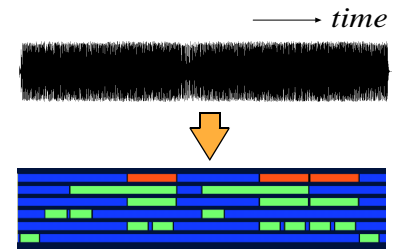


# A Chorus-Section Detecting Method for Musical Audio Signals

## Introduction

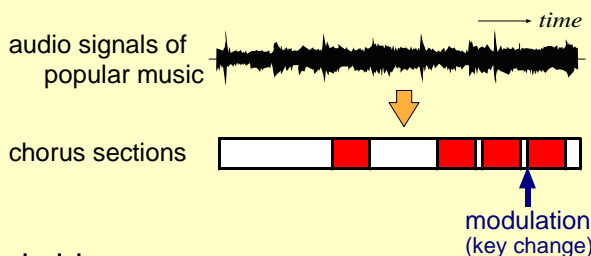


### Chorus Section Detection

- Chorus (refrain) sections
  - Most representative thematic sections in the music structure of popular songs
  - **Most repeated and memorable** portions
- ➔ Automatic detection is essential for building a computational model of **music understanding**
- Useful in various practical applications
  - Audio thumbnail, music retrieval, etc.

### RefrainD (Refrain Detecting Method)

- Exhaustively detect **all the chorus sections** appearing in a song
  - Obtain a list of **the start and end points of every chorus section** in CD recordings
  - Detect **modulated** chorus sections (with key change)



#### Basic idea

- Detect **without using any prior information** about spectral characteristics of chorus sections
- Chorus sections are usually **the most repeated sections** in popular music

1. Find various groups of repeated sections



2. Output the chorus-like group appearing frequently



#### Real-time output

- List of **chorus sections**
- Intermediate-result list of **repeated sections**
  - Usually reflect the music structure of the song
  - ex) repetition of "verse A → verse B → chorus"

### Previous Work

#### □ Previous chorus-detection methods

[Bartsch and Wakefield, 2001][Cooper and Foote, 2002][Logan and Chu, 2000]

- Only extract a single segment from several chorus sections
  - Detect a repeated section of a given length as the most representative of a song
  - ➔ Did **not** address the problem of **detecting all the chorus sections** in a song
  - ➔ **identifying both ends** of the chorus sections
  - ➔ **Not able to deal with modulated repetition**

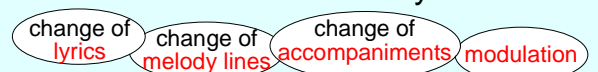
#### □ Previous music-summarization methods

[Peeters, Burthe, and Rodet, 2002][Dannenberg and Hu, 2002]

- ➔ Did **not identify both ends** of chorus sections
- ➔ **Not able to deal with modulated repetition**

### Problems

- It is rare for repeated sections to be exactly the same

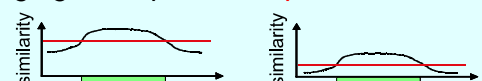


#### □ Problem 1: acoustical features and similarity

- Typical power spectrum and MFCC features are **liable to change considerably**

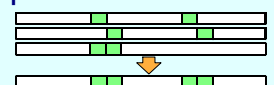
#### □ Problem 2: repetition-judgment criterion

- Appropriate criterion of the similarity for judging the repetition **depends on the song**



#### □ Problem 3: integrating repeated sections

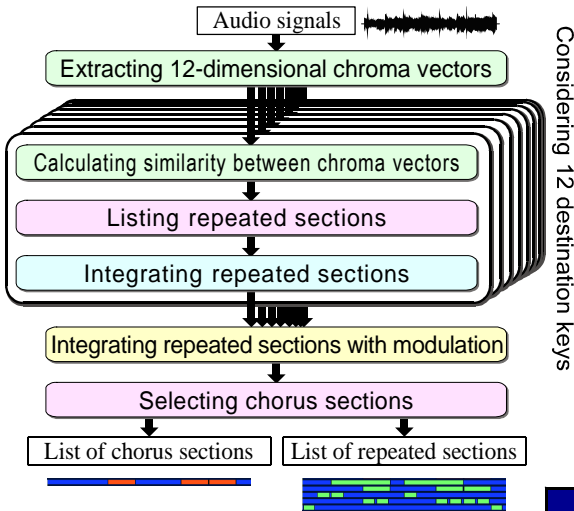
- Identify both ends by **examining mutual relationships** among various repeated sections



#### □ Problem 4: detecting modulated repetition

- Acoustic features generally undergo a **significant change after modulation** (key change)

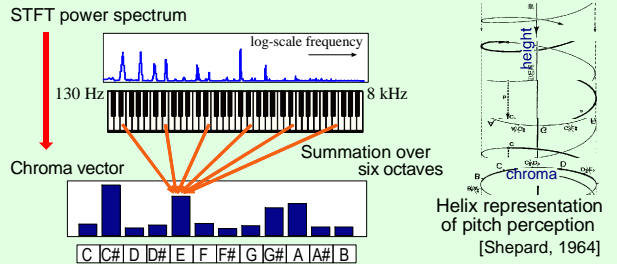
## Overview of Refraid



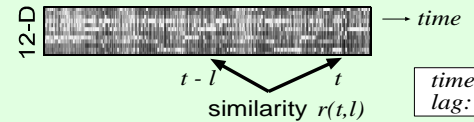
### Solution to Problem 1

#### Extracting 12-dimensional chroma vectors

- Sum of **power at frequencies of each pitch class**
- Capture the overall harmony (pitch-class dist.)



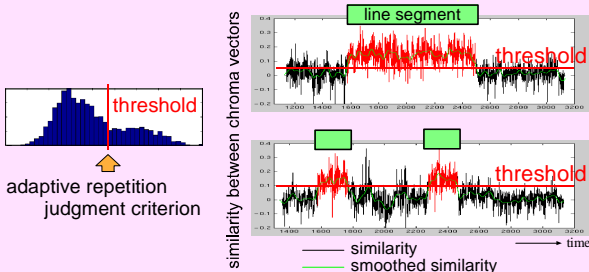
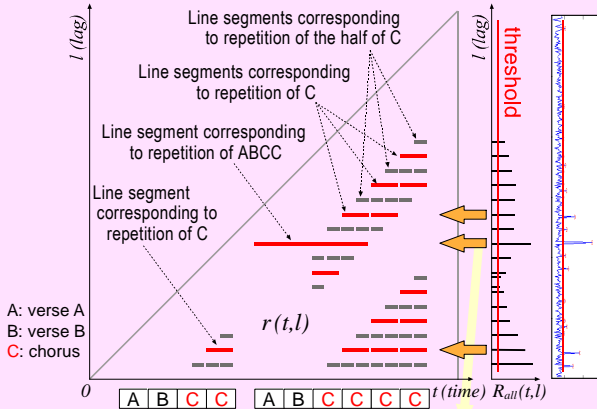
#### Calculating the similarity between vectors



### Solution to Problem 2

#### Listing repeated sections

- Find **line segments** in the similarity  $r(t, l)$



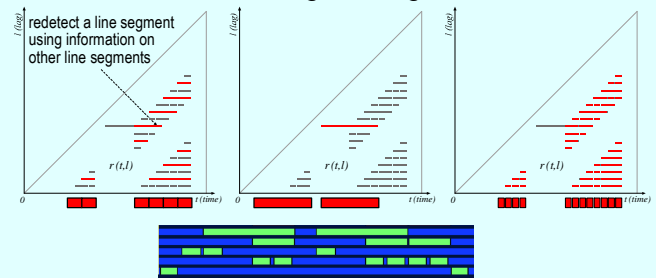
- Automatic threshold selection method** based on a discriminant criterion [Otsu, 1979]
- Dichotomize peak heights into two classes
- Discriminant criterion measures: **maximizing class separability** (between-class variance)
$$\sum_i \omega_i (\mu_i - \mu_T)^2$$

$\mu_i$ : class mean of heights  
 $\omega_i$ : probability of class occurrence  $\mu_T$ : total mean of heights

### Solution to Problem 3

#### Integrating repeated sections

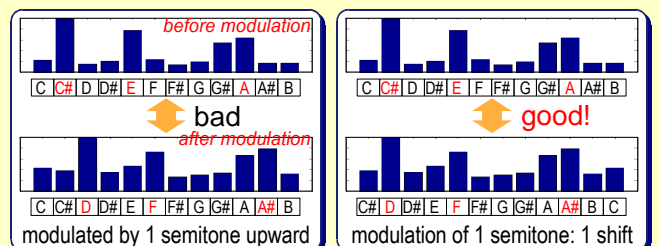
- Group line segments** having common sections
  - Revise both ends of sections in each group
  - Redetect missing line segments



### Solution to Problem 4

#### Integrating repeated sections w/ modulation

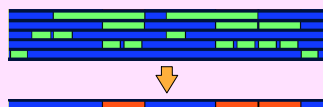
- Shift 12 elements of 12-D chroma vectors



URL of the Masataka Goto's Home Page:  
<http://staff.aist.go.jp/m.goto/>

## Selecting Chorus Sections

- Evaluate chorus possibility for each group



- # of sections is many
- reliability of section is high
- length of section is long

$$\sum (\text{reliability of section}) \log \frac{(\text{length of section})}{(\text{constant})}$$

- Three assumptions

1. Chorus has an **appropriate length** (7.7- 40 sec)
2. When there is a **long repeated section**, the end of it is likely to be the chorus section
3. When a section has **half-length repeated sub-sections**, it is likely to be the chorus section

## Experimental Results

- Conditions

- Tested on **100 songs** from "*RWC Music Database: Popular Music*"  
 RWC-MDB-P-2001 No. 1 - 100 [Goto et al., 2002]
- Correct chorus sections were **labeled manually**  
 Develop a music-structure labeling editor
- **F-measure**: harmonic mean of recall & precision rates  
 Judged to be correct if F-measure > 0.75

$$F\text{-measure} = \frac{2RP}{R + P} \quad \text{Recall (R)} = \frac{\text{total length of correctly detected chorus sections}}{\text{total length of correct chorus sections}}$$

$$\text{Precision (P)} = \frac{\text{total length of correctly detected chorus sections}}{\text{total length of detected chorus sections}}$$

- Results

- **80 songs** out of 100 were correct (F-measure mean: 0.938)

Modulation detection	○	×	○	×
Use of assumptions 2 & 3	○	○	×	×
# of songs (out of 100)	80	74	72	68

## Summary

- Propose the RefraiD method

- Regard **the most repeated sections** as the chorus sections in **popular music**
- Detect **all** the chorus sections with their **start** and **end** points
- Detect **modulated** chorus sections, which previous methods could not detect
- **Robust** enough to deal with real-world audio signals in real time