## Music as Language

PUTTING PROBABILISTIC TEMPORAL GRAPH GRAMMARS TO GOOD USE

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## Introduction

#### MOTIVATION

- The aim is not to generate a complete music piece
  - Rather an aid in the compositional process
- · Do this in a concise way, which is also expressive enough
  - To that end, we use formal grammars

#### PROBABILISTIC TEMPORAL GRAPH GRAMMARS

#### Grammar-Based Automated Music Composition in Haskell

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#### Abstract

Few algorithms for automated music composition are able to address the combination of harmonic structure, metrical structure. and repetition in a generalized way. Markov chains and neural nets struggle to address repetition of a musical phrase, and generative grammars generally do not handle temporal aspects of music in a way that retains a coherent metrical structure (nor do they handle repetition). To address these limitations, we present a new class of generative grammars called Probabilistic Temporal Graph Grammars, or PTGG's, that handle all of these features in music while allowing an elegant and concise implementation in Haskell. Being probabilistic allows one to express desired outcomes in a probabilistic manner; being temporal allows one to express metrical structure; and being a graph grammar allows one to express repetition of phrases through the sharing of nodes in the graph. A key aspect of our approach that enables handling of harmonic and metrical structure in addition to repetition is the use of rules that are parameterized by duration, and thus are actually functions. As part of our implementation, we also make use of a music-theoretic concept called chord spaces.

Rather than music analysis, however, we are interested in automated music composition. One way to approach this is to use grammars generalively—that is, to generate sentences from the start symbol. The problem is, with a conventional grammar (such as a context-free grammar, or CFG) the result is usually nonensical for example, "The dog wrote the house," or in the case of music, somethine that its doesn't sound right.

More specifically, conventional grammars intended for automated music composition have the following limitations:

- They are unable to capture the *sharing* of identical phrases, such as in a song form AABA, where the A sections are intended to be identical (or nearly identical) to one other.
- They do not take probabilities into account. Music analysis has shown that certain productions are more common than others—indeed specific genres of music (say, Bach chorales) have specific distributions of musical characteristics [23].
- They do not capture temporal aspects of music. For example, a production rule stating that a I chord can be replaced with V-I does not capture the fact that the total duration of the

## PROBABILISTIC TEMPORAL GRAPH GRAMMARS

- Probabilistic: Rules are assigned prob. weights
- **Temporal:** Rules are time-parametric
- **Graph**: *Let* construct allows sharing/repetition

#### **EUTERPEA**

- Euterpea will be our music development vehicle
- Define some extra things that are not in the library
  - 1. intervals, chords, scales
  - 2. transposition on several music elements
  - 3. random actions in MonadRandom

## Intervals, Chords/Scales

```
data Interval
   = P1 \mid Mi2 \mid M2 \mid Mi3 \mid M3 \mid P4 \mid A4 \mid P5
    | Mi6 | M6 | Mi7 | M7 | P8 | Mi9 | . . . | P15
  deriving (Eq, Enum)
type ChordType = [Interval] -- \equiv ScaleType
type SemiChord = [PitchClass] -- \equiv SemiScale
type Chord = [Pitch] -- \equiv Scale
(\Vdash) :: PitchClass \rightarrow ChordType \rightarrow SemiChord
(\Vdash) = \dots
```

#### A FAIRLY EXTENSIVE SET OF SCALES/CHORDS

```
-- Chord types.
maj = [P1, M3, P5]
m7b5 = [P1, Mi3, A4, Mi7]
allChords = [maj, ...] :: [ChordType]
-- Scale types.
ionian = [P1, M2, M3, P4, P5, M6, M7]
major = ionian
lydian = mode 4 ionian
allScales = [ionian, ...] :: [ScaleType]
```

#### **TRANSPOSITION**

## class Transposable a where

$$(\uparrow), (\downarrow) :: a \rightarrow Interval \rightarrow a$$

instance Transposable PitchClass where ...
instance Transposable Chord where ...

#### **RANDOM ACTIONS**

```
equally :: [a] \rightarrow [(Double, a)]
equally = zip (repeat 1.0)
choose :: MonadRandom m \Rightarrow [(Double, a)] \rightarrow m \ a
choose xs = do
   i \leftarrow getIndex \langle \$ \rangle getRandomR (0, sum (fst \langle \$ \rangle xs))
   return (xs!! i)
chooseBy :: MonadRandom m \Rightarrow (a \rightarrow Double) \rightarrow [a] \rightarrow m \ a
chooseBv = choose \circ fmap (\lambda a \rightarrow (f a, a))
```

## **PTGG Extensions**

#### **GRAMMARS**

A grammars consists of an initial symbol and several rewrite rules:

```
data Grammar meta a
= a \mid : [Rule meta a]
```

• A rule replaces an atomic symbol with a grammar term:

```
data Rule meta a = (a, Double, Dur \rightarrow Bool) \rightarrow (Dur \rightarrow Term meta a)
```

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#### **TERMS**

 Terms are (sequences of) atomic symbols, possibly wrapped with metadata or repeated with *Let*:

```
data Term meta a
= a: Dur
| Term meta a ⊗ Term meta a
| meta > Term meta a
| Let (Term meta a) (Term meta a → Term meta a)
```

#### **EXPANSION**

• The user has to provide a way to expand metadata:

```
class Expand input a meta b where expand :: input \rightarrow Term meta a \rightarrow IO (Term () b)
```

#### Interpretation

• The user has to provide a way to interpret abstract musical structures:

class ToMusic1  $c \Rightarrow$  Interpret input b c where interpret :: input  $\rightarrow$  Music  $b \rightarrow$  IO (Music c)

### **USER CONSTRAINTS**

• All in all, the user makes sure the following constraints are satisfied:

```
type Grammarly input meta a b c =

(Eq a, Eq meta, ToMusic1 c

, Expand input a meta b

, Interpret input b c)
```

#### REWRITING

 Given a desired total duration, a well-formed grammar and the required input for expansion and interpretation, rewrite up to fixpoint:

```
runGrammar :: Grammarly input meta a b c
\Rightarrow Grammar meta \ a \rightarrow Dur \rightarrow input
\rightarrow IO \ (Music \ b, Music1)
runGrammar \ (init \ | : rs) \ t0 \ input = \ \ \ \ \ do \
rewritten \ \lefta \ fixpointM \ rewrite \ (init : t0)
expanded \ \lefta \ expand \ input \ (unlet \ rewritten)
let \ abstract = \ toMusic \ expanded
concrete \ \lefta \ toMusic1\left\{\$} \ interpret \ input \ abstract
return \ (abstract, concrete)
```

## **HARMONY**

## Musicology Source: [Rohrmeier, 2011]

#### Towards a generative syntax of tonal harmony

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This paper aims to propose a hierarchical, generative account of diatonic harmonic progressions and suggest a set of phrase-structure grammar rules. It argues that the structure of harmonic progressions exceeds the simplicity of the Markovian transition tables and proposes a set of rules to account for harmonic progressions with respect to key structure, functional and scale degree features as well as modulations. Harmonic structure is argued to be at least one subsystem in which Western tonal music exhibits recursion and hierarchical organization that may provide a link to overarching linguistic generative grammar on a structural and potentially cognitive level.

### **GRAMMAR SYMBOLS: HARMONIC DEGREES**

```
data Degree
= I \mid II \mid III \mid IV \mid V \mid VI \mid VII -- terminals
\mid P \mid TR \mid DR \mid SR \mid T \mid D \mid S \quad -- non-terminals
deriving (Eq, Enum)
```

#### GRAMMAR FOR WESTERN TONAL HARMONY

```
harmony :: Grammar Interval Degree
harmony = P |:
   -- Phrase level
      (P, 1, always) \rightarrow \lambda t \rightarrow fillBars (t, 4 * wn) TR
       -- Functional level: Expansion
   (TR, 1, (> wn)) \rightarrow \lambda t \rightarrow TR : t/2 \otimes DR : t/2
   (TR, 1, always) \rightarrow \lambda t \rightarrow DR : t/2 \otimes T : t/2
   (DR, 1, always) \rightarrow \lambda t \rightarrow SR : t/2 \otimes D : t/2 +
    [(x, 1, (> wn)) \rightarrow \lambda t \rightarrow Let(x: t/2) (\lambda y \rightarrow y \otimes y)]
    |x \leftarrow [TR, SR, DR]| +
    [(TR, 1, always) \rightarrow (T:)]
   (DR, 1, always) \rightarrow (D:)
   (SR, 1, always) \rightarrow (S :)
```

#### GRAMMAR FOR WESTERN TONAL HARMONY

```
-- Functional level: Modulation
(D, 1, (\geqslant qn)) \rightarrow \lambda t \rightarrow P5 \triangleright D : t
(S, 1, (\geqslant qn)) \rightarrow \lambda t \rightarrow P4 \triangleright S : t ] +
   -- Scale-degree level: Secondary dominants
[(x, 1, (\geqslant hn)) \rightarrow \lambda t \rightarrow Let (x: t/2) (\lambda y \rightarrow (P5 \triangleright y) \otimes y)]
|x \leftarrow [T, D, S]| +
-- Scale-degree level: Functional-Scale interface
  (T, 1, (\geqslant wn)) \rightarrow \lambda t \rightarrow I: t/2 \otimes IV: t/4 \otimes I: t/4
, (T, 1, always) \rightarrow (I :)
(S, 1, always) \rightarrow (IV :)
(D, 1, always) \rightarrow (V :)
, (D, 1, always) \rightarrow (VI :) ]
```

#### **EXPANSION: KEY MODULATION**

```
data HarmonyConfig = HarmonyConfig
  {basePc :: PitchClass
  , baseScale :: ScaleType
  , chords :: [(Double, ChordType)] }
instance Expand HarmonyConfig Degree Interval SemiChord where
  expand :: HarmonyConfig → Term Interval Degree
          → IO (Term () SemiChord)
  expand\ cfg\ (i \triangleright e) = expand\ (cfg\ \{basePc = basePc\ cfg \uparrow i\})\ e
  expand cfg (degree: t) = (:t) \langle \$ \rangle choose (filterChords cfg degree)
```

#### Interpretation: From Abstract to Semi Chords

```
instance Interpret HarmonyConfig SemiChord Chord where interpret :: HarmonyConfig \rightarrow Music SemiChord \rightarrow IO (Music Chord) interpret cfg = fold1 f where f m (sc, d) = do ch \leftarrow chooseBy (chordDistance m) (inversions sc) return (m \otimes ch)
```



$$P: 8*wn$$

$$\downarrow$$
 $TR: 4*wn \otimes TR: 4*wn$ 

$$P: 8*wn$$

$$\downarrow$$
 $TR: 4*wn \otimes TR: 4*wn$ 

$$\downarrow$$
 $TR: 2*wn \otimes DR: 2*wn \otimes TR: 2*wn$ 

$$P: 8*wn$$
 $\downarrow$ 
 $TR: 4*wn \otimes TR: 4*wn$ 
 $\downarrow$ 
 $TR: 2*wn \otimes DR: 2*wn \otimes TR: 2*wn$ 
 $\vdots$ 
 $\downarrow$ 

 $I: wn \otimes IV: hn \ I: hn \otimes (P5 \rhd VI: wn) \otimes V: wn \otimes I: 2*wn$ 



## **Musicology Source:** [Keller, 2007]

# A Grammatical Approach to Automatic Improvisation

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Abstract—We describe an approach to the automatic generation of convincing jazz melodies using probabilistic grammars. Uses of this approach include a software tool for assisting a soloist in the creation of a jazz solo over chord or progressions. The method also shows promise as a means of automatically improvising complete solos in real-time. Our approach has been implemented and demonstrated in a free software tool.

Keywords— jazz, improvisation, educational software, probabilistic context-free grammar, melody generator.

context-free grammar, as it occurs in computer science and linguistics. Then we show how a grammar can be used to generate plausible rhythmic and melodic sequences for grazz. Playable examples will be presented that show the effectiveness of the approach. Our approach has been implemented and has been tested in the past year as part of a broader educational software tool, which proved beneficial in a jazz improvisation course taught by the first author and has also been used by various third parties.

### **GRAMMAR SYMBOLS: TONES**

```
data M
= HT | CT | L | AT | ST | R -- terminals
| P | Q | V | N -- non-terminals
deriving Eq
```

$$(\rightarrow)$$
 ::  $(a, Double, Dur \rightarrow Bool) \rightarrow Term meta \ a \rightarrow Rule meta \ a \Rightarrow b = a \mapsto const \ b$ 

## Grammar for Melodic Jazz Improvisation

```
 \begin{split} & \textit{melody} :: \textit{Grammar} \; () \; \textit{M} \\ & \textit{melody} = \textit{P} \; | \; : \\ & [ \; \textit{--Rhythmic Structure: Expand P to Q} \\ & \textit{(P, 1, (\equiv qn))} \; \rightarrowtail (\textit{Q} \; :) \\ & \textit{, (P, 1, (\equiv hn))} \; \rightarrowtail (\textit{Q} \; :) \\ & \textit{, (P, 1, (\equiv hn \cdot))} \; \rightarrowtail (\textit{Q} \; :) \\ & \textit{, (P, 1, (\equiv hn \cdot))} \; \rightarrowtail \textit{Q} : \textit{hn} \; \otimes \; \textit{Q} : \textit{qn} \\ & \textit{, (P, 25, (> hn \cdot))} \; \rightarrowtail \; \lambda t \; \rightarrow \; \textit{Q} : \textit{hn} \; \otimes \; \textit{P} : (t - hn) \\ & \textit{, (P, 75, (> wn))} \; \rightarrowtail \; \lambda t \; \rightarrow \; \textit{Q} : \textit{wn} \; \otimes \; \textit{P} : (t - wn) \end{split}
```

## GRAMMAR FOR MELODIC JAZZ IMPROVISATION

```
-- Melodic Structure: Expand Q to V, V to N
(Q, 52, (\equiv wn)) \rightarrow Q: hn \otimes V: qn \otimes V: qn
(Q, 47, (\equiv wn)) \rightarrow V: qn \otimes Q: hn \otimes V: qn
(Q, 1, (\equiv wn)) \rightarrow V: en \otimes N: qn \otimes N: qn \otimes N: qn \otimes V: en
(Q, 60, (\equiv hn)) \rightarrow Let(V: qn) (\lambda x \rightarrow x \otimes x)
(Q, 16, (\equiv hn)) \rightarrow HT: qn \otimes N: en
(Q, 12, (\equiv hn)) \rightarrow V: en \otimes N: qn \otimes V: en
(Q, 6, (\equiv hn)) \rightarrow N: hn
(Q, 6, (\equiv hn)) \rightarrow HT: qn^3 \otimes HT: qn^3 \otimes HT: qn^3
(Q, 1, (\equiv qn)) \rightarrow CT: qn
(V, 1, (\equiv wn)) \rightarrow Let(V:qn) (\lambda x \rightarrow x \otimes x \otimes x \otimes x)
(V, 72, (\equiv qn)) \rightarrow Let(V:en) (\lambda x \rightarrow x \otimes x)
(V, 22, (\equiv qn)) \rightarrow N: qn
(V, 5, (\equiv qn)) \rightarrow Let(HT: en^3) (\lambda x \rightarrow x \otimes x \otimes x)
(V, 1, (\equiv qn)) \rightarrow Let(HT: en^3) (\lambda x \rightarrow x \otimes x \otimes AT: en^3)
```

## GRAMMAR FOR MELODIC JAZZ IMPROVISATION

## -- Melodic Structure: Expand N to terminals

$$, (N, 1, (≡ hn)) \rightarrow CT: hn$$
  
 $, (N, 50, (≡ qn)) \rightarrow CT: qn$   
 $, (N, 50, (≡ qn)) \rightarrow ST: qn$   
 $, (N, 45, (≡ qn)) \rightarrow R: qn$   
 $, (N, 20, (≡ qn)) \rightarrow L: qn$   
 $, (N, 1, (≡ qn)) \rightarrow AT: qn$   
 $, (N, 40, (≡ en)) \rightarrow CT: en$   
 $, (N, 40, (≡ en)) \rightarrow ST: en$   
 $, (N, 20, (≡ en)) \rightarrow L: en$   
 $, (N, 20, (≡ en)) \rightarrow R: en$   
 $, (N, 1, (≡ en)) \rightarrow AT: en$ 

#### Interpretation: From Abstract to Actual Notes

```
data MelodyConfig = MelodyConfig
   { scales :: [(Double, ScaleType)]
  , octaves :: [(Double, Octave)] }
instance Interpret (MelodyConfig, Music SemiChord) M Pitch where
  interpret (cfg, chs) symbols = mapM interpretSymbol ∘ synchronize chs
     where
        synchronize :: Music a \rightarrow Music b \rightarrow Music (a, b)
        interpretSymbol :: (SemiChord, M) \rightarrow IO Pitch
        interpretSymbol(ch, s) = case s of
           CT \rightarrow choose ch
           AT \rightarrow choose \$ (ch \downarrow Mi2) + (ch \uparrow Mi2)
           ST \rightarrow choose \$ filter (match chord) (scales cfg)
```

## Rнутнм

## **Musicology Source:** [Bel, 1992]

#### Modelling improvisatory and compositional processes

#### Abstract

An application of formal languages to the representation of musical processes is introduced. Initial interest was the structure of improvisation in North Indian table drum music, for which experiments have been conducted in the field as far back as 1983 with an expert system called the Bol Processor, BP. The computer was used to generate and analyze drumming patterns represented as strings of onomatopeic syllables, bols, by manipulating formal grammars. Material was then submitted to musicians who assessed its accuracy and increasingly more elaborate and sophisticated rule bases emerged to represent the musical idiom.

Since several methodological pitfalls were encountered in transferring knowledge from musician to muchine, a new device, named QAVAID, was designed with the capability of learning from a sample set of improvised variations supplied by a musician. A new version of Bol Processor, BP2, has been implemented in a MIDI studie overionment to serve as a adio to rule-based composition in contemporary music. Extensions of the syntactic model, such as substitutions, nexternate contexts, are briefly introduced.

#### Keywords

Formal grammars, pattern languages, knowledge acquisition, cognitive anthropology, ethnomusicology.

#### GRAMMAR SYMBOLS: RHYTHMIC SYLLABLES

```
data Syllable
   = -- terminals
      Tr | Kt | Dhee | Tee | Dha | Ta
      Ti | Ge | Ke | Na | Ra | Noop
       -- non-terminals
     S | XI | XD | XI | XA | XB | XG | XH | XC
      XE | XF | TA7 | TC2 | TE1 | TF1 | TF4 | TD1
      TB2 | TE4 | TC1 | TB3 | TA8 | TA3 | TB1 | TA1
   deriving Eq
(\Rightarrow) :: a \rightarrow [a] \rightarrow Rule meta a
x \rightarrow xs = (x, 1, always) \rightarrow fold1 \otimes ((:en) \langle \$ \rangle xs)
```

### **GRAMMAR FOR TABLA IMPROVISATION**

```
rhythm :: Grammar () Syllable
rhvthm = S |:
   [S \rightarrow TE1, XI]
  XI \rightarrow [TA7, XD], XD \rightarrow [TA8]
  XI \rightarrow [TF1, XJ], XJ \rightarrow [TC2, XA]
  XA \rightarrow [TA1, XB], XB \rightarrow [TB3, XD]
  XI \rightarrow [TF1, XG], XG \rightarrow [TB2, XA]
  S \rightarrow TA1, XH
  , XH \rightarrow [TF4, XB], XH \rightarrow [TA3, XC]
  XC \rightarrow [TE4, XD], XC \rightarrow [TA3, XE]
  XE \rightarrow [TA1, XD], XE \rightarrow [TC1, XD]
  XC \rightarrow [TB1, XB]
  S \rightarrow [TB1, XF]
  XF \rightarrow [TA1, XJ], XF \rightarrow [TD1, XG]
```

#### **GRAMMAR FOR TABLA IMPROVISATION**

```
, TA7 \rightarrow [Kt, Dha, Tr, Kt, Dha, Ge, Na]

, TC2 \rightarrow [Tr, Kt], TE1 \rightarrow [Tr], TF1 \rightarrow [Kt]

, TF4 \rightarrow [Ti, Dha, Tr, Kt]

, TE4 \rightarrow [Ti, Noop, Dha, Ti]

, TD1 \rightarrow [Noop], TB2 \rightarrow [Dha, Ti], TC1 \rightarrow [Ge]

, TB3 \rightarrow [Dha, Tr, Kt]

, TA8 \rightarrow [Dha, Ti, Dha, Ge, Dhee, Na, Ge, Na]

, TA3 \rightarrow [Tr, Kt, Dha], TB1 \rightarrow [Ti], TA1 \rightarrow [Dha]
```

#### Interpretation: From Syllables to MIDI

```
instance ToMusic1 Syllable where toMusic1 = toMusic \circ pitch \circ percussionMap where percussionMap :: Syllable \rightarrow Int percussionMap s = \mathbf{case} \ s \ \mathbf{of} \ Tr \rightarrow 38 Kt \rightarrow 45 \dots
```

# GENERATED RESULTS

#### **Songs as Configurations**

 Given a total duration and the required configurations, generate a "music piece":

```
generate :: FilePath \rightarrow Dur
\rightarrow HarmonyConfig \rightarrow MelodyConfig
\rightarrow IO ()
generate f t hCfg mCfg = \mathbf{do}
(absHarm, harm) \leftarrow runGrammar harmony t hCfg
(\_, mel) \leftarrow runGrammar melody t (mCfg, absHarm)
(\_, rhy) \leftarrow runGrammar rhythm t ()
writeToMidiFile f (harm :=: mel :=: rhy)
```

#### Sonata in E Minor

```
sonata
= generate "sonata" (12 * wn)
  HarmonyConfig
     \{basePc = E
     baseOct = 4
     . baseScale = minor
    , chords = equally [mi, maj, dim]}
  MelodyConfig
     { scales = equally [ionian, harmonicMinor]
    , octaves = [(5, 4), (20, 5), (10, 6)]
```

#### **ORIENTAL ALGEBRAS**

```
orientalAlgebras
= generate "oriental" (12 * wn)
  HarmonyConfig
     \{basePc = A
     baseOct = 3
     , baseScale = arabian -- \equiv [P1, M2, Mi3, P4, A4, Mi6, M7]
     , chords = equally allChords \}
  MelodyConfig
     { scales = equally allScales
     , octaves = [(20, 4), (15, 5), (5, 6)]
```



#### **FUTURE WORK**

- Jazz harmony (extend with context-sensitive features)
  - [Steedman, 1984] A generative grammar for jazz chord sequences
  - [Steedman, 1996] The blues and the abstract truth
- Better & more principled interpretation
- Intrinsically-typed grammars
- Non-musical Domains

## **Conclusion**

It's gotta be simple, so people can dig it!

Thelonious Monk

