



# Empowering social scientists with web mining tools

*FOSDEM 2020*

*Open Research Tools and Technologies Devroom*

*Guillaume Plique, SciencesPo médialab*

**Why and how to enable researchers to perform complex web mining tasks?**

Guillaume Plique, a.k.a. Yomguithereal

**SciencesPo**  
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**What is web mining?**

# Scraping

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```
1 <!DOCTYPE html><html>
2 <head>
3 <script src="https://www.googletagmanager.com/gtag/js?id=UA-144247239-1" async="true"></script><script>window.dataLayer = window.dataLayer || [];function gtag(){dataLayer.push(arguments);}gtag('js', new Date());gtag('config', 'UA-144247239-1');</script><meta
4 <title>
5 Echo JS - JavaScript News
6 </title>
7 <meta content="index" name="robots">
8 <meta content="width=device-width, initial-scale=1, maximum-scale=1" name="viewport">
9 <link href="/css/style.css?v=10" rel="stylesheet" type="text/css">
10 <link href="/favicon.ico" rel="shortcut icon">
11 <script src="/js/jquery.1.6.4.min.js"></script><script src="/js/app.js?v=10"></script>
12 </head>
13 <body>
14 <div class="container">
15 <header><h1><a href="/">Echo JS</a> <small>0.11.0</small></h1><nav><a href="/">top</a>
16 <a href="/latest/0">latest</a>
17 <a href="/random">random</a>
18 <a href="/submit">submit</a><a href="/replies" class="replies">replies</a></nav> <nav id="account"><a href="/user/Yomguithereal">Yomguithereal (846)</a> | <a href="/logout?apisecret=f259c441ff5de09ec124c8a20e2f42a54cd2689b">logout</a></nav> <a href="#" id="l
19 <div id="siteneews">
20 Site News : Follow Echo JS on Twitter, our official account is : <a href="https://twitter.com/echojs">@echojs</a>
21 </div>
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36 <article data-news-id="35032"><a href="#" class="uparrow"><h2><a href="https://medium.com/javascript-scene/land-your-dream-javascript-job-with-a-better-resume-beda92bcbcd6" rel="nofollow">Land Your Dream JavaScript Job with a Better Resume</a></h2>
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40 <article data-news-id="35062"><a href="#" class="uparrow"><h2><a href="https://github.com/victorgribeiro/plot" rel="nofollow">Plot any equation with a few lines of JavaScript</a></h2> <address>at github.com</address><a href="#down" class="downarrow"><span class="upvote
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52 </section>
53 </div>
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55 <div class="keyboard-help-banner banner-background banner">
56
57 </div>
58 <div class="keyboard-help-banner banner-foreground banner">
59 <div class="primary-message">
60 Keyboard shortcuts
61 </div>
62 <div class="secondary-message">
```



# Collecting data from APIs



Developer

Use cases

Products

Docs

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Apps



🔍 Search all documentation...

## Basics

## Accounts and users

## Tweets

Post, retrieve and engage with Tweets

Get Tweet timelines

Curate a collection of Tweets

Optimize Tweets with Cards

[Search Tweets](#)

Filter realtime Tweets

Sample realtime Tweets

Get batch historical Tweets

Rules and filtering

Data enrichments

Tweet objects

Tweet compliance

Tweet updates

## Direct Messages

## Media

## Trends

## Search Tweets

[Overview](#) [Quick start](#) [Guides](#) [FAQ](#) [API reference](#)

Overview contents ^

[Premium search](#)

[Standard search](#)

[Enterprise search](#)

## Introduction

The Twitter API platform offers three tiers of search APIs:

**Standard** This search API searches against a sampling of recent Tweets published in the past 7 days. Part of the 'public' set of APIs.

**Premium** Free and paid access to either the last 30 days of Tweets or access to Tweets from as early as 2006. Built on the reliability and full-fidelity of our enterprise data APIs, provides the opportunity to upgrade your access as your app and business grow.

**Enterprise** Paid (and managed) access to either the last 30 days of Tweets or access to Tweets from as early as 2006. Provides full-fidelity data, direct account management support, and dedicated technical support to help with integration strategy.

## Feature summary

Category	Product name	Supported history	Query capability	Counts endpoint	Data fidelity
<b>Standard</b>	<a href="#">Standard Search API</a>	7 days	<a href="#">Standard operators</a>	Not available	Incomplete
<b>Premium</b>	<a href="#">Search Tweets: 30-day endpoint</a>	30 days	<a href="#">Premium operators</a>	Available	Full
<b>Premium</b>	<a href="#">Search Tweets: Full-archive endpoint</a>	Tweets from as early as 2006	<a href="#">Premium operators</a>	Available	Full

**But why is this useful to [social] sciences?**

## Bad take

01. Every social sciences data collection is biased (i.e. observer's paradox)
02. People express themselves without being asked to, on the Internet
03. What's more they are not being observed (lol, I know...)
04. Web mining is therefore a superior source of data for social sciences!

## Good take

01. Internet data comes with its own biases that you should be aware of
02. Apply **media studies** and **STS** without moderation
03. Still is another very interesting and large data source!

# Web mining is hard

You need to know The Web™:

DNS HTTP HTML CSS JS DOM AJAX SSR CSR XPATH ...

## How do you teach researchers web technologies

01. The same as anyone else really (CSS as sushi plates anyone?)
02. What most consider as an easy layer of technologies really ISN'T
03. We really are standing on the shoulders of giants

# Teaching researchers how to scrape

01. Fighting the platforms and their APIs
02. Legal issues in some countries
03. Sometimes forbidden to teach it (~lock picking)
04. Publication wiggles (the monkey army)

## Jupyterizing researchers is not a solution

01. Some researchers don't have the **time** nor the **will** to learn python and web stuff.
02. We should be OK with that!

## Web mining is HARD

It really is a craftsmanship.

# Internet is a dirty, dirty place

Browsers truly are heuristical wonders!

## Multithreading, parallelization, throttling etc.

Once we cut access to Google to our whole university!

**Complex spidering, scalability, storage, indexing,  
recombobulation, steam engines, fancy boats, unionization,  
agility, upper management, Peters syndrom, eXtreme  
programming**

*Most of it is irrelevant and made up but you get the point...*

## How do we empower researchers then?

By **designing** tools suited to their research questions

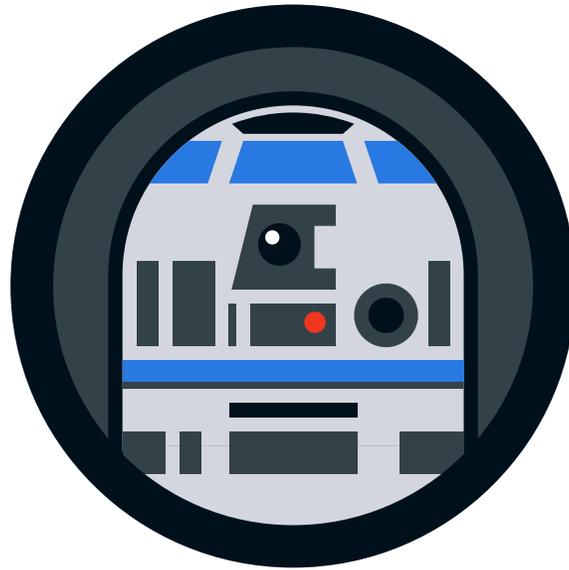
# SciencesPo's médialab

01. Social Science Researchers
02. Designers
03. Engineers

# A brief guided tour of tools we designed

01. [artoo.js](#)
02. [minet](#)
03. [Hyphe](#)
04. [\(Gazouilloire\)](#)

# Parasitizing web browsers instead of emulating them!



Demo Time!

# Leveraging bookmarklets to empower researchers

[artoo.js](#) The client-side scraping companion.

---

## Bookmarklet Generator

*This handy bookmarklet generator lets you create a custom standalone artoo.js bookmarklet using the provided snippet of code:*

Your bookmarklet name

Paste your code here...

Generate

But can we scale up?



*Not-contractual logo - Jules Farjas ©*

## Handling the pesky details for you

01. Multithreaded, memory-efficient **fetching** from the web.
02. Multithreaded, scalable **crawling** using a comfy DSL.
03. Multiprocessed raw text **content extraction** from HTML pages.
04. Multiprocessed **scraping** from HTML pages using a comfy DSL.
05. **URL-related heuristics** utilities such as normalization and matching.
06. Data collection from various **APIs** such as CrowdTangle.

# The Unix philosophy

Do one thing well

```
xsv search -s url urls.csv | minet fetch url -d html > result.txt
```

**Demo time!**

# The low-fi approach

```
# Yomgui at mbp-de-plique-1.home in ~/code/minet on git:master * [15:54:11]
→ ./ftest/ftest.sh
Fetching pages: 0% | ded_resolve.py | 0/100 [00:00<?, ? urls/s]
ded_resolve.py | 0/100 [00:00<?, ? urls/s]
```

```
# Yomgui at mbp-de-plique-1.home in ~/code/minet on git:master * [15:51:23]
→ ./ftest/ftest.sh
rm -rf ftest/content
rm -rf ftest/report.csv
```

## Relocalizing data collection

01. Sometimes you don't need a server
02. We are rarely doing BigData™
03. Let's put the researcher at the center so they can control their data

## A programmatic API

Jupyter's back y'all!

```
from minet import multithreaded_fetch  
  
for result in multithreaded_fetch(urls_iterator):  
    print(result.status)
```

**How to enable researchers to crawl the Web?**



# HYPHE

Hyphe is a web corpus curation tool  
featuring a research-driven web crawler

# A dedicated interface

Polarisation post élections EU

- OVERVIEW
- IMPORT
- CRAWL
- PROSPECT
- WEB ENTITIES
- TAGS
- NETWORK
- EXPORT
- TOOLS
- SETTINGS
- HYBRO
- HELP

SciencesPo MÉDIALAB

Network Viz Settings

Filtering

- IN 859
- UNDECIDED 0
- OUT 4
- DISCOVERED 87,091

Filter DISCOVERED web entities

Filter ALL web entities

APPLY CHANGES CANCEL

Key

- Each dot or *node* is a web entity
- Each line or *edge* or *link* represents one or more hyperlinks from a web entity to another. Links are oriented even though it is not figured in the Image.

NODE COLOR

Portée (tag)

- nationale (366)
- régionale (78)
- internationale (20)

# Serving a robust methodology



*the node has  
been crawled  
(IN)*



*another node  
has been  
crawled*

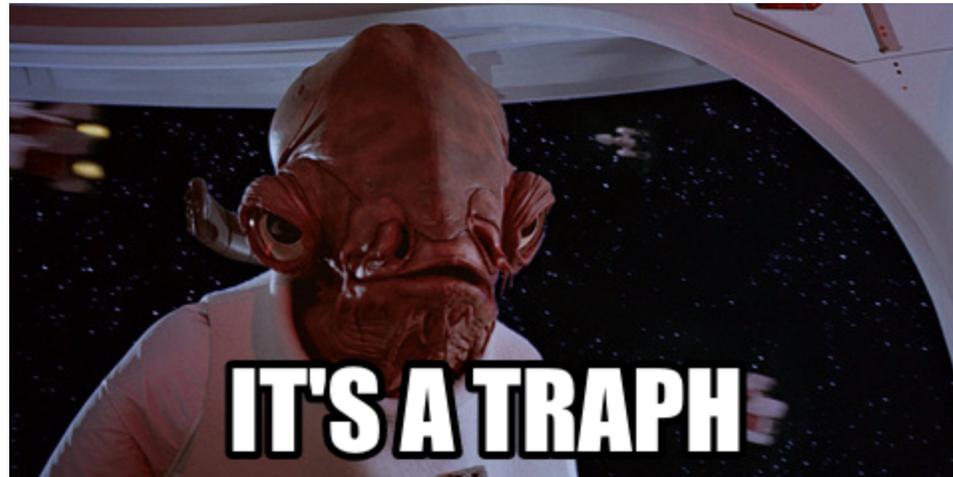


*you can discard  
nodes  
manually*



*add and crawl  
nodes  
manually*

## Non-trivial technical challenges



## Trade-off between scalability & usability

We need to be able to **design** user paths.

## The future!

What about a GUI for minet?

**Thank you for listening!**

