



# Mining the social **web** for **music**-related data: a hands-on **tutorial**

wifi password: yh4zs

Please install the required software!

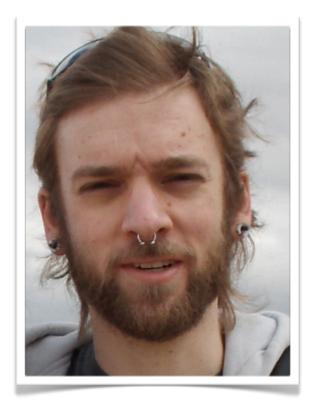
Check the details at:

ismir2009.benfields.net

#### Welcome!



Claudio Baccigalupo IIIA-CSIC Barcelona, Spain



Ben Fields
Goldsmiths
University of London, UK

ismir 2009. ben fields. net

#### Source code archive

All the code examples are included in the file: ismir2009.benfields.net/sources.zip

Unzip the archive and open a shell in its folder. Then check that Python and Ruby are installed:

```
$ ruby --version
$ python --version
```

Or download them from: python.org and ruby-lang.org

#### It's a hands-on tutorial

#### You will write code for real MIR applications:

1. Evaluating hypotheses

- 4. Performing audio analysis
- 2. Comparing lyrics by genre
- 5. Capturing social data

3. Revealing trends

6. Collecting feedback

#### exploring multiple languages and web sites:

















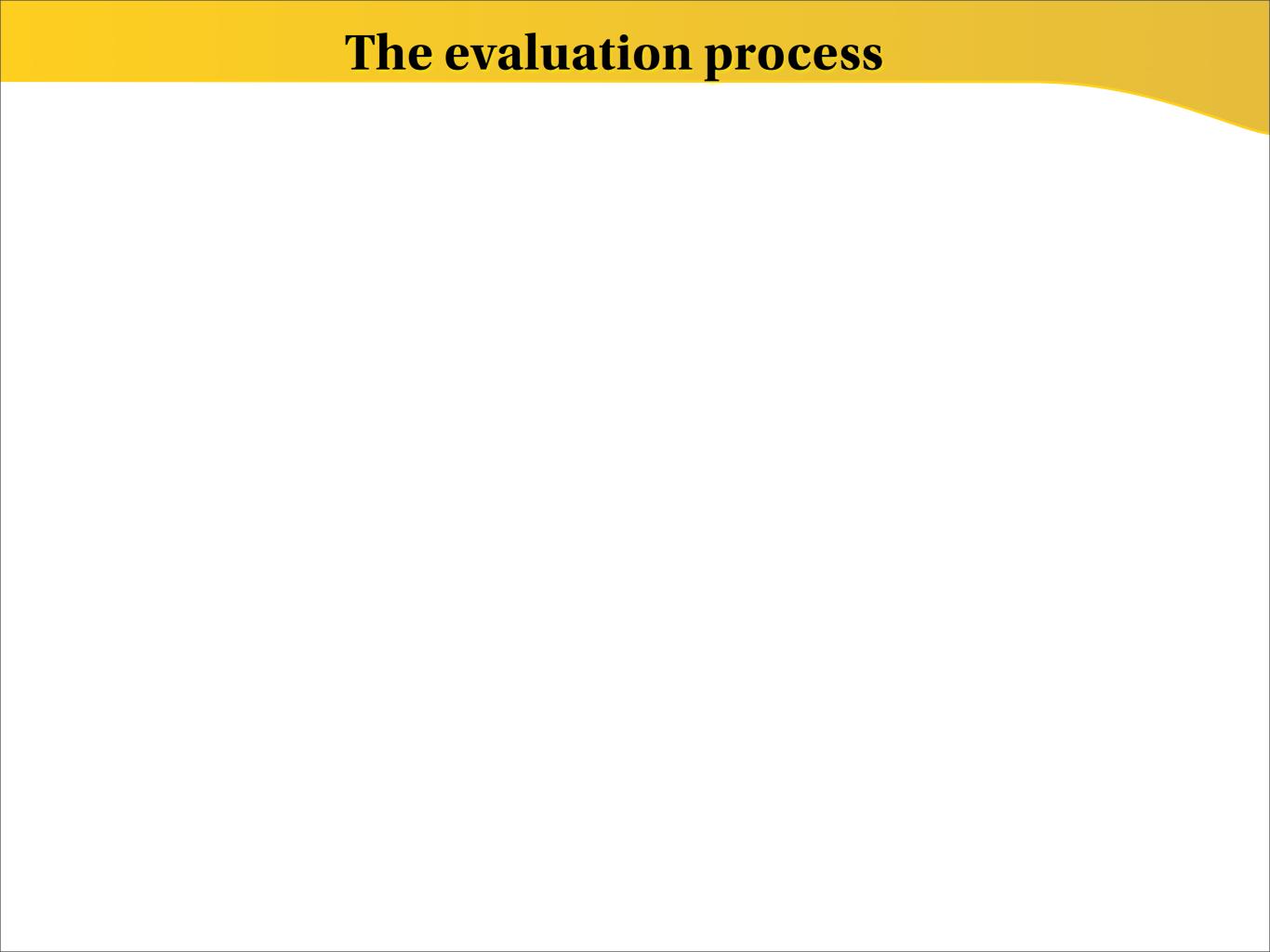








## EVALUATING HYPOTHESES



#### The evaluation process

Say you have built the "ultimate genre recogniser"



How would you evaluate its precision rate?

#### The evaluation process

Say you have built the "ultimate genre recogniser"



#### How would you evaluate its precision rate?

- 1. Build a local collection of varied songs
- 2. Assign them with a genre label
- 3. Run the algorithm and check its output

A cumbersome, boring process!



#### The traditional approach

Evaluate with a few, manually labelled examples

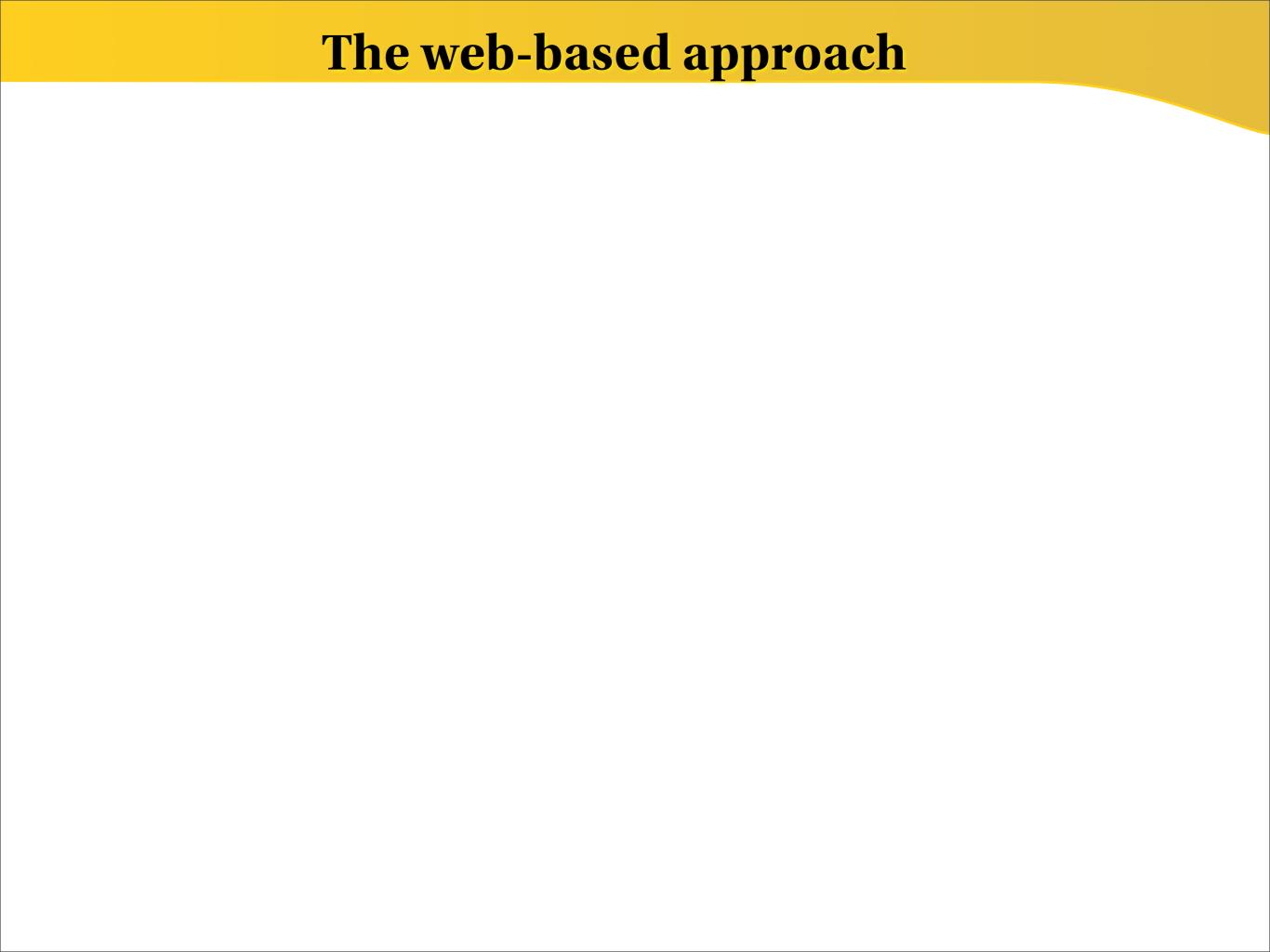
```
$ cd <PACKAGE PATH>/c
$ python isrock.py ../m/rock.mp3
$ python isrock.py ../m/metal.mp3
$ python isrock.py ../m/vocal.mp3
$ python isrock.py ../m/experimental.mp3
```

#### The traditional approach

Evaluate with a few, manually labelled examples

```
$ cd <PACKAGE PATH>/c
$ python isrock.py ../m/rock.mp3
                                            =» True
                                            =>> True
$ python isrock.py ../m/metal.mp3
                                            =>> False
$ python isrock.py ../m/vocal.mp3
                                            =» False
$ python isrock.py ../m/experimental.mp3
```

The "ultimate" recogniser or just a coincidence?

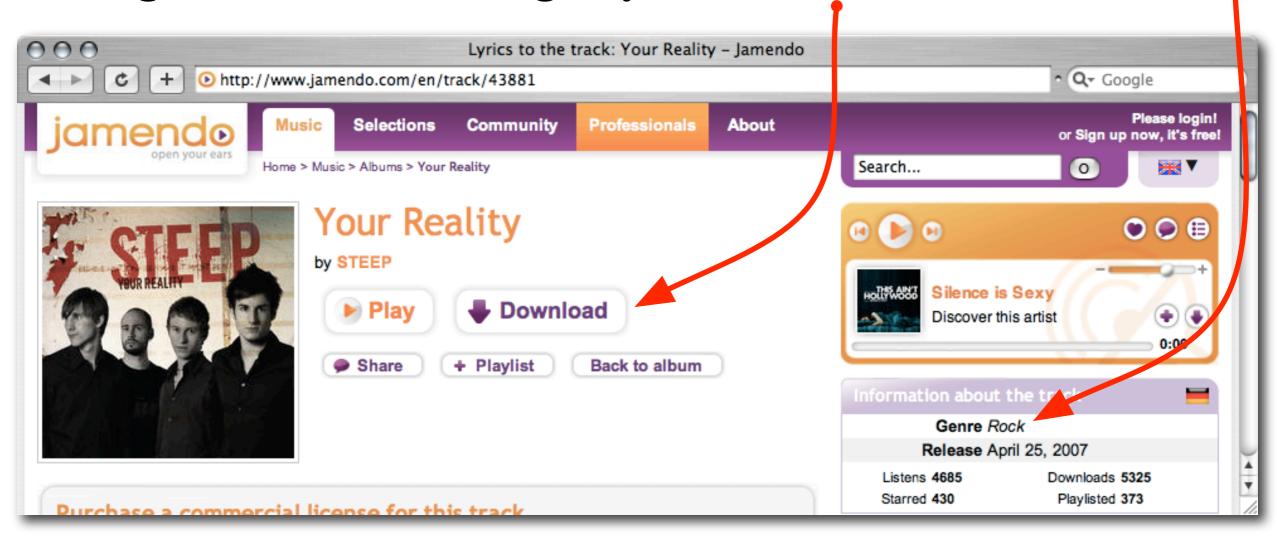


#### The web-based approach

The web contains thousands of genre-classified songs that can be legally downloaded for free

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Jamendo includes 170K songs by 14K artists

A web API allows you to retrieve data in a **compact** format from a site via simple **queries** 

### A web API allows you to retrieve data in a **compact** format from a site via simple **queries**



jamendo.com/en/albums

```
http://api.jamendo.c...er=ratingmonth_desc
The Butcher's Ballroom
                      Diablo Swing Orchestra
Believe vour Ears Ear3
Oh My Sean Fournier
Looking for a Way Out
                        Paolo Pavan
The Best of BlueMoons 2009 PeerGynt Lobogris
KOMIKS MUSIK ECLECTEK
Increase the Dosage Revolution Void
          Jaime Heras
Mind's Eye Celestial Aeon Project
Dinner for One Amity in Fame
Unfinished History
                    2Inventions
Shadows of Light Atomic cat
DigitaLegal Greendjohn
Earth zero-project
To Get Home Before Night Comes Steven Dunston
Bluemoon II Dreams PeerGynt Lobogris
Mechanical Butterfly Mechanical Butterfly
I Will Wait For You Erica Shine
Roots Galdson
Waste Your Time Loudog
```

api.jamendo.com/get2/name
+artist\_name/album/plain/?
order=ratingmonth\_desc

## A web API allows you to retrieve data in a **compact** format from a site via simple **queries**



jamendo.com/en/albums

```
http://api.jamendo.c...er=ratingmonth_desc
The Butcher's Ballroom Diablo Swing Orchestra
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api.jamendo.com/get2/name
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## A web API allows you to retrieve data in a **compact** format from a site via simple **queries**

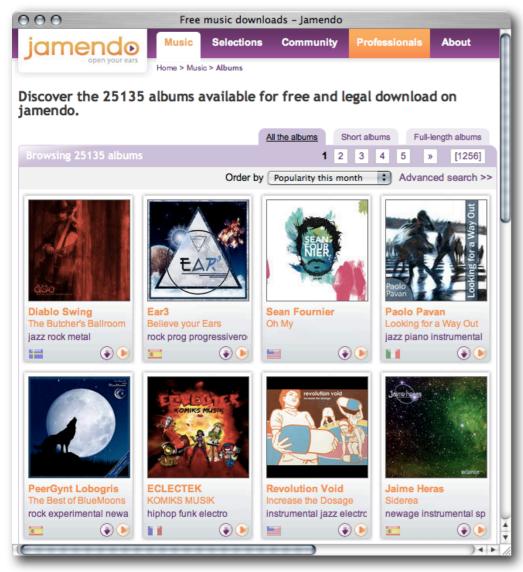


jamendo.com/en/albums



api.jamendo.com/get2/name
+artist\_name/album/plain/?
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jamendo.com/en/albums

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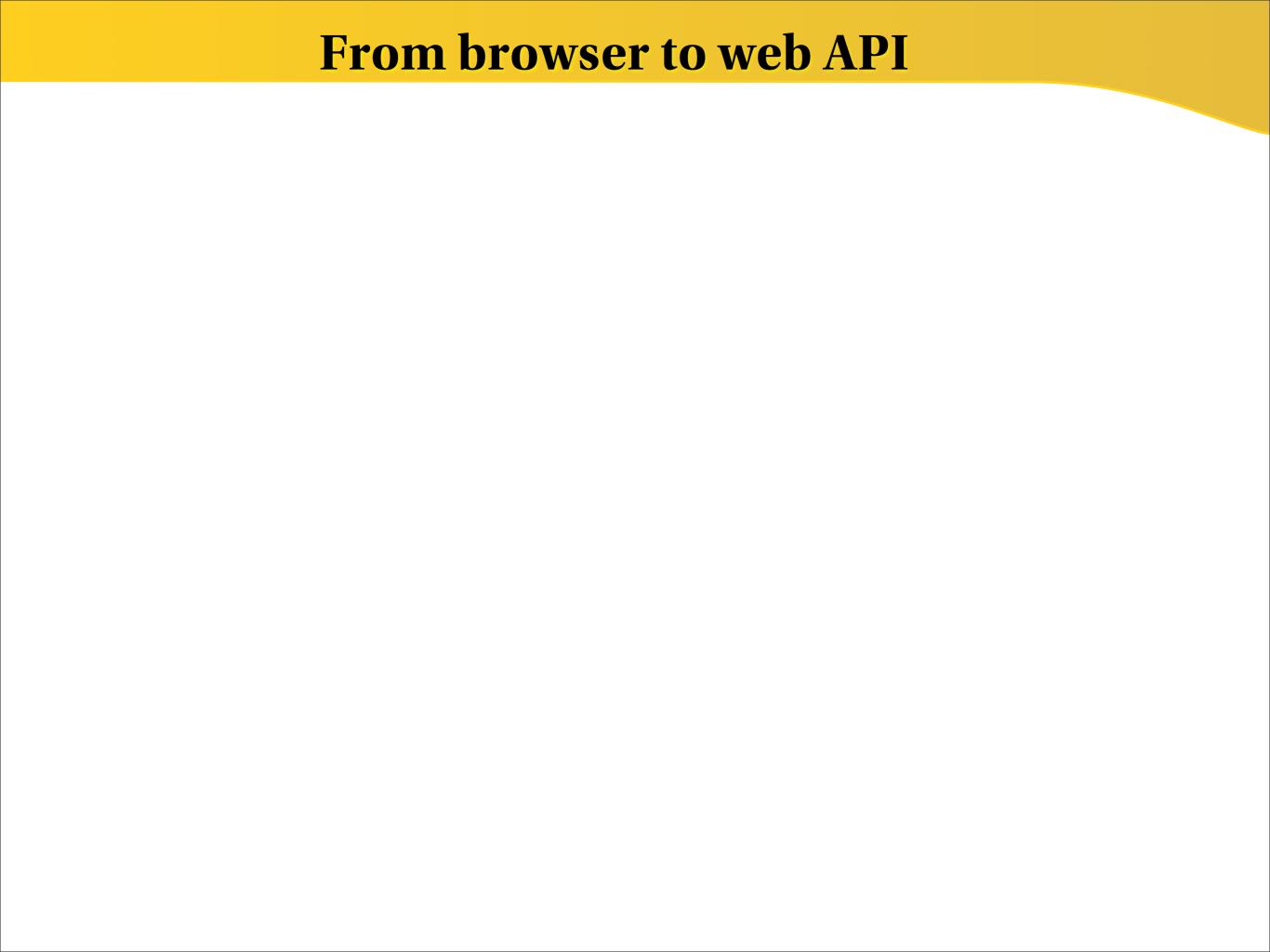
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               Loudog
```

api.jamendo.com/get2/name
+artist\_name/album/plain/?
order=ratingmonth\_desc



Documentation at: developer.jamendo.com

API query to retrieve 50 random Rock songs: api.jamendo.com/get2/stream/track/plain/? tag\_idstr=rock&n=50&order=random\_desc

```
http://api.jamendo.com/get2/stream/track/plain/?tag_idstr=rock&n=50&order=random_desc
                                                                                                        Q → Google
                 http://api.jamendo.com/get2/stream/track/plain/?tag_idstr=rock&n=50&order=random_desc
http://stream30.jamendo.com/stream/42809/mp31/01%20-%20orchid%20-%20moreless.mp3?u=0&h=a78973f505
http://stream30.jamendo.com/stream/112045/mp31/14%20-%20mobsofa%20-%20say%20it%20in%20french.mp3?u=0&h=d3975af8da
http://stream30.jamendo.com/stream/55601/mp31/04%20-%20DOUG%20the%20Eagle%20-%20One%20Less%20Hero.mp3?u=0&h=0630209871
http://stream30.jamendo.com/stream/3411/mp31/02%20-%20Drallibotrop%20-%20El%20Ruskov%20Torero.mp3?u=0&h=9e9137f748
http://stream28.jamendo.com/stream/170400/mp31/04%20-%20The%20LOG%20-%20The%20choice.mp3?u=0&h=fa83cd57de
http://stream30.jamendo.com/stream/193295/mp31/05%20-%20Shock%20Generators%20-%20Poor%20Bastard.mp3?u=0&h=7b1232be2b
http://stream28.jamendo.com/stream/184774/mp31/04%20-%200scar%20Brent%20-%20Marylise.mp3?u=0&h=f0a3973a78
http://stream30.jamendo.com/stream/175781/mp31/03%20-%20The%20JCS%20Project%20-%20GONE.mp3?u=0&h=6714f2f213
http://stream30.jamendo.com/stream/271671/mp31/03%20-%20tedstriker%20-%20Ted%20Striker%20-%20Cuervo.mp3?u=0&h=89a2996da1
http://stream28.jamendo.com/stream/44607/mp31/03%20-%20SouPeX%20-%20Le%20Fils%20De%20Satan.mp3?u=0&h=059fcd2719
http://stream30.jamendo.com/stream/141274/mp31/02%20-%20Redstorm%20-%20Fear%20The%20Storm.mp3?u=0&h=d9ffe51ef2
http://stream30.jamendo.com/stream/134889/mp31/06%20-%20Pierre%20Blanc%20Electricite%20Generale%20-%20PBEG01-06.mp3?
u=0&h=99db1705d3
http://stream28.jamendo.com/stream/143859/mp31/14%20-%20Adapters%20-%20bonus.mp3?u=0&h=019ef9fee9
http://stream28.jamendo.com/stream/1530/mp31/06%20-%20SEPTENTRION%20-%20Un%20petit%20poete.mp3?u=0&h=336ac83c35
```

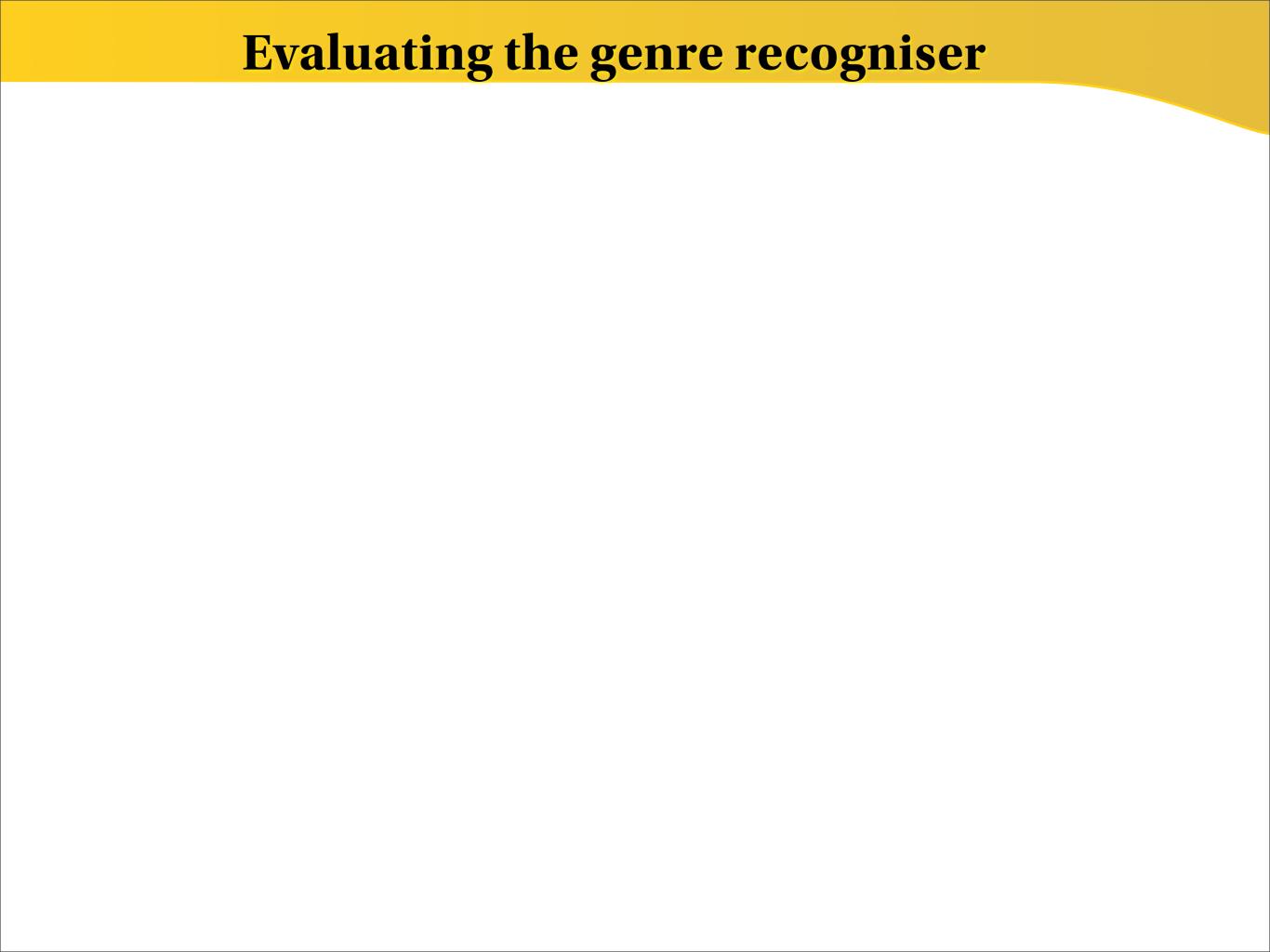
```
python
```

```
$ python
from urllib import urlopen
from isrock import isRock
```

```
$ python
from urllib import urlopen
from isrock import isRock
query = "http://api.jamendo.com/get2/stream/track/
plain/?n=50&tag_idstr=rock&order=random_desc"
result = urlopen(query).read()
```

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$ python
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from isrock import isRock
query = "http://api.jamendo.com/get2/stream/track/
plain/?n=50&tag_idstr=rock&order=random_desc"
result = urlopen(query).read()
songs = result.split()
```

```
$ python
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from isrock import isRock
query = "http://api.jamendo.com/get2/stream/track/
plain/?n=50&tag_idstr=rock&order=random_desc"
result = urlopen(query).read()
songs = result.split()
rock = [isRock(song) for song in songs]
print "The ratio of rock songs is: %.2f" % (float
(rock.count(True))/len(songs))
```



#### Evaluating the genre recogniser

The code is included in the file c/jamendo\_1.py:

\$ python jamendo\_1.py

=» The ratio of rock
songs is: 0.58

#### Evaluating the genre recogniser

The code is included in the file c/jamendo\_1.py:

```
$ python jamendo_1.py
```

=» The ratio of rock
songs is: 0.58

The script **c/jamendo\_2.py** allows to specify the number of tests and multiple genres at once:

\$ python jamendo\_2.py 30 rock jazz country rnb

The result shows that the isRock recogniser **is not able** to distinguish Rock from other genres

#### Lessons learnt

Music data can easily be retrieved from the web

Thousands of songs can be downloaded for free

Songs in Jamendo already have a **genre label** attached, so you do not have to decide for one

Working with a web API simplifies the process

Different **musical objects** are available (songs, artists, albums, playlists, users) to work on

### QUESTIONS?

#2

## COMPARING LYRICS BY GENRE

#### The relevance of lyrics

#### Recent interest for lyrics-based analysis:

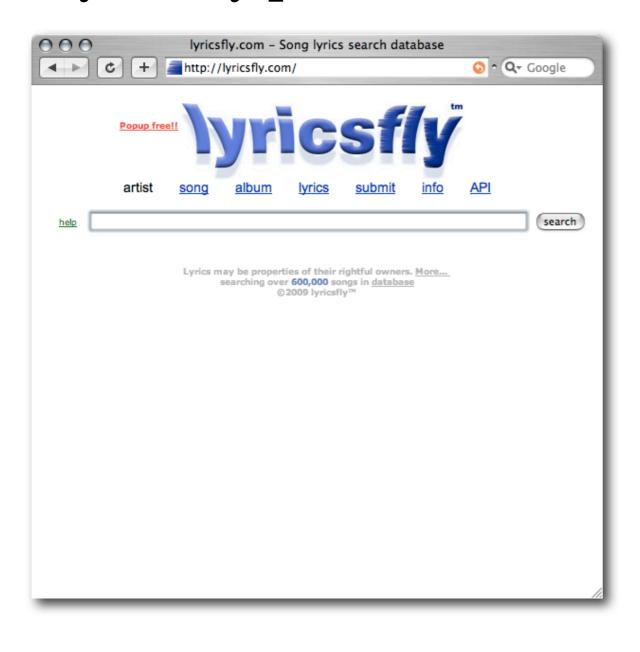
- 1. Knees, Schedl, Widmer, Multiple Lyrics Alignment: Automatic Retrieval of Song Lyrics, 2005
- 2. Geleijnse, Korst, Efficient Lyrics Extraction from the web, 2006
- 3. Kleedorfer, Knees, Pohle, Oh Oh Oh Whoah! Towards Automatic Topic Detection in Song Lyrics, 2008
- 4. Mayer, Neumayer, Rauber, Rhyme and Style Features for Musical Genre Categorisation By Song Lyrics, 2008

Lyrics were retrieved without using any web API

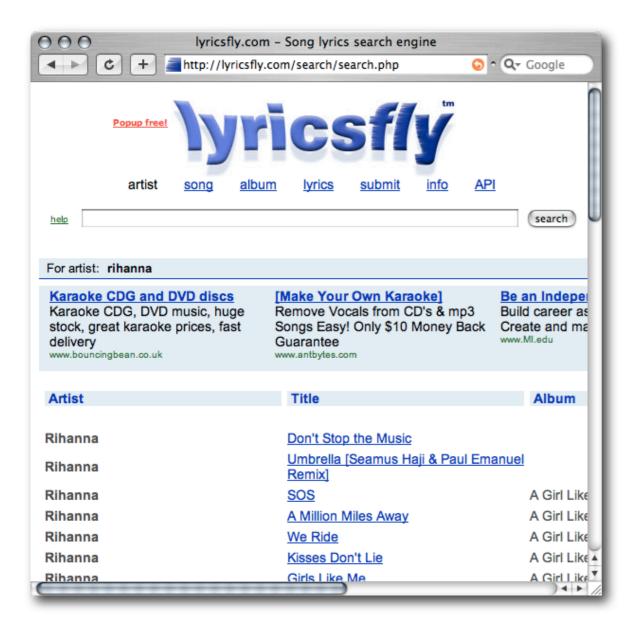
#### An online song lyrics database

Lyricsfly provides a web API to retrieve lyrics

# Lyricsfly provides a web API to retrieve lyrics



# Lyricsfly provides a web API to retrieve lyrics

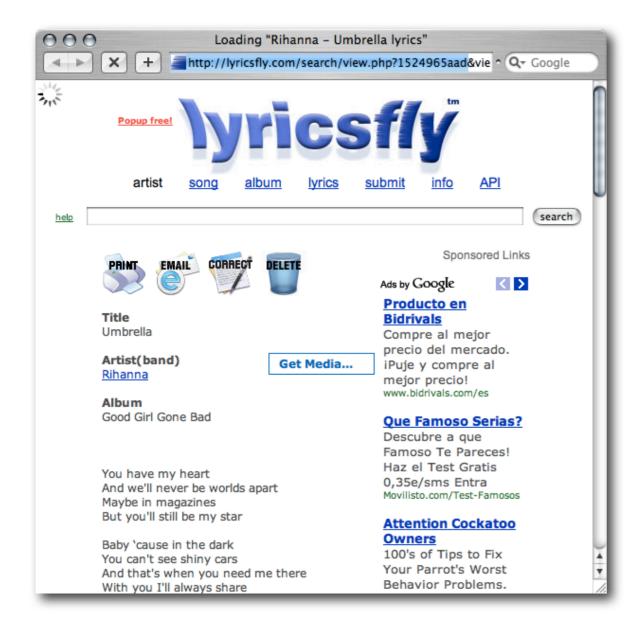


# Lyricsfly provides a web API to retrieve lyrics



lyricsfly.com/search/view.php? 1524965aad&view=578812

# Lyricsfly provides a web API to retrieve lyrics



Mozilla Firefox http://lyricsfly.com/api/api.php?i=260b56t ☆ ▼ This XML file does not appear to have any style information associated with it. The document tree is shown below. < < start> <status>300</status> <delay>5000</delay> <cs>4f9d750395</cs> <id>314589</id> <ar>Rihanna</ar> <tt>Umbrella</tt> <al>zzz n/a</al> <tx> You have my heart[br] And we'll never be worlds apart[br] Maybe in magazines[br] But you'll still be my star[br] [br] Baby 'cause in the dark[br] You can't see shiny cars[br] And that's when you need me there[br] With you I'll always share[br] Because[br] [br] When the sun shines, we'll shine together[br] Told you I'll be here forever[br] Said I'll always be a friend[br] Took an oath, I'ma stick it out till the end[br] [br] Now that it's raining more than ever[br] Know that we'll still have each other[br] You can stand under my umbrella[br] You can stand under my umbrella[br] [br] (Ella ella, eh eh eh)[br] Under my umbrella[br] (Ella ella, eh eh eh)[br] Under my umbrella[br] (Ella ella, eh eh eh)[br] Under my umbrella[br] (Ella ella, eh[br] lyricsfly.com free access weekly limited API temporary [br] eh eh, eh eh eh)[br] [br] These fancy things, will never come in bet... \*\*\* Your access is restricted to 30% of content. Please get permanent user ID key for 100% at lyricsfly.com/api/ \*\*\* [br] Lyrics delivered by lyricsfly.com

lyricsfly.com/search/view.php? 1524965aad&view=578812 lyricsfly.com/api/api.php?
i=KEY&a=Rihanna&t=Umbrella

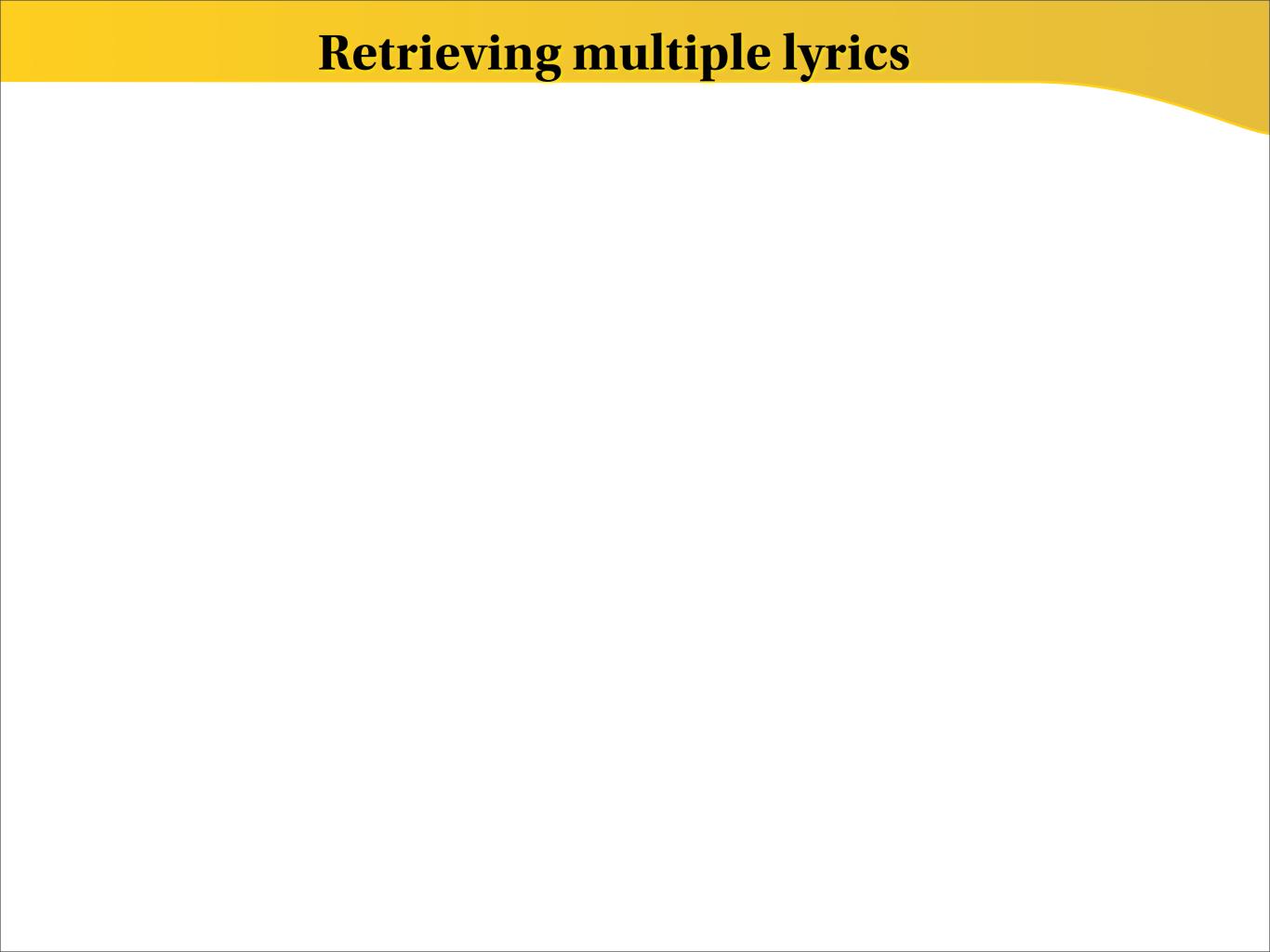
```
$ echo '$lyricsfly_key = "PASTE YOUR KEY
HERE"
```

```
$ irb
```

```
$ irb
require 'net/http'
require 'rexml/document'
require 'lyricsfly_key'
```

```
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require 'net/http'
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url = "http://lyricsfly.com/api/api.php?
a=Rihanna&t=Umbrella&i=#{$lyricsfly_key}"
result = Net::HTTP.get_response(URI.parse(url))
```

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require 'net/http'
require 'rexml/document'
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url = "http://lyricsfly.com/api/api.php?
a=Rihanna&t=Umbrella&i=#{$lyricsfly_key}"
result = Net::HTTP.get_response(URI.parse(url))
response = REXML::Document.new
(result.body).elements['//tx']
puts response.text
```



#### Retrieving multiple lyrics

The code is included in the file **c/lyricsfly\_1.py**:

```
$ ruby lyricsfly_1.rb
```

```
=> You have my heart[br]
And we'll never be ...
```

#### Retrieving multiple lyrics

The code is included in the file **c/lyricsfly\_1.py**:

```
$ ruby lyricsfly_1.rb
```

```
=>> You have my heart[br]
And we'll never be ...
```

The script **c/lyricsfly\_2.rb** allows to specify the artist name and track title:

```
$ ruby lyricsfly_2.rb
"John Lennon" Imagine
```

```
=>> Imagine there's no
Heaven
It's easy if you try
No Hell below us ...
```

# Lyrics-based analysis

Mayer, Neumayer, Rauber, Rhyme and Style Features for Musical Genre Categorisation By Song Lyrics, 2008



Textual features of lyrics are related to the genre

Hip-hop lyrics have more '?' than Country ones

Evaluated on 29 Hip-hop and 41 Country songs

Does this hold with larger data sets?

'Country' and 'Hip-hop'



music web API #1



List songs by genre



music web API #2





'Country' and 'Hip-hop'



music web API #1



List songs by genre



music web API #2





'Country' and 'Hip-hop'



music web API #1



List songs by genre



music web API #2





'Country' and 'Hip-hop'



music web API #1



List **songs** by genre



music web API #2

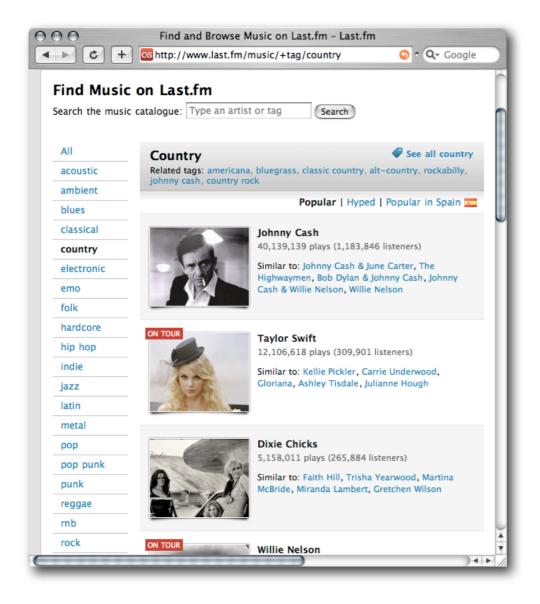


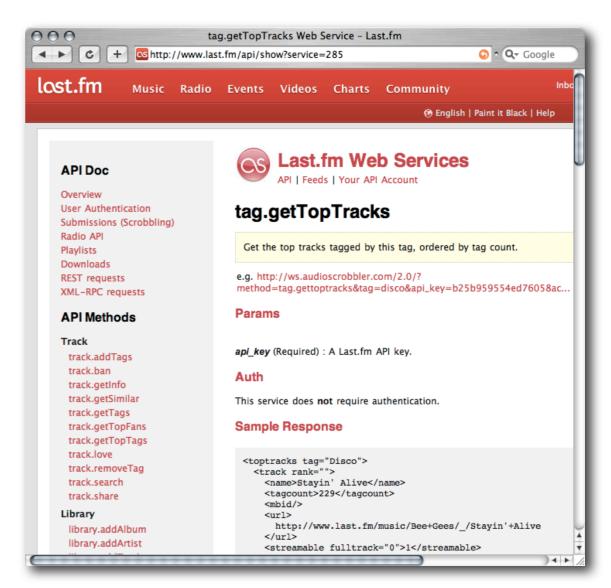




Last.fm has 4M songs classified by tags/genres

# Last.fm has 4M songs classified by tags/genres

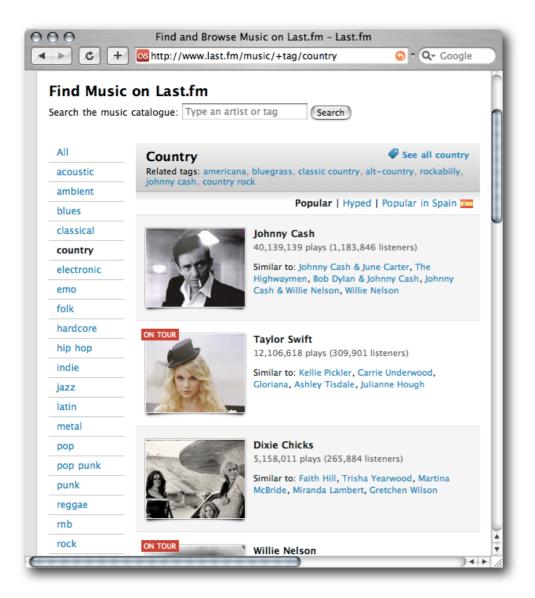




last.fm/music/+tag/country

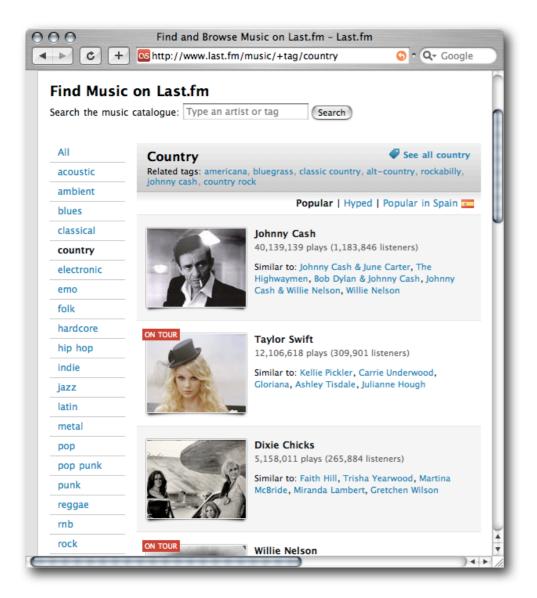
last.fm/api/show?service=285

# Last.fm has 4M songs classified by tags/genres



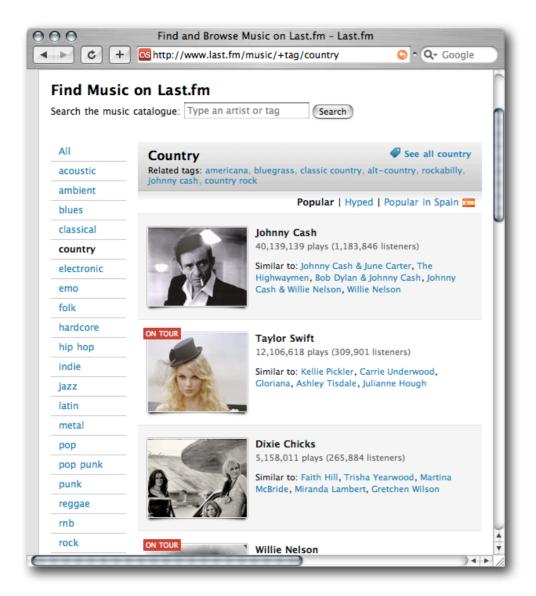
last.fm/music/+tag/country

# Last.fm has 4M songs classified by tags/genres



last.fm/music/+tag/country

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last.fm/music/+tag/country

```
000
                                           Mozilla Firefox
                                                                                                C X ( Material / Wes. audioscrobbler.com/2.0/?method=tag.gettopt ☆ ▼  GoogleQ
This XML file does not appear to have any style information associated with it. The document tree is shown
below.
- <lfm status="ok">
 - <toptracks tag="Disco">
    - <track rank="1">
        <name>Dancing Queen</name>
        <tagcount>100</tagcount>
        <url>http://www.last.fm/music/ABBA/_/Dancing+Queen</url>
        <streamable fulltrack="0">1</streamable>
      - <artist>
          <name>ABBA</name>
          <mbid>d87e52c5-bb8d-4da8-b941-9f4928627dc8</mbid>
          <url>http://www.last.fm/music/ABBA</url>
        </artist>
        <image size="small">http://userserve-ak.last.fm/serve/34s/8674393.jpg</image>
        <image size="medium">http://userserve-ak.last.fm/serve/64s/8674393.jpg</image>
        <image size="large">http://userserve-ak.last.fm/serve/126/8674393.jpg</image>
      - <image size="extralarge">
          http://userserve-ak.last.fm/serve/300x300/8674393.jpg
        </image>
     </track>
    - <track rank="2">
        <name>I Will Survive</name>
        <tagcount>99</tagcount>
        <mbid/>
         http://www.last.fm/music/Gloria+Gaynor/_/I+Will+Survive
        <streamable fulltrack="0">1</streamable>
```

ws.audioscrobbler.com/2.0/?
method=tag.gettoptracks&
tag=disco& api\_key=*KEY* 

# Combining two music web APIs

The code is included in the file **c/lyricsfly\_3.rb**:

```
require 'net/http'
require 'rexml/document'
require "#{File.dirname(__FILE__)}/lyricsfly_key"
require "#{File.dirname(__FILE__)}/lastfm_key"
def get_lyrics(artist_and_title)
 artist, title = artist_and_title.collect{|arg|
   arg.gsub(/[^a-zA-Z0-9]/,'%25')}
 url = "http://lyricsfly.com/api/api.php?"
 url += "a=#{artist}&t=#{title}&i=#{$lyricsfly_key}"
  result = Net::HTTP.get_response(URI.parse(url))
  response = REXML::Document.new(result.body).elements['//tx']
  response.text.gsub("[br]", "") unless response.nil?
end
```

# Combining two music web APIs

```
def get_artists_and_titles(genre)
 url = "http://ws.audioscrobbler.com/2.0/?method="
 url += "tag.gettoptracks&tag=#{genre}&api_key=#{$lastfm_key}"
 result = Net::HTTP.get_response(URI.parse(url))
 response = REXML::Document.new(result.body)
 response.elements.collect('//track') do Itrack| [
   track.elements['artist'].elements['name'].text,
track.elements['name'].text ] end unless response.nil?
end
ARGV.each do Igenrel
  tracks = get_artists_and_titles(genre)
  lyrics = tracks.collect{Itrack| get_lyrics(track)}.compact
  qm = lyrics.inject(0.0) { | qm, lyric| qm + lyric.count("?") }
  p "#{genre} avg question marks: %.2f" % (qm/lyrics.length)
end
```

Finally: \$ ruby lyricsfly\_3.rb country hip-hop

#### Lessons learnt

Hip-hop lyrics have more "?" than Country ones

Any **programming language** with libraries to retrieve pages and parse XML can do the work

Data from different web APIs can be aggregated

A mash-up application can uncover hidden musical relationships among different domains

# From instance to concept

There is no limit to the chain of API calls

To connect even more resources, **unique identifiers** work better than ambiguous *names* 

Many web sites identify musical objects through a specific set of **Musicbrainz IDs** which allow to easily match the same item in multiple places

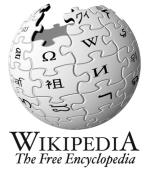










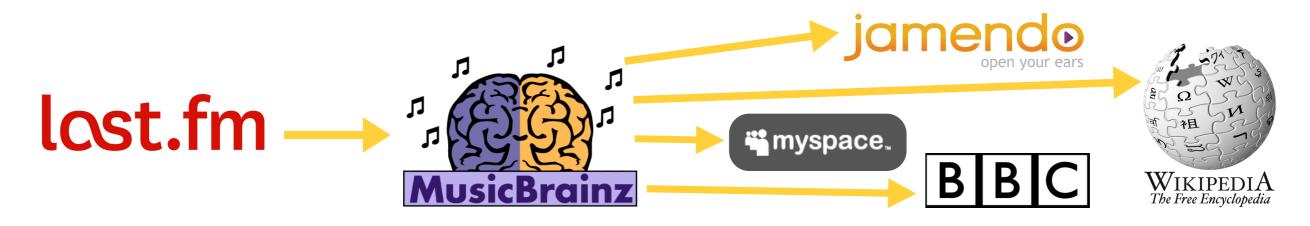


#### From instance to concept

There is no limit to the chain of API calls

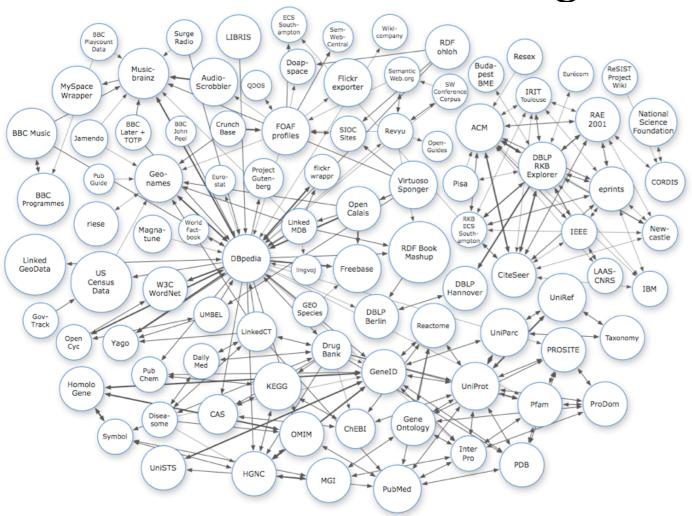
To connect even more resources, **unique identifiers** work better than ambiguous *names* 

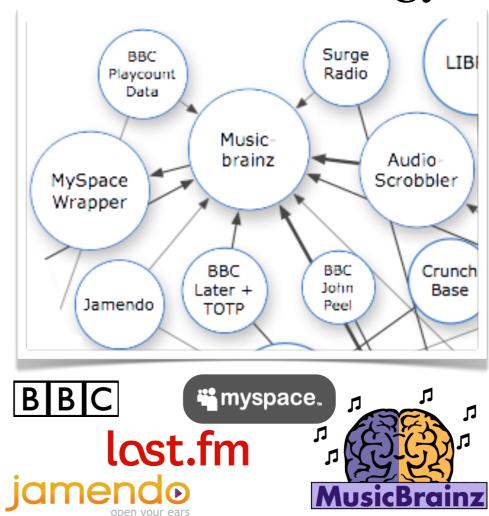
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# Music and web ontologies

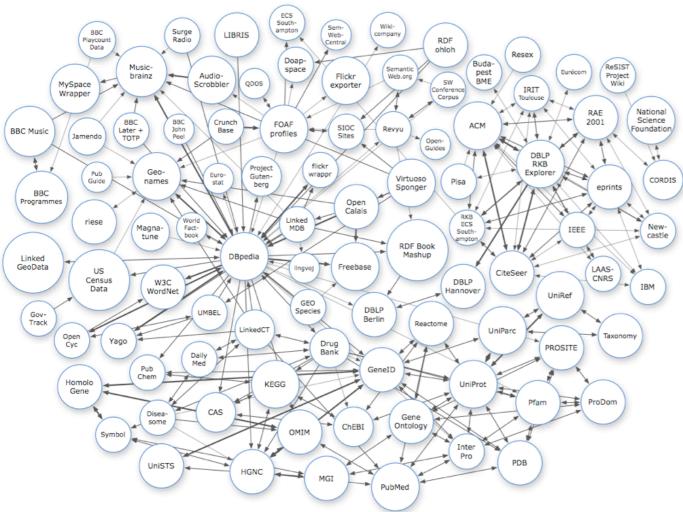
The **Linking Open Data** project is a prominent attempt at expressing and **connecting objects** of different domains using **semantic web** technology



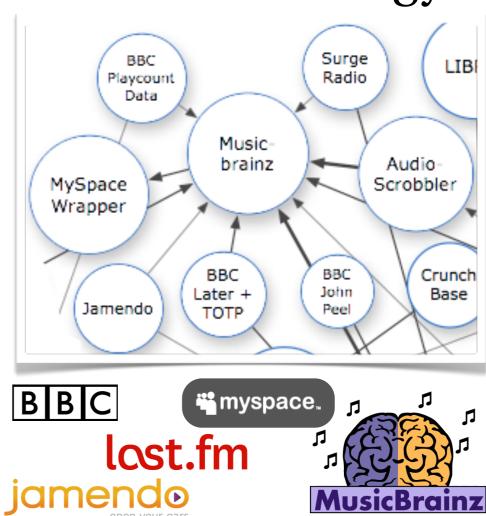


# Music and web ontologies

The **Linking Open Data** project is a prominent attempt at expressing and **connecting objects** of different domains using **semantic web** technology



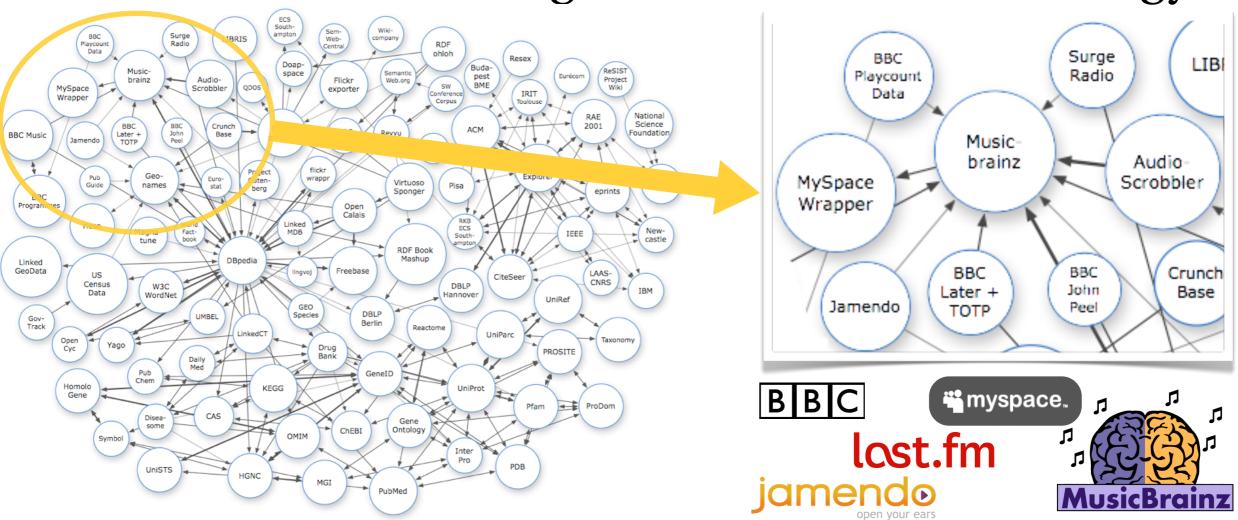
linkeddata.org



musicontology.com

# Music and web ontologies

The Linking Open Data project is a prominent attempt at expressing and connecting objects of different domains using semantic web technology



linkeddata.org

sameas.org musicontology.com

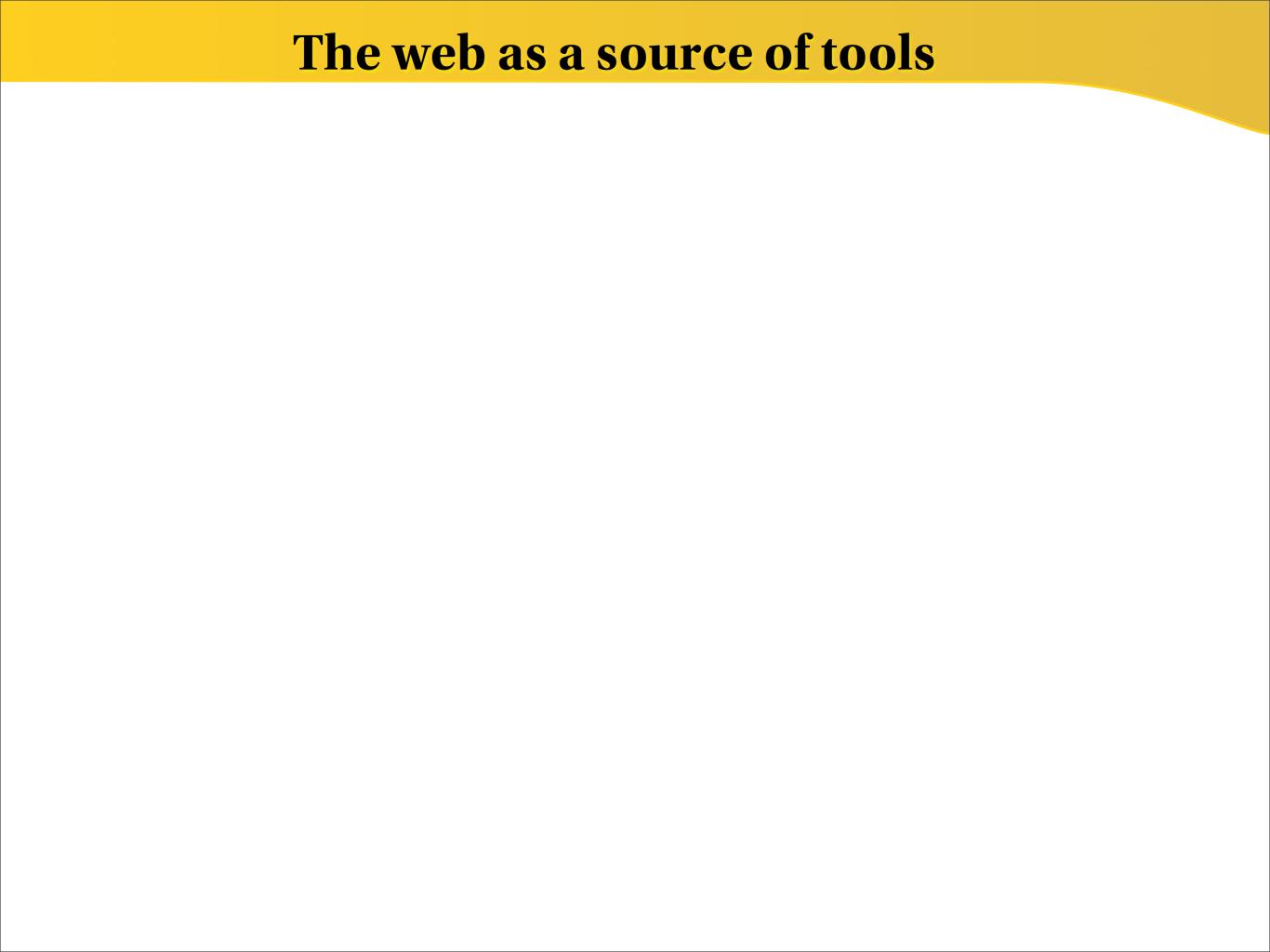
# QUESTIONS?

# First break 10 minutes

- \$ wget http://peak.telecommunity.com/dist/ez\_setup.py
- \$ sudo python ez\_setup.py
- \$ easy\_install pylast

#3

# PERFORMING AUDIO ANALYSIS

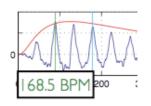


How do you extract acoustic features of a song?

## How do you extract acoustic features of a song?

1. Write your own code:

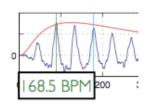




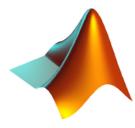
## How do you extract acoustic features of a song?

1. Write your own code:





2. Use a software package:



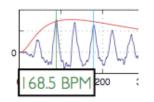




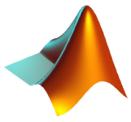
## How do you extract acoustic features of a song?

1. Write your own code:





2. Use a software package:







3. Retrieve from a web site:



echonest.com/analyze

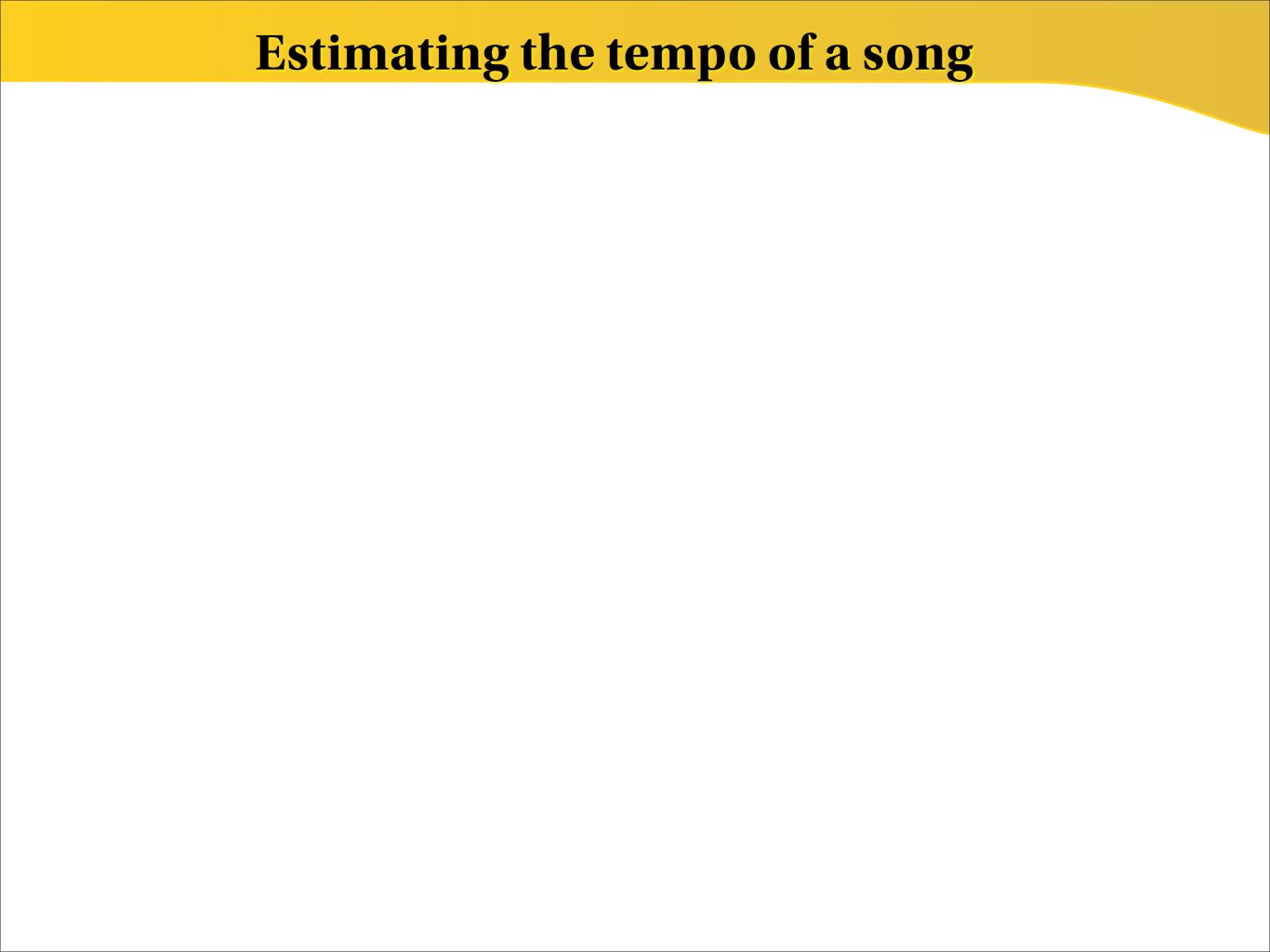
analyze

Analyze any song and output an XML 'musical score for computers.'

RHYTHM: time signature, beats, onsets, loudness

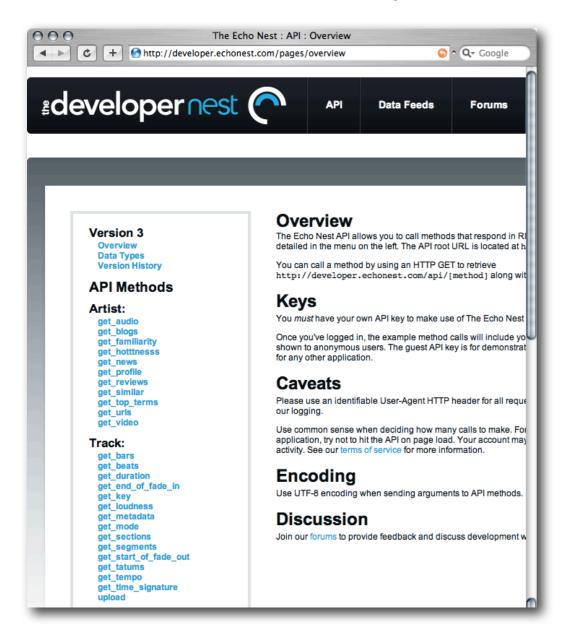
PITCH: key, harmony, melody

TIMBRE: sound color, spectral surface



#### Estimating the tempo of a song

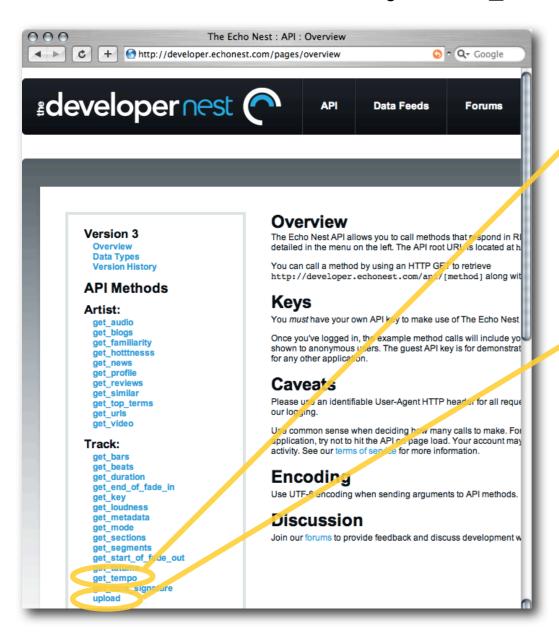
#### Acoustic analysis performed through a web API:



developer.echonest.com/ pages/overview

#### Estimating the tempo of a song

#### Acoustic analysis performed through a web API:



- upload: 'Upload a track to The Echo Nest's analyzer for analysis and later retrieval of track information'
- get\_tempo: 'Retrieve the overall estimated tempo of a track in beats per minute after previously calling for analysis via upload'

developer.echonest.com/ pages/overview

**Authentication** is required

```
$ irb
```

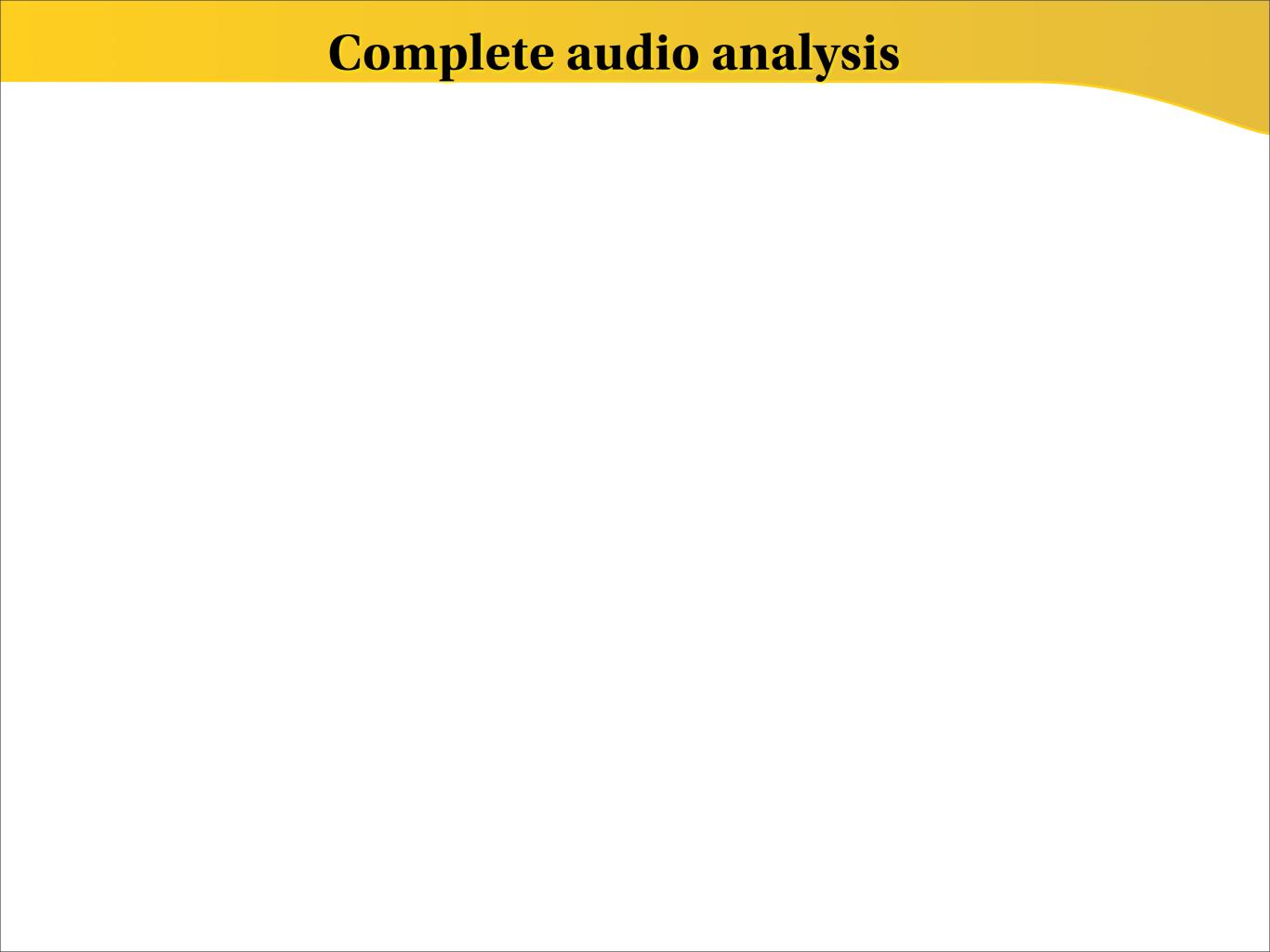
```
$ irb
require 'net/http'
require 'rexml/document'
require 'echonest_key'
```

```
$ irb
require 'net/http'
require 'rexml/document'
require 'echonest_key'
song = 'http://ismir2009.benfields.net/m/120bpm.mp3'
url= 'http://developer.echonest.com/api/upload'
result = Net::HTTP.post_form(URI.parse(url),
{'api_key' => $echonest_key, 'version' => '3',
'url' => song})
```

```
song_id = REXML::Document.new
(result.body).elements['//track'].attributes['id']
```

```
song_id = REXML::Document.new
(result.body).elements['//track'].attributes['id']
url = 'http://developer.echonest.com/api/get_tempo'
url+= "?id=#{song_id}"
url+= "&version=3&api_key=#{$echonest_key}"
result = Net::HTTP.get_response(URI.parse(url))
```

```
song_id = REXML::Document.new
(result.body).elements['//track'].attributes['id']
url = 'http://developer.echonest.com/api/get_tempo'
url+= "?id=#{song_id}"
url+= "&version=3&api_key=#{$echonest_key}"
result = Net::HTTP.get_response(URI.parse(url))
tempo = REXML::Document.new(result.body).elements
['//tempo'].text
puts "The estimated tempo is #{tempo} BPM"
```



#### Complete audio analysis

The code is included in the file **c/echonest\_1.rb**:

```
$ ruby echonest_1.rb
=>> The estimated tempo
is 120.013 BPM
```

#### Complete audio analysis

The code is included in the file **c/echonest\_1.rb**:

```
$ ruby echonest_1.rb
```

```
=» The estimated tempo
is 120.013 BPM
```

The script **c/echonest\_2.rb** allows to specify the track location and estimates more features:

```
$ ruby echonest_2.rb
http://
ismir2009.benfields.net
/m/120bpm.mp3
```

```
"time_signature"=> 4,
"mode"=> 1, "key"=> 5,
"tempo"=> 120

developer.echonest.com/
forums/thread/9
```

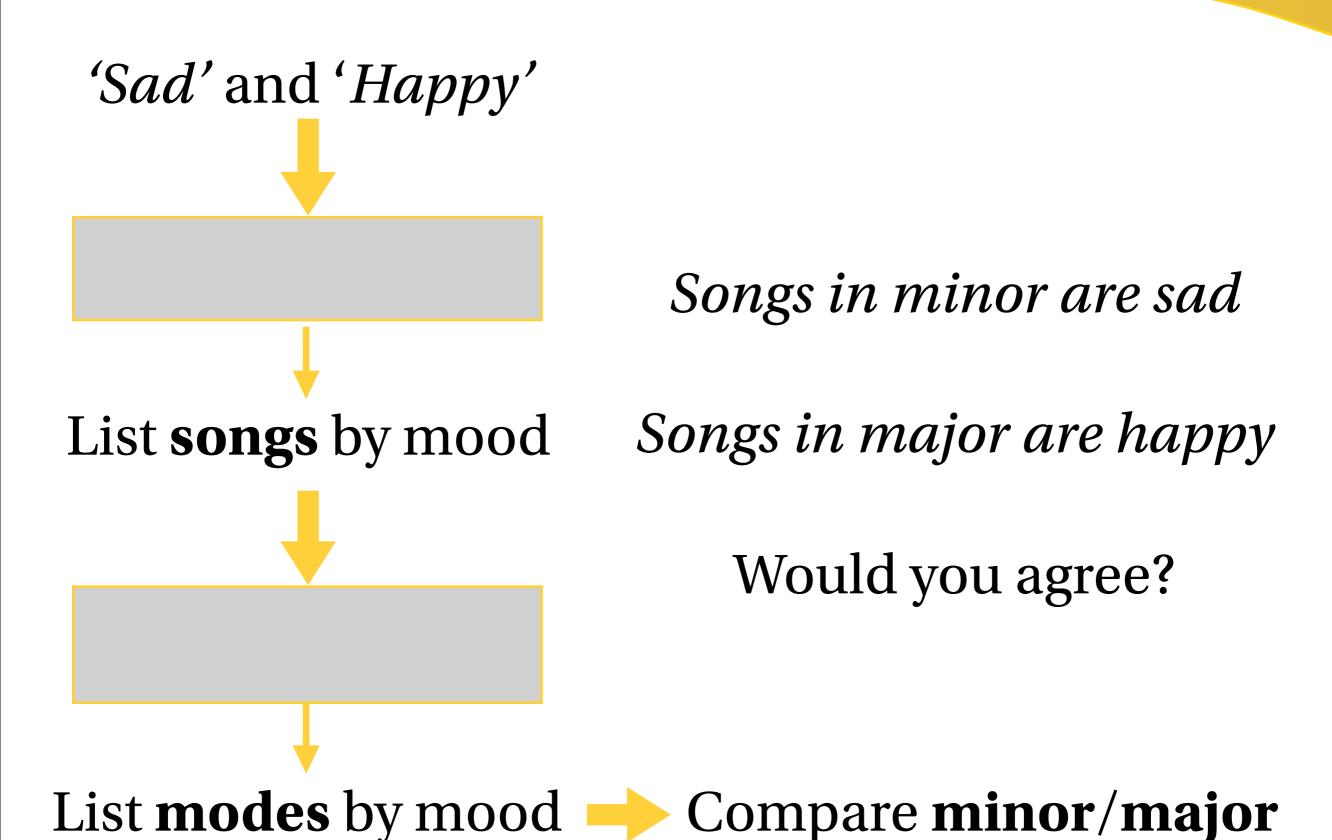
#### Minor/major vs. sad/happy

Songs in minor are sad

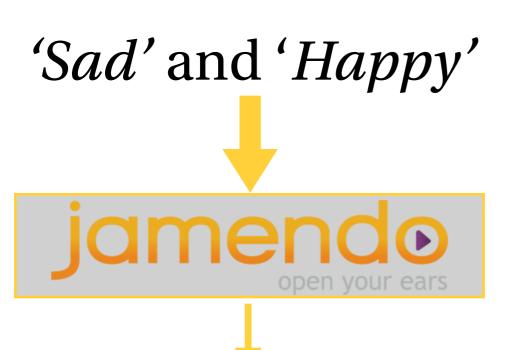
Songs in major are happy

Would you agree?

#### Minor/major vs. sad/happy



#### Minor/major vs. sad/happy



Songs in minor are sad

List **songs** by mood

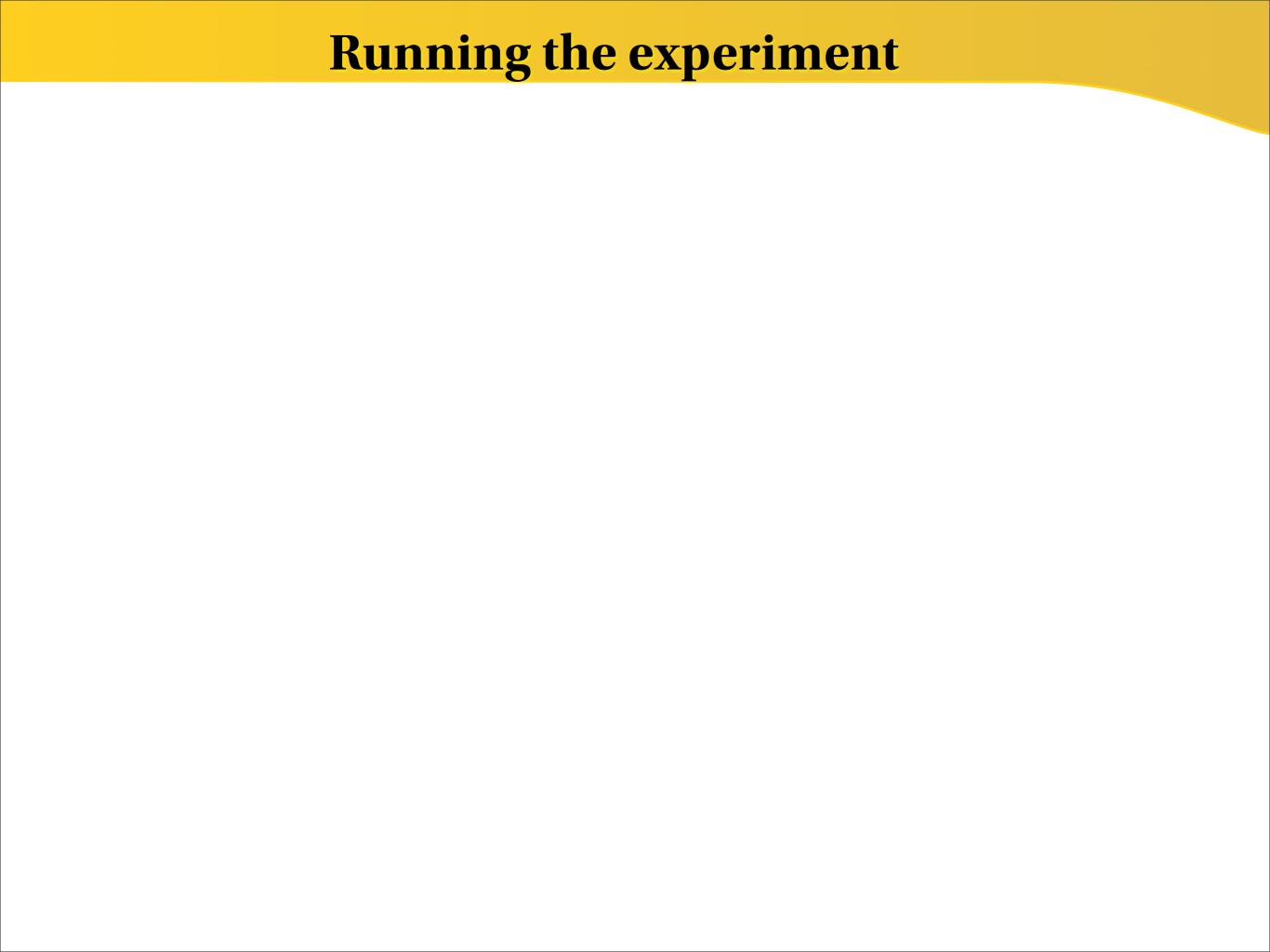
Songs in major are happy



Would you agree?



List **modes** by mood — Compare **minor/major** 



#### Running the experiment

The code is included in the file **c/echonest\_3.rb**:

\$ ruby echonest\_3.rb sad happy

sad songs are 0.25 major, 0.75 minor happy songs are 1.00 major, 0.00 minor

#### Running the experiment

The code is included in the file **c/echonest\_3.rb**:

\$ ruby echonest\_3.rb sad happy

sad songs are 0.25 major, 0.75 minor happy songs are 1.00 major, 0.00 minor

Repeating the experiment with more songs can serve as a proper **evaluation** of the statement

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sad songs are 0.25 major, 0.75 minor happy songs are 1.00 major, 0.00 minor

Repeating the experiment with more songs can serve as a proper **evaluation** of the statement

Do not submit too many simultaneous queries!

#### Advanced echonest-ing

Even DJs can use web-based tools to remix

The echonest python wrapper is available here:

code.google.com/p/echo-nest-remix/

See it in action at donkdj.com (an autoremixer)

#### Lessons learnt

The web makes available both musical data and tools for acoustic analysis

Symbolic analysis not available... yet?

The future of music software is on the web

# QUESTIONS?



# REVEALING TIRENDS

#### What is trendy?

"Trend" is related to a specific time and context

Anything that is **rapidly** becoming famous in **your** environment (your friends, your location, ...)

Mavens are the first to pick up on nascent trends

Music example: which **artists** should you now be listening to, to keep up with the **latest trends**?





your friends











your friends









Last month they mostly listened to:











your friends









Last month they mostly listened to:









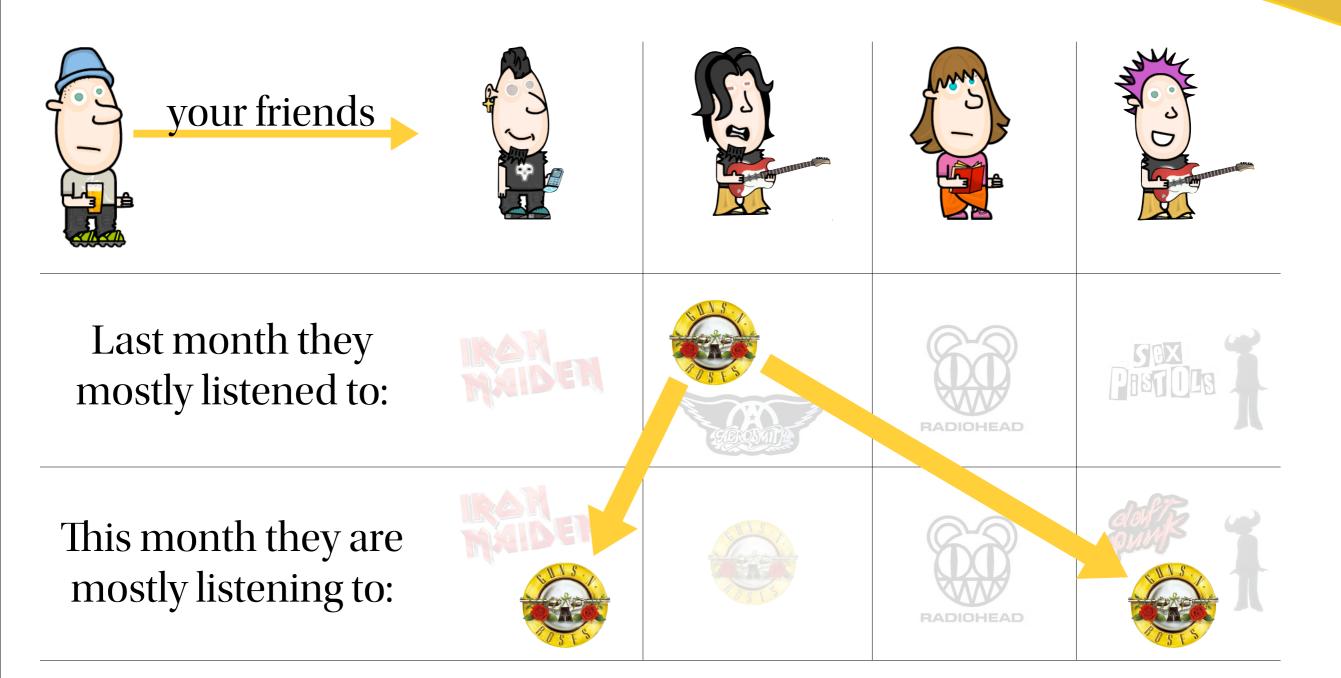
This month they are mostly listening to:











This kind of information can be retrieved from music-related web communities such as Last.fm

#### Hiding API calls with wrappers

Last.fm provides for each user the **list of friends** and the **most played** artists in a given period

These data can be retrieved via Last.fm API or, more easily, using the Python **wrapper** *pylast*, available at <u>code.google.com/p/pylast</u> which can be installed through *easy\_install*:

- \$ wget http://peak.telecommunity.com/dist/ez\_setup.py
- \$ sudo python ez\_setup.py
- \$ easy\_install pylast

API wrappers **abstract** the functions that make HTTP calls to send and receive information

API wrappers **abstract** the functions that make HTTP calls to send and receive information

```
$ python
```

API wrappers **abstract** the functions that make HTTP calls to send and receive information

```
$ python
import pylast
from lastfm_key import lastfm_key
```

API wrappers **abstract** the functions that make HTTP calls to send and receive information

```
$ python
import pylast
from lastfm_key import lastfm_key
api = pylast.get_lastfm_network(lastfm_key)
friends = api.get_user("claudiob").get_friends()
print "Last.fm friends: %s" % friends
```



#### Extracting trendy artists of the month

#### To reveal which artists a user should listen to:

- 1. Retrieve the list of friends of that user
- 2. Retrieve the most played artists by the friends during this and the previous month, printing those who have 'grown' more in this period while excluding artists the user is already aware of

#### Extracting trendy artists of the month

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#### The code is included in the file **c/lastfm\_2.py**:

- \$ python lastfm\_2.py claudiob
- =» Trendy artists for claudiob:
- 1) Amy Winehouse, already known by daddyrho, recently discovered by kobra\_cccpozzi, pilomatic, econ-luca, ...

#### Lessons learnt

Social data from the web helps uncover trends

Data for trends imply a **temporal** dimension, a **context** (friends, geographical location, ...) and a **class** of objects (artists, tracks, ...) to observe

More **transparent** and 'human' than using collaborative filtering for recommendations

API wrappers shorten and clear up the code

## QUESTIONS?

- \$ wget http://github.com/soundcloud/python-api-wrapper/tarball/ master -0 scapi.tar.gz
- \$ gunzip < scapi.tar.gz | tar xvf -</pre>

- \$ wget http://github.com/soundcloud/python-api-wrapper/tarball/ master -0 scapi.tar.gz
- \$ gunzip < scapi.tar.gz | tar xvf -</pre>
- \$ cd soundcloud-python-api-wrapper-d34be69

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- \$ gunzip < scapi.tar.gz | tar xvf -</pre>
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- \$ cd soundcloud-python-api-wrapper-d34be69
- \$ sudo python setup.py install
- \$ easy\_install python-igraph

#5

# CAPTURING SOCIAL DATA

#### Social networks for musicians

### Web sites for musician-to-musician networking





- 1. Grant access to an artist's public music
- 2. Record **relationships** among musicians in the same network
- 3. Provide social data in the domain of music

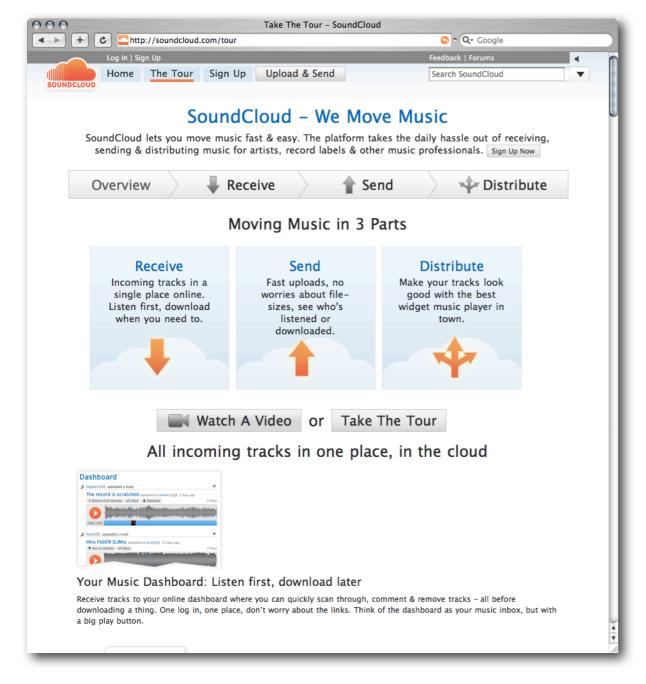
Can be very useful for music informatics

#### A different kind of musical resource

SoundCloud, an advanced music-sharing platform

#### A different kind of musical resource

### SoundCloud, an advanced music-sharing platform



your user has access to can be accessed through this console. You can however not write to resources here.

Table of Interesting Things:

Loading ...

Introduction

Start by choosing a preset URI or by entering one on your own. Then select the format in which you wish to get your response, we support both XML and JSON. Then just press the "Call on me"-button to send the request to the API. If you choose among the preset URI:s, a small guide to that resource will show up. All examples are marked like this:

/users/

All parameters that are replaceable with own values are marked:

/users/{user-permalink}/favorites

Under Collection you will find extra functionality available for collections such as filtering, ordering and intervals.

URI

Format

Json

Call on me

Body

API Console - SoundCloud

Home The Tour Sign Up Upload & Send

This console is an easy way to get started with our API and see how it responds. Check out

the resources available and prototype your application in a really simple way. All resources

Q → Google

+ C http://soundcloud.com/api/console

**API** Console

soundcloud.com

soundcloud.com/api/console



### Install the Python wrapper for SoundCloud API:

```
$ wget http://github.com/soundcloud/python-api-wrapper/tarball/
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$ gunzip < scapi.tar.gz | tar xvf -</pre>
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master -0 scapi.tar.gz
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$ cd soundcloud-python-api-wrapper-d34be69
$ sudo python setup.py install</pre>
```

#### Code is included in the file **c/soundcloud\_1.py**:

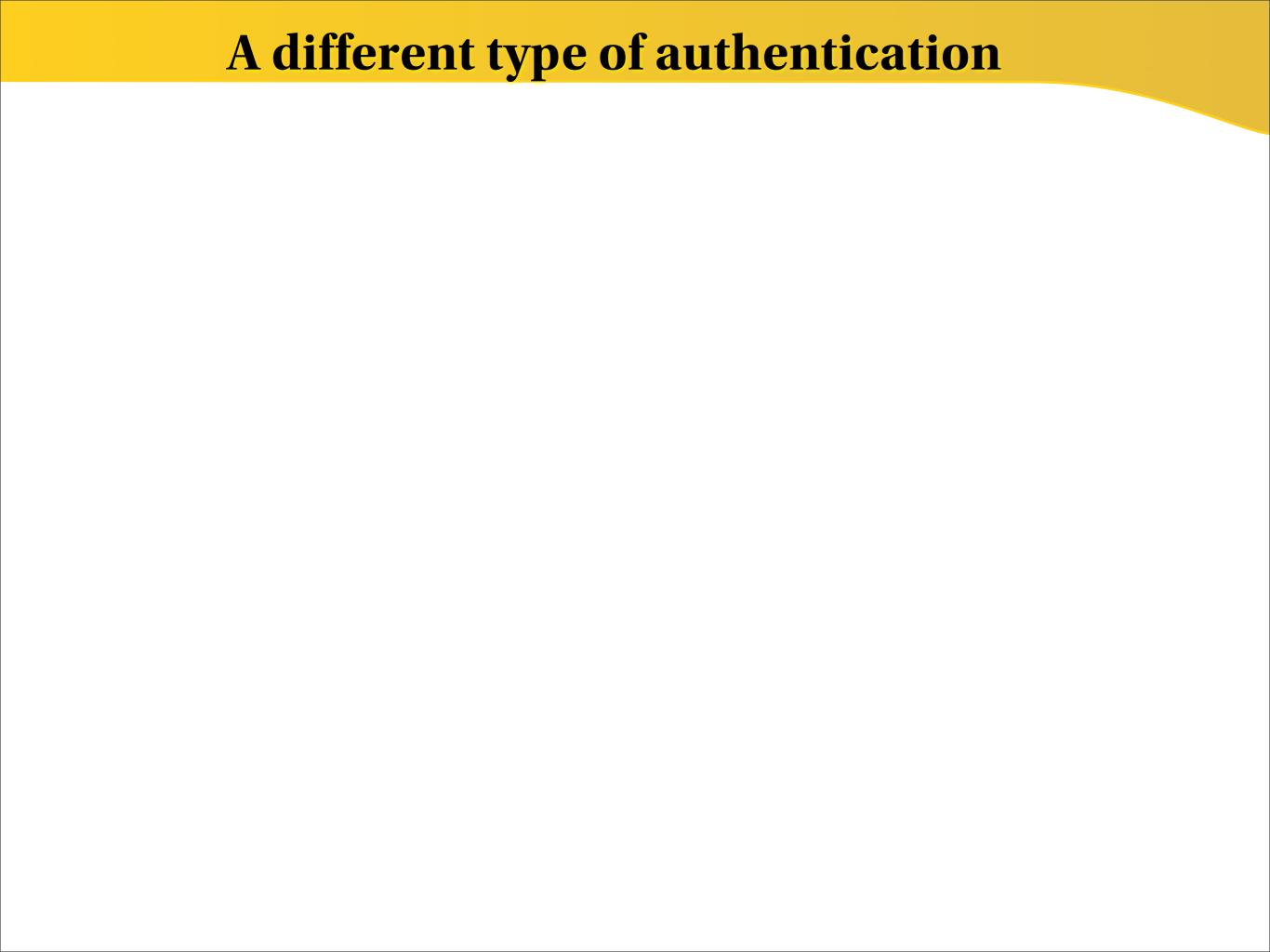
```
import scapi
from soundcloud_oauth import init_scope
root = init_scope()
user = root.users("bfields")
for friend in user.followings():
```

### Install the Python wrapper for SoundCloud API:

```
$ wget http://github.com/soundcloud/python-api-wrapper/tarball/
master -0 scapi.tar.gz
$ gunzip < scapi.tar.gz | tar xvf -
$ cd soundcloud-python-api-wrapper-d34be69
$ sudo python setup.py install</pre>
```

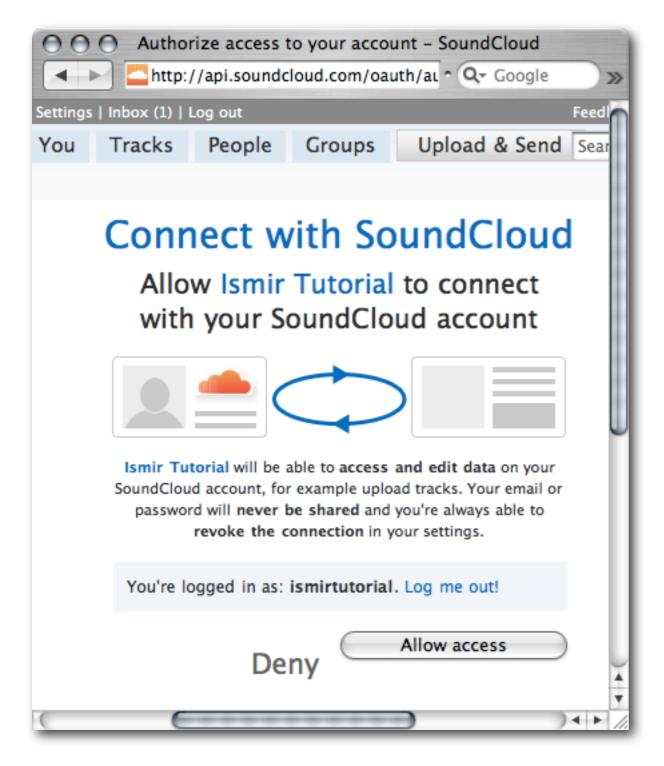
#### Code is included in the file **c/soundcloud\_1.py**:

```
import scapi
from soundcloud_oauth import init_scope
root = init_scope()
user = root.users("bfields")
for friend in user.followings():
    print "Following %s" % friend["username"]
```



#### A different type of authentication

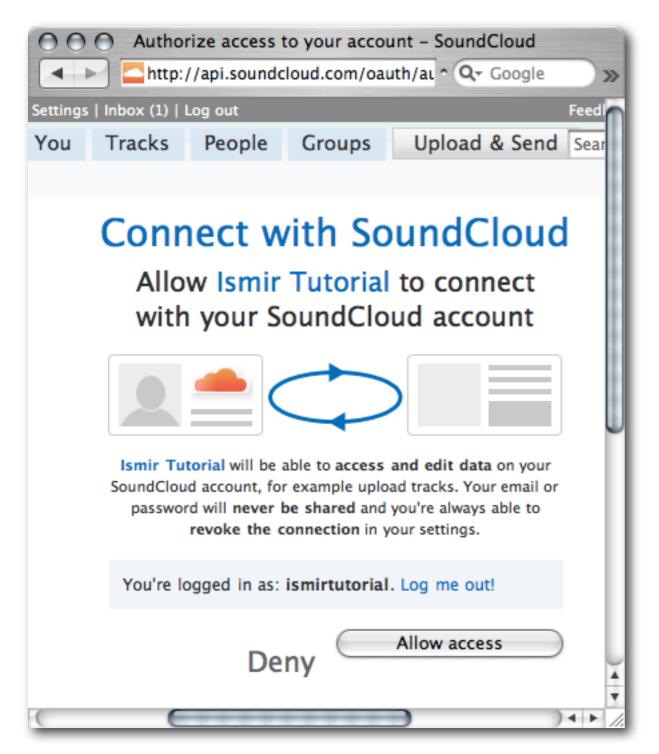
SoundCloud authenticates with **OAuth** protocol:



c/soundcloud\_1.py
runs the full protocol

#### A different type of authentication

SoundCloud authenticates with **OAuth** protocol:



c/soundcloud\_1.py
runs the full protocol

c/soundcloud\_2.py
includes a valid token
only for this application

\$ python soundcloud\_2.py

=>> bfields is following:
Forss, atl, stunna, ...

\$ easy\_install python-igraph

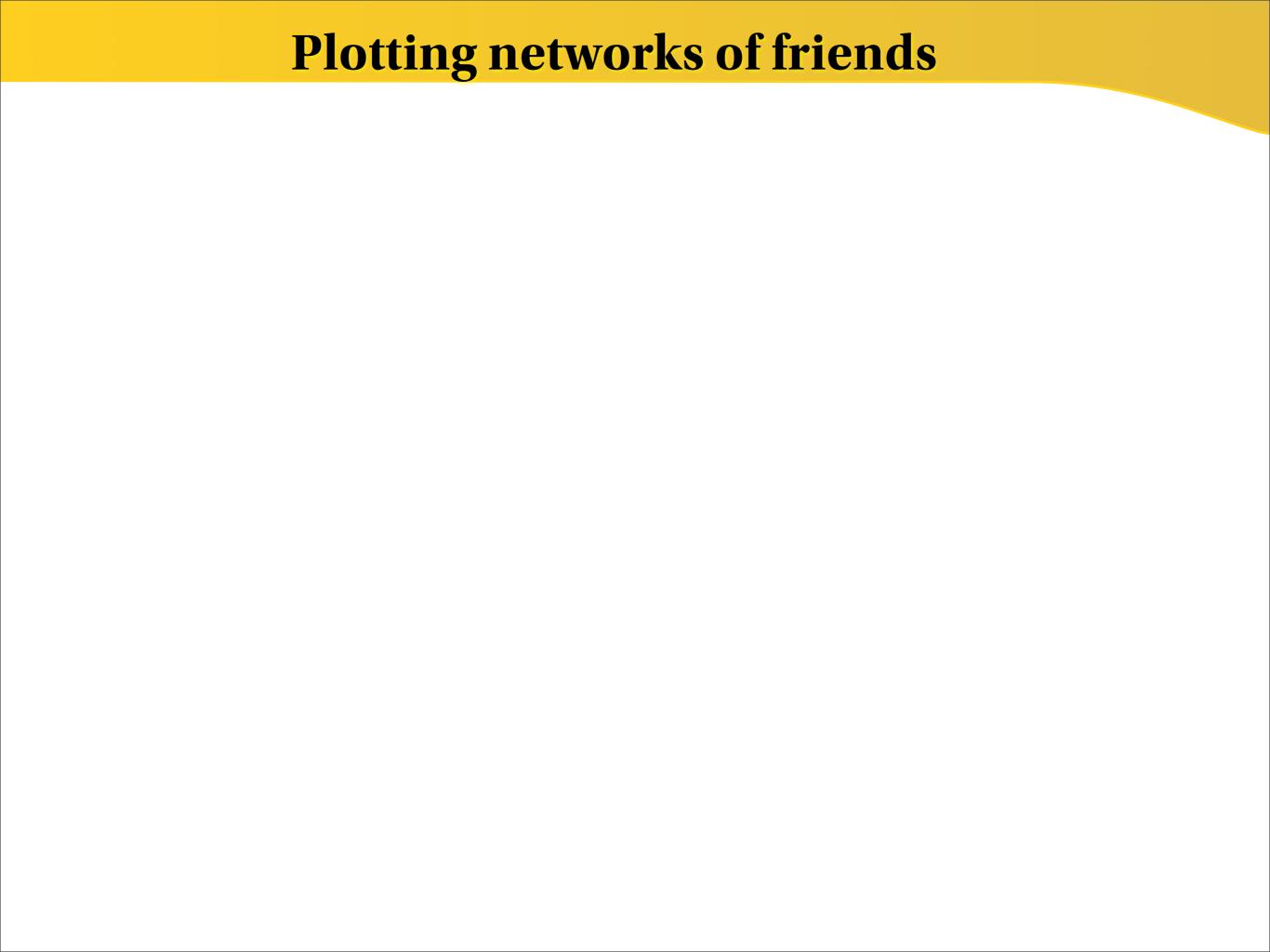
Install the **igraph** library from **igraph.sf.net/ download.html** and the Python **wrapper**:

```
$ easy_install python-igraph
```

and test by drawing a simple graph into a file:

```
$ python
import igraph
g = igraph.Graph(n=2, edges=[(0,1)])
g.write_svg("test.svg", g.layout("kk"))

[test.svg]
```



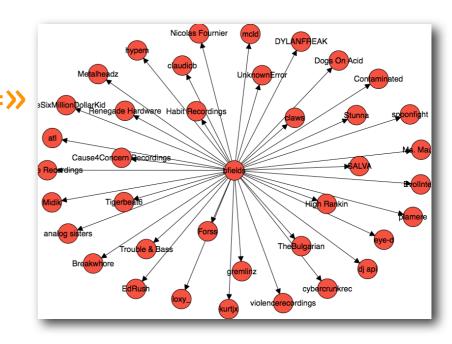
#### The code included in the file c/soundcloud\_3.py:

- 1. Adds a *vertex* for a given seed **user**
- 2. Gets from SoundCloud the list of people the user "follows"
- 3. For each of these persons:
  - Recursively restart from 1. until the desired level of depth
  - Adds an edge to connect the person to the seed user

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\$ python soundcloud\_3.py bfields 2



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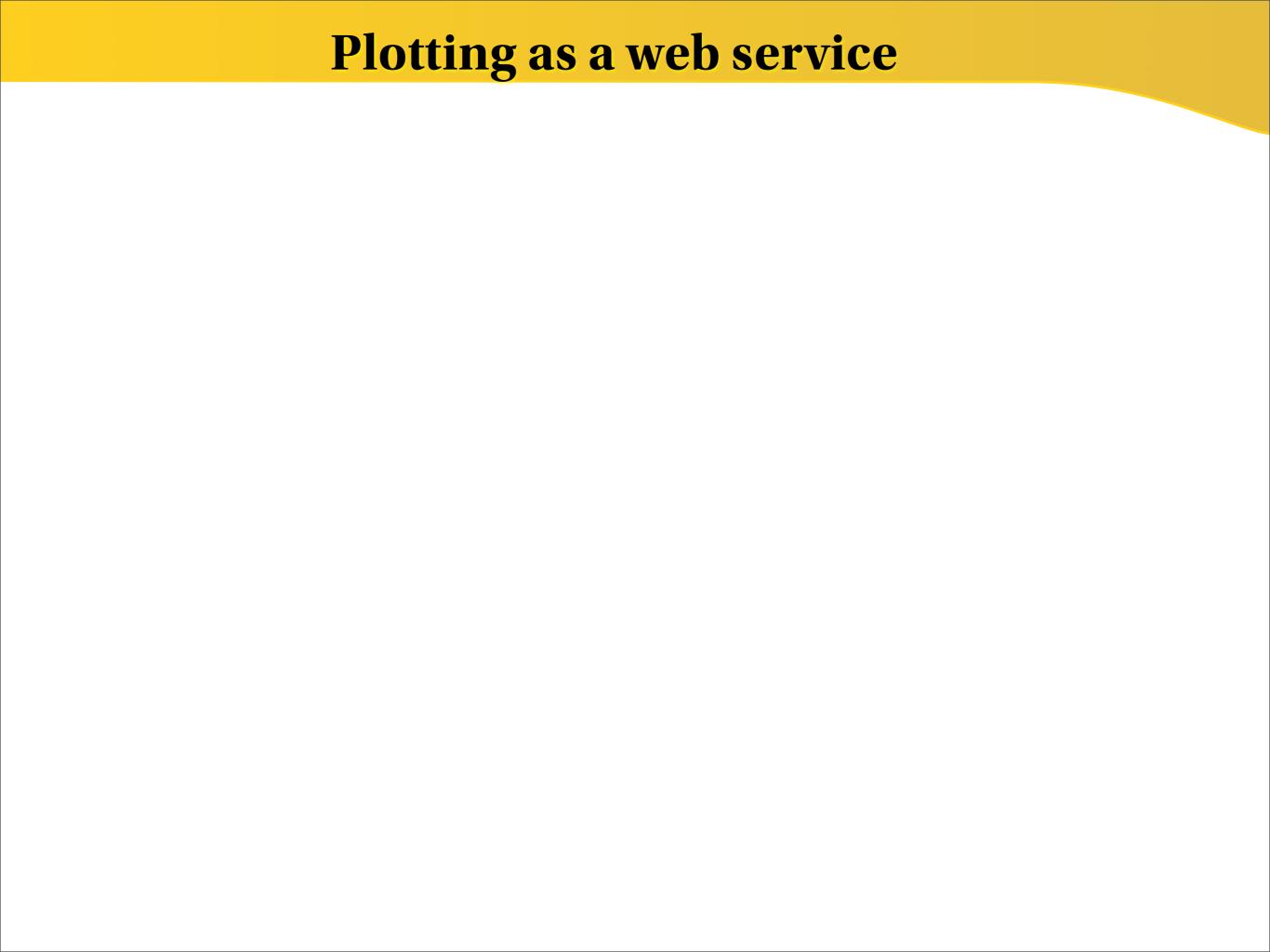
- 1. Adds a *vertex* for a given seed **user**
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Digita Digita Supplication of the property of

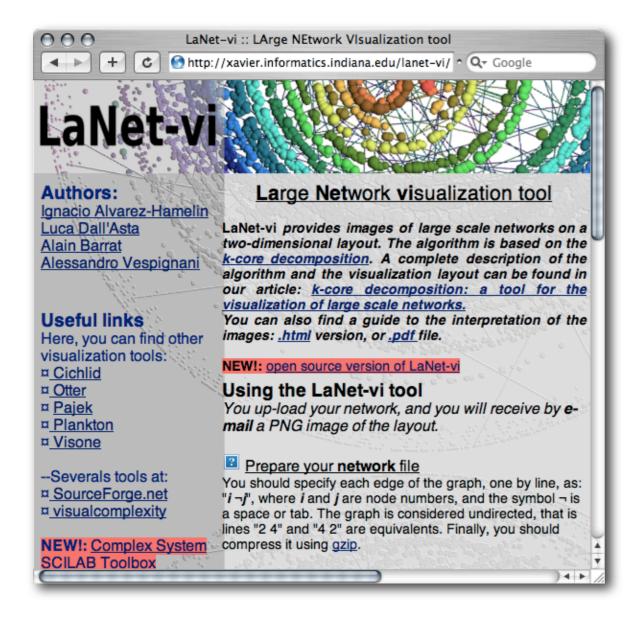
\$ python soundcloud\_3.py bfields 3



How to plot a snapshot of the full network?

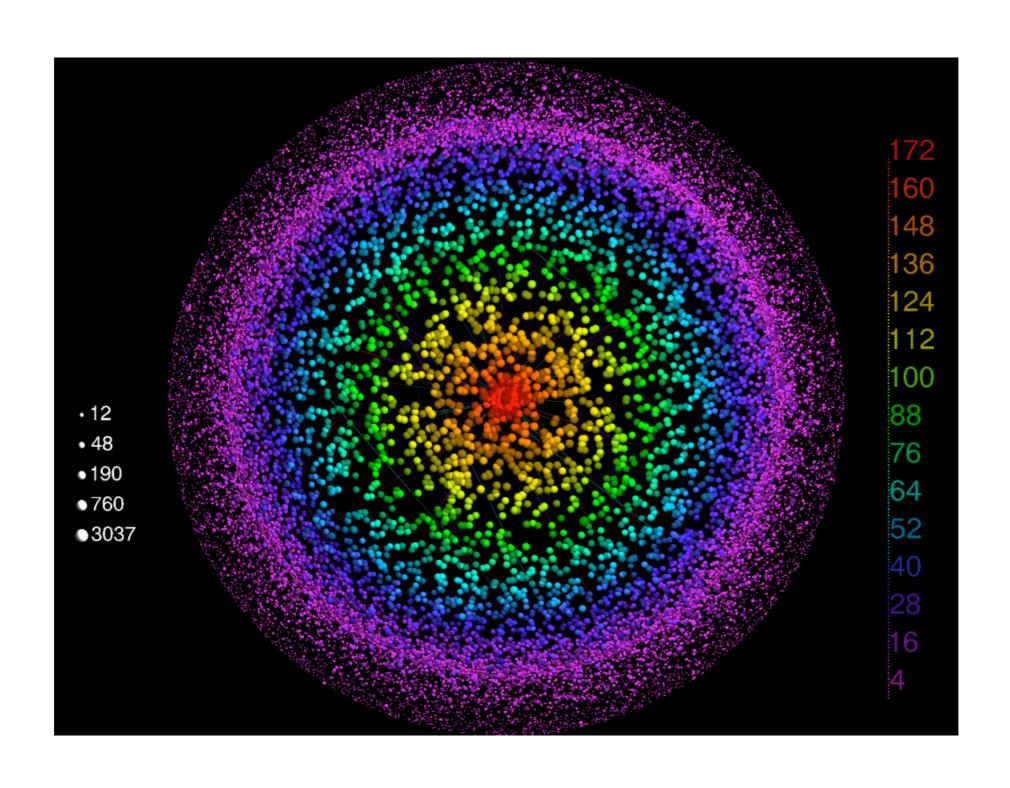
c/soundcloud\_4.py
collects the full network
of SoundCloud friends
(takes a long time!)

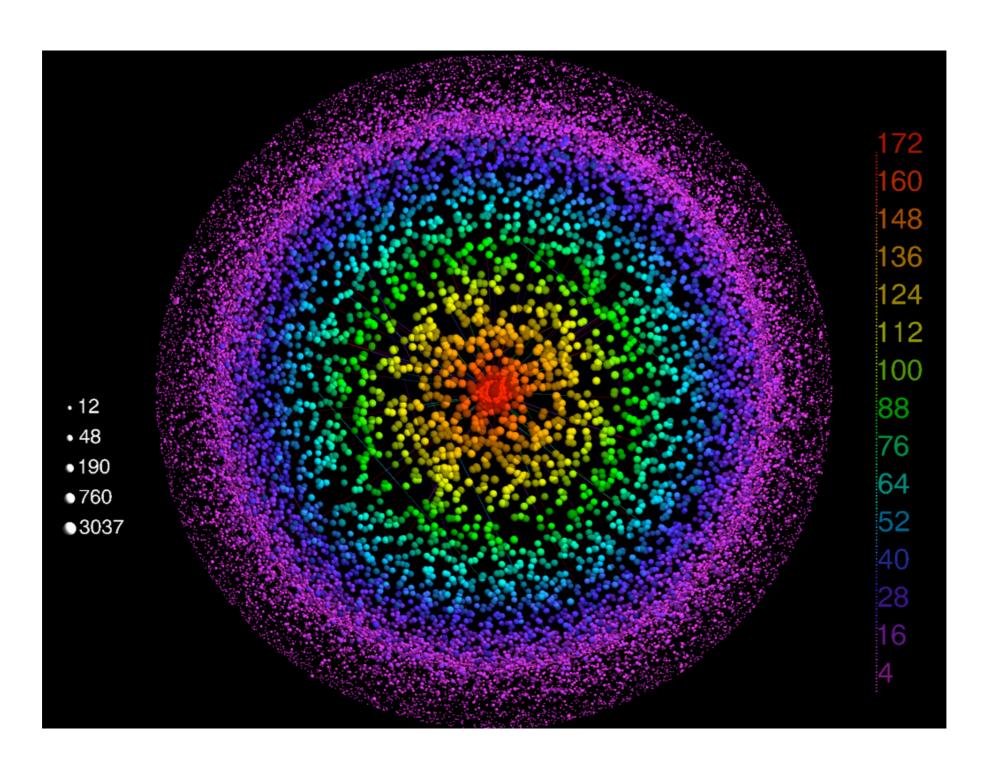
#### How to plot a snapshot of the full network?



<u>xavier.informatics.indiana.edu</u> /lanet-vi/ c/soundcloud\_4.py
collects the full network
of SoundCloud friends
(takes a long time!)

LaNet-vi offers a web service that draws large scale networks of data (no software required!)





ismir2009.benfields.net/m/soundcloud\_16k.png

#### **Another Application of Graphs**

Find the closest Michael Jackson remix to a given user and give an ordered list of artists to get to that user:

http://tr.im/mjness

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Find the closest Michael Jackson remix to a given user and give an ordered list of artists to get to that user:

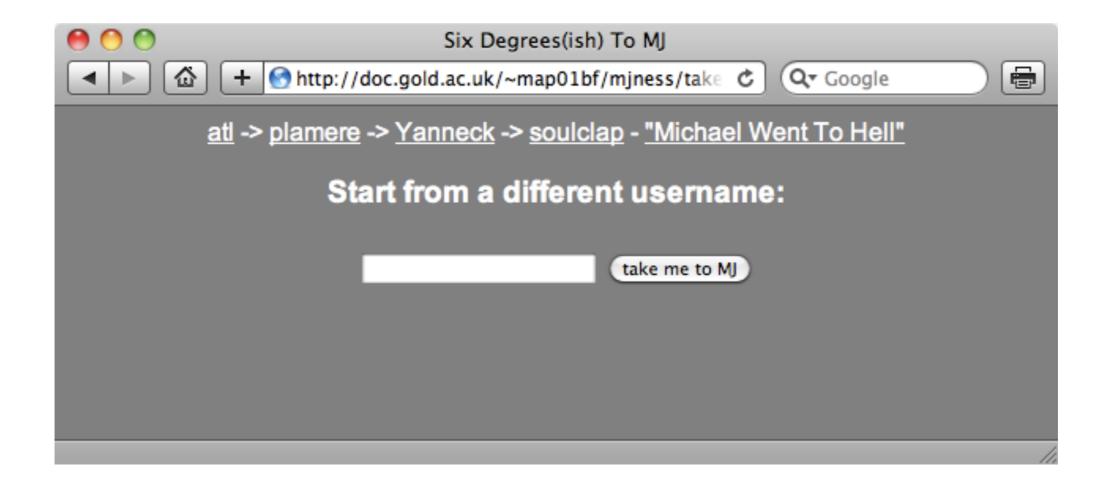
## http://tr.im/mjness



#### **Another Application of Graphs**

Find the closest Michael Jackson remix to a given user and give an ordered list of artists to get to that user:

## http://tr.im/mjness



#### Lessons learnt

Musicians **relate** in online communities with each other (as friends, followers, ...)

**Social networks** can easily be extracted and plotted, either partially or completely

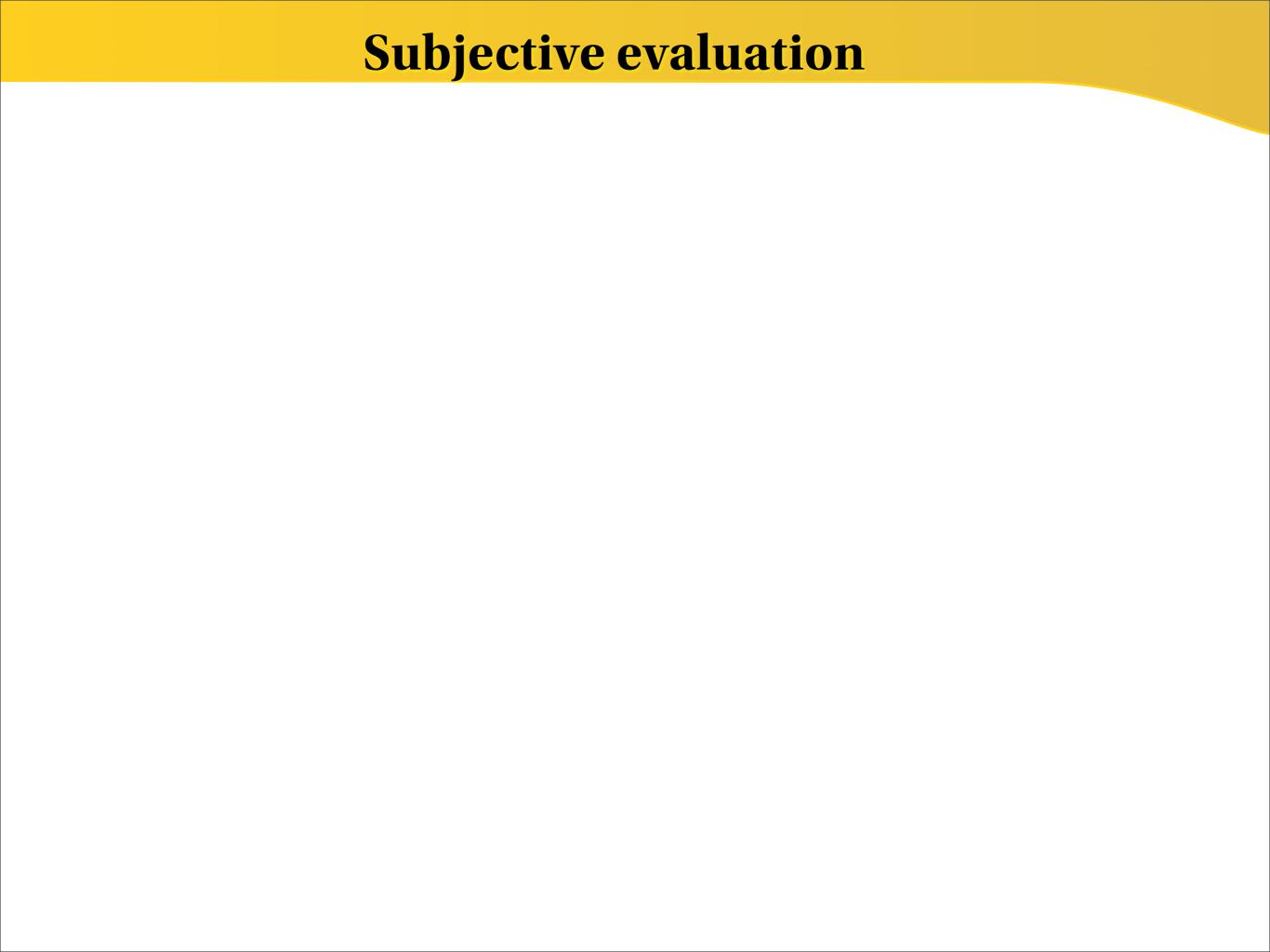
Plotting can also be outsourced to a web service

Researchers can benefit for several applications: **playlist generation**, recommender systems, ...

# QUESTIONS?

#6

# COLLECTING FIELDBACK



#### Subjective evaluation

#### Researchers need feedback in many scenarios

Recommender systems

**Automatic composition** 

Mood-based analysis

...and more

#### Subjective evaluation

## Researchers need feedback in many scenarios

Recommender systems

Automatic composition

Mood-based analysis

...and more

# Setting up a web survey

http://ismir2009.benfields.net/c/facebook_1.php
+ ttp://ismir2009.benfields.net/c ^ Q- Google
▶
Personal data:
Your name:
Your birth year: Your sex:   Male  Female
Your current home-town:
Survey:
This song was performed by a (Human) or by a (Robot) ?

#### Subjective evaluation

## Researchers need feedback in many scenarios

Recommender systems

Automatic composition

Mood-based analysis

...and more

# Setting up a web survey has some drawbacks!

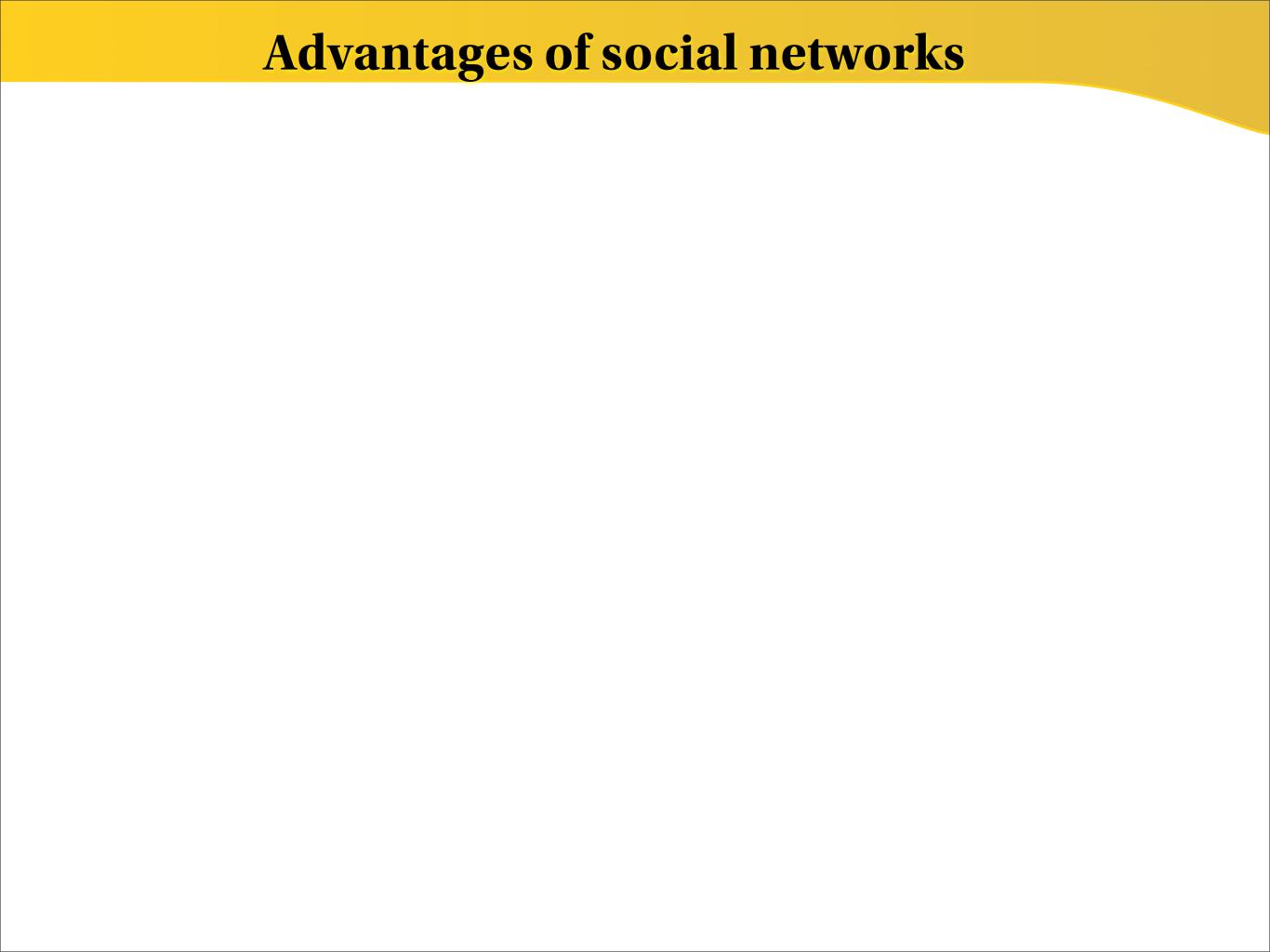
http://ismir2009.benfields.net/c/facebook_1.php
+ ttp://ismir2009.benfields.net/c ^ Q- Google
▶
Personal data:
Your name:
Your birth year: Your sex: Male Female
Your current home-town:
Survey: This song was performed by a Human or by a Robot ?

isolated

hard to share

can vote twice (or never)

requires personal data



Benefits of publishing the survey on Facebook:



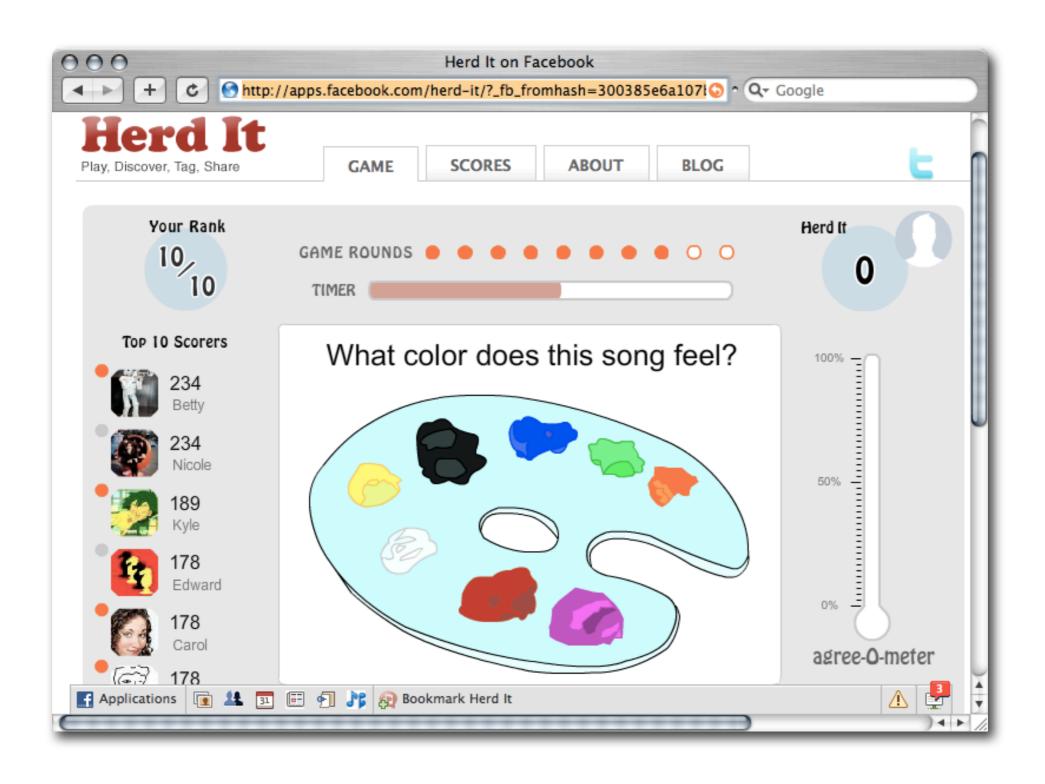
facebook NETLAG belo Ofriendster

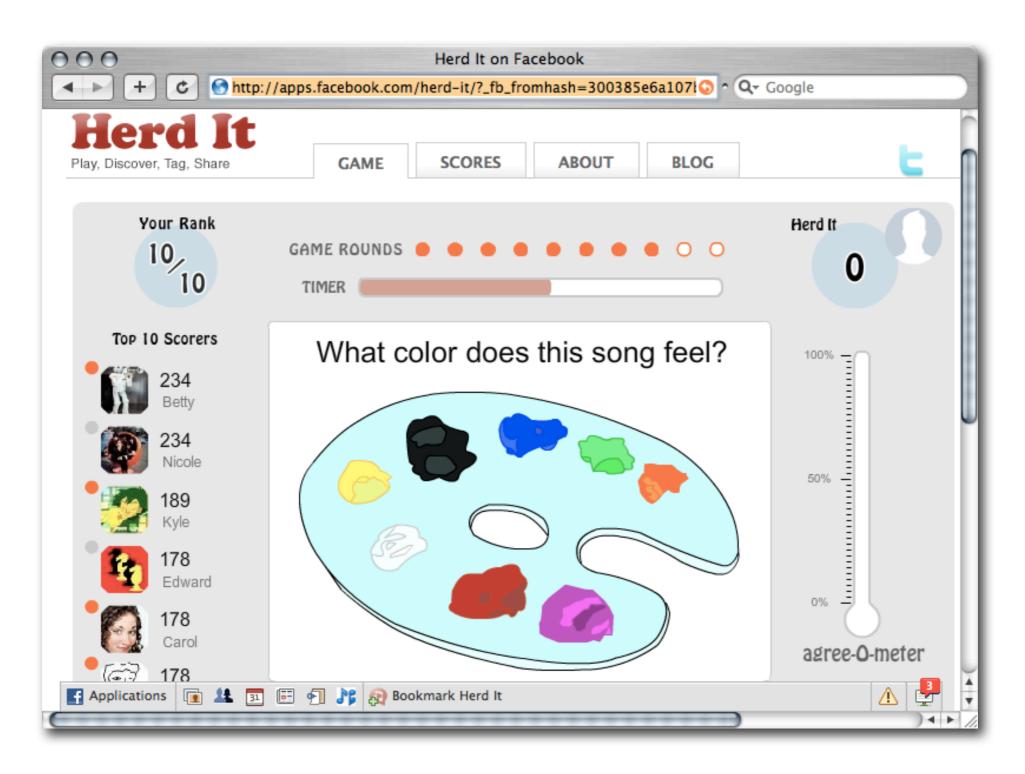
# Benefits of publishing the survey on **Facebook**:

- 1. Collect personal data without filling any form
- 2. Explore social connections between users
- 3. Share and publish surveys through networks of friends
- 4. Potentially reach millions of users in a friendly environment
- 5. Attract more people with game-styled application









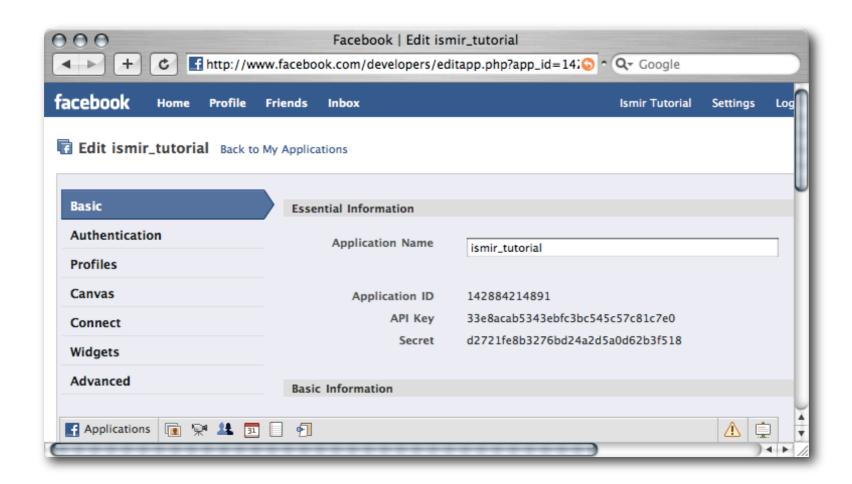
apps.facebook.com/herd-it

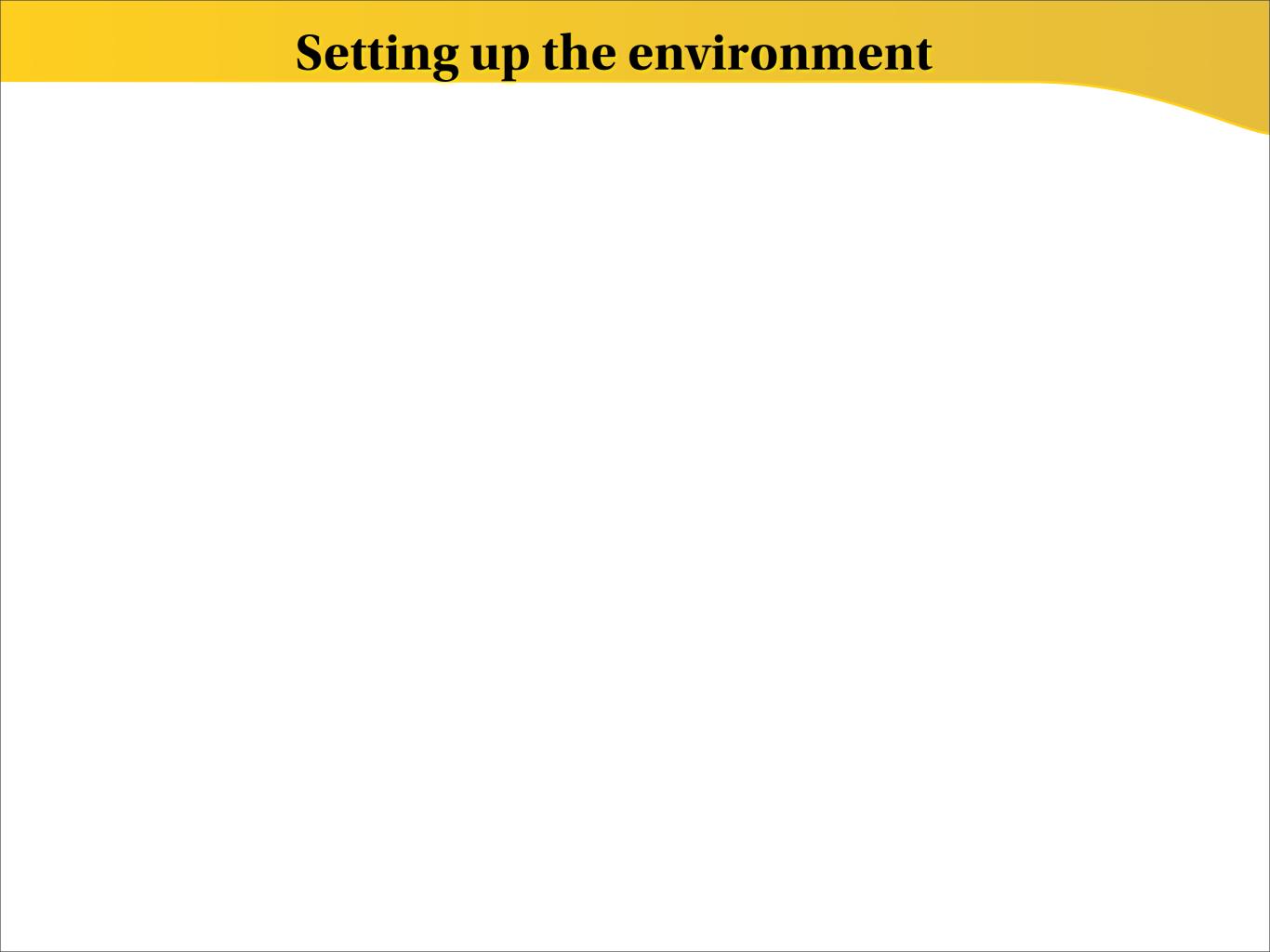
```
<?php if(!($vote = @$_GET['vote'])) { ?>
<object type="application/x-shockwave-flash" height="30"</pre>
data="mp3player.swf?autoplay=true&song_url=http://
ismir2009.benfields.net/m/saxex.mp3"></object>
<form>
<b>Personal data:</b><br /> Your name:
  <input type="text" name="first_name" size="17">
  <input type="text" name="last_name" size="17"> Your birth year:
  <input type="text" name="birth_year" size="4"> Your sex:
  <input type="radio" name="sex" value="male"> Male
  <input type="radio" name="sex" value="female"> Female
  Your current home-town: <input type="text" name="city" size=25>
<b>Survey:</b><br />
  This song was performed by a
  <input type="submit" value='Human' name="vote" /> or by a
  <input type="submit" value='Robot' name="vote" />?</form>
```

```
<?php } else {</pre>
$info = $_GET;
$data_file = "/tmp/fb_survey.txt";
$text = "|". date("Y.m.d H:i:s");
$text .= "|". $vote;
$text .= "|". $info['first_name'] ." ". $info['last_name'];
$text .= "|". $info['sex'];
$text .= "|". $info['birth_year'];
$text .= "|". $info['city'];
$file = fopen($data_file, "a");
fwrite($file, $text ."\n"); fclose($file);
$file = file_get_contents($data_file, 'r');
$human = substr_count($file, '|Human|');
$robot = substr_count($file, '|Robot|');
echo "Votes so far: Human ". $human ." - Robot ". $robot;
echo "". $file ."";
} ?>
```

#### Creating a Facebook application

- 1. Create a Facebook account
- 2. Navigate to facebook.com/developers/apps.php
- 3. Add the Developer application to the Facebook profile
- 4. Set up a new application





#### Setting up the environment

5. Copy and paste the application keys to **c/facebook\_key.php**:

```
<?php
$app_id = "142884214891";
$api_key = "33e8acab5343ebfc3bc545c57c81c7e0";
$secret_key = "d2721fe8b3276bd24a2d5a0d62b3f518";
?>
```

- 6. Download and unzip the Facebook PHP client library from facebook.com/developers/apps.php to the c/ folder
- 7. Add the following lines at the top of **c/facebook\_1.php**:

```
<?php
require_once('facebook_key.php');
require_once("facebook-platform/php/facebook.php");
$facebook = new Facebook($api_key, $secret);
$user = $facebook->require_login(); ?>
```

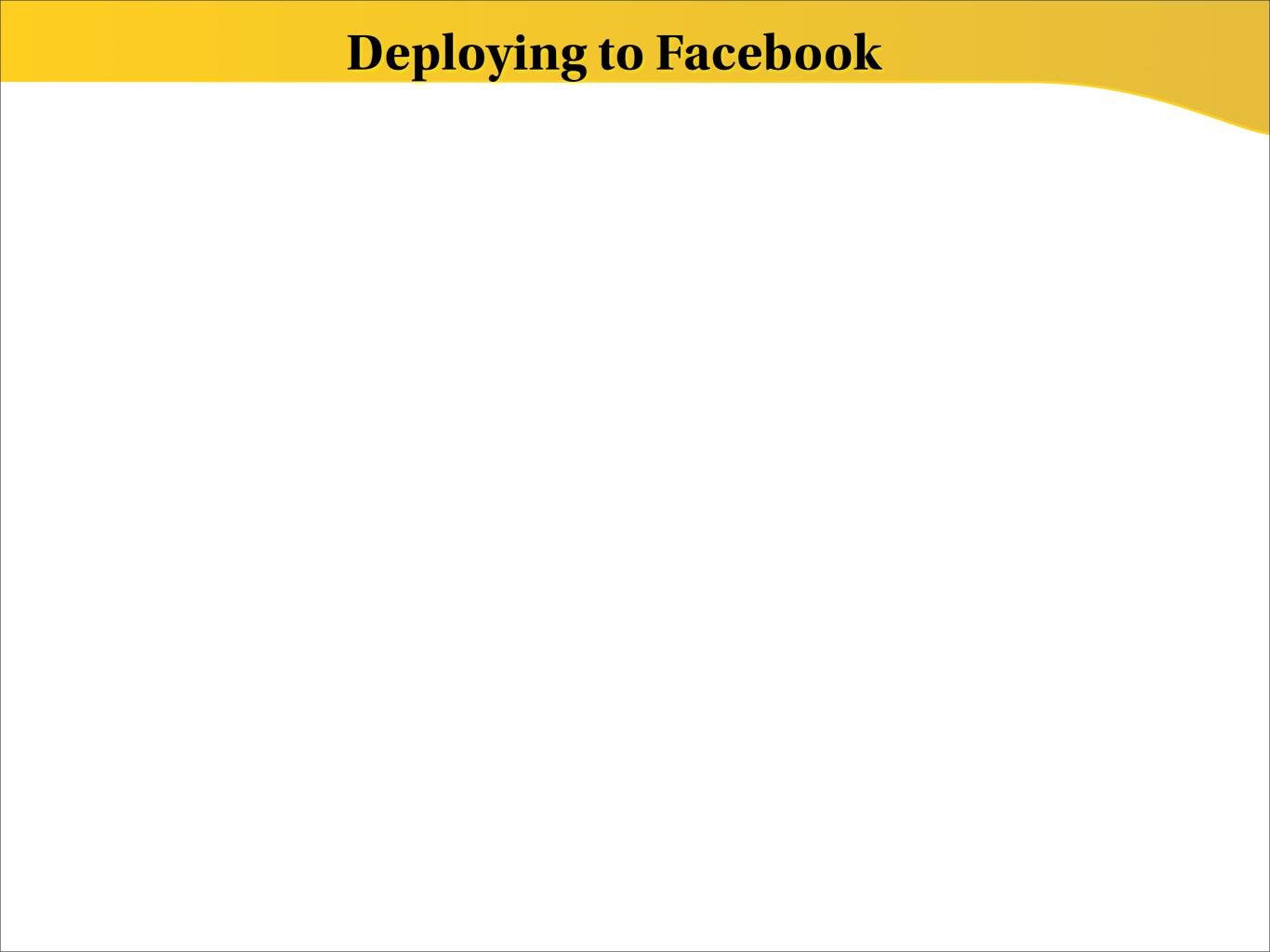
```
<?php if(!($vote = @$_GET['vote'])) { ?>
<object type="application/x-shockwave-flash" height="30"</pre>
data="mp3player.swf?autoplay=true&song_url=http://
ismir2009.benfields.net/m/saxex.mp3"></object>
<form>
<b>Personal data:</b><br /> Your name:
  <input type="text" name="first_name" size="17">
  <input type="text" name="last_name" size="17"> Your birth year:
  <input type="text" name="birth_year" size="4"> Your sex:
  <input type="radio" name="sex" value="male"> Male
  <input type="radio" name="sex" value="female"> Female
  Your current home-town: <input type="text" name="city" size=25>
<b>Survey:</b><br />
 This song was performed by a
  <input type="submit" value='Human' name="vote" /> or by a
  <input type="submit" value='Robot' name="vote" />?</form>
```

```
<?php if(!($vote = @$_GET['vote'])) { ?>
<fb:mp3 src="http://ismir2009.benfields.net/m/saxex.mp3"</pre>
title="Autumn Leaves" album="Autumn Leaves" artist="Human or
Robot?" />
<form>
<b>Personal data:</b><br /> Your name:
  <input type="text" name="first_name" size="17">
  <input type="text" name="last_name" size="17"> Your birth year:
  <input type="text" name="birth_year" size="4"> Your sex:
  <input type="radio" name="sex" value="male"> Male
  <input type="radio" name="sex" value="female"> Female
  Your current home-town: <input type="text" name="city" size=25>
<b>Survey:</b><br />
  This song was performed by a
  <input type="submit" value='Human' name="vote" /> or by a
  <input type="submit" value='Robot' name="vote" />?</form>
```

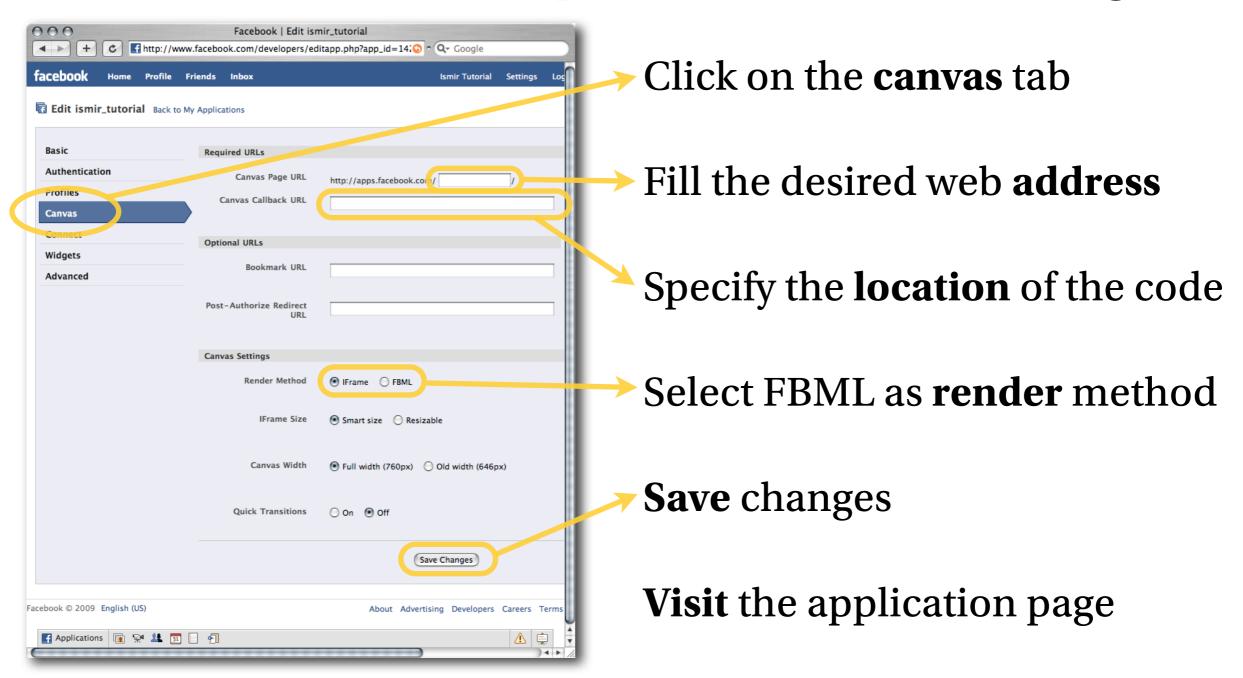
```
<?php if(!($vote = @$_GET['vote'])) { ?>
<fb:mp3 src="http://ismir2009.benfields.net/m/saxex.mp3"</pre>
title="Autumn Leaves" album="Autumn Leaves" artist="Human or
Robot?" />
<form>
<b>Survey:</b><br />
  This song was performed by a
  <input type="submit" value='Human' name="vote" /> or by a
  <input type="submit" value='Robot' name="vote" />?</form>
```

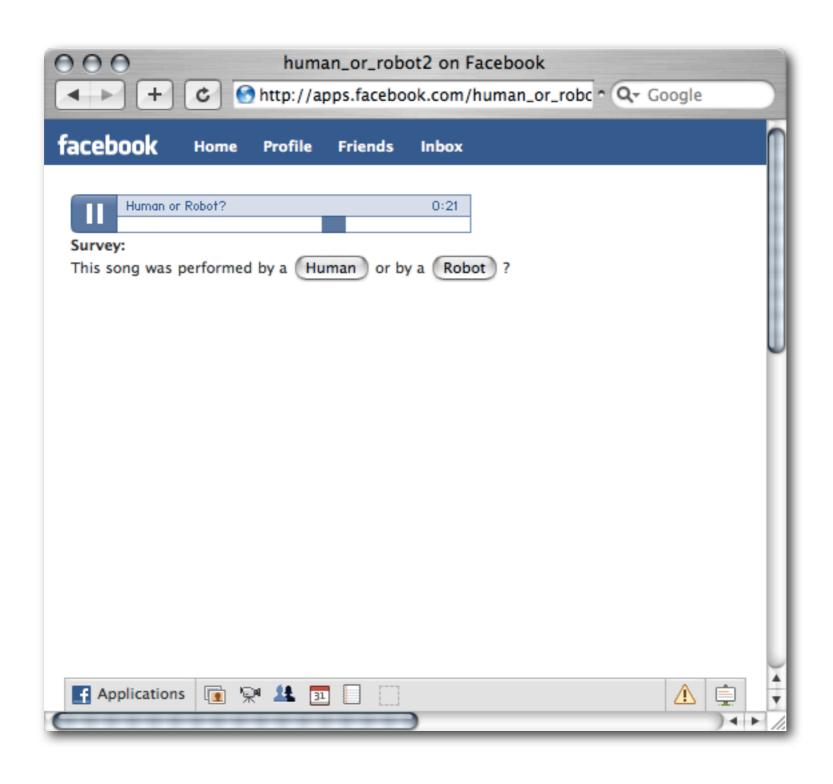
```
<?php } else {</pre>
\frac{1}{\sin 6} = \frac{GET}{1}
$data_file = "/tmp/fb_survey.txt";
$text = "|". date("Y.m.d H:i:s");
$text .= "|". $vote;
echo "Votes so far: Human ". $human ." - Robot ". $robot;
echo "". $file ."";
} ?>
```

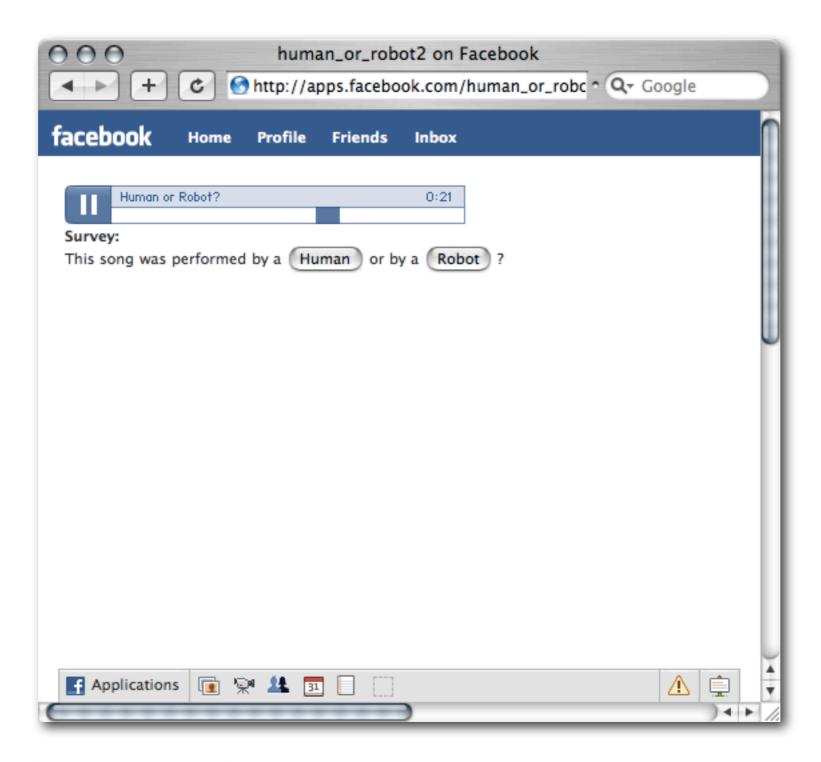
```
<?php } else {</pre>
$info = reset($facebook->api_client->users_getStandardInfo
($user, array('first_name', 'last_name', 'sex', 'birthday',
'current_location')));
$info['birth_year'] = isset($info['birthday']) ?
  date("Y", strptime($info['birthday'], "%m %d, %Y")) : '';
$info['city'] = isset($info['current_location']) ?
  $info['current_location']['city'] : '';
$data_file = "/tmp/fb_survey.txt";
$text = "|". date("Y.m.d H:i:s");
$text .= "|". $vote;
[\ldots]
echo "Votes so far: Human ". $human ." - Robot ". $robot;
echo "". $file ."";
} ?>
```



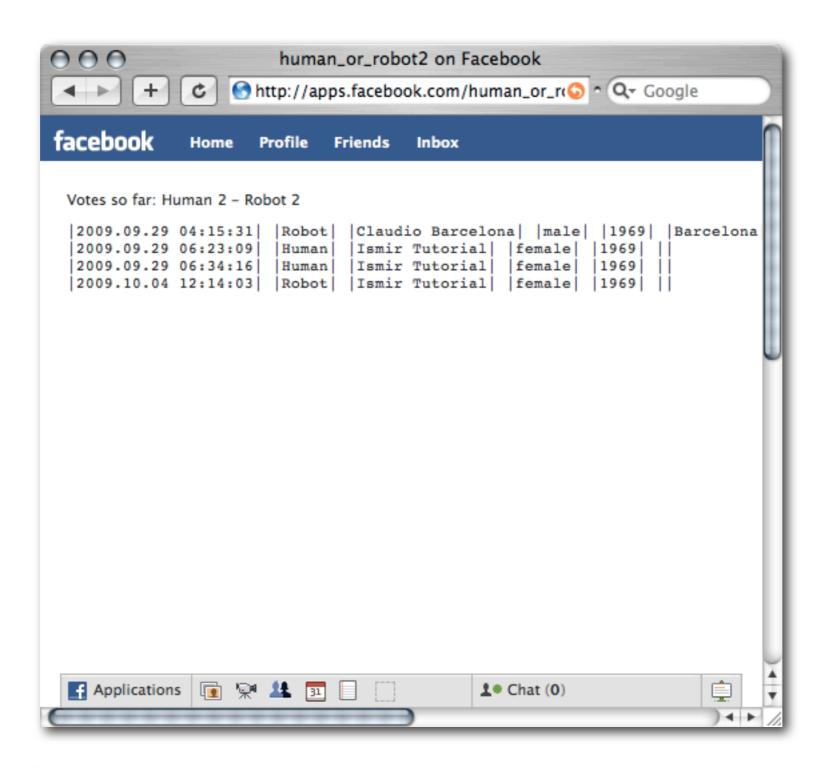
Update the code from the file c/facebook\_2.php to a web server and update Facebook settings:







apps.facebook.com/CANVAS\_PAGE\_URL



apps.facebook.com/CANVAS\_PAGE\_URL

#### Lessons learnt

Developing Facebook apps is fast and easy

Users can benefit from the **social** environment

More social **features** can be exploited

# QUESTIONS?

# CONCLUSIONS

Mining the web for musical data is easy and fast

Every researcher can benefit from this approach

Web APIs can be combined for specific goals

Online **social networks** are practical to collect human experiences and evaluate hypotheses

The web also offers tools for analysis and graphs

Mining the web for musical data is easy and fast

Every researcher can benefit from this approach

Web APIs can be **combined** for specific goals

Online **social networks** are practical to collect human experiences and evaluate hypotheses

The web also offers tools for analysis and graphs

Give it a try!

#### Other interesting web services

- 1. Music reviews (the guardian, NY Times)
- 2. Music TV shows (BBC)
- 3. Concerts (Songkick)
- 4. Sales data (7digital, People's music store)
- 5. Sheet music (Musopen)
- 6. Distribute composition (Noteflight)
- 7. Playlists (Art of The Mix, playlist.com, Spotify, iTunes Store)
- 8. Radio programmes (Yes.com, Shoutcast)

#### A more advanced mash-up

# ismir2009.benfields.net/gmapradio

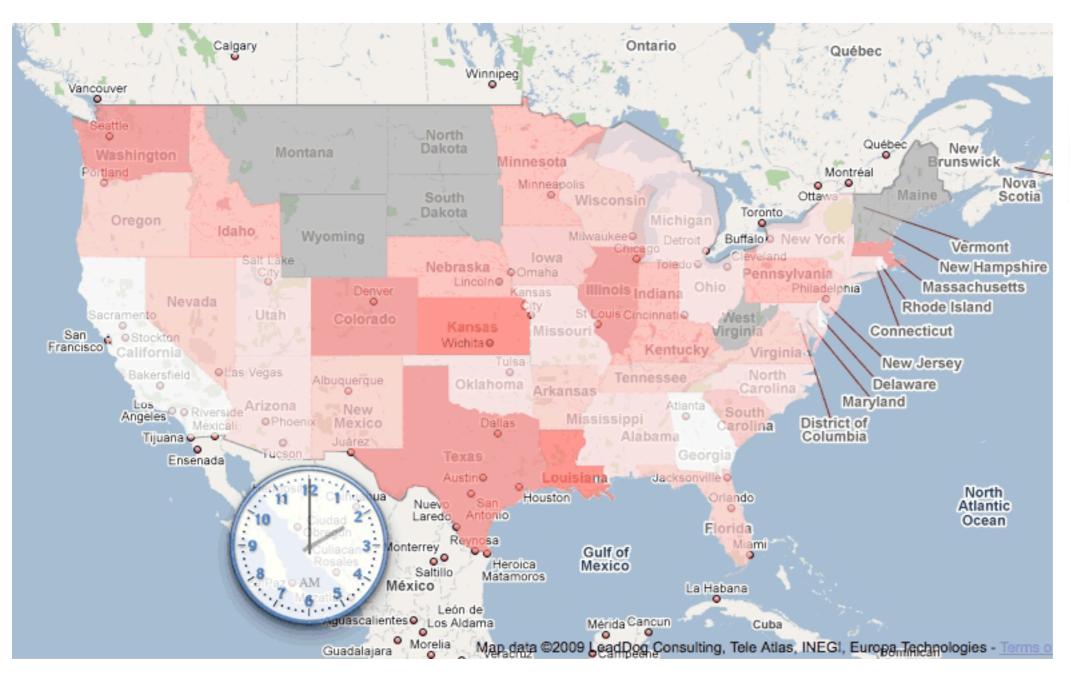


lost.fm



#### A more advanced mash-up

## ismir2009.benfields.net/gmapradio





lost.fm



# QUESTIONS?