



University of Antwerp  
Operations Research Group

ANT/OR

# FuX, an Android app that generates counterpoint

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CI for Creativity and Affective Computing





# Overview

Computer Aided Composing

Quantifying Counterpoint Quality

VNS

Android Implementation

Conclusion



## Computer aided composing (CAC)

Composing music = combinatorial optimization problem

- ▶ Music → combination of notes
- ▶ “Good” music → fits a style as well as possible
- ▶ Formalized and quantified “rules” of a style → objective function



# Counterpoint

- ▶ Polyphonic baroque music
- ▶ Inspired Bach, Haydn, . . .
- ▶ One of the most formally defined musical styles  
→ Rules written by Fux in 1725



## 5th species counterpoint

- ▶ Counterpoint & Cantus firmus

- ▶ Represented as a vector of note objects, each with:
  - ▶ Pitch: midi value
  - ▶ Duration
  - ▶ Beat number
  - ▶ Measure number
  - ▶ Tied?



## Quantifying musical quality

Examples of rules:

- ▶ Each large leap should be followed by stepwise motion in the opposite direction
- ▶ Half notes should always be consonant on the first beat, unless they are suspended and continued stepwise and downward
- ▶ All perfect intervals should be approached by contrary or oblique motion

→ 19 vertical and 19 horizontal subscores between 0 and 1



## Quantifying musical quality

- ▶ Eight notes (8ths) must move in step.

$$\textit{subscore}_1^H(s) = \frac{\#8\text{ths not preceded by step} + 8\text{ths not left by step}}{\#8\text{ths} \times 2} \quad (1)$$

- ▶ Whole notes should always be vertically consonant.

$$\textit{subscore}_1^V(s) = \frac{\#\text{dissonant whole notes}}{\#\text{whole notes}} \quad (2)$$



## Quantifying musical quality

$$f_{cf}(s) = \underbrace{\sum_{i=0}^{19} a_i \cdot \text{subscore\_cf}_i^H(s)}_{\text{horizontal aspect}} \quad (3)$$

$$f_{cp}(s) = \underbrace{\sum_{i=0}^{19} a_i \cdot \text{subscore\_cp}_i^H(s)}_{\text{horizontal aspect}} + \underbrace{\sum_{j=0}^{19} b_j \cdot \text{subscore}_j^V(s)}_{\text{vertical aspect}} \quad (4)$$





## Variable Neighborhood Search

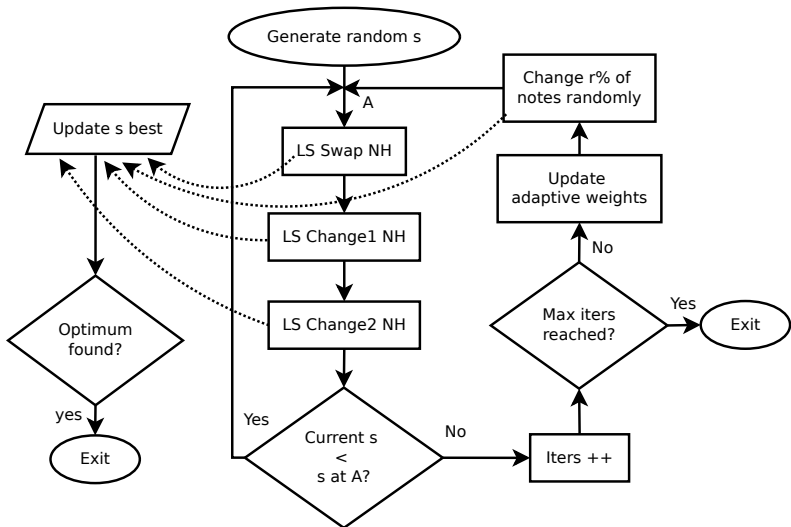
- ▶ Local search with 3 neighborhoods
- ▶ Selection: steepest descent

$N_i$	Name	Description
$N_{sw}$	Swap	Swap two notes
$N_{c1}$	Change1	Change one note
$N_{c2}$	Change2	Change two notes



# Variable Neighborhood Search

- ▶ Excluded fragments
  - ▶ Tabu list
  - ▶ Infeasible
- ▶ Perturbation
  - ▶ Change  $r\%$  of the notes randomly
- ▶ Adaptive weights mechanism
  - ▶ Increase weight of subscore with highest value
  - ▶ Keeps the search in the right direction





## Experiments & Results

- Full factorial experiment,  $n=2304$

Parameter	Values	Nr. of levels
$N_{sw}$ - Swap	on with $tt_{sw}=0$ , $tt_{sw}=\frac{1}{16}$ , $tt_{sw}=\frac{1}{8}$ , off	4
$N_{c1}$ - Change1	on with $tt_{c1}=0$ , $tt_{c1}=\frac{1}{16}$ , $tt_{c1}=\frac{1}{8}$ , off	4
$N_{c2}$ - Change2	on with $tt_{c2}=0$ , $tt_{c2}=\frac{1}{16}$ , $tt_{c2}=\frac{1}{8}$ , off	4
Random move	$\frac{1}{4}$ changed, $\frac{1}{8}$ changed, off	3
Adaptive weights	on, off	2
Max. iterations	5, 20, 50	3
Length of music	16, 32 measures	2



## Experiments & Results

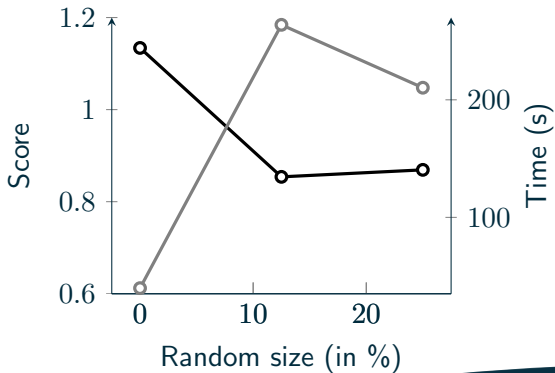
- ▶ Multi-Way ANOVA model with interaction effects, using R
- ▶  $R^2 = 0.98$

Parameter	Df	$F$ value	Prob ( $> F$ )
$N_{c1}$	1	9886.2323	$< 2.2e^{-16}$
$N_{c2}$	1	15690.7234	$< 2.2e^{-16}$
$N_{sw}$	1	3909.2959	$< 2.2e^{-16}$
randsize	2	1110.1724	$< 2.2e^{-16}$
maxiters	2	322.6488	$< 2.2e^{-16}$
length	1	165.6053	$< 2.2e^{-16}$
adj. weights	1	4.0298	0.0448367
$tt_{c1}$	2	2.2575	0.1048791
$tt_{c2}$	2	8.271	0.0002646
$tt_{sw}$	2	3.2447	0.0391833



## Experiments & Results

- Mean plot for the size of the random jump





## Optimal parameter settings

Parameter	Value
$N_{sw}$	on with $tt_{sw} = \frac{1}{16}$
$N_{c1}$	on with $tt_{c1} = \frac{1}{16}$
$N_{c2}$	on with $tt_{c2} = \frac{1}{16}$
Random move	$\frac{1}{8}$ changed
Adaptive weights	on
Max. number of iterations	50



# C++ Implementation

The screenshot displays the MuseScore application window. The title bar reads "MuseScore: endmusic". The menu bar includes "File", "Edit", "Create", "Notes", "Layout", "Style", "Display", "Plugins", "Optimize", and "Help". The "Optimize" menu is open, showing three options: "Generate 5th Species Counterpoint", "Generate 1st Species Counterpoint", and "Generate Cantus Firmus".

On the left, a "Palettes" panel is visible, listing various musical symbols and notations such as "Grace Notes", "Drums", "Clefs", "Key Signatures", "Time Signatures", "Bar lines", "Lines", "Arpeggio & Glissando", "Breath & Pauses", "Brackets", "Articulations & Ornaments", "Accidentals", "Dynamics", "Fingering", "Note Heads", "Tremolo", "Repeats", "Breaks & Spacer", "Beam Properties", and "Symbols".

The main workspace shows a score titled "endmusic". A yellow box labeled "Generated Music" is positioned at the top of the score area. Below it, the score is displayed in two parts: "Part 1" (treble clef) and "Part 2" (bass clef). The score consists of two systems of music. The first system shows a melody in Part 1 and a bass line in Part 2. The second system, starting at measure 11, continues the melody and bass line. The word "Optimize" is visible in the bottom right corner of the score area.





## Android App - FuX

- ▶ Software toolkit for mobile devices
  - ▶ Dalvik Virtual Machine → Java
  - ▶ VNS is computationally expensive  
→ Native C++ (jni) with java NDK
  - ▶ Midi files (Android-Midi-Lib & MediaPlayer)
- ⇒ Continuous stream of music (multitreading)

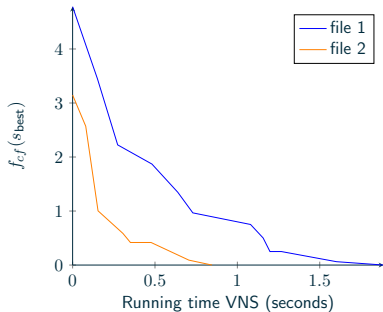


## Android App - FuX

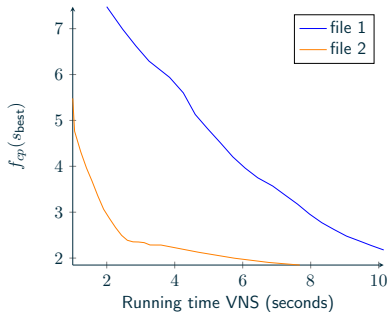
Time	Generate	Playback
-1	16 measures (file 1)	
0s	8 measures (file 2)	file 1
16s	8 measures (file 3)	file 2
24s	8 measures (file 4)	file 3
...	...	...

→ Evaluation based on last 16 measures

# Results over time



(a) Cantus firmus



(b) Counterpoint

Evolution of the objective function over time

FuX  
dorien



INSTALLED



This app is compatible with your Proximus HTC HTC One V.

OVERVIEW

USER REVIEWS

WHAT'S NEW

PERMISSIONS

You +1'd this

## Description

Are you a composer looking for ideas? Or do you just enjoy listening to music? FuX lets you listen to an endless stream of continuously generated counterpoint music. FuX uses a Variable Neighbourhood Search algorithm (VNS) to generate a continuous stream of fifth species counterpoint.

Strict counterpoint is a formally defined musical style that originates in the 16th century. The rules of this style were written down by Fux in his book "Gradus Ad Parnassum" in 1725. This app generates a continuous stream of music that adheres to these rules as well as possible.

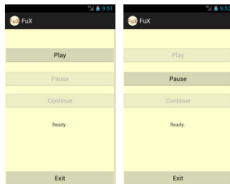
The VNS algorithm used in FuX takes into account 19 melodic and 19 harmonic rules when

[MORE](#)

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## App Screenshots



-1 2

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### ABOUT THIS APP

RATING:

★ ★ ★ ★ ★

UPDATED:

November 14, 2012

CURRENT VERSION:

1.0

REQUIRES ANDROID:

2.3.3 and up

CATEGORY:

Music & Audio

SIZE:

349k

PRICE:

Free

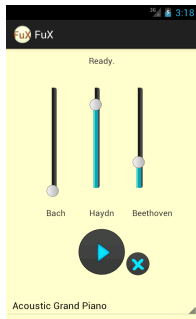
CONTENT RATING:

Everyone



## Composer specific music - FuX 2.0

- ▶ Analyzed existing music (Bach, Beethoven, Haydn)
- ▶ 3 composer classification models
- ▶ Incorporated in objective function





## Conclusion

An efficient VNS has been developed and implemented as an Android app. The resulting app can play a continuous stream of counterpoint music on any Android phone or tablet.

Future research:

- ▶ More complex music:
  - ▶ Different styles
  - ▶ More parts
  - ▶ Theme
- ▶ Improved sound quality
- ▶ Bugfixes for multitude of devices
- ▶ Hit song prediction



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