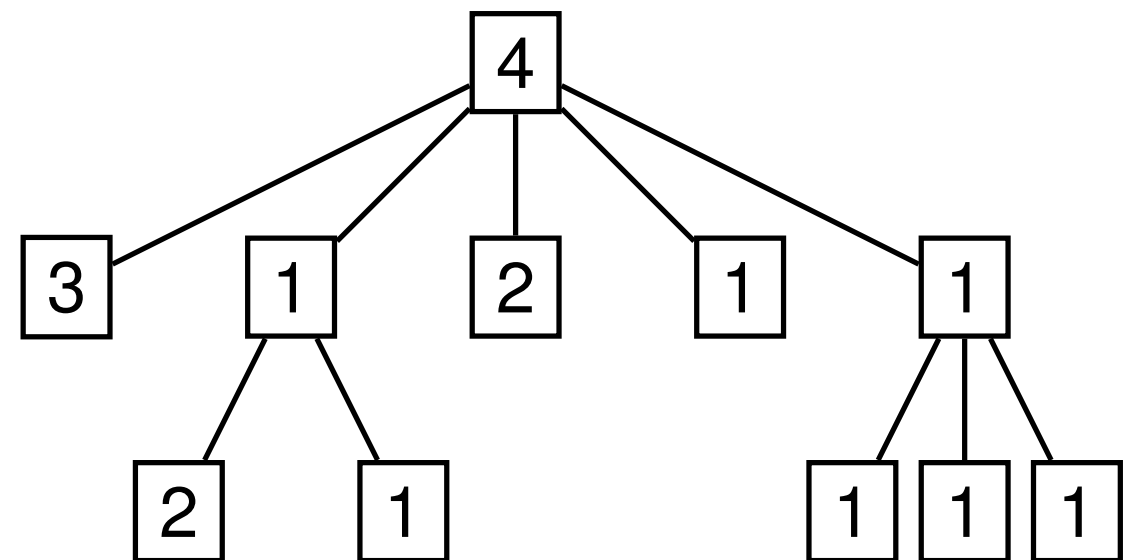
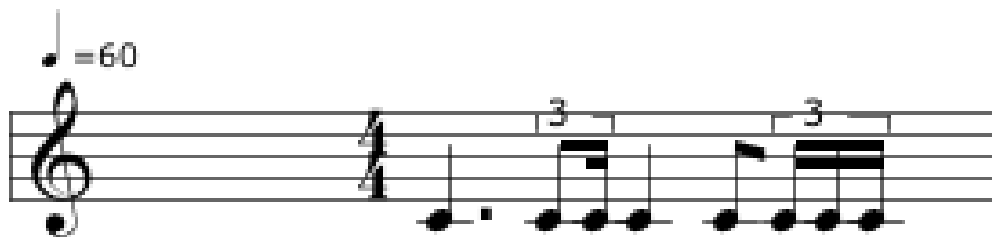
trees are the standard data structure for OpenMusic

Laurson

Patchwork: A Visual Programming Language
Helsinki: Sibelius Academy, 1996

Agon, Haddad, Assayag

Representation et rendu de structures rythmiques
JIM, 2002



list (4 (3 (1 (2 1)) 2 1 (1 (1 1 1))))

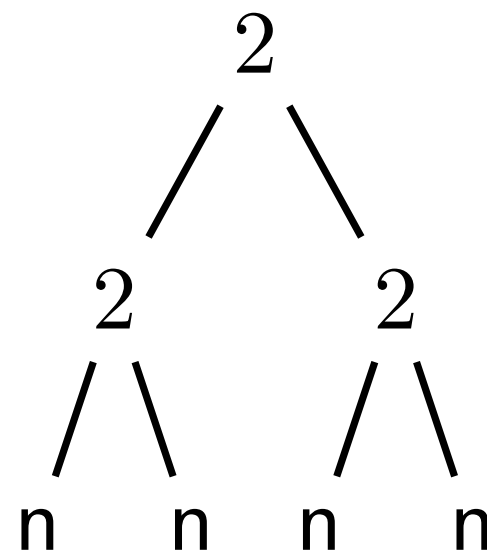
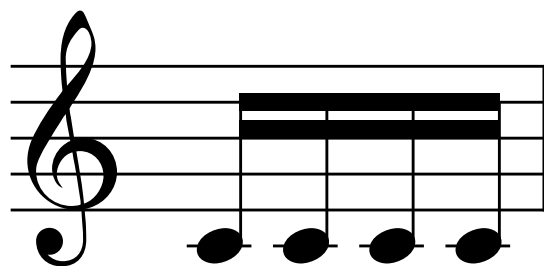
- labels in \mathbf{N} = durations
- \sum children = equal subdivisions of parent
- notes = leaves
- for numerical computations (not symbolic)

symbolic RT

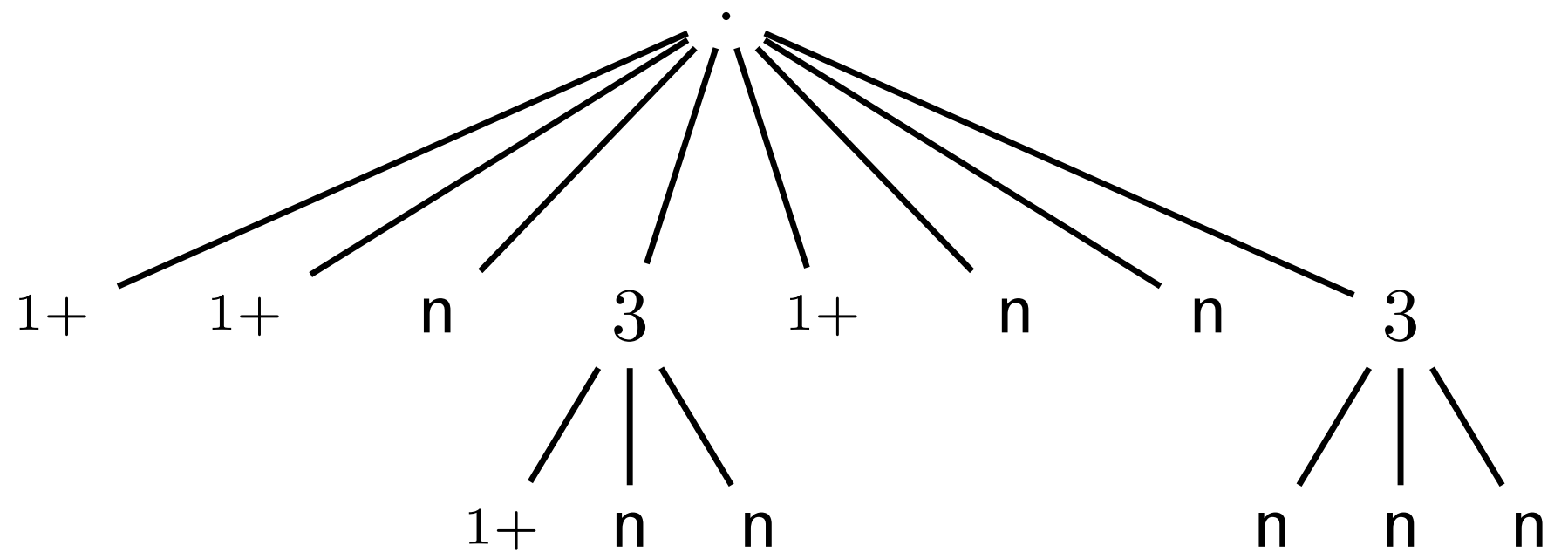
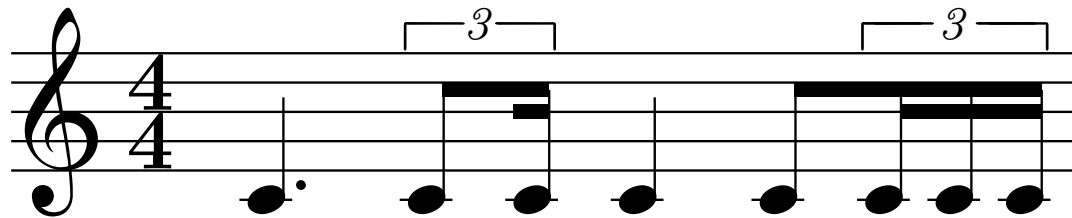
- all sibling represent equal durations
- for symbolic computations (unary notation)

terms over the following signature:

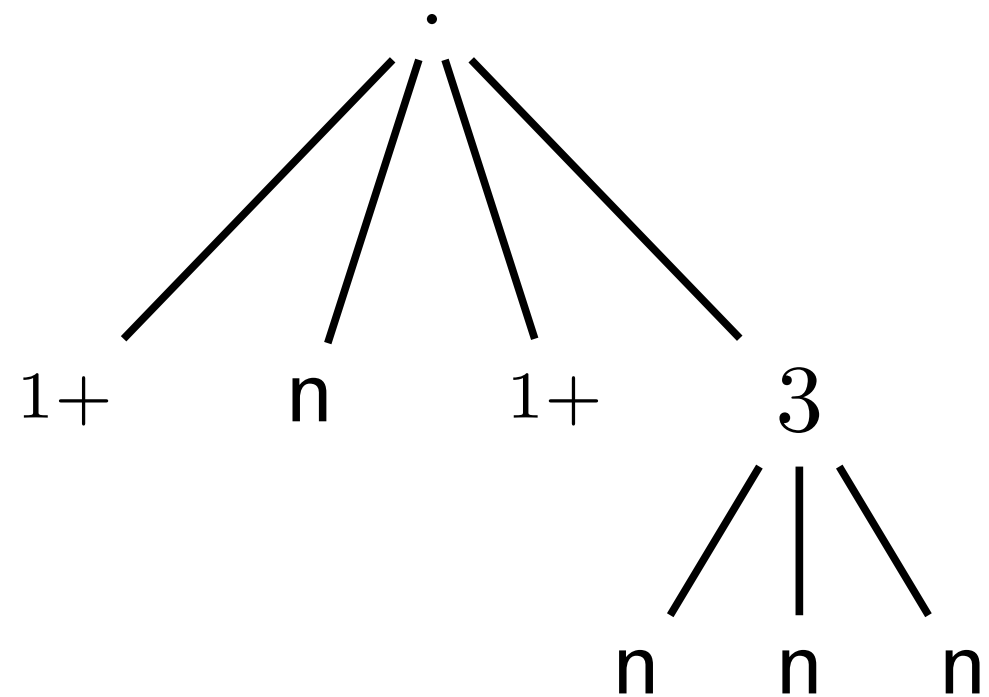
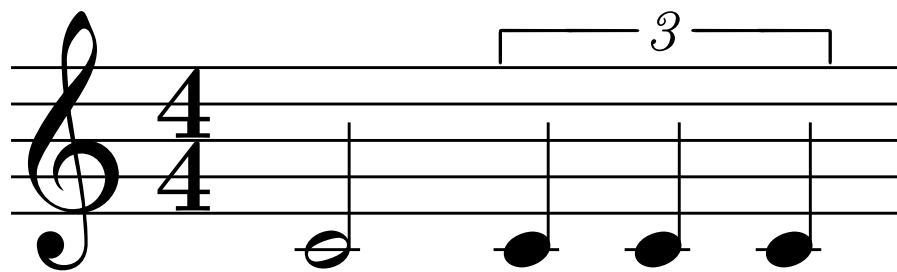
- inner nodes: labelled with arity = prime numbers 2-13
- leaves:
 - n : note
 - r : rest
 - s : slur. Sum with previous leaf in dfs ordering
 - 1+ : add to next sibling



symbolic RT (example 2)



symbolic RT (example 3)



advantage of RT representation over string representation

- close to traditional music notation
- keep the integrity constraint
sum of durations = 1
- groups of correlated events
reflected in the tree structure
= sequences of siblings
→ preserved in local transformations

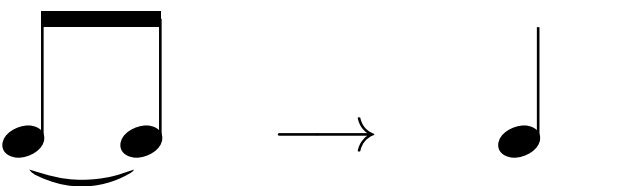
4

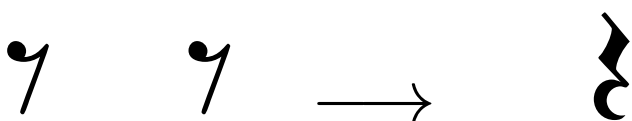
Local Quantization by RT Rewriting

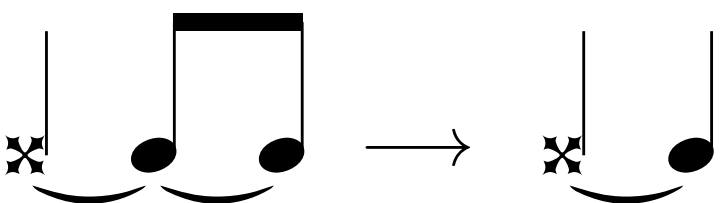
principle

1. **generate** an initial tree t_0 from input s
with maximum precision, maximum complexity
 - t_0 complete
 - closest to s given maximum depth, signature
 - alignment to a complete grid
2. **simplify** t_0 into t using a set of rewrite rules
of 2 kinds:
 - **conservative rules** (preserve durations)
 - **simplifying rules** (do not preserve durations)
3. **return** score corresponding to t

conservative rules

merge-ns $p(\mathbf{n}, \mathbf{s}, \dots, \mathbf{s}) \rightarrow \mathbf{n}$ 

merge-r $p(\mathbf{r}, \dots, \mathbf{r}) \rightarrow \mathbf{r}$ 

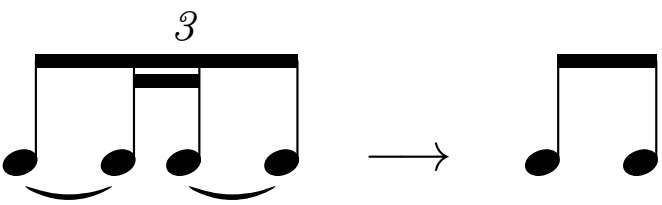

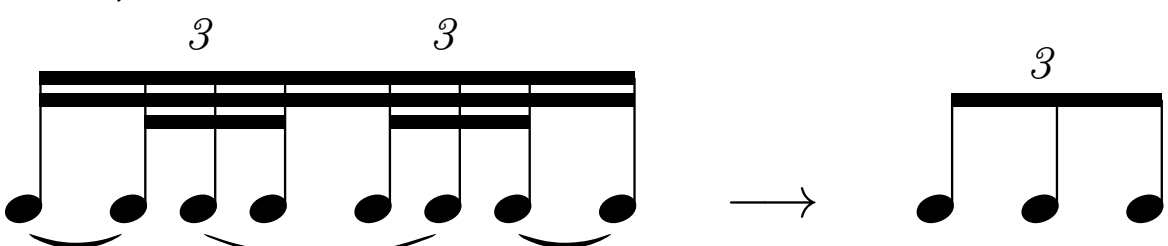
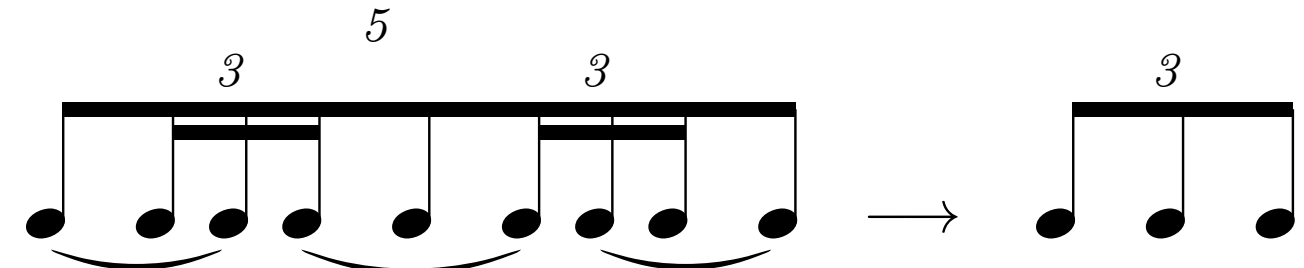
merge-s $p(\mathbf{s}, \dots, \mathbf{s}) \rightarrow \mathbf{s}$ 

replace-s
$$p(x_1, \dots, x_m, t, \underbrace{1+, \dots, 1+}_k, \mathbf{n}, y_1, \dots, y_n)$$

$$\rightarrow p(x_1, \dots, x_m, t, \mathbf{n}, \underbrace{\mathbf{s}, \dots, \mathbf{s}}_k, y_1, \dots, y_n)$$

$$t = \mathbf{n} \text{ or } t = \mathbf{r} \text{ or } t = \mathbf{s}, t = p(z_1, \dots, z_p)$$

conservative rules (2)

3/2	$3(n, 2(s, n), s) \rightarrow 2(n, n)$	
5/2	$5(n, s, 2(s, n), s, s) \rightarrow 2(n, n)$	
7/2, 11/2, ...		
4/3	$2(2(n, 3(s, n, s)), 2(3(s, s, n), s)) \rightarrow 3(n, n, n)$	
5/3	$5(n, 3(s, s, n), s, 3(s, n, s), s) \rightarrow 3(n, n, n)$	
...		

conservative rules (application)

equational theory of rhythm notation

the set of conservative rules is

- confluent and terminating

it can be used as a tool for

- simplifying rhythm notations
- identify equivalent rhythm notations

simplifying rules

reduce

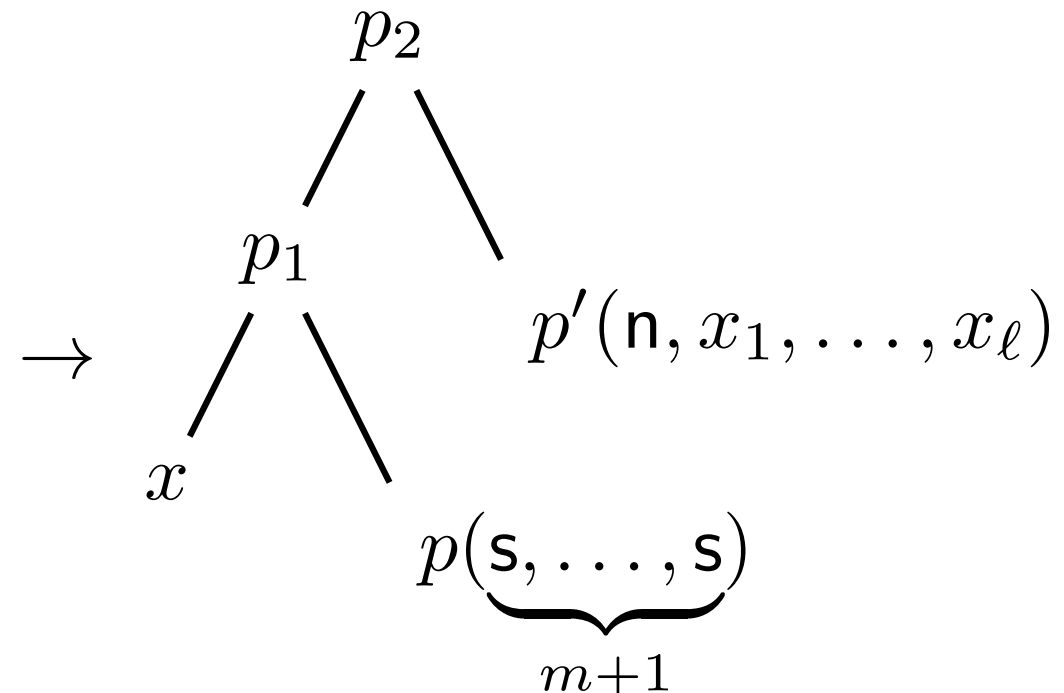
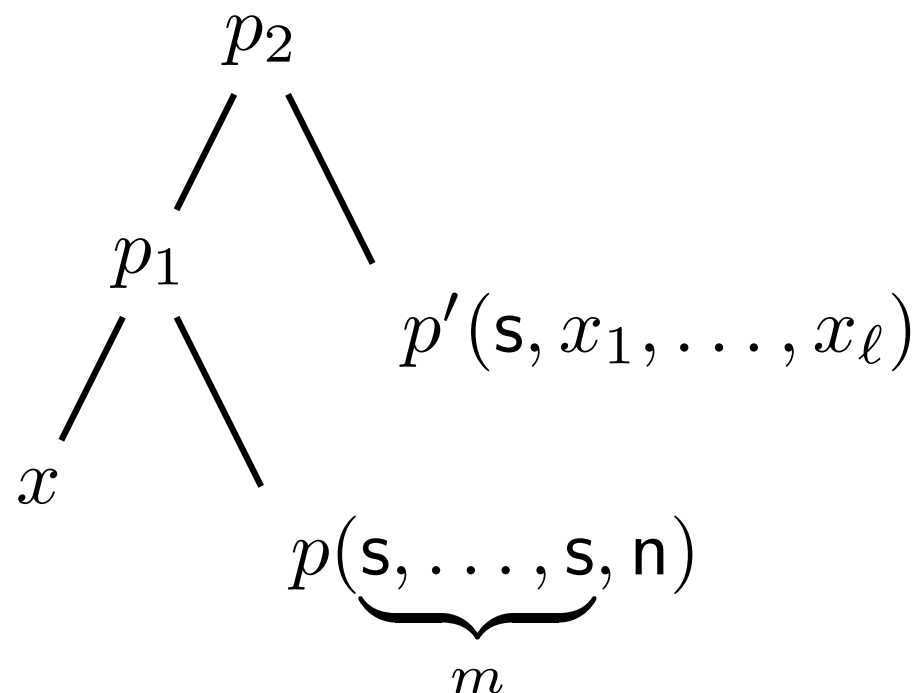
$$p(\mathbf{s}, \mathbf{n}, x_1, \dots, x_m) \rightarrow p(\mathbf{n}, \mathbf{s}, x_1, \dots, x_m)$$

$$p(\mathbf{s}, \mathbf{r}, x_1, \dots, x_m) \rightarrow p(\mathbf{r}, \mathbf{r}, x_1, \dots, x_m)$$

inflate

$$p(\underbrace{\mathbf{s}, \dots, \mathbf{s}}_m, \mathbf{r}) \rightarrow p(\underbrace{\mathbf{s}, \dots, \mathbf{s}}_{m+1})$$

$$p_1(p(\underbrace{\mathbf{s}, \dots, \mathbf{s}}_m, \mathbf{n}), p'(\mathbf{s}, x_1, \dots, x_k)) \rightarrow p_1(p(\underbrace{\mathbf{s}, \dots, \mathbf{s}}_{m+1}), p'(\mathbf{n}, x_1, \dots, x_k))$$



TRS with regexp constraints

- there is an exponential number of simplifying rules
- currently implemented as LISP functions
(1 function represents a family of rules)
- studying other compact rule-based representation, with
 - tree, context and function variables
 - regular constraints (variable in regular tree language)

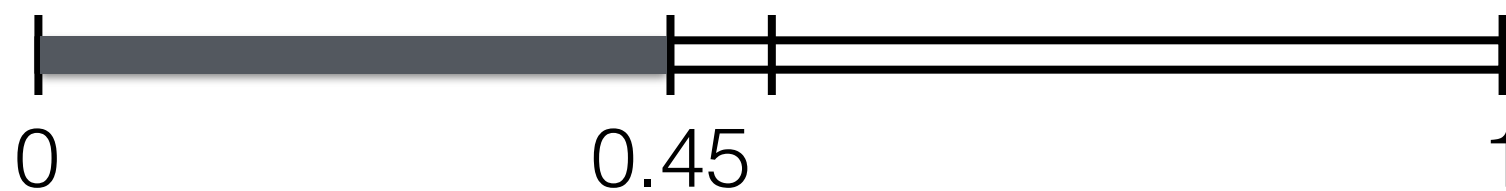
Kutsia, Marin

Matching with Regular Constraints, 2005

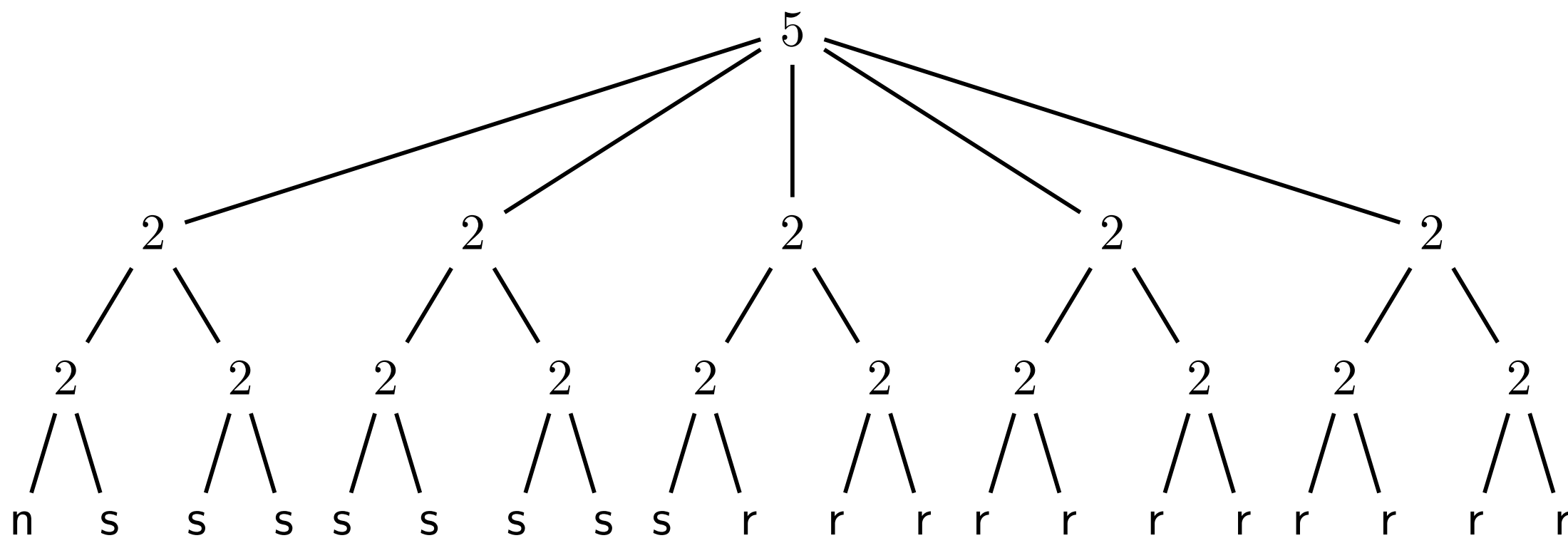
problems:

- matching
- rewriting strategies (bottom-up)
- characterization of set of descendants

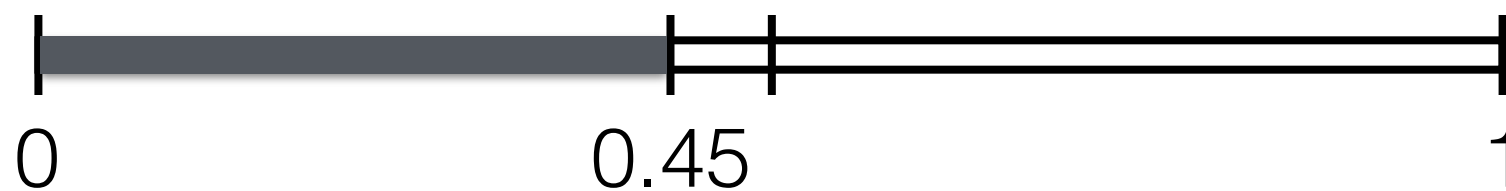
example



initial tree (complete)



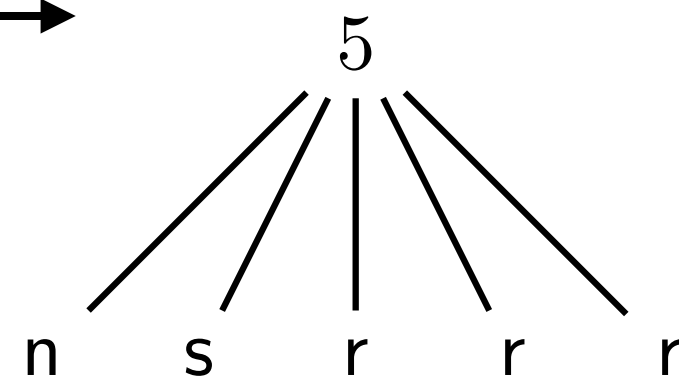
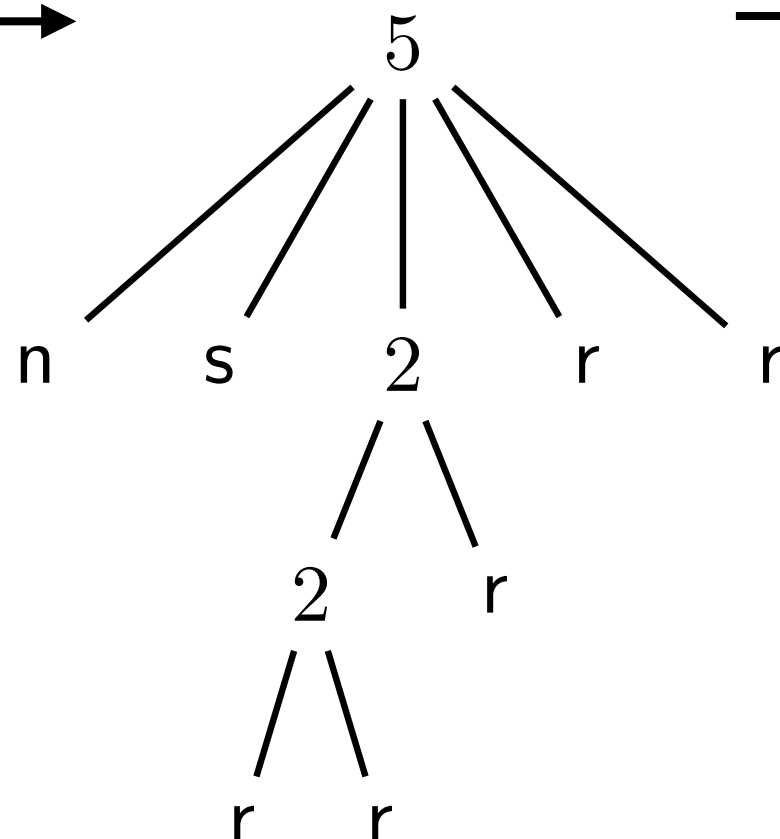
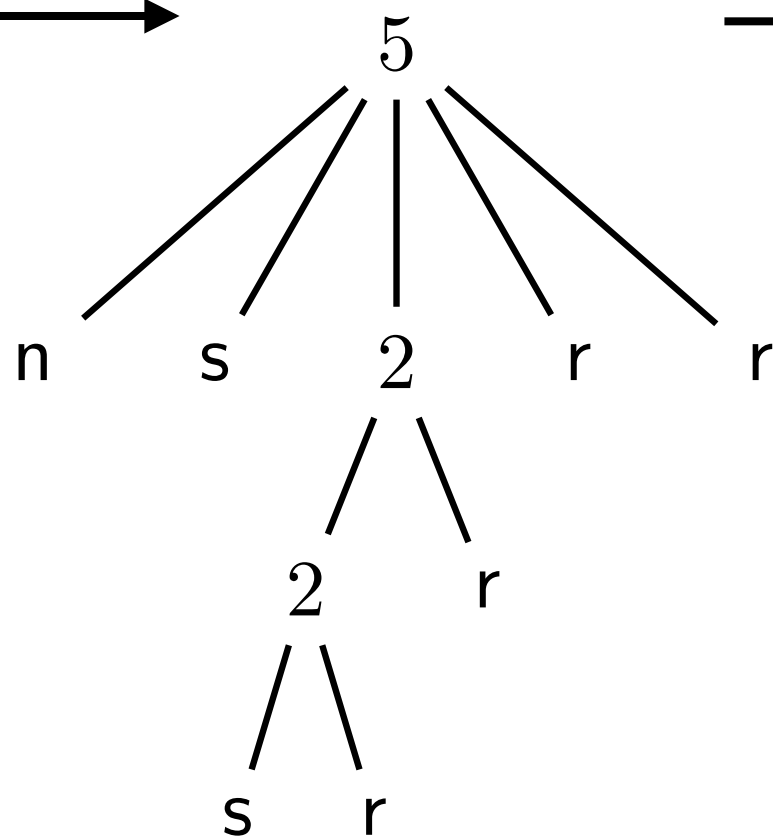
example



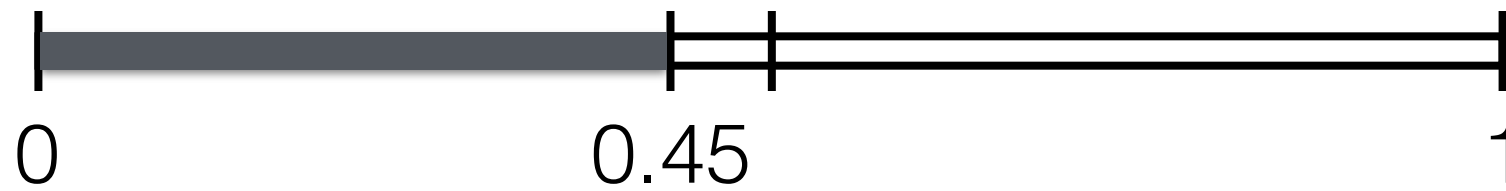
normalize
(conservative)

reduce
(non-conservative)

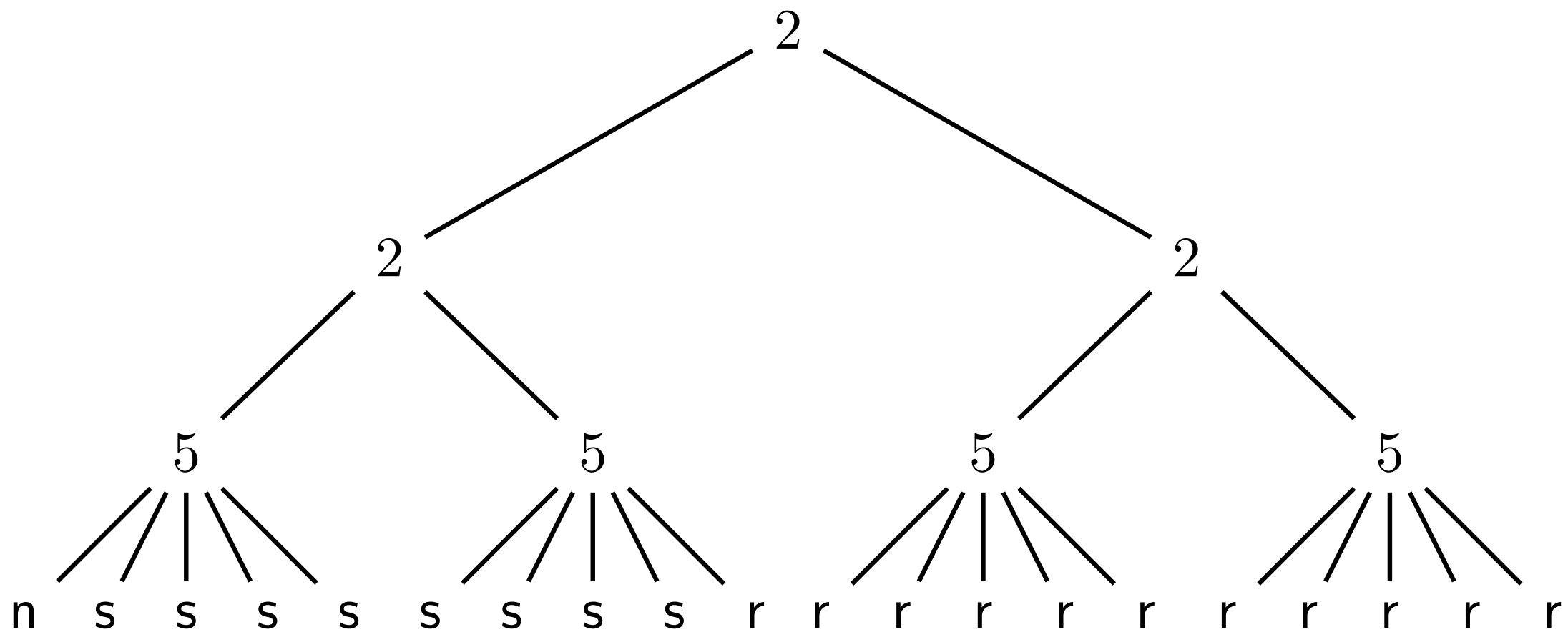
normalize
(conservative)



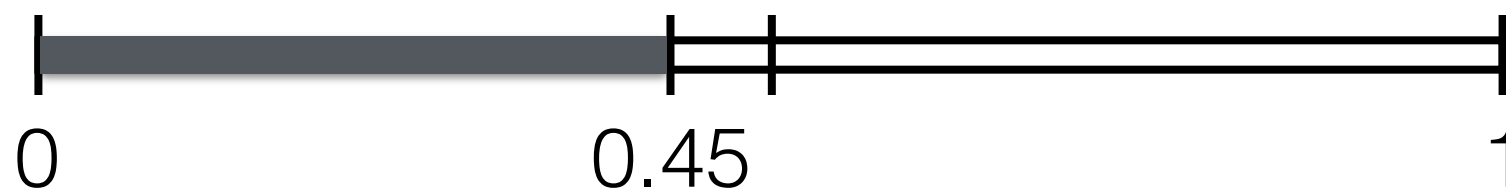
example (2)



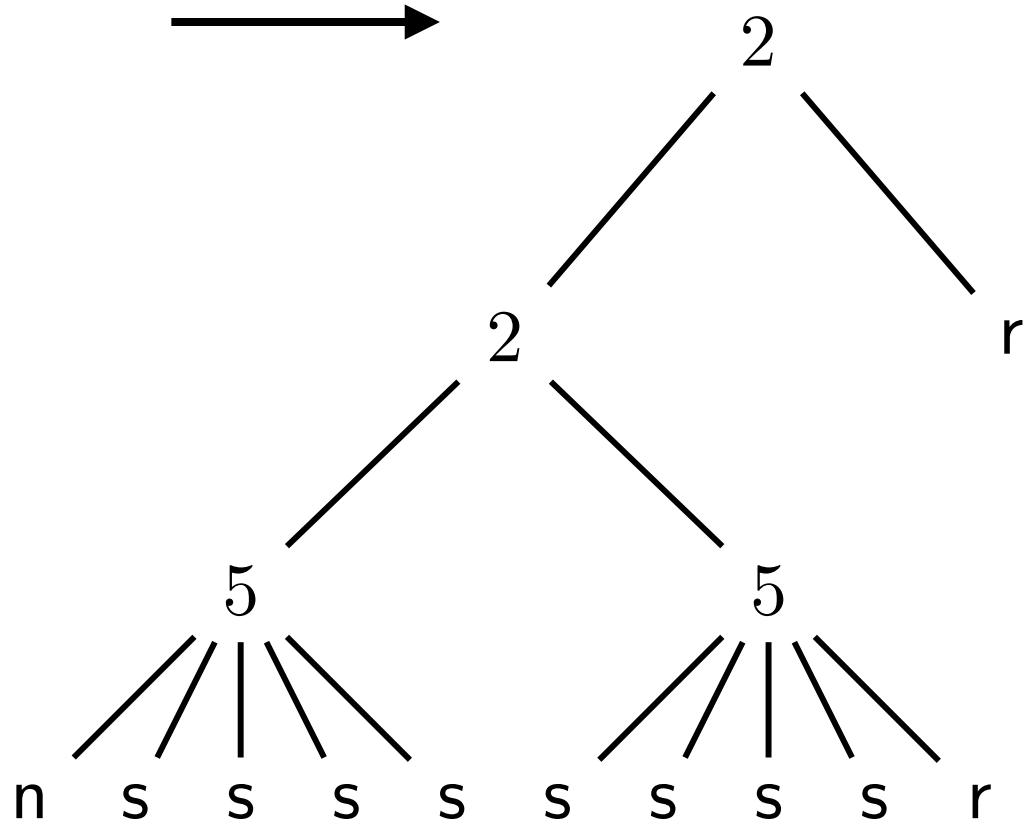
other initial tree (complete)



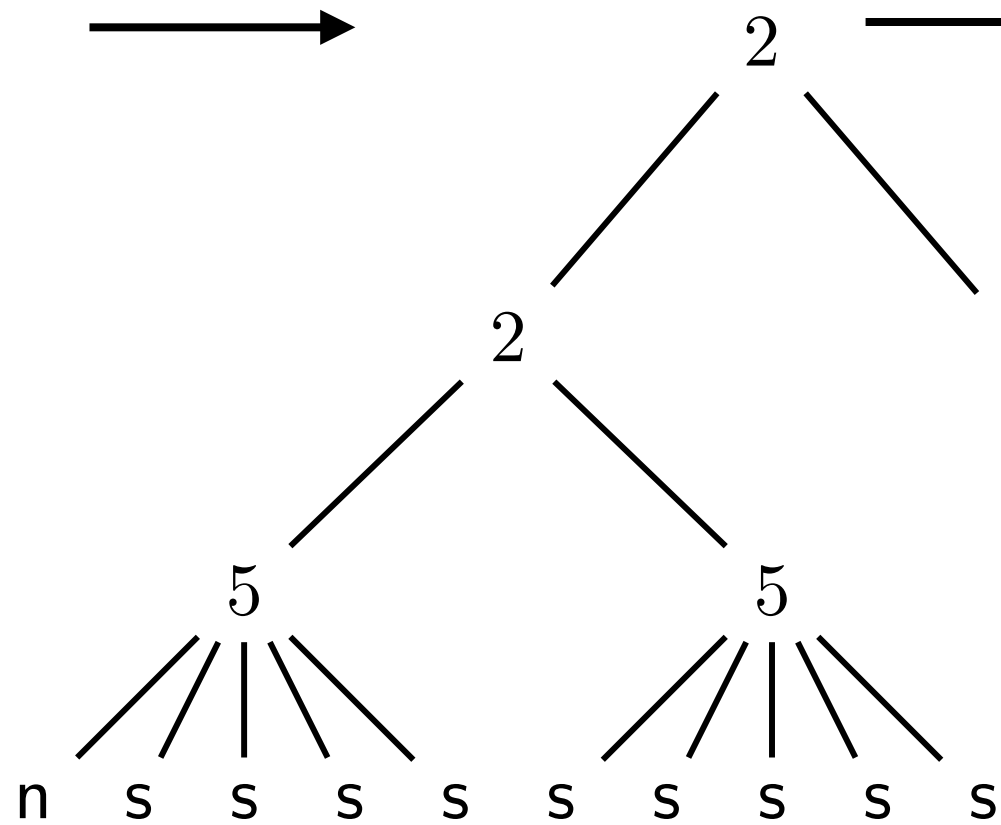
example



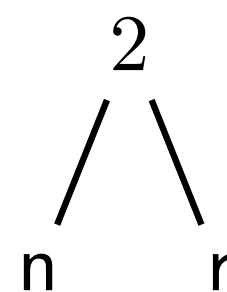
normalize
(conservative)



inflate
(non-conservative)



normalize
(conservative)



summary and questions

1. generate an initial tree t_0 from input s
 - several possibilities of t_0
2. simplify t_0 into t
 - simplifying rules diverge
 - (symbolic) exploration of space of reachable t
 - choice of best t according to
 - complexity and
 - distance to s
3. return score corresponding to t
 - conversion of RT into notation (through OMRT)

5

Weighted Tree Automata

- the **set of initial trees**, given an input sequence **s** is a regular tree language **L_s** , recognized by a tree automaton **A_s** .
- **exploration**: the closure of **L_s** under rewriting is characterized by a tree automaton **A_s^*** constructed incrementally from **A_s** and the rewrite rules (tree automata completion)
- choice of the **best t** :
minimizing complexity and distance to **s**
both computed by weighted tree automata

space exploration, selection best choice

Bayesian approach to quantization

Cemgil, Desain, Kappen

Rhythm Quantization for Transcription
Computer Music Journal 24(2), 2000.

Cemgil

Bayesian Music Transcription
PhD Radboud University of Nijmegen, 2004

$$p(\mathbf{t} \mid \mathbf{s}) = p(\mathbf{s} \mid \mathbf{t}) \cdot p(\mathbf{t})$$

$$\frac{\text{dist}(\mathbf{s}, \mathbf{t})}{\text{score complexity (length of Shannon code in bits)}} = \frac{1}{\text{square of a weighted Euclidian distance}}$$

ad hoc performance model $\mathbf{s} = \mathbf{t} / v + \varepsilon$

v = tempo (constant)

ε = expressive timing deviation

space exploration, selection of best choice

weighted tree automaton (WTA) **A**:
finite bottom-up tree automaton
with a weight for each transition.
associates a weight **A**(**t**) to each term **t**.

choice of **t** for **s** minimizing $\text{dist}(\mathbf{s}, \mathbf{t}) \cdot \text{cpty}(\mathbf{t})$
 $= \mathbf{A}_{ws}^*(\mathbf{t}) \cdot \mathbf{A}_c(\mathbf{t})$

where

- $\mathbf{A}_{ws}^*(\mathbf{t}) = \text{dist}(\mathbf{s}, \mathbf{t})$ if **t** recognized by \mathbf{A}_s^*
= ∞ otherwise

(*ongoing*) construction follows the construction of \mathbf{A}_s^* from **A_s**

- **A_c** is a weighted tree automaton characterizing the user preferred notations (independently of **s**).

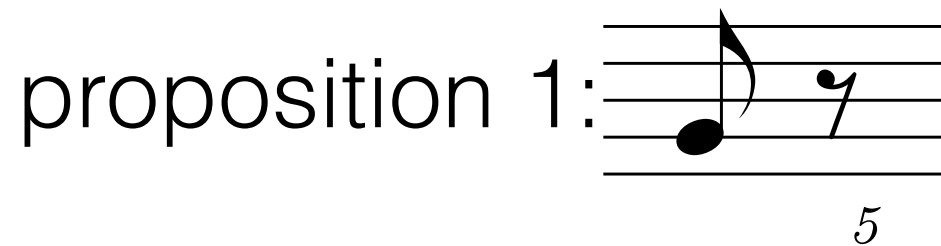
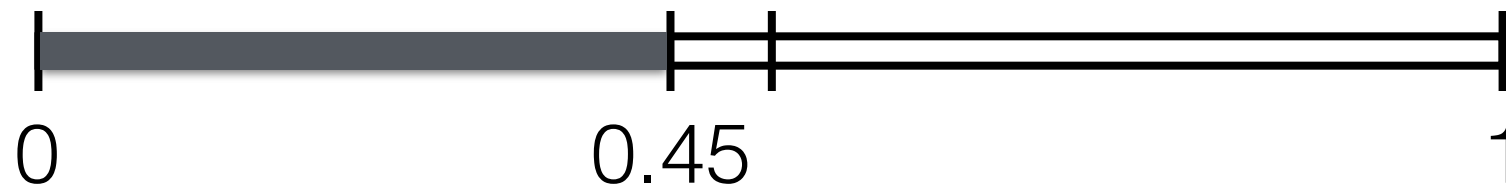
It is [learned online](#) by quantization of previous segments.

construction of $\mathbf{A_c}$ (user's style)

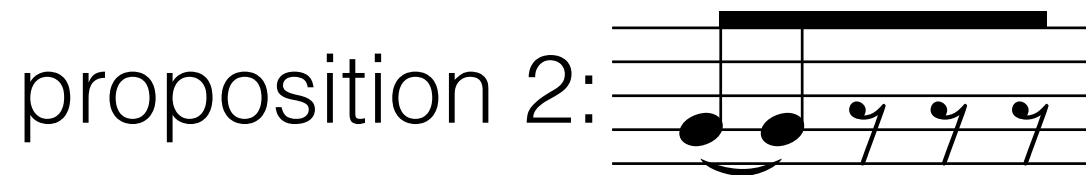
for each segment \mathbf{s}

1. enumerate the k first \mathbf{t} candidates according to $\mathbf{A_{ws}^*}(\mathbf{t}).\mathbf{A_c}(\mathbf{t})$
(k is a user parameter)
2. print these \mathbf{t} in traditional music notation
3. the user chooses his preferences,
 $\mathbf{A_c}$ is updated accordingly
using extension of RPNI algorithm to WTA
(Adrien Maire)

example



$d = 0.05$, low complexity



$d = 0.05$, higher complexity

- if the user chooses proposition 1 for this segment then A is left unchanged
- if the user prefers proposition 2 then A is updated:
5-uplets will get higher weights for next segments

enumeration

- there exists a WTA \mathbf{A}
s.t. for all \mathbf{t} , $\mathbf{A}(\mathbf{t}) = \mathbf{A}_{ws}^*(\mathbf{t}) \cdot \mathbf{A}_c(\mathbf{t})$
- apply k -best algorithm to the
weighted hypergraph presentation of \mathbf{A}

Huang, Chiang
Better k -best parsing
Parsing 2005

improves Knuth extension to hyper graphs
of Dijkstra's shortest path algorithm

conclusion

- approach for local rhythm quantization based on RT, involving
 1. term rewriting
 2. weighted tree automata

perspectives

- joined tempo inference and local quantization
- application of rhythm trees techniques (automata, transformations) to other symbolic MIR problems

trees representations in music

Lerdahl and Jackendoff
A Generative theory of tonal music
MIT Press, 1983

Gilbert, Conklin
A probabilistic context- free grammar
for melodic reduction
Artificial Intelligence and Music, IJCAI, 2007

Johanna Högberg
Generating music by means of tree transducers
CIAA, 2005

structuration of a piece
in a *time-span tree*

