Unlock Unstructured Data

Hui Lin

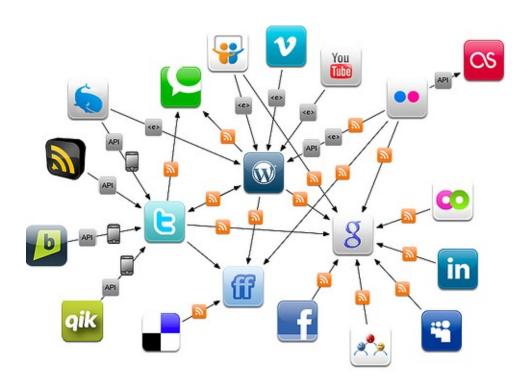
2016-12-16

What I do?

Outline

- What?
- Why?
- Where?
- Automatic data pipeline
- Data analysis
- Visualization and Report
- Cross functional collaboration

What is Unstructured Data?



Why?—It is everywhere

- Open government data
- Search engine data
- Services that track social behavior
- Social media data

Why?—Practical arguments

- Social media is impactful! [Amusing Ourselves to Death: Public Discourse in the Age of Show Business (1985)]
 - "the medium is the message"
 - "the medium is the metaphor"
 - "the form excludes the content"
- Financial resources are sparse
- ... and so is our time
- Reproducibility

Where to get the data?

- API: Twitter/Google/Wikipedia...
- Webpage: Forum, Reviews
- Survey
- Interviews

API: Trump v.s Clinton Wikipedia View

Static Web: Wikipedia

Show 10 \$ entries					S	Search:	:h:				
		nan	ne						n		
I	Ronald Fisher								36		
2	Karl Pearson								28		
3	Jerzy Neyman								17		
4	Udny Yule								13		
5	Abraham Wald								12		
6	Milton Friedman								11		
7	Alexander Alexandrovich Ch	iuprov							10		
8	Arthur Lyon Bowley								10		
9	Dennis Lindley								10		
10	Harold Hotelling								10		
Showing	g I to I0 of 621 entries Previou	ıs I	2	3	4	5	•••	63	Next		

Static Web: buzzfeed.com

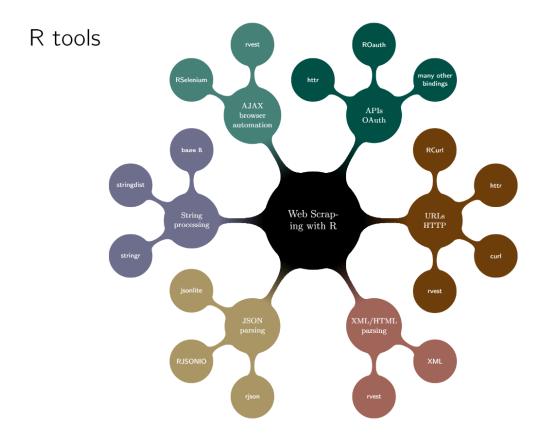
Show 10 \$\pi\$ entries Search:										
				Titles	5					
ı	Download The BuzzFee	d App Now!								
2	23 Cheap Ways To Seen	n Like You're	Actual	ly Fanc	у					
3	17 Stunning Women Who Make 'The Big Chop' Look So Damn Good									
4	The Internet Has Decided On Its Favorite Cursed Child Couple									
5	How Normal Are Your	Burger Choic	es?							
6	Can You Get Through T	his Post Witl	nout Sp	pending	g \$50					
7	What's The Deal With	Those Men's	Gymna	stics "(Onesie	s"?				
8	Raise Your Kitchen Gam	ne With The	BuzzFe	ed Foc	d New	sletter	·!			
9	9 I7 Things All Secretly Judgmental People Will Understand									
10	Oh My God, Beach Volle	eyball Is Magn	ificent							
Showii	ng I to 10 of 98 entries	Previous	I	2	3	4	5	• • •	10	Next

Static Web: buzzfeed.com

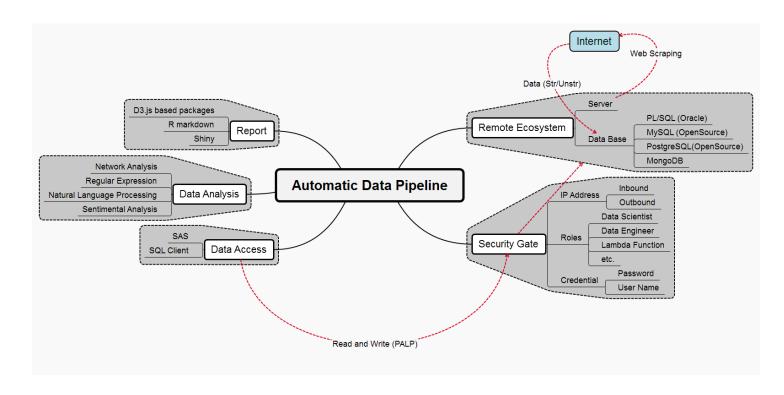
Show 10 \$	entries					Sea	arch:			
		autho	ors							Freq
ı	David Mack									5
2	Alicia Melville-Smit	:h								3
3	Andy Neuenschwa	ınder								3
4	Adam Davis									2
5	Adolfo Flores									2
6	Brian Galindo									2
7	Casey Rackham									2
8	Erin Chack									2
9	Erin La Rosa									2
10	Gena-mour Barret	t								2
Showing I to	10 of 68 entries	Previous	I	2	3	4	5	6	7	Next

Summary of packages

https://github.com/ropensci/user2016-tutorial



Automatic Data Pipeline



Data Analytics: Regular Expression



Data Analytics: Regular Expression

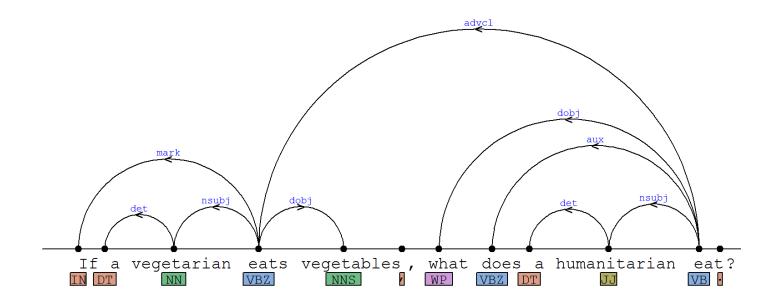
http://stat545.com/block022_regular-expression.html

```
## [1] "P9929AMXT" "P9703AM" "P0506AM" "P1197AM" "P1271AM"
```

Data Analytics: Natural Language Processing

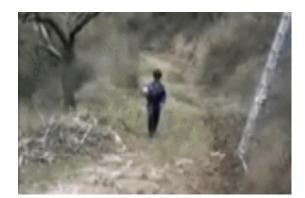


NLP: How does computer understand language?



Issue driven

■ If you don't know where to go



Issue driven

■ If you don't know where to go ...



■ If you know where to go ...

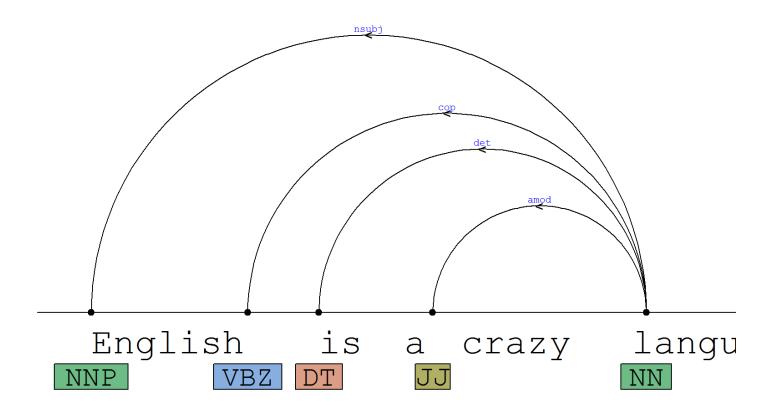


NLP: What are you interested in?

```
truck play parkway hamburger grocers teachers hamburger grocers teachers hamburger grocers teachers fingles backway funders and drive play be play be
```

NLP: What are you interested in?

```
## [1] "English is a crazy language"
## [1] "English muffins"
```



Marketing Campaign: #yieldhero

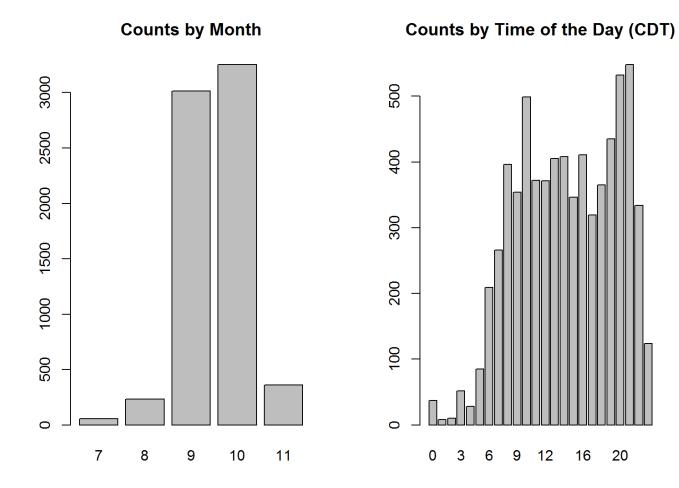
- When is the best time to tweet
- Who to target
- Product mentioned
- Sentiment score

#yieldhero Summary Statistics

- From 2016-07-28 to 2016-11-18
- There are 6914 tweets, 1930 original tweets
- Products mentioned > 20 times
 - P1197AM
 - P0157AMX
 - P22T73R
 - P28T08R

When is the best time to tweet?

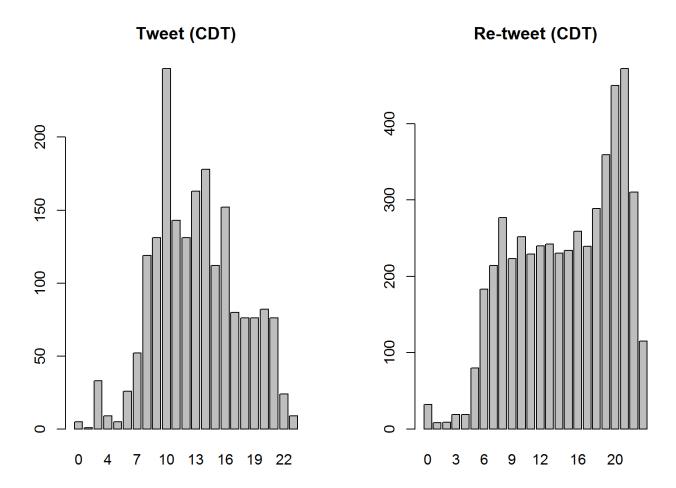
Total Tweet Counts



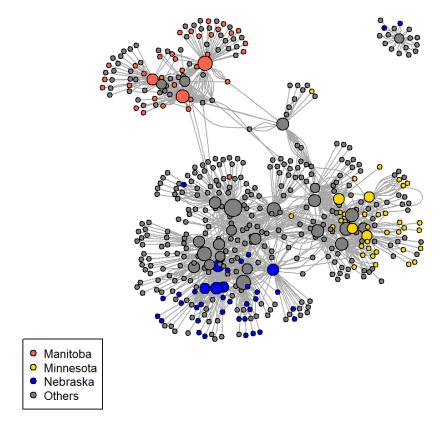
20

When is the best time to tweet?

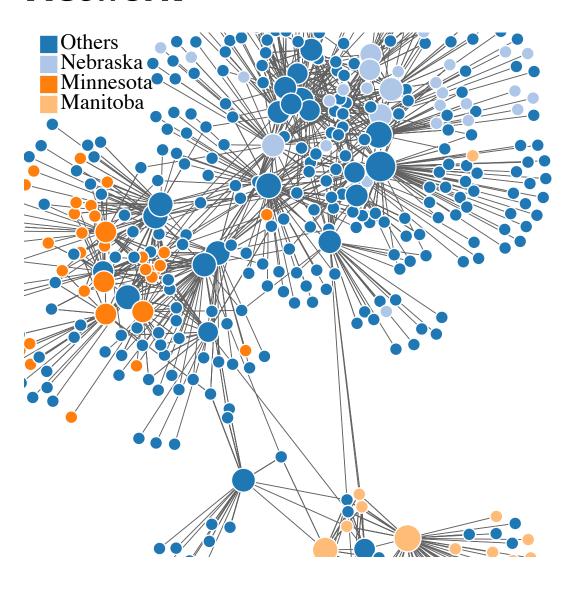
Tweet and Re-tweet counts by time of the day



Who to target?



Network



Who to target?

Show	5 centries				Seai	rch:		
	name				size			state
	All	All				All		
I	PallasSeeds				I		L	Inknown
2	jrjr58				I			Indiana
3	frenchrw				I			Texas
4	Pioneer_IL				I			Illinois
5	DarrenVanness				I		N	lebraska
Show	ing I to 5 of 482 entries							
	Previous		2	3	4 5	•••	97	Next

Products Mentioned

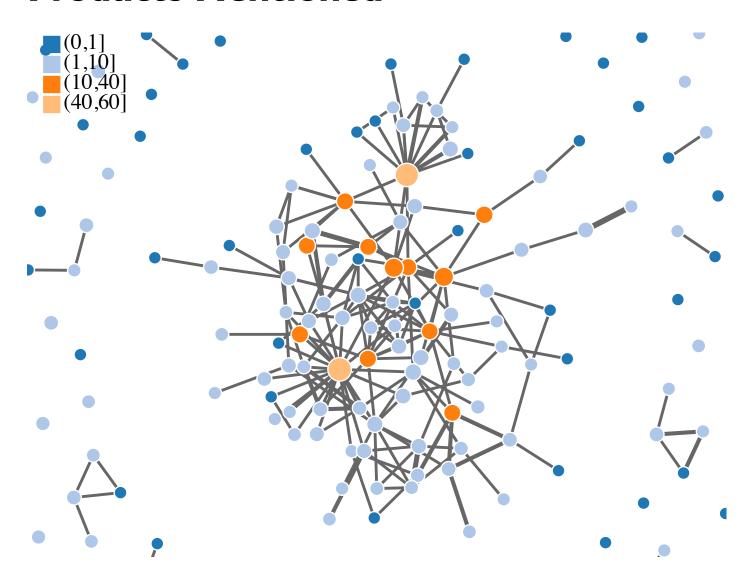


Table of Products

Show 7 \$\cdot\text{entries}				Search:								
	PRO	D_NM								size		
	All				All							
I	PI197AM									48		
2	P0157AMX									47		
3	P22T73R									21		
4	P28T08R									21		
5	P9188AM									14		
6	P0506AM									13		
7	P0589AMXT									13		
Show	ing I to 7 of 209 entries	Previous	I	2	3	4	5	•••	30	Next		

Shiny App Example

library(shiny)

runApp('Rcode/Shiny_NLP')

Is web scraping legal?

- No unambiguous yes or no in any country according to current jurisdiction
- So far, court cases (especially in the US) often dealt with commercial interest and often huge masses of data
 - eBay vs. Bidder's Edge
 - AP vs. Meltwater
 - Facebook vs. Pete Warden
 - United States vs. Aaron Swartz

Recommendation for your work

- Encrypt sensitive personal identifiable information
- YOU take all the responsibility for your web scraping work
- If you publish data, do not commit copyright fraud
- If in doubt, ask the author/creator/provider of data for permission
- Consult current jurisdiction

Trick: robots.txt

What is robots.txt?

"Robots Exclusion Protocol", informal protocol to prohibit web robots from crawling content

- Located in the root directory of a website, e.g. http://baidu.com/robots.txt
- Documents which bot is allowed to crawl which resources (and which not)
- Not a technical barrier, but a sign that asks for compliance
- Syntax in robots.txt
- Scraping etiquette

Data and Code

All data are available in the package I am developing:

```
library(devtools)
install_github("happyrabbit/DataScienceR")
library(DataScienceR)
```

- Slides and R code can be found here:
- http://scientistcafe.com/