# Discovering the line of fifths in a large historical corpus

Future Directions of Music Cognition Virtual Conference

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## Corpus Studies – Music Theory – Music Analysis

A sketch of the corpus studies cycle:

- 1. analyze a piece or some salient aspect
- compare it to other pieces and wonder whether observation holds more generally
- 3. gather/create suitable corpus to study question on a large scale
- 4. operationalize question for quantitative analysis
- 5. test against data
- 6. usually: new (general) observations
- 7. do they apply to individual pieces?
- 8. go back to 1.

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#### Comparing tonal material



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Figure 2: Chick Corea, Children's Song No. 2 (1984), mm. 1–4.

#### The Line of Fifths

Theoretical model: the *Line of Fifths* (LOF) (Temperley, 2000).

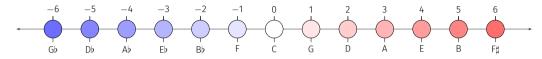


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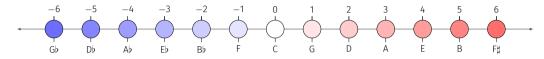


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The LOF contains many common scales as contiguous subsegments, e.g.

- diatonic
- pentatonic
- chromatic
- hexachord (Desprez, Corea)

• ..

## Research question

If the line of fifths (and its subsegments) are central for tonal organization in many pieces, we should be able to see its relevance in a corpus study.

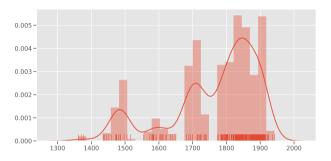
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#### Operationalization

- vector-space model: a piece is represented by the distribution of its pitch classes
- · representation of notes as tonal pitch-classes (e.g. F#, Gb, A##, ...)
- restriction fo Fbb to B## (35 dimensions)
- important: no inherent ordering of pitch classes

## The corpus



**Figure 4:** Convenience sample of 2012 pieces by 75 composers, 1361–1942 (Moss, Neuwirth, and Rohrmeier, 2020).

#### Method

## Principal Components Analysis (PCA)

- We use PCA for dimensionality reduction.
- · Principal components are dimensions that maximize variance in the data.
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#### Procedure

- · corpus 'lives' in 35-D space, all dimensions are assumed to be independent
- we inspect the first two principal components, explaining 64% of data variance
- each data point is colored according to its most frequent pitch class

## Structure Discovery with Dimensionality Reduction

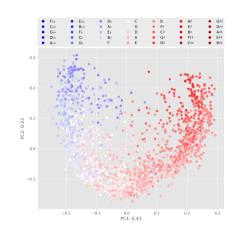
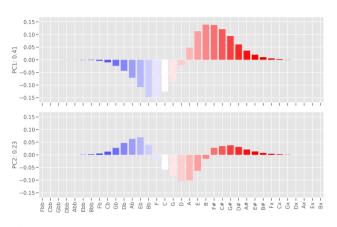


Figure 5: PCA, global view.



**Figure 6:** PCA, first two components: distance to center D (top) and 'accidental regions' (bottom).

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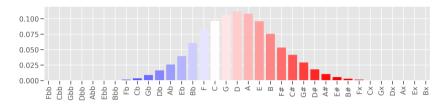


Figure 7: Average tonal pitch-class distribution in the corpus.

#### Observations:

- almost normally distributed
- · centered on D (mid-point on line of fifths)

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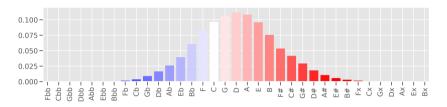


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This is a global statistic. What does it look like under a historical perspective?

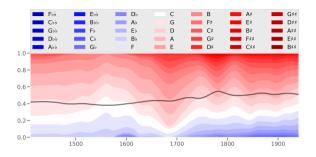


Figure 8: Relative pitch-class frequencies over time.

- · local variations possibly due to specific sample (corpus)
- amount pitch-classes with one or several accidentals increases
- entropy remains relatively stable
- · relative frequencies appear to be correlated

 high correlations around the central axis

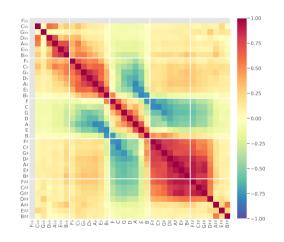


Figure 9: PC co-evolution *across* historical periods. 10/12

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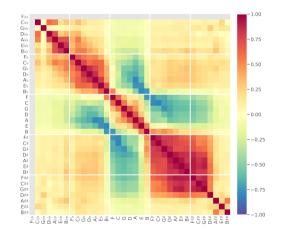


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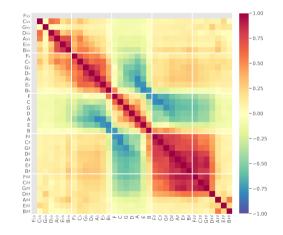


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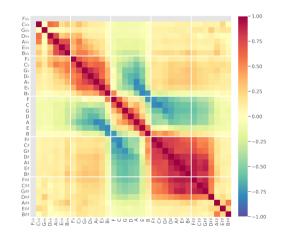


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- $\rightarrow$  pieces further away from the LOF center are generally more chromatic

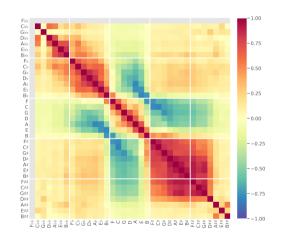


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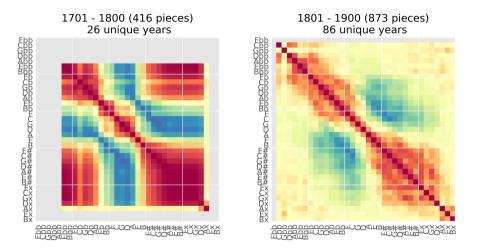


Figure 10: PC co-evolution in the 18th (left) and 19th (right) centuries.

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#### Future work

- expanding the corpus (also beyond canon)
- taking other parameters into account (harmony, meter, form...)
- zooming on from the global view

Thank you for your attention!

Slides available at fabian-moss.de

#### References

Moss, F. C., Neuwirth, M., & Rohrmeier, M. (2020). Tonal Pitch-Class Counts Corpus (TP3C) (Version v1.0.0). Zenodo. https://doi.org/10.5281/zenodo.3600088 Temperley, D. (2000). The line of fifths. *Music Analysis*, 19(3), 289–319.

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