



Tools for Feature Extraction

Exploring and using the essentia library

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Outline

- 1 Introduction to essentia
 - General structure of essentia
 - How To: Use essentia with Python
 - How To: Add a new function in C++
- 2 Danceability()
 - Description of the Danceability-algorithm
 - Modifying the algorithm
 - Results and interpretation of the modified algorithm
- 3 Classifying Songs
 - General idea of the proposed algorithm
 - "Sneak Peak" into the extraction algorithm
- 4 Conclusion and Summary



Section 1

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A few remarks and little bit of history

Essentia is

- a C++ library for audio analysis with Python bindings



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Essentia is

- a C++ library for audio analysis with Python bindings
- fairly young (first version released in 2008, newest version 2.1 beta3 released on September 2016)



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Essentia is

- a C++ library for audio analysis with Python bindings
- fairly young (first version released in 2008, newest version 2.1 beta3 released on September 2016)
- open-source, with continuing additions



Some features of essentia

Essentia provides algorithms for

- spectral analysis



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Essentia provides algorithms for

- spectral analysis
- extraction and segmentation



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- statistics and math



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- statistics and math
- tonal and pitch analysis



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- spectral analysis
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- duration, silence



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- spectral analysis
- extraction and segmentation
- statistics and math
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- duration, silence
- loudness, dynamics and rhythm
- filters
- ...



Operating modes

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- standard, recommended for

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- standard, recommended for
 - maximum control in C++
 - research with Python (interactive environment)
- streaming, recommended for
 - easy-to-write extractors in C++ and Python
 - porting from Python to C++



Section 2

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Using essentia in Python

- Step 0: Import the library

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import essentia
import essentia . standard
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Using essentia in Python

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```

- Step 2: Use the algorithms

```
audio = loader ( )
```



Algorithms in essentia

can have multiple

- parameters, set during the instantiation



Algorithms in essentia

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Step 1:

Create the .h and .cpp files:

- danceabilityDetailed.h
- danceabilityDetailed.cpp

Step 2: danceabilityDetailed.h

start of file, class declaration

```
#ifndef ESSENTIA_DANCEABILITYDETAILED_H  
#define ESSENTIA_DANCEABILITYDETAILED_H  
  
#include "algorithm.h"  
#include "essentiamath.h"  
  
namespace essentia {  
namespace standard {  
  
class DanceabilityDetailed : public Algorithm {
```



Step 2: danceabilityDetailed.h

declare all protected variables, especially input and output:

protected :

```
Input<std::vector<Real>> _signal;  
Output<Real> _danceability;  
Output<std::vector<Real>> _dfaExponents;  
Output<std::vector<Real>> _dfaTaus;  
int _preferredSize, _actualSize;
```

Step 2: danceabilityDetailed.h

constructor declaration, here input and output are declared

public :

```
DanceabilityDetailed() {  
    _preferredSize = 36; //as seen in the paper  
    _actualSize = _preferredSize;  
    declareInput(_signal, "signal", "#d");  
    declareOutput(_dfaTaus, "dfaTaus", "#d");  
}
```

Step 2: danceabilityDetailed.h

declare parameters

```
void declareParameters() {  
    declareParameter("minTau", "#d",  
                    "(0,inf)", 310.);  
    declareParameter("maxTau", "#d",  
                    "(0,inf)", 8800.);  
}
```

Step 2: danceabilityDetailed.h

declare other functions or variables

```
void compute ();  
void configure ();  
  
static const char* name;  
static const char* category;  
static const char* description;
```


Step 2: danceabilityDetailed.h

declare other functions or variables

protected:

```
std::vector<int> _tau;
```

```
Real stddev(const std::vector  
            <Real>& array, int start,  
            int end) const;
```

```
};
```

```
} // namespace standard
```

```
} // namespace essentia
```

Step 2: danceabilityDetailed.h

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protected :

```
std::vector<int> _tau;
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Real stddev(const std::vector  
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```
} // namespace standard
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```
} // namespace essentia
```

Repeat for streaming...



How To: Add a new function in C++

Step 3: danceabilityDetailed.cpp

File start and fill inherited variables

```
#include "danceabilityDetailed.h"

using namespace std;
namespace essentia {
namespace standard {

const char* DanceabilityDetailed
    ::name= "DanceabilityDetailed";
```



Step 3: danceabilityDetailed.cpp

File start and fill inherited variables

```
const char* DanceabilityDetailed
    ::category = "Rhythm";
const char* DanceabilityDetailed
    ::description
    = DOC(" Long\n\nDescription" );
```

Step 3: danceabilityDetailed.cpp

Fill the declared functions with meaning

```
Real DanceabilityDetailed ::  
    stddev(const vector<Real>& array ,  
           int start , int end) const {  
    ...  
}  
void DanceabilityDetailed :: configure () {  
    ...  
}  
void DanceabilityDetailed :: compute () {  
    ...  
}
```

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Sample frame title

- Detrended Fluctuation Function - statistical self affinity
$$y(m) = \sum_{n=1}^m s(n)$$
- Computation procedure
 - Segmentation
 - Standard Deviation
- Danceability taken as the average of the DFT
- Higher the Danceability value, more is the music danceable

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Modifying Essentia algorithm

- Essentia provides open source C++ library with Python interface
- Danceability() function
 - Input - signal(vector real)
 - Output - danceability, DFA(real)
- Modified the code as according to get vector as output
- Danceability values for Music
 - ChaChaCha - 1.18
 - Rumba - 1.05
 - Tango - 1.28
- Inference - Tango is more Danceable

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Results

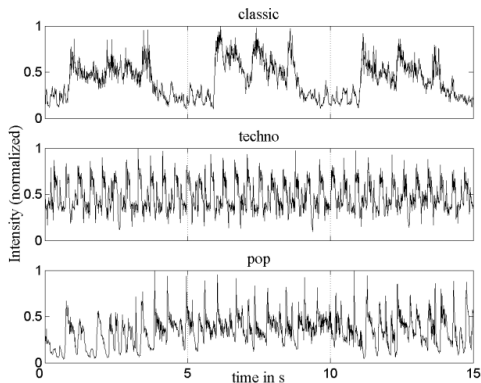


Figure: From the research paper: time series $s(n)$

Results

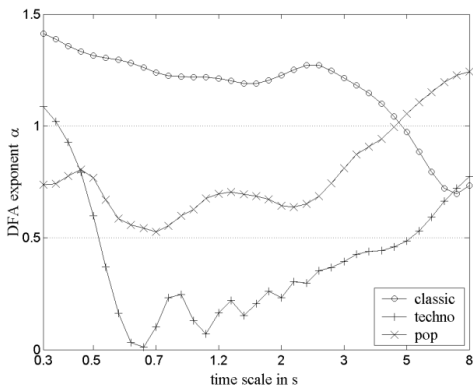


Figure: From the research paper: DFA Exponent Function



Let's take a look and try it out!

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Purpose of the algorithm

is to

- extract features from songs



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 - beats per minute
 - meter
 - danceability
 - ...



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- classify them according to their features (possibly with machine learning)



Purpose of the algorithm

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- extract features from songs
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 - ...
- classify them according to their features (possibly with machine learning)
- be used as classification for DJ-algorithm



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"Sneak Peak" into the extraction algorithm

Extraction demonstration of

- beats per minute



"Sneak Peak" into the extraction algorithm

Extraction demonstration of

- beats per minute
- rubato



"Sneak Peak" into the extraction algorithm

Extraction demonstration of

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"Sneak Peak" into the extraction algorithm

Extraction demonstration of

- beats per minute
- rubato
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- novelty



"Sneak Peak" into the extraction algorithm

Extraction demonstration of

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"Sneak Peak" into the extraction algorithm

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Conclusion and Summary

- Essentia is a powerful tool to extract music features with many options and algorithms ranging from Spectral, tonal, Rhythm

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- Essentia Library is being used world wide for Music Classification based on tempo, rubato etc.

Conclusion and Summary

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- Danceability approach mentioned by us is easy and well defined to get a quick overview of any song
- Overall we recommend this library for music lovers and who wish to play around, especially rhythm