

Functional Modelling of Musical Harmony

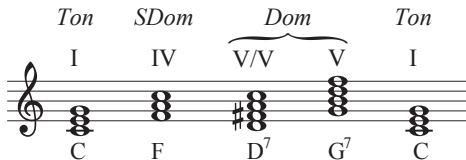
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- ▶ Modelling musical harmony using Haskell
- ▶ Applications of a model of harmony:
 - ▶ Musical analysis
 - ▶ Finding cover songs
 - ▶ Generating chords for melodies
 - ▶ Generating chords and melodies
 - ▶ Correcting errors in chord extraction from audio sources
 - ▶ Chordify—a web-based music player with chord recognition

What is harmony?



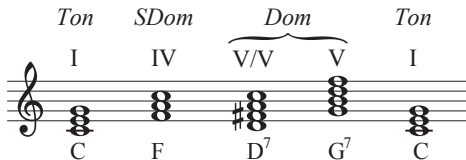
Ton *SDom* *Dom* *Ton*

I IV V/V V I

C F D⁷ G⁷ C

- ▶ Harmony arises when at least two notes sound at the same time
- ▶ Harmony induces tension and release patterns, that can be described by music theory and music cognition
- ▶ The internal structure of the chord has a large influence on the consonance or dissonance of a chord
- ▶ The surrounding context also has a large influence

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Demo: how harmony affects melody

- ▶ A *chord* is a group of tones separated by intervals of roughly the same size.
- ▶ All music is made out of chords (whether explicitly or not).
- ▶ There are 12 different notes. Instead of naming them, we number them relative to the first and most important one, the tonic. So we get I, II \flat , II \sharp . . . VI \sharp , VII.
- ▶ A chord is built on a root note. So I also stands for the chord built on the first degree, V for the chord built on the fifth degree, etc.
- ▶ So the following is a chord sequence: I IV II 7 V 7 I.

Models for musical harmony explain the harmonic progression in music:

- ▶ Everything works around the *tonic* (I).
- ▶ The *dominant* (V) leads to the tonic.
- ▶ The *subdominant* (IV) tends to lead to the dominant.
- ▶ Therefore, the I IV V I progression is very common.
- ▶ There are also *secondary dominants*, which lead to a relative tonic. For instance, II^7 is the secondary dominant of V, and I^7 is the secondary dominant of IV.
- ▶ So you can start with I, add one note to get I^7 , fall into IV, change two notes to get to II^7 , fall into V, and then finally back to I.

Why are harmony models useful?



Having a model for musical harmony allows us to automatically determine the functional meaning of chords in the tonal context. The model determines which chords “fit” on a particular moment in a song.

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Having a model for musical harmony allows us to automatically determine the functional meaning of chords in the tonal context. The model determines which chords “fit” on a particular moment in a song. This is useful for:

- ▶ Musical information retrieval (find songs similar to a given song)
- ▶ Audio and score recognition (improving recognition by knowing which chords are more likely to appear)
- ▶ Music generation (create sequences of chords that conform to the model)

Why Haskell?



Haskell is a strongly-typed pure functional programming language:

Strongly-typed All values are classified by their type, and types are known at compile time (statically). This gives us strong guarantees about our code, avoiding many common mistakes.

Pure There are no side-effects, so Haskell functions are like mathematical functions.

Functional A Haskell program is an expression, not a sequence of statements. Functions are first class citizens, and explicit state is avoided.

data Root = A | B | C | D | E | F | G

type Octave = Int

data Note = Note Root Octave

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type Octave = Int

data Note = Note Root Octave

a4, b4, c4, d4, e4, f4, g4 :: Note

a4 = Note A 4

b4 = Note B 4

c4 = Note C 4

d4 = Note D 4

e4 = Note E 4

f4 = Note F 4

g4 = Note G 4

Melody



```
type Melody = [Note]
```

```
cMajScale :: Melody
```

```
cMajScale = [c4, d4, e4, f4, g4, a4, b4]
```

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cMajScaleRev :: Melody
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```
cMajScaleRev = reverse cMajScale
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cMajScale = [c4, d4, e4, f4, g4, a4, b4]

cMajScaleRev :: Melody

cMajScaleRev = reverse cMajScale

reverse :: [α] \rightarrow [α]

reverse [] = []

reverse (h : t) = reverse t ++ [h]

(++) :: [α] \rightarrow [α] \rightarrow [α]

(++) = ...

Transposing a melody one octave higher:

`octaveUp :: Octave → Octave`

`octaveUp n = n + 1`

`noteOctaveUp :: Note → Note`

`noteOctaveUp (Note r o) = Note r (octaveUp o)`

`melodyOctaveUp :: Melody → Melody`

`melodyOctaveUp m = map noteOctaveUp m`

Building a repeated melodic phrase:

ostinato :: Melody \rightarrow Melody

ostinato m = m \ddagger ostinato m

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Is a given melody in C major?

root :: Note \rightarrow Root
root (Note r o) = r
isCMaj :: Melody \rightarrow Bool
isCMaj = (\equiv [A, B, C, D, E, F, G]) \circ sort \circ nub \circ map root

“Details” left out



We have seen only a glimpse of music representation, leaving out:

- ▶ Rhythm
- ▶ Accidentals
- ▶ Intervals
- ▶ Voicing
- ▶ ...

A good pedagogical reference on using Haskell to represent music:

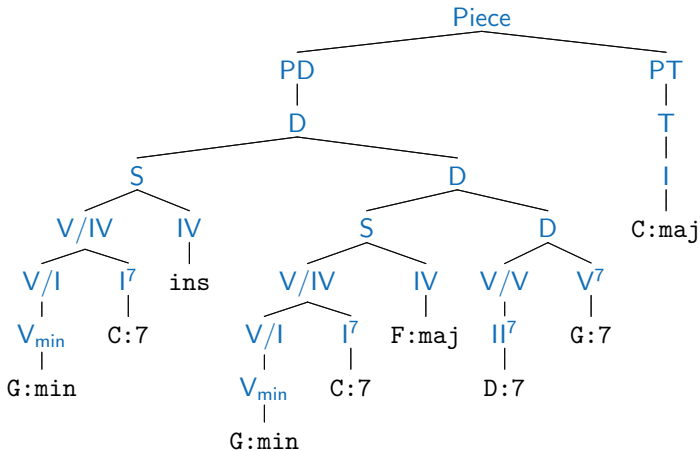
<http://di.uminho.pt/~jno/html/ipm-1011.html>

A serious library for music manipulation:

<http://www.haskell.org/haskellwiki/Haskore>

Back to harmony analysis

A hierarchical representation of the harmony of the sequence
 G_{\min} C^7 G_{\min} C^7 F_{Maj} D^7 G^7 C_{Maj} :



- ▶ A practical application of a harmony model is to estimate harmonic similarity between songs
- ▶ The more similar the trees, the more similar the harmony
- ▶ We don't want to write a diff algorithm for our complicated model; we get it automatically by using a *generic diff*
- ▶ The generic diff is a type-safe tree-diff algorithm, part of a student's MSc work at Utrecht University
- ▶ Generic, thus working for any model, and independent of changes to the model

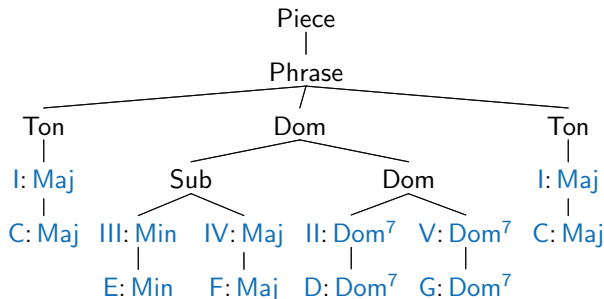
Application: automatic harmonisation of melodies



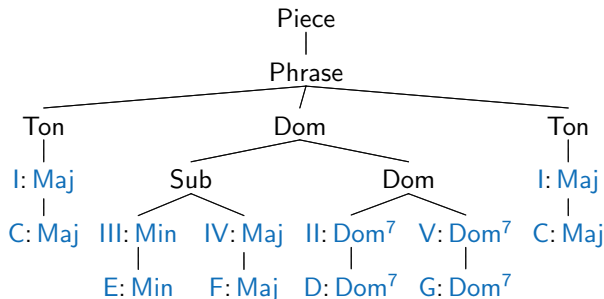
Another practical application of a harmony model is to help selecting good harmonisations (chord sequences) for a given melody:

The image displays a musical score for a single system. The top staff is a treble clef with a common time signature (C). The melody consists of the following notes: G4 (quarter), A4 (quarter), G4 (quarter), F4 (quarter), E4 (quarter), D4 (quarter), C4 (half). The bottom staff is a bass clef with a common time signature (C). The accompaniment consists of the following chords: G2-A2-B2 (quarter), G2-A2-B2 (quarter), G2-B2-C3 (quarter), G2-A2-B2 (quarter), G2-A2-B2 (quarter), G2-A2-B2 (quarter), G2-A2-B2 (quarter), G2-A2-B2 (quarter), G2-A2-B2 (quarter). Below the bass staff, Roman numeral chord symbols are placed under each measure: V, III, I, III, II, IV, III, IV, V.

We generate candidate chord sequences, parse them with the harmony model, and select the one with the least errors.

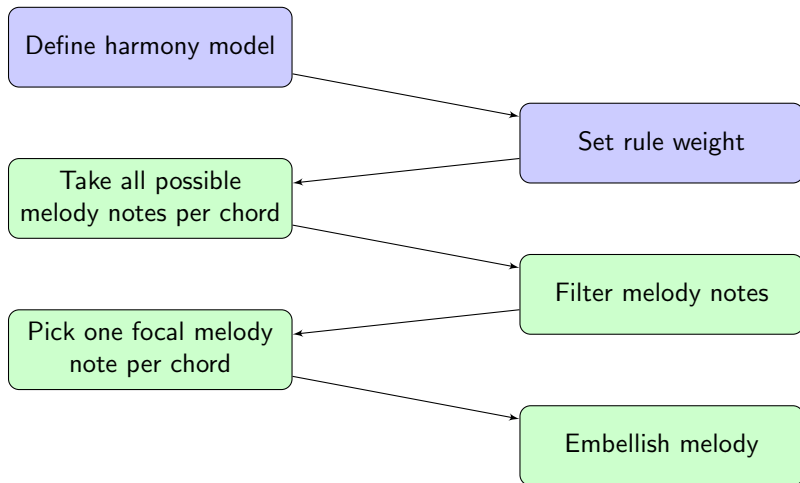


You can see this tree as having been produced by taking the chords in green as input...



You can see this tree as having been produced by taking the chords in green as input... or the chords might have been dictated by the structure!

System structure



A functional model of harmony



$\text{Piece}_{\mathfrak{M}} \rightarrow [\text{Phrase}_{\mathfrak{M}}]$ ($\mathfrak{M} \in \{\text{Maj}, \text{Min}\}$)

A functional model of harmony



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$\text{Phrase}_{\mathfrak{M}} \rightarrow \begin{array}{c} \text{Ton}_{\mathfrak{M}} \text{ Dom}_{\mathfrak{M}} \text{ Ton}_{\mathfrak{M}} \\ | \qquad \text{Dom}_{\mathfrak{M}} \text{ Ton}_{\mathfrak{M}} \end{array}$

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$\text{Ton}_{\text{Maj}} \rightarrow I_{\text{Maj}}$

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$\text{Dom}_{\mathfrak{M}} \rightarrow \begin{array}{c} V_{\mathfrak{M}}^7 \\ | \quad V_{\mathfrak{M}} \\ | \quad VII_{\mathfrak{M}}^0 \\ | \quad \text{Sub}_{\mathfrak{M}} \text{ Dom}_{\mathfrak{M}} \\ | \quad II_{\mathfrak{M}}^7 \quad V_{\mathfrak{M}}^7 \end{array}$

A functional model of harmony

Piece $_{\mathfrak{M}}$ \rightarrow [Phrase $_{\mathfrak{M}}$] $\quad (\mathfrak{M} \in \{\text{Maj}, \text{Min}\})$

Phrase $_{\mathfrak{M}}$ \rightarrow Ton $_{\mathfrak{M}}$ Dom $_{\mathfrak{M}}$ Ton $_{\mathfrak{M}}$
 | Dom $_{\mathfrak{M}}$ Ton $_{\mathfrak{M}}$

Ton $_{\text{Maj}}$ \rightarrow I $_{\text{Maj}}$

Ton $_{\text{Min}}$ \rightarrow I $^m_{\text{Min}}$

Dom $_{\mathfrak{M}}$ \rightarrow V $^7_{\mathfrak{M}}$
 | V $_{\mathfrak{M}}$
 | VII $^0_{\mathfrak{M}}$
 | Sub $_{\mathfrak{M}}$ Dom $_{\mathfrak{M}}$
 | II $^7_{\mathfrak{M}}$ V $^7_{\mathfrak{M}}$

Sub $_{\text{Maj}}$ \rightarrow II $^m_{\text{Maj}}$
 | IV $_{\text{Maj}}$
 | III $^m_{\text{Maj}}$ IV $_{\text{Maj}}$
 Sub $_{\text{Min}}$ \rightarrow IV $^m_{\text{Min}}$

Now in Haskell—I



A GADT encoding musical harmony:

```
data Mode = MajMode | MinMode
```

```
data Piece =  $\forall \mu ::$  Mode.Piece [Phrase  $\mu$ ]
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Now in Haskell—I



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```
data Phrase ( $\mu :: \text{Mode}$ ) where
```

```
PhraseVI :: Ton  $\mu \rightarrow \text{Dom } \mu \rightarrow \text{Ton } \mu \rightarrow \text{Phrase } \mu$ 
```

```
PhraseVI :: Dom  $\mu \rightarrow \text{Ton } \mu \rightarrow \text{Phrase } \mu$ 
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Now in Haskell—



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```
  PhraseVI ::           Dom  $\mu \rightarrow \text{Ton } \mu \rightarrow \text{Phrase } \mu$ 
```

```
data Ton ( $\mu :: \text{Mode}$ ) where
```

```
  TonMaj :: SD I Maj  $\rightarrow \text{Ton Maj}_\mu$ 
```

```
  TonMin :: SD I Min  $\rightarrow \text{Ton Min}_\mu$ 
```

Now in Haskell—



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```

```
  TonMin :: SD I Min  $\rightarrow$  Ton MinMode
```

```
data Dom ( $\mu :: \text{Mode}$ ) where
```

```
  Dom1 :: SD V Dom7  $\rightarrow$  Dom  $\mu$ 
```

```
  Dom2 :: SD V Maj  $\rightarrow$  Dom  $\mu$ 
```

```
  Dom3 :: SD VII Dim  $\rightarrow$  Dom  $\mu$ 
```

```
  Dom4 :: SDom  $\mu \rightarrow$  Dom  $\mu \rightarrow$  Dom  $\mu$ 
```

```
  Dom5 :: SD II Dom7  $\rightarrow$  SD V Dom7  $\rightarrow$  Dom  $\mu$ 
```

Scale degrees are the leaves of our hierarchical structure:

```
data DiatonicDegree = I | II | III | IV | V | VI | VII
```

```
data Quality       = Maj | Min | Dom7 | Dim
```

```
data SD ( $\delta ::$  DiatonicDegree) ( $\gamma ::$  Quality) where  
  SurfaceChord :: ChordDegree  $\rightarrow$  SD  $\delta$   $\gamma$ 
```

Generating harmony



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```
gen :: (Representable  $\alpha$ , Generate (Rep  $\alpha$ ))  
    => Gen  $\alpha$ 
```


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$$\begin{aligned} \text{gen} &:: (\text{Representable } \alpha, \text{Generate } (\text{Rep } \alpha)) \\ &\Rightarrow [(\text{String}, \text{Int})] \rightarrow \text{Gen } \alpha \end{aligned}$$

Examples of harmony generation—I



```
testGen :: Gen (Phrase MajMode)
testGen = gen [("Dom4", 3), ("Dom5", 4)]
example :: IO ()
example = let k = Key (Note ♯ C) MajMode
          in sample' testGen >>= mapM_ (printOnKey k)
printOnKey :: Key → Phrase MajMode → IO String
```

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```

> example

```
[C: Maj, D: Dom7, G: Dom7, C: Maj]
[C: Maj, G: Dom7, C: Maj]
[C: Maj, E: Min, F: Maj, G: Maj, C: Maj]
[C: Maj, E: Min, F: Maj, D: Dom7, G: Dom7, C: Maj]
[C: Maj, D: Min, E: Min, F: Maj, D: Dom7, G: Dom7, C: Maj]
```

Examples of harmony generation—II



Generating a melody for a given harmony



We then generate a melody in 4 steps:

Generating a melody for a given harmony



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1. Generate a list of candidate melody notes per chord;

Generating a melody for a given harmony



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4. Embellish the candidate notes to produce a final melody.

Generating a melody for a given harmony



We then generate a melody in 4 steps:

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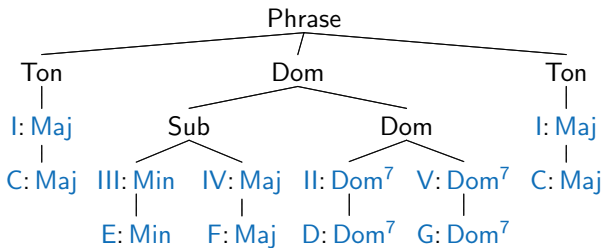
These four steps combine naturally using plain monadic bind:

```
melody :: Key → State MyState Song
melody k = genCandidates >>= refine >>= pickOne >>= embellish
         >>= return ◦ Song k
```

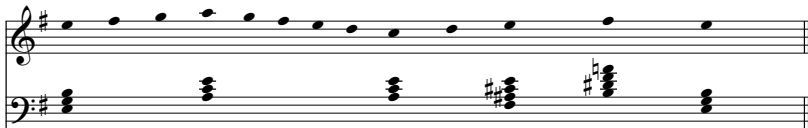
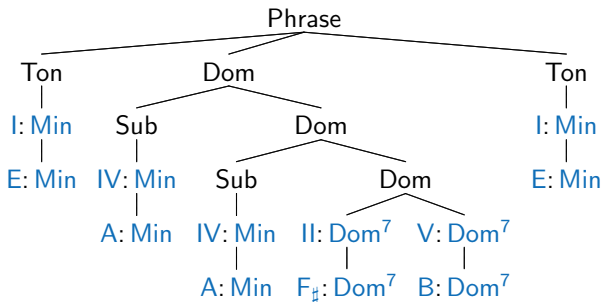
Example I



A musical score consisting of two staves. The upper staff is a treble clef with a single melodic line of eighth notes. The lower staff is a bass clef with block chords. The chords are: C major (C-E-G), F major (F-A-C), C major (C-E-G), F major (F-A-C), D dominant seventh (D-F-A-C), and C major (C-E-G).



Example III

Another application: chord recognition



Yet another practical application of a harmony model is to improve chord recognition from audio sources.

Chord candidates	0.92 C	0.96 Em	
	0.94 Gm	0.97 C	
	1.00 C	1.00 G	1.00 Em
Beat number	1	2	3

How to pick the right chord from the chord candidate list? Ask the harmony model which one fits best.

Demo: Chordify



Demo:

chordify[®]

<http://chordify.net>

- ▶ Frontend
 - ▶ Reads user input, such as YouTube/Soundcloud links, or files
 - ▶ Extracts audio
 - ▶ Calls the backend to obtain the chords for the audio
 - ▶ Displays the result to the user
 - ▶ Implements a queueing system, and library functionality
 - ▶ Uses PHP, JavaScript, MongoDB

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 - ▶ Implements a queueing system, and library functionality
 - ▶ Uses PHP, JavaScript, MongoDB
- ▶ Backend
 - ▶ Takes an audio file as input, analyses it, extracts the chords
 - ▶ The chord extraction code uses GADTs, type families, generic programming (see the harmtrace package on Hackage)
 - ▶ Performs PDF and MIDI export (using LilyPond)
 - ▶ Uses Haskell, SoX, sonic annotator, and is mostly open source

Musical modelling with Haskell:

- ▶ A model for musical harmony as a Haskell datatype
- ▶ Makes use of several advanced functional programming techniques, such as generic programming, GADTs, and type families
- ▶ When chords do not fit the model: error correction
- ▶ Harmonising melodies
- ▶ Generating harmonies
- ▶ Recognising harmony from audio sources

Play with it!



`http://hackage.haskell.org/package/HarmTrace`

`http://hackage.haskell.org/package/FComp`

`http://chordify.net`