

# Generation of Novel Chord Progressions via a Musically-Inspired Chaotic Mapping

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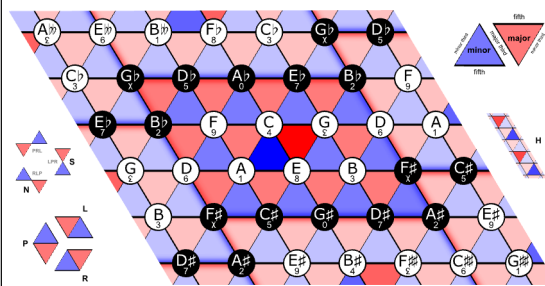
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## Highlights

- We utilize a chaotic mapping onto a set of symbols to generate chord progressions
- Symbol arrangement is determined by the *Tonnetz*, where pitches are vertices of a doubly-periodic simplex mesh<sup>[4]</sup>
- Double-pendulum trajectory is mapped onto the *Tonnetz*, where the sequence of triangles visited determines chord progression
- Progressions are evaluated according to metrics<sup>[2]</sup> which correlate with positive listening experiences

## The Tonnetz



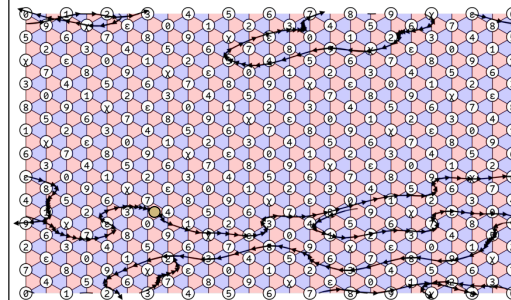
Three periodic axes: modulo 3 (minor third), 4 (major third), and 7 (perfect fifth), image from [5]

## Double Pendulum Chaotic System

The double pendulum system has two periodic degrees of freedom, the angles of each mass  $\theta_1$  and  $\theta_2$ , and angular velocities for each mass, yielding the system of differential equations, which is chaotic for most masses  $m_i$ , rod lengths  $\ell_i$ , and initial conditions<sup>[3]</sup>:

$$\begin{cases} \dot{\theta}_1 = \omega_1 \\ \dot{\theta}_2 = \omega_2 \\ \dot{\omega}_1 = \frac{-g(2m_1 + m_2) \sin \theta_1 - m_2 g \sin(\theta_1 - 2\theta_2) - 2 \sin(\theta_1 - \theta_2) m_2 (\omega_2^2 \ell_2 + \omega_1^2 \ell_1 \cos(\theta_1 - \theta_2))}{\ell_1 (2m_1 + m_2 - m_2 \cos(2\theta_1 - 2\theta_2))} \\ \dot{\omega}_2 = \frac{2 \sin(\theta_1 - \theta_2) (\omega_1^2 \ell_1 (m_1 + m_2) + g (m_1 + m_2) \cos \theta_1 + \omega_2^2 \ell_2 m_2 \cos(\theta_1 - \theta_2))}{\ell_2 (2m_1 + m_2 - m_2 \cos(2\theta_1 - 2\theta_2))} \end{cases}$$

## Tonnetz-Inspired Chaotic Mapping



### Mapping Trajectories to the Tonnetz

Since our representation has repeated notes, we use the periodic DoFs modulo  $12\pi$  and  $16\pi$  rescaled to the unit interval, then interpolated onto the  $x$  and  $y$  axes of the Tonnetz:

$$\begin{cases} \theta_1 \mapsto \theta_1 \bmod 12\pi / 12\pi \\ \theta_2 \mapsto \theta_2 \bmod 16\pi / 16\pi \end{cases}$$

### Mapping Points on the Tonnetz to Chords

Each point on the projected trajectory is mapped to a chord according to the vertices of its enclosing triangle on the *Tonnetz*. Chord at gold dot on trajectory is (0, 4, 7), that is, C-E-G or C-major.

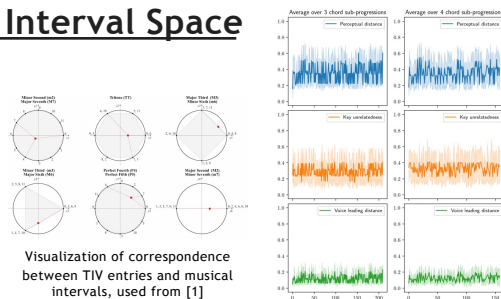
## Analysis via Tonal Interval Space

Tonal Interval Vector<sup>[1]</sup> (TIV) of a chord is the weighted Fourier transform of its chroma vector  $c \in \mathbb{Z}_{12}^{12}$ ,

$$T_k = \frac{w_k}{c} \sum_{n=0}^{11} c_n e^{-2\pi i n k / 12}, \quad k \in \mathbb{Z}$$

where,

- $w_k$  are weights based on music theory
- $c_n = 1$  if  $n$  is in the pc-set
- $c = \sum_{n=0}^{11} c_n$  is the energy of the chroma vector



Visualization of correspondence between TIV entries and musical intervals, used from [1]

### Perceptual Distance

Euclidian distance between TIVs of chords<sup>[2]</sup>:

$$d_p(T_1, T_2) = \|T_1 - T_2\|_2$$

### Key Unrelatedness

Cosine distance between TIV of a chord and a key<sup>[2]</sup>:

$$d_k(T, T_{key}) = \cos^{-1} \frac{\Re(T \cdot T_{key})}{\|T\| \|T_{key}\|}$$

### Voice Leading Distance

Measures how parsimonious two successive chords are, chords with fewer notes in common have higher distances<sup>[2]</sup>.

## Chord Progressions

### Pitch Class Sets

Vertices of enclosing triangle of *Tonnetz*, used for analysis

### Octave

Three octaves, arranged to minimize voice leading distance, used for playback

### Duration

Amount of time in triangle, rounded to nearest 16<sup>th</sup> note, used for playback



### Listen Here!



## Conclusions & Next Steps

We present a method for generating novel chord progressions without the use of preexisting works employing a musically-inspired chaotic mapping. While the variety of chords is limited to only major and minor triads in the current work, extensions to the *Tonnetz* permit for the addition of four-note chords, greatly improving chord variety<sup>[4]</sup>. Additional extensions include the generation of melodies with strong voice leading via of the geometric dual to the *Tonnetz*, a grid of hexagons wherein each represents a single note<sup>[4]</sup>. Our work also indicates the efficacy of “objective” metrics of musical quality, as our high performance under the tested metrics does not necessarily correspond to pleasant listening experiences.

[1] Bernardes, Gilberto, Diogo Cocharro, Marcelo Caetano, Carlos Guedes, and Matthew Davies. “A Multi-Level Tonal Interval Space for Modelling Pitch Relatedness and Musical Comprehension.” *Journal of New Music Research* 45 (May 27, 2016): 1-14. <https://doi.org/10.1080/02597515.2016.1187192>.

[2] Navarro-Caceres, Maria, Marcelo Caetano, and Gilberto Bernardes. “Objective Evaluation of Tonal Fitness for Chord Progressions Using the Tonal Interval Space.” In *Artificial Intelligence in Music, Sound, Art and Design*, edited by Juan Romero, Aniló Ekárt, Tiago Martins, and João Correia, 150-64. Lecture Notes in Computer Science. Cham: Springer International Publishing, 2020. [https://doi.org/10.1007/978-3-030-43053-1\\_11](https://doi.org/10.1007/978-3-030-43053-1_11).

[3] Simont, Troy, Cezayirli, Jack Wisdom, and James A. Yorke. “Chaos in a Double Pendulum.” *American Journal of Physics* 60, no. 6 (June 1, 1992): 491-99. <https://doi.org/10.1119/1.16890>.

[4] Tymoczko, Dmitri. “The Generalized Tonnetz.” *Journal of Music Theory* 56, no. 1 (2012): 1-52.

[5] Image courtesy T. Ples under CCO

