DATA COLLECTION

Slides by WESLEY WILLETT

VISUAL ANALYTICS

WHERE DOES DATA COME FROM?

We tend to think of data as a thing...

in a database...

somewhere...

WHY DO YOU NEED DATA?

(HINT: Usually, because you have a question you need to answer!)



ANALYSIS IS A CYCLE

GATHERING DATA, APPLYING STATISTICAL TOOLS, AND CONSTRUCTING GRAPHICS TO ADDRESS QUESTIONS



INSPECT "ANSWERS" AND ASSESS <u>NEW</u> QUESTIONS

(SOMETIMES YOU'LL ALREADY START WITH DATA...)

"EXPLORATORY DATA ANALYSIS"



We'll revisit this later in the course...

(...BUT OFTEN YOU <u>START</u> WITH A QUESTION AND NEED TO COLLECT DATA TO FIT IT)

CHOOSING A QUESTION

"How has language evolved over time?"

"What will the weather be like next month?"

"Are the right people seeing my advertisements?"

"What is the current temperature?"

A PROBLEM OF SCALE CHALLENGING ne?" "How TO FIND DATA "What will the weathe be like next month?" "Are the right p my NOT AS "What ature?" INTERESTING

HOW TO OBTAIN DATA?

COLLECT IT

- OBSERVATION
- SURVEYS
- LOGGING
- SENSORS
- CROWDSOURCING

FIND OR EXTRACT IT

- OPEN CORPUSES
- DATA RETAILERS
- APIS
- SCRAPING THE WEB

GENERATE IT - SIMULATIONS

ALL OF THESE HAVE **PROS/CONS**

THIS LIST IS NOT EXHAUSTIVE

This lecture is intended to expose you to just a few useful data sources and collection methods.



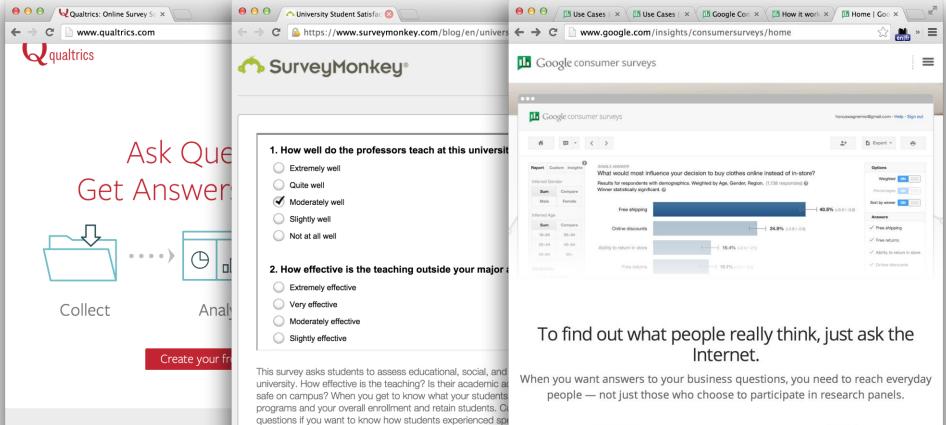
Choosing the best way to capture information you need.



Paper surveys / In person interviews

STILL ONE OF THE BEST WAYS TO GET DETAILED DATA OR DATA ABOUT SENSITIVE SUBJECTS

SURVEYS ONLINE



The Ridiculously Powe

To create a survey using the University Student Satisfaction s





CROWDSOURCING DATA COLLECTION

\varTheta 🖯 🚺 Amazon Mechanical Turk - 🗙 🚺					RM
← → C 🔒 https://www.mturk.com/mturk	<td></td> <td></td> <td></td> <td>☆ N ≈ =</td>				☆ N ≈ =
HITs containing 'short survey' 11-20 of 49 Results Sort by: HITs Available (most first) \ddagger @	Show all details	Hide all details	<u>First</u> ≪ Previ	ous < 1:	2 3 4 5 > Next >> Last
Answer a short survey about Work Team Dynamics		Requ	uest Qualification (V	Vhy?)	View a HIT in this group
Requester: Whitney Ohmer	HIT Expiration Date:	Oct 12, 2014 (2 weeks 5 days)	Reward:	\$0.25	
	Time Allotted:	60 minutes	HITs Available:	1	
Answer a short survey about Work Team Dynamics		Requ	uest Qualification (V	Vh <u>y?)</u>	View a HIT in this group
Requester: Whitney Ohmer	HIT Expiration Date:	Oct 12, 2014 (2 weeks 5 days)	Reward:	\$0.25	
	Time Allotted:	60 minutes	HITs Available:	1	
Short Survey					View a HIT in this group
Requester: David Tannenbaum	HIT Expiration Date:	Oct 12, 2014 (2 weeks 5 days)	Reward:	\$0.10	
	Time Allotted:	60 seconds	HITs Available:	1	
Short survey about website experience (on average if	t takes 13 minutes)	Not Qualified to	work on this HIT (V	<u>Vhy?)</u>	View a HIT in this group

WEB LOGGING

Tracking Visits, Click-Throughs, and Traffic Patterns and other measures of User Activity.

- Google Analytics
- Open Web Analytics
- and many others...

EDITS & ACCESSS LOGS ON

\varTheta 💿 💿 🛛 W Wikipedia:Si	tatistics: Revisic ×	IK.
← → C 🗋 en.wiki	pedia.org/w/index.php?title=Wikipedia:Statistics&action=history	🚺 🗨 🎲 📲 📲
WIKIPEDIA The Free Encyclopedia	Project page Talk Read Edit View history Search Wikipedia:Statistics: Revision history View logs for this page	Create account 🔒 Log in
Main page Contents Featured content Current events Random article Donate to Wikipedia Wikimedia Shop	Browse history From year (and earlier): 2014 From month (and earlier): all Go For any version listed below, click on its date to view it.	Tag filter:

SENSORS

- Weather stations
- Personal activity trackers
- Cameras
- Mobile phones







HOW TO OBTAIN DATA?

COLLECT IT

- OBSERVATION
- SURVEYS
- LOGGING
- SENSORS
- CROWDSOURCING

FIND OR EXTRACT IT

- OPEN CORPUSES
- DATA RETAILERS
- APIS
- SCRAPING THE WEB

GENERATE IT - SIMULATIONS



SIMULATIONS

http://www.nasa.gov/content/a-portrait-of-global-winds/

TheUpshot

EDITED BY DAVID LEONHARDT FOLLOW US: F S S S GET THE UPSHOT IN YOUR INBOX



Is It Better to Rent or Buy?

By MIKE BOSTOCK, SHAN CARTER and ARCHIE TSE

The choice between buying a home and renting one is among the biggest financial decisions that many adults make. But the costs of buying are more varied and complicated than for renting, making it hard to tell which is a better deal. To help you answer this question, our calculator takes the most important costs associated with buying a house and computes the equivalent monthly rent. **RELATED ARTICLE**

Home Price A very important factor, but not



If you can rent a similar home for less than ...

HOW TO OBTAIN DATA?

COLLECT IT

- OBSERVATION
- SURVEYS
- LOGGING
- SENSORS
- CROWDSOURCING

FIND OR EXTRACT IT

- OPEN CORPUSES
- DATA RETAILERS
- APIS
- SCRAPING THE WEB

GENERATE IT – SIMULATIONS

FINDING AND EXTRACTING EXISTING DATA

LARGE OPEN CORPUSES



About: Iceland

An Entity of Type : <u>place</u>, from Named Graph : <u>http://dbpedia.org</u>, within Data Space : <u>dbpedia.org</u>

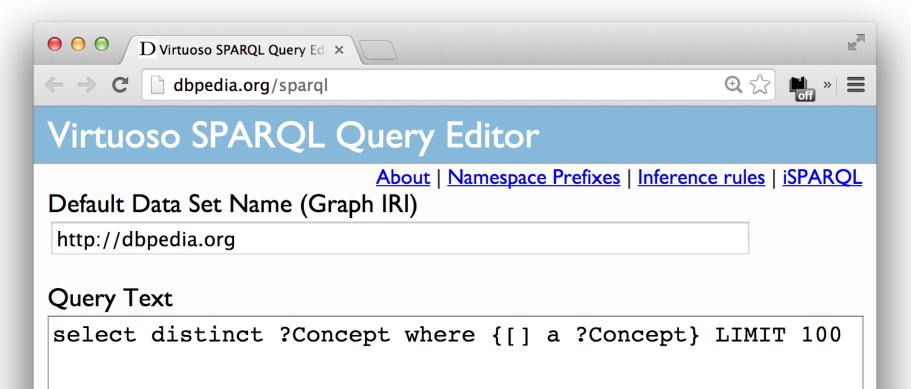


Iceland / aɪslənd/ (Icelandic: Ísland ['istlant]), sometimes referred to in full as the Republic of Iceland (Lýðveldið Ísland), is a Nordic island country marking the juncture between the North Atlantic and the Arctic Ocean, on the Mid-Atlantic Ridge. The country has a population of 325,671 and a total area of 103,000 km2 (40,000 sq mi), which makes it the most sparsely populated country in Europe.

Property

Value

QUERYING DBPEDIA



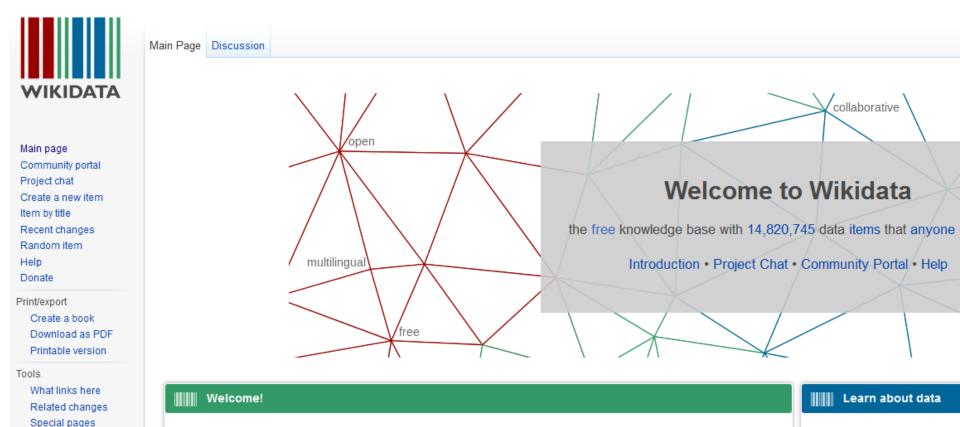
Ended in 2014

•	O Freeba	ase ps://www.freeba	×	E						<u>حک</u>	
í	≈ Freebase	e Find			Browse	Que	ry He	əlp	Sign In o	r Sign Up	English 🗸
			2	,653,58	81,676	5- (and	Facts counting)				
	A	community	v-curated d	atabase o	of well-k	nown	peop	le, pla	aces, and t	hings	
	Data	Schema	Queries	Apps	Loads		Review ⁻	Tasks	Users		
	Explore Fr	eebase Data						- 1	How can you g	et started?	
	Domain		ID		Topics	Facts			Learn how it wo	orks	
	Music		/music		29M	200M			Discover what kin Freebase contains		
	Books		/book		6M	15 M			and how Freebase uniquely identify i	e allows you to	D
	Media		/media_commo	n	5M	16M			the web	dentities allyw	

WIKIDATA

Permanent link

Page information



Wikidata is a free linked database that can be read and edited by both humans and machines.

Wikidata acts as central storage for the structured data of its Wikimedia sister projects including Wikipedia

New to the wonderful world o up to speed and feeling com

PROJECT GUTENBERG

•••	🚺 All B	ooks (sort	ed by popula ×					R _M
← → (2 🗋 w	ww.gute	enberg.org/eb	ooks/search	n/?sort_or	rder=dov	vnloads 🗈 🕁 🛄	» =
	F	Project Gu	itenberg offers 4	6,845 free eboo	oks to down	load.	f Donate E Flatt	tr this!
	Search	Latest	Terms of Use	Bookmarks	Donate?	Mobile	Search Project Gutenberg. <s< th=""><th>Help</th></s<>	Help

All Books (sorted by popularity)



Sort Alphabetically

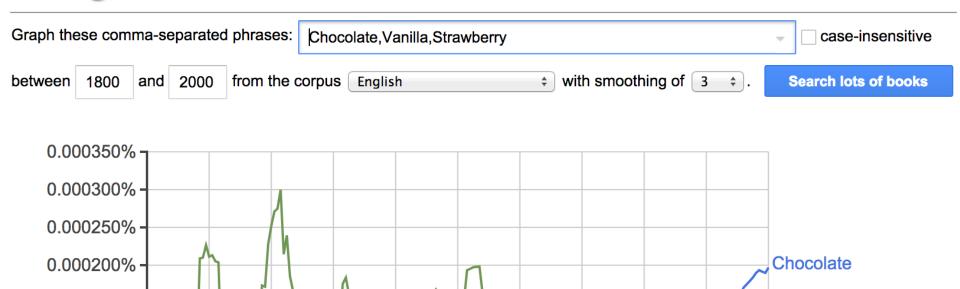
Sort by Release Date



The Kama Sutra of Vatsyayana Vatsyayana 13285 downloads



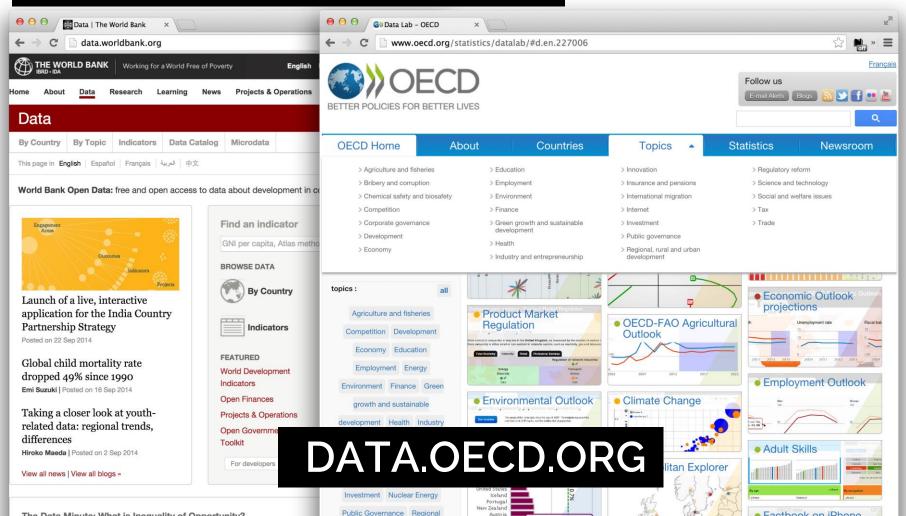
Google books Ngram Viewer



FINDING AND EXTRACTING EXISTING DATA

GOVERNMENT AND INTERNATIONAL DATA INITIATIVES

DATA.WORLDBANK.ORG



GOVERNMENT INITIATIVES

🖪 Data Search | data.gov.uk 🛛 🛛

0...0

A / Datasets

data.gov.uk/data/search

Search for data...

19422 Results

Skills Funding Agency

August 2013 Following a change of ...

full set of search fields will still...

Learning Aim Reference Service

Or conduct map based search

Live traffic information from the Highway

Live traffic information data showing traffic information on the road network in England, maintained by the Highways Agency.

Learning Aim Reference Service (LARS) service will offer a 'Quic

facility, allowing users to search by most commonly used fields

Opening up Government

WWW.DATA.GOV (US)

DATA

TOP

 $\leftarrow \rightarrow$

C

DATA.GOV.UK

DATA.GOV.B

The home of the data

00

C

Data.gov

https://www.data.gov

E ĐATA GOV

Here you will find data, tools web and mobile applications

SEA

data.gov.be data.gov.be/fr/datasets data.gov.be/fr/datasets data.gov.be <lidata.gov.be <lidata.gov.be data.gov.be

Liste de sets de données disponibles comme "open data".

Catégorie		Туре		Granularité		
- Tout -	\$	- Tout -	\$	- Tout -	\$	Appliquer

Titre	Catégorie	Туре
Zones de stationnement voirie 2013	Mobilité	Téléchar
Usages TIC des ménages wallons	TIC	<u>Téléchar</u> Service v
Usages TIC des citoyens wallons	Population, Economie, TIC	Téléchar Service v
UDP Mars 2013 par commune	Energie, Pouvoirs publics	Téléchar
UDP Mai 2013 par commune	Energie, Pouvoirs publics	Téléchar

Health Care Provider Charge

BROWSE TOPICS

NEW DATA INITIATIVES JUST TO TRACK ALL THE DATA INITIATIVES

•••	Browse by country re3dat ×			1	X
$\leftarrow \Rightarrow c$	www.re3data.org/browse/by-country/		off ×	»	





INITIATIVES IN FRANCE

HTTP://DATA.GOUV.FR

→ C Attps://www.data.gouv.fr/fr/		-^_ w	
		Open Data Paris ×	
Libert - Égalid - Francaise République Française	Plateforme ou	← → C □ opendata.paris.fr/explore/	S 💾 »
Comment ça marche ? Organisations Licenc	e Ouverte Tableau de b	PARISDATA MAIRIE D	
Q Recherche			E PARIS 🕹
Agriculture et alimentation		A Les données Les Data Challenges L'API La licence La	démarche Le forum
Culture	Partagez,		
Économie et Emploi	les donnée	Cartographe	
Éducation et Recherche			
International et Europe	+ CONTRIB	▼ Filtres	
Logement, Développement Durable et Énergie			
Santé et Social		Trouver un jeu de données	Dernière modification
Société			
Territoires et Transports			
		Zones de rencontre	Obplace
MEILLEURES RÉ			
IDÉESLIBRES, ORG	://OP	ENDATA.PARIS.FR/EXPLC	RE/

FINDING AND EXTRACTING EXISTING DATA

OTHER PUBLIC DATA REPOSITORIES

MORE REPOSITORIES

VISUALIZING.ORG

http://visualizing.org/data/browse

AMAZON PUBLIC DATA HOSTING http://aws.amazon.com/publicdatasets/

GOOGLE PUBLIC DATA

http://www.google.com/publicdata/directory

FINDING AND EXTRACTING EXISTING DATA

DATA RETAILERS

DATA RETAILERS

AZURE DATA MARKET

https://datamarket.azure.com/browse/data

FACTUAL

http://www.factual.com/

AND AGAIN, THERE ARE MANY, MANY MORE...

FINDING AND EXTRACTING EXISTING DATA

APIS

TWITTER

Streaming APIs (live data by users and by topics)

The "Firehose" (all of live twitter)

Complete Archives via "Gnip" and eventually (maybe) the US Library of Congress

HTTPS://DEV.TWITTER.COM

⊖ ⊖ ⊖ y Documentation Home ×	H _M
$\leftarrow \Rightarrow \mathbb{C}$ https://dev.twitter.com/overvi	
🈏 / Overview	
	Sign in
Documentation	^
Twitter for Websites	
Cards	
OAuth	
REST APIs	
Streaming APIs	
Ads APIs	
MoPub	
Best Practices	
API Overview	
API Status	
Manage My Apps	
Terms of Use	

Documentation

The Twitter Platform connects your website or application with the worldwide conversation happening on Twitter.

CON #COP17 ECOSPHERE PROJECT

The CNN #COP17 ECOSPHERE Project launched on 14 November 2011.

This is a timeline of how the ECOSPHERE develops in the build-up to the COP17 Conference in Durban.

Back to ECOSPHERE

1276 tweets





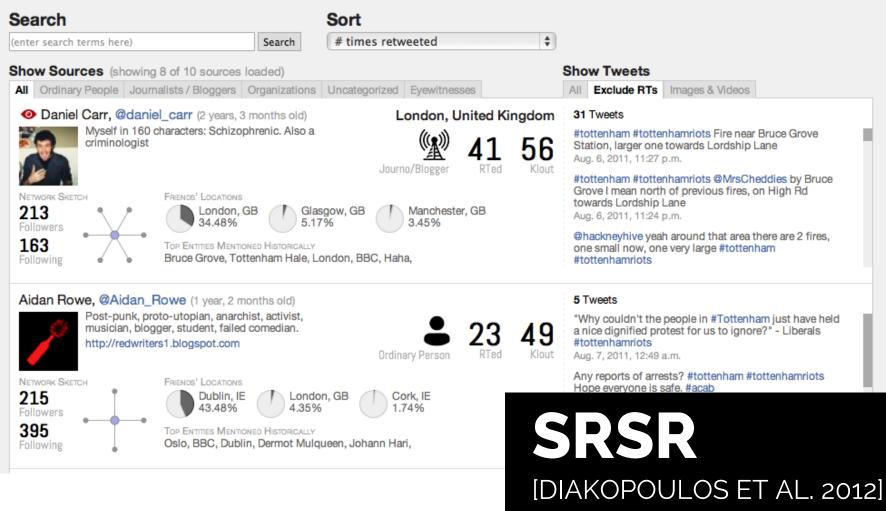
ECOSPHERE TIMELINE



HTTP://CNN-ECOSPHERE.COM/

Tottenham Riots

402 sources sharing 551 tweets matching "tottenhamriots" or "tottenham"



GOOGLE EARTH ENGINE

HTTPS://EARTHENGINE.GOOGLE.ORG/

MOREAPIS (<u>APPLICATION PROGRAMMING INTERFACES</u>)

NEW YORK TIMES APIS

http://developer.nytimes.com/

(Archival news articles from 1851, books, movies, geographical, and political data)

ECHONEST APIS

http://developer.echonest.com/

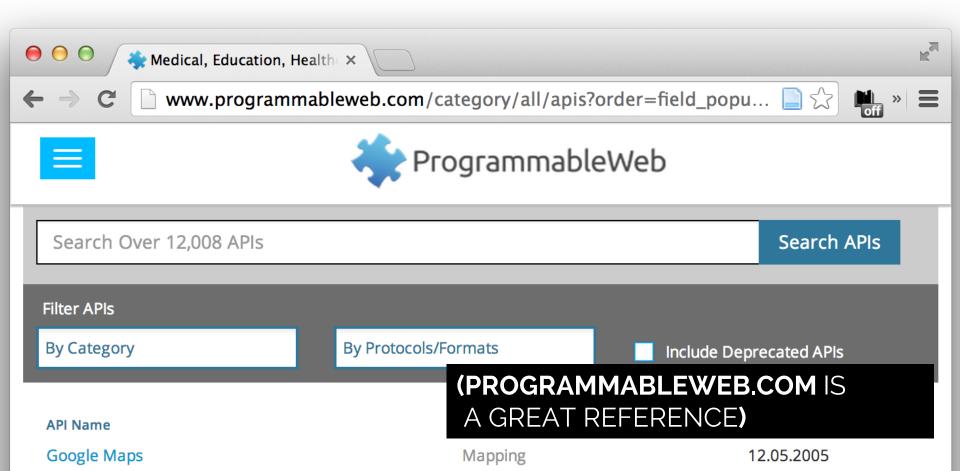
(Incredibly detailed Song, Album, Artist data for millions of musicians)

OPEN STREET MAP

http://wiki.openstreetmap.org/wiki/API

(Detailed location and map data for the whole world)

AND THE LIST GOES ON!



FINDING AND EXTRACTING EXISTING DATA

SCRAPING THE WEB

WHY SCRAPE?

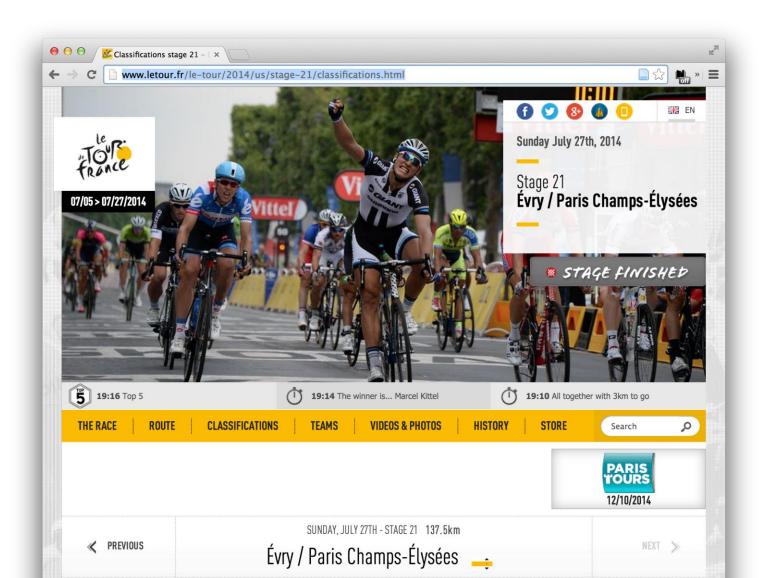
<u>No API exists</u> for the data you want (can't access the right data, wrong format, etc.)

<u>Simplicity</u> – Usually don't need to authenticate, no rate-limiting, etc.

Want to capture <u>context of pages</u> or relationship between them.

FOR EXAMPLE...



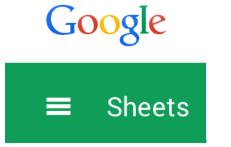


		OVERALL			STAGE				
👕 Individual 👕 Points			Individual 👕 Points 💿 Team 🛞 Climber						
		ndividual time e covered: 3660.5 KM	classi	fication					
RANK	RID	ER	RIDER NO.	TEAM	TIMES	GAP			
1.		NIBALI Vincenzo	41	ASTANA PRO TEAM	89h 59' (06''			
2.		PÉRAUD Jean-Christophe	81	AG2R LA MONDIALE	90h 06' 4	43'' + 07' 37"			
3.		PINOT Thibaut	127	FDJ.FR	90h 07' 3	21'' + 08' 15"			
4.	\$	VALVERDE BELMONTE Alejandro	11	MOVISTAR TEAM	90h 08' 4	46'' + 09' 40"			
5.		VAN GARDEREN Tejay	141	BMC RACING TEAM	90h 10' :	30'' + 11' 24"			
5.		BARDET Romain	82	AG2R LA MONDIALE	90h 10' :	32'' + 11' 26"			
7.		KONIG Leopold	201	TEAM NETAPP-ENDURA	90h 13' :	38'' + 14' 32"			
в.	3	ZUBELDIA AGIRRE Haimar	169	TREK FACTORY RACING	90h 17'	03'' + 17' 57"			
9.		TEN DAM Laurens	67	BELKIN PRO CYCLING	90h 17' :	17" + 18' 11"			
10.		MOLLEMA Bauke	61	BELKIN PRO CYCLING	90h 20' :	21'' + 21' 15"			
11.		ROLLAND Pierre	151	TEAM EUROPCAR	90h 22' :	13'' + 23' 07"			
12.		SCHLECK Frank	161	TREK FACTORY RACING	90h 24' :	54'' + 25' 48"			
13.		VAN DEN BROECK Jurgen	131	LOTTO-BELISOL	90h 33' (07'' + 34' 01"			
14.		TROFIMOV Yury	29	TEAM KATUSHA	90h 35' 4	47'' + 36' 41"			
15.		KRUIJSWIJK Steven	64	BELKIN PRO CYCLING	90h 37' :	21'' + 38' 15"			
16.		FEILLU Brice	211	BRETAGNE - SECHE ENVIRONNEMENT	90h 43' (05'' + 43' 59"			
17.		HORNER Christopher	114	LAMPRE - MERIDA	90h 43' 3	37'' + 44' 31"			
18.	\$	NIEVE ITURRALDE Mikel	5	TEAM SKY	90h 45' 3	37'' + 46' 31"			
19.		GADRET John	13	MOVISTAR TEAM	90h 46' :	36'' + 47' 30"			

SOMETIMES YOU DON'T NEED A SCRAPER!

A few tips and tricks...

PULLING DATA TABLES FROM THE WEB



IMPORTHTML

Imports data from a table or list within an HTML page.

Demographics of India

From Wikipedia, the free encyclopedia

This article is about the people from India. For other uses, see Indian (disambiguation).

The demographics of India are inclusive of the second most populous country in the world, with over 1.21 billion people (2011 census), more than a sixth of the world's population. Already containing 17.5% of the world's population, India is projected to be the world's most populous country by 2025, surpassing China, its population reaching 1.6 billion by 2050.^{[4][5]} Its population growth rate is 1.41%, ranking 102nd in the world in 2010.^[6] Indian population reached the billion mark in 2000.

D	emographics of India
Population	1,236,344,631 (July 2014 est.) ^[1] (2nd)
Growth rate	1.51% (2009 est.) (93rd)
Birth rate	20.22 births/1,000 population (2013 est.)
Death rate	7.4 deaths/1,000 population (2013 est.)
Life	68.89 years (2009 est.)
expectancy	
• male	67.46 years (2009 est.)
female	72.61 years (2009 est.)
Fertility rate	2.44 children born/woman (SRS 2011)
Infant mortality rate	44 deaths/1,000 live births (2011 est.)
	Age structure

Rank	State / Union Territory	Туре	Population	% ^[18]	Area ^[19] (km²)	Density (/km²)	Males	Females	Sex Ratio [20]	Literacy	Rural ^[21] Population	Urban ^[21] Population	
1	Uttar Pradesh	State	199,812,341	16.50	240,928	828	104,480,510	95,331,831	912	67.68	131,658,339	34,539,582]
2	Maharashtra	State	121,455,333	9.28	307,713	365	58,243,056	54,131,277	929	82.34	55,777,647	41,100,980]
3	Bihar	State	103,804,637	8.60	94,163	1,102	54,278,157	49,821,295	918	61.80	74,316,709	8,681,800	
4	West Bengal	State	91,276,115	7.54	88,752	1,030	46,809,027	44,467,088	950	76.26	57,748,946	22,427,251	
5	Madhya Pradesh	State	72,626,809	6.00	308,245	236	37,612,306	35,014,503	931	69.32	44,380,878	15,967,145]
6	Tamil Nadu	State	72,147,030	5.96	130,058	555	36,137,975	36,009,055	996	80.09	34,921,681	27,483,998	
7	Rajasthan	State	68,548,437	5.66	342,239	201	35,550,997	32,997,440	928	66.11	43,292,813	13,214,375	
8	Karnataka	State	61,095,297	5.05	191,791	319	30,966,657	30,128,640	973	75.36	34,889,033	17,961,529]
9	Guiarat	State	60.439.692	4.99	196.024	308	31.491.260	28.948.432	919	78.03	31.740.767	18.930.250	
1	ēr ~ 7	\$	% .0 ₄	.0 <u>0</u>	123 -	Aria	ıl	-	10 -	В	I S	Α -	۵
=	ImportHtml("ht	tp:/	/en.wik	ipedi	ia.org	/wiki/	Demogr	aphics	_of_In	dia",	"table"	',4)	
	Δ		B		С			D		F		F	

Population distribution in India by states

	А	В	С	D	E	F
1	Rank	State / Union Territory	Туре	Population	% [18]	Area [19] (km²)
2	1	Uttar Pradesh	State	199,812,341	16.5	240,928
3	2	Maharashtra	State	121,455,333	9.28	307,713
4	3	Bihar	State	103,804,637	8.6	94,163
5	4	West Bengal	State	91,276,115	7.54	88,752
6	5	Madhya Pradesh	State	72,626,809	6	308,245
7	6	Tamil Nadu	State	72,147,030	5.96	130,058

PARSING

Tabula



Tabula is a tool locked inside P

2		
All Students	79,858	99%
Gender		
Male	40,492	98%
Female	39,134	99%
Ethnicity		
White	10,665	99%
Black	49,379	99%
Latino/Hispanic	13,717	98%
Asian	4,746	100%
Native American	132	99%
Multiracial	941	98%
Other Groups		
IEP	11,471	98%
	Use	row/columns separators
	Close Copy to clipboard as C	SV Download data

BUILDING A WEB SCRAPER

FETCHING DATA + PARSING DATA

YOU SHOULD **SEPARATE** THESE PROCESSES **WHENEVER POSSIBLE**!

FETCHING

DON'T DO EVERYTHING AT ONCE

Download complete pages and save them locally <u>before</u> you process them.

DEALING WITH PAGINATION

If results or records are spread across multiple pages, you may need to parse the page to find the link to the next page.

PARSING

SERIOUSLY, DON'T DO EVERYTHING AT ONCE!

Processing data from local files means you don't have to get it right the first time.

USE YOUR BROWSER'S DEVELOPER TOOLS

All modern web browsers have built-in tools that let you inspect web pages.

BE CAREFUL - YOU CAN GET YOURSELF BLOCKED

Many sites will try to slow or block heavy access (both to prevent scraping and DoS attacks)

To get around this...You can introduce delays in your scraper or scrape from multiple locations.

A FEW MORE NOTES ABOUT DATA MANAGEMENT

FORMATS AND BEST-PRACTICES

DATA FORMATS

STRUCTURED vs. UNSTRUCTURED

<u>STRUCTURED DATA</u> is more like what you'd find in a traditional spreadsheet or database. <u>UNSTRUCTURED DATA</u> can include raw text,

streaming data, even images or video.

<u>SEMI-STRUCTURED DATA</u> is more organized, but doesn't follow a fixed schema (e.g. DBPEDIA data)



(Comma-Separated Value)

1 firstName,lastName,age,streetAddress,city,state
2 John,Smith,25,21 2nd Street,New York,NY,10021,2

firstName	lastName	age	streetAddress	city	state	postalCode	homePhoneNumber	faxPhoneNumber	gender
John	Smith	25	21 2nd Street	New York	NY	10021	212 555-1239	646 555-4567	male



(e<u>X</u>tensible <u>M</u>arkup <u>L</u>anguage)

```
<person>
  <firstName>John</firstName>
  <lastName>Smith</lastName>
  <age>25</age>
  <address>
    <streetAddress>21 2nd Street</streetAddress>
    <city>New York</city>
    <state>NY</state>
    <postalCode>10021</postalCode>
  </address>
  <phoneNumbers>
    <phoneNumber type="home">212 555-1234</phoneNumber>
    <phoneNumber type="fax">646 555-4567</phoneNumber>
  </phoneNumbers>
```

<gender>

firstName	lastName	age	streetAddress	city	state	postalCode	homePhoneNumber	faxPhoneNumber	gender
John	Smith	25	21 2nd Street	New York	NY	10021	212 555-1239	646 555-4567	male



(JavaScript Object Notation)

```
"firstName": "John",
"lastName": "Smith",
"age": 25,
"address": {
    "streetAddress": "21 2nd Street",
    "city": "New York",
    "state": "NY",
    "postalCode": "10021"
},
"phoneNumber": [
    {
        "type": "home",
        "number": "212 555-1239"
    },
    {
        "type": "fax",
        "number": "646 555-4567"
```

firstName	lastName	age	streetAddress	city	state	postalCode	homePhoneNumber	faxPhoneNumber	gender
John	Smith	25	21 2nd Street	New York	NY	10021	212 555-1239	646 555-4567	male

YAML

(YAML Ain't Markup Language)

```
firstName: John
lastName: Smith
age: 25
address:
    streetAddress: 21 2nd Street
    city: New York
    state: NY
    postalCode: 10021
```

phoneNumber:

type: home number: 212 555-1234

type: fax

firstName	lastName	age	streetAddress	city	state	postalCode	homePhoneNumber	faxPhoneNumber	gender
John	Smith	25	21 2nd Street	New York	NY	10021	212 555-1239	646 555-4567	male

HANDLING DATA

STORING DATA

- Always keep <u>backups</u>
- <u>Password protect</u> or <u>encrypt</u> any data with personal or sensitive information

PROVENANCE

- Keep track of <u>where/when</u> data was collected
- Record any data processing steps so you (or others) can repeat them if necessary

IP, COPYRIGHT, AND (RE)SHARING DATA

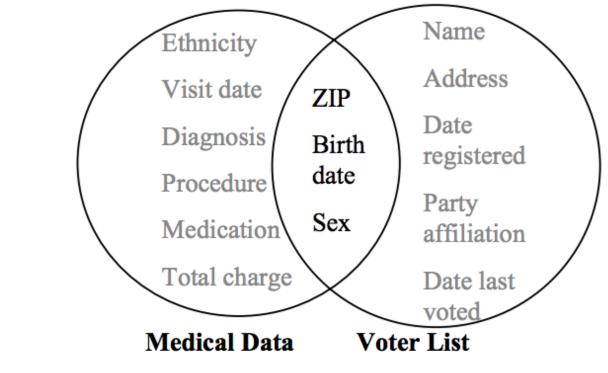
- Be sure you know who <u>owns</u> the data.
- Think early on about whether or not you'll need to <u>publish</u> or <u>(re)share</u> data.
- Be careful you <u>aren't violating</u> <u>copyright</u>, especially when scraping.

PRIVACY AND ANONYMIZING DATA

- Any information that could be used to identify individuals is sensitive!
- There may be <u>legal reprecussions</u> for releasing it.
- In some cases you might need to <u>anonymize</u> data before sharing.

JUST REMOVING NAMES IS OFTEN NOT ENOUGH!

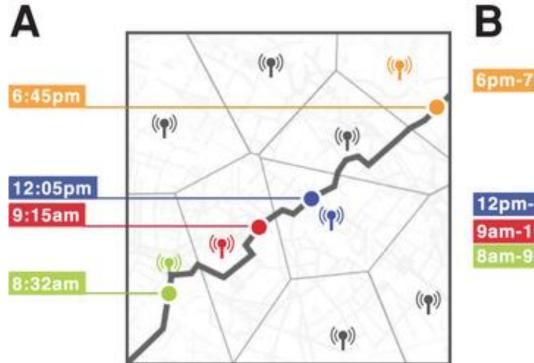
OTHER INFORMATION CAN STILL BE UNIQUE

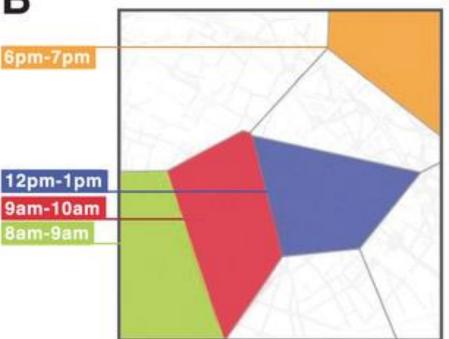


k-ANONYMITY: A MODEL FOR PROTECTING PRIVACY

[L. Sweeney. 2002]

LOCATION DATA IS ESPECIALLY SENSITIVE





[de Montjoye et al. 2013] <u>Unique in the Crowd: The privacy bounds of human mobility</u>

REGULATIONS (ACADEMIA AND RESEARCH)

Institutional Review and Ethics Boards may need to approve experiments or data collection <u>before it happens.</u>

Studies involving people may need informed consent.

REGULATIONS (INDUSTRY)

Some governments have placed limits on <u>how long</u> user data can be kept.

Some kinds of tracking (e.g., cookies) may now require <u>opt-in</u> or <u>notifications</u>. (However this varies by country).

SOCIAL EXPERIMENTS

sotal evidence of massive-scale emotional

Exper cont

Adam D

^aCore Dat CA 9414'

PNAS

DNAS

Senator asks FTC to investigate Facebook's mood study After the social network altered the news feeds of nearly 700,000 users Autor without tolling them, Sen. Mark R. Warner wants to know if there should be Edited oversight on these types of experiments. Emo cont without them in laboratory experime negative emotions to others. networks [Fowler JH, Christakis NA (2008) BMJ 337:a. though the results are controversial. In an experiment with people who use Facebook, we test whether emotional contagion occurs outside of in-person interaction between individuals by reducing the amount of emotional content in the News Feed. When positive expressions were reduced, people produced fewer positive posts and more negative posts; when negative expressions were reduced, the opposite pattern occurred. These results indicate that emotions expressed by others on Facebook influence our own emotions, constituting experimental evidence for massive-scale contagion via social networks. This work also suggests that, in contrast to prevailing assumptions, in-person interaction and nonand a low a second state as a second s

PSYCHOLS COGNITIVE SCIE

stories, and activities undertaken by meprimary manner by which people see content than Which content is shown or omitted in the News Feeu termined via a ranking algorithm that Facebook continually develops and tests in the interest of showing viewers the content

they will find most relevant and engaging. One such test is

"EXPERIMENTING ON HUMAN BEINGS"



Dating Research from OkCupid

We Experiment On Human Beings!

July 28th, 2014 by Christian Rudder



I'm the first to admit it: we might be popular, we might create a lot of great relationships, we might blab blab blab. But OkCupid doesn't

IN SUMMARY: THERE ARE LOTS OF TOOLS AT YOUR DISPOSAL!

COLLECT IT

- OBSERVATION
- SURVEYS
- LOGGING
- SENSORS
- CROWDSOURCING

FIND OR EXTRACT IT

- OPEN CORPUSES
- DATA RETAILERS
- APIS
- SCRAPING THE WEB

GENERATE IT - SIMULATIONS

(...AND WE'LL BE HAPPY TO DISCUSS OR SUGGEST MORE)



TUTORIAL 2 – BUILDING A WEB SCRAPER

NEXT WEEK DATA CLEANING

BEFORE NEXT WEEK'S CLASS

INSTALL :



OpenRefine (formerly Google Refine) <u>http://openrefine.org/</u>

DATA COLLECTION

Slides by WESLEY WILLETT

VISUAL ANALYTICS