# Audio Fingerprinting

mainly based on

A review of audio fingerprinting (Cano et al. 2005)

presented by

Denis Lebel

#### **Presentation Outline**

- Introduction
- Desired Properties
- Usage Modes
- Applications
- Fingerprinting Framework
  - Front-end
  - Fingerprint Models
  - Similarity Measures and Searching Methods
  - Hypothesis Testing
- Conclusion
- References

#### Introduction

- Idea
  - An attempt to mimic human music recognition abilities
- Audio Fingerprint
  - Unique identifier of an audio signal
  - Content-based signature that summarizes an audio recording
  - Uses relevant (perceptual) acoustics characteristics of signal
- Fingerprinting System
  - Database of known fingerprints
  - Query system

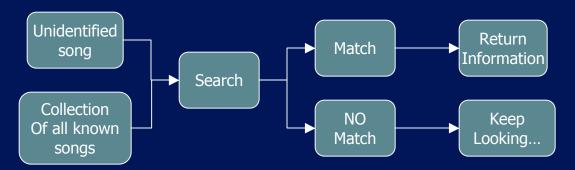


Figure 1: General idea of a fingerprinting system

## **Desired Properties**

- Accuracy
  - Function of correct, missed, and wrong identifications
- Reliability
  - Correct identification method
- Robustness
  - Ability to accurately identify an item (no matter how compressed or distorted it is)
- Granularity
  - Ability to identify a signal from a short excerpt
- Security
  - Vulnerability to cracking

## **Desired Properties**

- Versatility
  - Ability to identify a signal regardless of audio format
- Scalability
  - Performance with very large databases
- Complexity
  - Computational costs of fingerprint extraction, size of fingerprint, search complexity, comparison complexity, etc.
- Fragility
  - Integrity verification (detection of changes in content)

## **Desired Properties**

- Properties are interrelated and dependent of system purpose
- Generally speaking, fingerprint should be:
  - A perceptual digest of the recording
  - Invariant to distortions
  - Compact
  - Easily computable

## **Usage Modes**

- Identification
  - Content identification of an audio signal

- Integrity Verification
  - Detection of data alteration

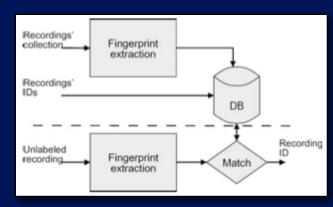


Figure 2: Content-based audio identification framework. (Cano et al. 2005)

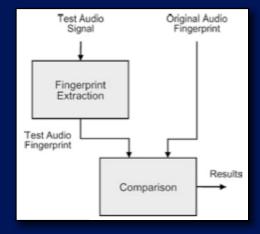


Figure 3: Integrity verification framework. (Cano et al. 2005)

## Usage Modes

- Watermarking support
  - Audio fingerprints can be used to derive secrets keys from the audio content
- Content-based Audio Retrieval and Processing
  - Extraction of audio features (i.e., low-level and high-level descriptors)
  - Fingerprints can be used to retrieve similar content (i.e., query-by-example scheme)

## **Applications**

- Audio Content Monitoring and Tracking
  - At the distributor end
  - At the transmission channel
  - At the consumer end
- Added-Value Services
  - Content information describing audio excerpt (e.g., tempo)
  - Meta-data describing musical work (e.g., composer, year, ...)
  - Other information (e.g., album cover)
- Integrity Verification Systems
  - Audio fingerprints can be used to ensure user's audio files have the best quality available

#### **Presentation Outline**

- Introduction
- Desired Properties
- Usage Modes
- Applications
- Fingerprinting Framework
  - Front-end
  - Fingerprint Models
  - Similarity Measures and Searching Methods
  - Hypothesis Testing
- Conclusion
- References

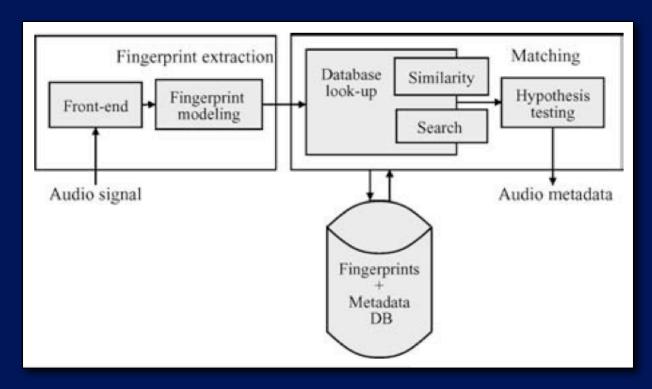


Figure 4: Content-based audio identification framework. (Cano et al. 2005)

■ Fingerprint Extraction: Front-End

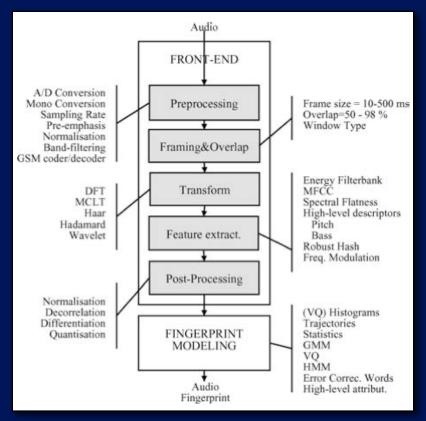


Figure 5: Fingerprint Extraction Framework. (Cano et al. 2005)

- Fingerprint Extraction: Fingerprint Modeling
  - Idea: Reduce redundancies
  - Reduce size of fingerprint
  - Similarity measure and search method depends on the model chosen
  - Several techniques can be used (for a summary: Cano et al. 2005)

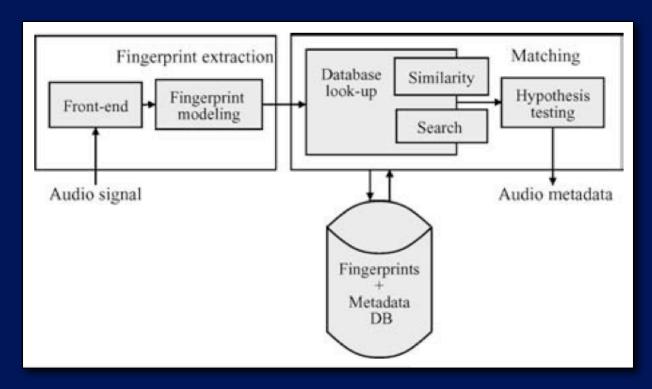


Figure 4: Content-based audio identification framework. (Cano et al. 2005)

14

- Fingerprint Extraction:Similarity Measures
  - Related to type of model chosen
  - Correlation metric is common
    - Example: Euclidean distance

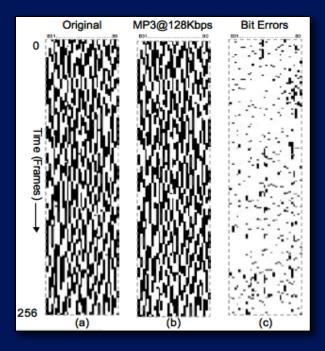


Figure 6: a) Fingerprint block of original clip b) fingerprint block of a compressed version. c) Difference (error) (Haitsma et al. 2002)

- Fingerprint Extraction: Searching Methods
  - Using brute-force search is inappropriate for large database
  - Idea: Optimizing the search
- Some possible optimizations
  - Pre-computing distances offline
  - Filtering unlikely candidates with a cheap similarity measure
  - Candidate pruning
  - Others...

- Fingerprint Extraction: Hypothesis Testing
  - Idea: Whether the query is present in the repository
  - A threshold must be used and it depends on:
    - Fingerprint model
    - Similarity of fingerprints in the database
    - Database size
    - Discriminative information of the query
  - The larger the database, the higher the probability of wrong match
    - False Acceptance Rate (FAR)
    - False Rejected Rate (FRR)

#### Conclusion

- Most existing systems fall more or less into this generic framework
- Large databases still represent a challenge (scalability, complexity, accuracy...)
- P2P systems might be the future (e.g., Music2Share)

#### References

- Cano, P., E. Batlle, T. Kalker, and J. Haitsma. 2005. A review of audio fingerprinting. The Journal of VLSI Signal Processing 41: 271–84.
- Haitsma, J., and T. Kalker. 2002. A highly robust audio fingerprinting system. *Proceedings of the International Symposium on Music Information* Retrieval. 107–15.
- Kalker, T., D. Epema, P. Hartel, R. Langendijk, and M. Van Steen. 2004. Music2Share: Copyright-compliant music sharing in P2P systems. *Proceedings of the IEEE* 92 (6): 961–70.

## Links

- http://www.shazam.com/
- <a href="http://www.relatable.com/">http://www.relatable.com/</a>
- http://www.audiblemagic.com/
- http://www.gracenote.com/