Motivation

Melodic concepts like vadi, samvadi, nyas, graha svara:

- > Lack of objective definition hinder the cause of music information retrieval
- > Absence of quantitative evidence for qualitative terms like 'shine' or 'focus'
- > Manual analyses introduce subjective biases, and are not easily reproducible

Lack of studies at the time-scale of a full raga performance:

- > Some attention has been paid to phrase-level modelling, which is not adequate to appreciate how a musician plans the evolution of the melody over the timescale of the concert
- > Pitch histogram model is useful for intonation analysis, but timing information is crucial for exploring melodic structures

How 'improvisatory' are the improvisations?

- > What is the universal structure that underlies melodic improvisation, and is this raga-specific?
- > How much of this is artist-dependent?
- > Can the gharana (lineage) be inferred from a concert audio?

Data processing



(Modified Evolution Contour)

25

of svara

Knowledge hypotheses

K1: Evolution of melody in time

Irrespective of the raga and concert-duration, artists take the same time to explore the melody and arrive at the highest svara

K2: Transitional characteristics of nyas svaras

Artists 'focus' on a nyas svara for consecutive breath-phrases to establish that svara before moving on to the next svara

K3: Relationship between functional roles of svaras and their duration in melody

Any svara in a breath-phrase cannot be stretched arbitrarily long, the nyas svara decides how much variance other svaras can exhibit

K4: Duration and position of svaras in melody

The performance starts from a lower svara (graha) and reaches the focal svara (vadi) in course of the gradual development of the melody

K5: Presence of possible pulsation in melody

There is an implicit pulsation present in the alap of Hindustani music, this carries forward to the tempo of the bandish

[van der Meer (1980),



K2

Data-driven exploration of melodic structures in Hindustani music

Kaustuv Kanti Ganguli, Sankalp Gulati, Xavier Serra, and Preeti Rao

Widdess (2011), Bagchee (1998)]

Figure 3. Bar graph of svara duration stacked in sorted manner for each breath-phrase. We observe that breath-phrases often comprise one long nyas svara and several other svaras of less duration

K4



Figure 4. Ratio of inter-onset-interval of salient svaras across breath-phrases. We see a tatum pulse (peak) at 0.8 seconds and its harmonics

K2



Dept. of Electrical Engineering, Indian Institute of Technology Bombay, Mumbai, India Music Technology Group, Universitat Pompeu Fabra, Barcelona, Spain



Figure 7. Mean (left) and standard deviation (right) of all svaras (octave folded) for each svara along x-axis being the salient svara in a breath-phrase

K3

Music collection & Annotation

> 75 concerts from 10 widely used ragas

Svaras refer to transcribed steady note segments [Ganguli et. al., 2015]





Figure 5. Svara-transition matrix of salient svaras of each breath-phrase. Intensity of each bin is proportional to the number of transitions taken from the svara of bin index on x-axis to the svara of bin index on y-axis

Summary

> We outline the motivation and relevance of computational approaches for quantitatively studying the underlying musical concepts

> Musically relevant acoustic features, computed using existing MIR tools and techniques, are intuitive and easy-to-interpret by musicians/musicologists

> 40 eminent artists (male and female), 67 unique compositions

> Diverse in terms of number of svaras, their svarasthanas and layas of bandish

> A trained Hindustani musician annotated the end of alap and vistar section

> The corpus amounts to 20 hours of data

Modified evolution contours (MEC) for 37 concerts in our music collection



Figure 6. Heuristic features extracted from breath-phrases to observe correlation of svaras and their durations. The green (unit-less) and blue contours are with an offset of 10 and 20 sec for better visualization

MEC Feature Extraction

> A collection of heuristic features (slope-based, duration-based, jump-based, and level-based)

- > Slp: slope between the MEC value of initial frame and the first frame where MEC=1
- > Cen: centroid (salience of the bins as the weights is regarded) of each svara
- > Pro: proportion of duration spent on each svara
- > Feature selection in Weka reveals:
 - > Slp is a raga-independent feature
 - > Cen is a raga-dependent feature
 - > Pro for vadi/samvadi svaras is always higher



> We discover implicit relationships between svaras and duration in the temporal evolution of a raga performance which is useful in the music pedagogy

> Statistical analyses on a larger representative corpus shows that the validated hypotheses are generalizable

Future work

> Use these findings for characterizing artist- and gharanaspecific melodic aspects in Hindustani music

> Incorporate timbre and volume dynamics with melodic features to study use of alankars in alap performances

> Corroborate the findings to propose a system that could provide qualitative (musically valid) feedback to music learners and aid compositional tools