# MY472 – Week 7: APIs

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MY 472: Data for Data Scientists

November 13, 2018

Course website: lse-my472.github.io

#### Course outline

- 1. Introduction to data
- 2. The shape of data
- 3. Cloud computing
- 4. Basics of HTML and CSS
- 5. Using data from the internet
- 6. (Reading week)
- 7. Working with APIs
- 8. Creating and managing databases
- 9. Interacting with online databases
- 10. Exploratory data analysis
- 11. Parallel computing

#### Seminar schedule

- 7 APIs
  - 3rd marked assignment (in groups)
  - ▶ Deadline: November 23
- 8 SQL
- 9 Online databases
  - 4th marked assignment (in groups)
  - ▶ Deadline: December 7th
- 10 Exploratory data analysis
- 11 Course wrap-up
  - 5th marked assignment (individual)
  - ▶ Deadline: December 21st

Take-home exam due January 18

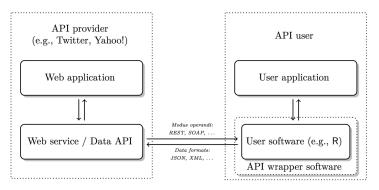
# Plan for today

- APIs
  - Definition
  - Types of APIs
  - Constructing an API call
  - Authentication
  - Example: the New York Times API
- Social media data
  - ▶ What data is available?
  - Twitter APIs

#### **APIs**

API = Application Programming Interface; a set of structured http requests that return data in a lightweight format.

HTTP = Hypertext Transfer Protocol; how browsers and e-mail clients communicate with servers.



Source: Munzert et al, 2014, Figure 9.8

#### **APIs**

#### Types of APIs:

- 1. RESTful APIs: queries for static information at current moment (e.g. user profiles, posts, etc.)
- Streaming APIs: changes in users' data in real time (e.g. new tweets, weather alerts...)

#### APIs generally have extensive documentation:

- Written for developers, so must be understandable for humans
- ▶ What to look for: endpoints and parameters.

#### Most APIs are rate-limited:

- Restrictions on number of API calls by user/IP address and period of time.
- Commercial APIs may impose a monthly fee

# Connecting with an API

#### Constructing a REST API call:

- Baseline URL endpoint: https://maps.googleapis.com/maps/api/geocode/json
- Parameters: ?address=london
- Authentication token (optional): &key=XXXXX

From R, use httr package to make GET request:

```
library(httr)
r <- GET(
"https://maps.googleapis.com/maps/api/geocode/json",
query=list(address="london", key="XXXXX))</pre>
```

If request was successful, returned code will be 200, where 4xx indicates client errors and 5xx indicates server errors. If you need to attach data, use POST request.

```
"results" : [
      "address_components" : [
            "long_name" : "London",
            "short_name" : "London",
            "types" : [ "locality", "political" ]
        },
            "long_name" : "London",
            "short name" : "London".
            "types" : [ "postal_town" ]
      ],
      "formatted_address" : "London, UK",
      "geometry" : {
         "bounds" : {
            "northeast" : {
               "lat" : 51.6723432,
               "lng" : 0.148271
            ٦.
            "southwest" : {
               "lat": 51.384940099999999,
               "lng": -0.3514683
        },
         "location" : {
            "lat": 51.5073509,
            "lng" : -0.1277583
        },
```

ł

```
. . .
            "location_type" : "APPROXIMATE",
            "viewport" : {
               "northeast" : {
                  "lat" : 51.6723432,
                  "lng" : 0.148271
               },
               "southwest" : {
                  "lat": 51.38494009999999,
                  "lng" : -0.3514683
           }
        "place_id" : "ChIJdd4hrwug2EcRmSrV3Vo611I",
        "types" : [ "locality", "political" ]
  ],
  "status" : "OK"
```

#### **JSON**

Response is often in JSON format (Javascript Object Notation).

- ► Type: content(r, "text")
- Data stored in key-value pairs. Why? Lightweight, more flexible than traditional table format.
- Curly brackets embrace objets; square brackets enclose arrays (vectors)
- Use from JSON function from jsonlite package to read JSON data into R
- But many packages have their own specific functions to read data in JSON format; content(r, "parsed")

#### Authentication

- Many APIs require an access key or token
- An alternative, open standard is called OAuth
- ► Connections without sharing username or password, only temporary tokens that can be refreshed
- httr package in R implements most cases (examples)

# R packages

Before starting a new project, worth checking if there's already an R package for that API. Where to look?

- CRAN Web Technologies Task View (but only packages released in CRAN)
- GitHub (including unreleased packages and most recent versions of packages)
- rOpenSci Consortium

Also see this great list of APIs in case you need inspiration.

# Why APIs?

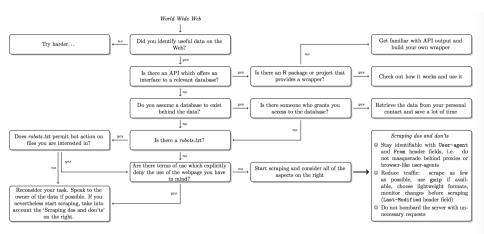
#### Advantages:

- 'Pure' data collection: avoid malformed HTML, no legal issues, clear data structures, more trust in data collection...
- Standardized data access procedures: transparency, replicability
- Robustness: benefits from 'wisdom of the crowds'

#### Disadvantages

- They're not too common (yet!)
- Dependency on API providers
- Rate limits

#### Decisions, decisions...



Example: the New York Times API

see 01-nytimes-api.Rmd

# Twitter data

#### Twitter APIs

Two different methods to collect Twitter data:

#### REST API:

- Queries for specific information about users and tweets
- Search recent tweets
- Examples: user profile, list of followers and friends, tweets generated by a given user ("timeline"), users lists, etc.
- R library: tweetscores (also twitteR, rtweet)

#### 2. Streaming API:

- Connect to the "stream" of tweets as they are being published
- ► Three streaming APIs:
  - 2.1 Filter stream: tweets filtered by keywords
  - 2.2 Geo stream: tweets filtered by location
  - 2.3 Sample stream: 1% random sample of tweets
- R library: streamR

Important limitation: tweets can only be downloaded in real time (exception: user timelines,  $\sim$  3,200 most recent tweets are available)

# Anatomy of a tweet



• Follow

#### Four more years.



RETWEETS 756,411

FAVORITES 288,867 kello 👺 💆 🧱 🕌 hello 🚱 🌉 🚳









### Anatomy of a tweet

#### Tweets are stored in JSON format:

```
{ "created_at": "Wed Nov 07 04:16:18 +0000 2012",
  "id": 266031293945503744,
  "text": "Four more years. http://t.co/bAJE6Vom",
  "source": "web",
  "user": {
   "id": 813286.
    "name": "Barack Obama".
    "screen_name": "BarackObama",
    "location": "Washington, DC",
    "description": "This account is run by Organizing for Action staff.
       Tweets from the President are signed -bo.",
    "url": "http://t.co/8aJ56Jcemr",
    "protected": false.
    "followers_count": 54873124,
    "friends_count": 654580,
    "listed_count": 202495,
    "created at": "Mon Mar 05 22:08:25 +0000 2007",
    "time_zone": "Eastern Time (US & Canada)",
    "statuses count": 10687.
    "lang": "en" }.
  "coordinates": null,
  "retweet_count": 756411,
  "favorite count": 288867.
  "lang": "en"
```

# Streaming API

- Recommended method to collect tweets
- Potential issues:
  - ► Filter streams have same rate limit as spritzer: when volume reaches 1% of all tweets, it will return random sample
  - Good to restart stream connections regularly.
- My workflow:
  - Amazon EC2, cloud computing
  - Cron jobs to restart R scripts every hour.
  - Save tweets in .json files, one per day.

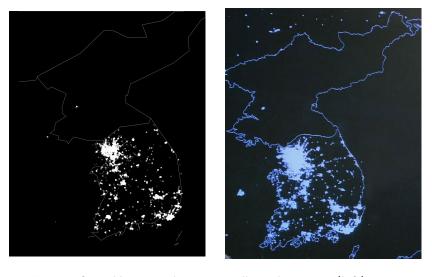
# Sampling bias?

Morstatter et al, 2013, *ICWSM*, "Is the Sample Good Enough? Comparing Data from Twitter's Streaming API with Twitter's Firehose":

- ▶ 1% random sample from Streaming API is not truly random
- Less popular hashtags, users, topics... less likely to be sampled
- ▶ But for keyword-based samples, bias is not as important

González-Bailón et al, 2014, *Social Networks*, "Assessing the bias in samples of large online networks":

- Small samples collected by filtering with a subset of relevant hashtags can be biased
- Central, most active users are more likely to be sampled
- Data collected via search (REST) API more biased than those collected with Streaming API



Tweets from Korea: 40k tweets collected in 2014 (left) Korean peninsula at night, 2003 (right). Source: NASA.

# Who is tweeting from North Korea?



Twitter user: @uriminzok\_engl

# Facebook data

## Collecting Facebook data

Facebook used to allow access to public pages' data through the Graph API:

- 1. Posts on public pages and groups
- 2. Likes, reactions, comments, replies...

Currently not available.

Aggregate-level statistics available through the FB Marketing API. See the code by Connor Gilroy (UW)

Access to other (anonymized) data used in published studies requires permission from Facebook or from users.

**Social Science One** as a new model for academic partnerships with Facebook.

Example: Twitter API

see O2-twitter-streaming-api.Rmd see O3-twitter-rest-api.Rmd