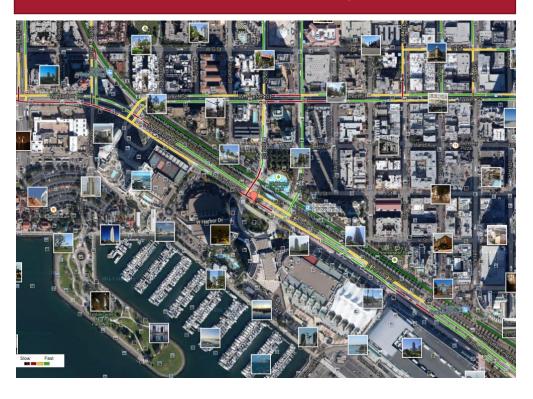
Text Mining



What is Text Mining?

- Extract new insights from text
- Let's you drink from a fire hose of information
- Language is hard; many unsolved problems
 - Unstructured
 - Expression is individualistic
 - Multi-language/cultural implications

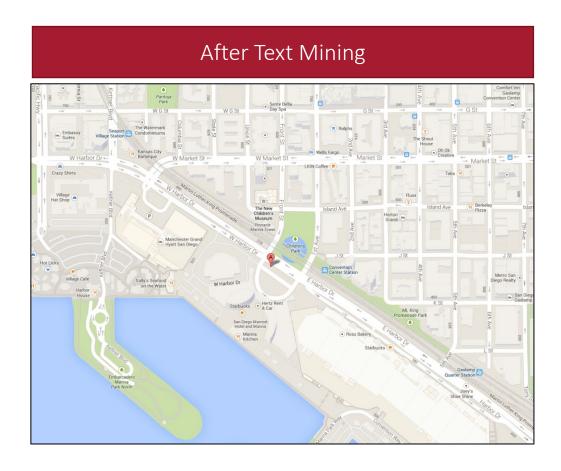
Before Text Mining



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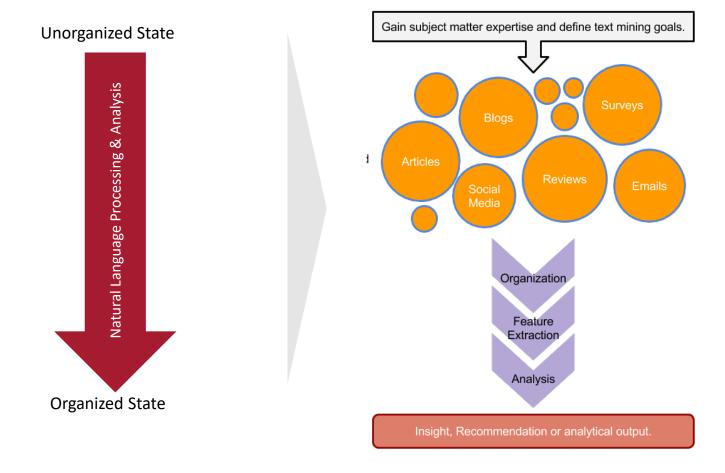
What is Text Mining?

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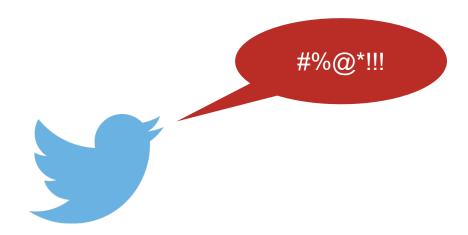
TM Project Workflow



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A safe/supportive learning environment

- This text has never been read. "Keyboard Courage" is rampant which may entail some less than ideal topics.
 - Twitter is a realistic Natural Language Channel
 - It is a great place to get topics, and messy challenging data.
 - As a safe learning environment, no offense is intended, merely exposure to a real data set. If offended, please reach out and I will get you additional data sets.



Let's Practice Review!

A_more_string_manipulation.R

B real text Search Manipulation.R

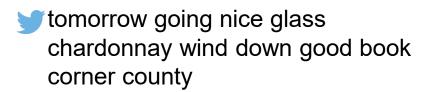


R for Cleaning Steps

Tomorrow I'm going to have a nice glass of Chardonnay and wind down with a good book in the corner of the county:-)



- 1.Remove Punctuation
- 2.Remove extra white space
- 3.Remove Numbers
- 4.Make Lower Case
- 5.Remove "stop" words



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Meta Example

\$doc id'

'\$text'

META: \$favorited, \$created ...

doc id	text	favorited	replyToSN	created	truncated	replyToSID	id	replyToUID	statusSource	screenName	retweetCount	retweeted	longitude	latitude								
_	@ayyytylerb that is so true drink lots of coffee			8/9/2013 2:43					<a href="http://twitter.co</td><td></td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>RT @bryzy brib: Senior March tmw morning at 7:25 A.M. i</td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>NA</td><td>3.65665E+17</td><td></td><td><a href=" http:="" td="" twitter.co<=""><td>, ,</td><td>1</td><td>FALSE</td><td>NA</td><td>NA</td>	, ,	1	FALSE	NA	NA								
	If you believe in #gunsense tomorrow would be a very go		NA	8/9/2013 2:43		NA	3.65665E+17		web	ianeCkav	0		NA	NA								
	My cute coffee mug. http://t.co/2udvMU6XIG		NA	8/9/2013 2:43		NA	3.65665E+17		<a href="http://twitter.co</td><td>, ,</td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>RT @slaredo21: I wish we had Starbucks here Cause coff</td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>NA</td><td>3.65665E+17</td><td></td><td><a href=" http:="" td="" twitter.co<=""><td></td><td>2</td><td>FALSE</td><td>NA</td><td>NA</td>		2	FALSE	NA	NA								
_	Does anyone ever get a cup of coffee before a cocktail??		NA	8/9/2013 2:43		NA	3.65665E+17		<a and<="" bitter,="" coffee="" href="http://twitter.co</td><td></td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>" i="" like="" my="" td="" womenblack,=""><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>NA</td><td>3.65665E+17</td><td></td><td><a href="http://twitter.co</td><td></td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>@dreamwwediva ya didn't have coffee did ya?</td><td></td><td></td><td>8/9/2013 2:43</td><td></td><td></td><td></td><td></td><td></td><td>_</td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>RT @iDougherty42: I just want some coffee.</td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>3.03004E+17</td><td>3.65665E+17</td><td></td><td><a href=" http:="" td="" twitter.co<=""><td></td><td>1</td><td></td><td>NA</td><td>NA</td></td>		NA	8/9/2013 2:43		NA	3.65665E+17		<a href="http://twitter.co</td><td></td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>@dreamwwediva ya didn't have coffee did ya?</td><td></td><td></td><td>8/9/2013 2:43</td><td></td><td></td><td></td><td></td><td></td><td>_</td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>RT @iDougherty42: I just want some coffee.</td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>3.03004E+17</td><td>3.65665E+17</td><td></td><td><a href=" http:="" td="" twitter.co<=""><td></td><td>1</td><td></td><td>NA</td><td>NA</td>		1		NA	NA
	RT @Dorky76: I can't care before coffee.		NA	8/9/2013 2:43		NA	3.65664E+17		<a href="http://tapbots.o</td><td>•</td><td>2</td><td></td><td>NA</td><td>NA</td></tr><tr><td>_</td><td></td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>NA</td><td>3.65664E+17</td><td></td><td><a href=" http:="" td="" twitter.co<=""><td></td><td>2</td><td></td><td>NA</td><td>NA</td>		2		NA	NA								
_	No lie I wouldn't mind coming home smelling like coffee										0											
	RT @JonasWorldFeed: Play Ping Pong with Joe. Take a tou		NA	8/9/2013 2:43		NA	3.65664E+17		<a href="http://www.ech</td><td></td><td>6</td><td></td><td>NA</td><td>NA</td></tr><tr><td>_</td><td>Have I ever told any of you that Tate Donovan bought my</td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>NA</td><td>3.65664E+17</td><td></td><td></td><td>CurlysCrazyMofo</td><td>0</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>RT @JonasWorldFeed: Play Ping Pong with Joe. Take a tou</td><td></td><td>NA</td><td>8/9/2013 2:43</td><td></td><td>NA</td><td>3.65664E+17</td><td></td><td></td><td>JoeJonasVA</td><td>6</td><td></td><td>NA</td><td>NA</td></tr><tr><td></td><td>@HeatherWhaley I was about 2 joke it takes 2 hands to ho</td><td></td><td></td><td>8/9/2013 2:42</td><td></td><td>3.65647E+17</td><td>3.65664E+17</td><td></td><td><a href=" http:="" td="" twitter.co<=""><td></td><td>0</td><td></td><td>NA</td><td>NA</td>		0		NA	NA								
	RT @MoveTheSticks: Charlie Whitehurst looks like he sho	FALSE	NA	8/9/2013 2:42		NA	3.65664E+17	NA	<a href="http://twitter.co</td><td></td><td>42</td><td>FALSE</td><td>NA</td><td>NA</td></tr><tr><td>17</td><td>Coffee always makes everything better.</td><td>FALSE</td><td>NA</td><td>8/9/2013 2:42</td><td>FALSE</td><td>NA</td><td>3.65664E+17</td><td></td><td></td><td>sharkshukri</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td></tr><tr><td>18</td><td>RT @AdelaideReview: Food For Thought: @Annabelleats</td><td>FALSE</td><td>NA</td><td>8/9/2013 2:42</td><td>FALSE</td><td>NA</td><td>3.65664E+17</td><td>NA</td><td><a href=" http:="" td="" twitter.co<=""><td>thepaulbaker</td><td>1</td><td>FALSE</td><td>NA</td><td>NA</td>	thepaulbaker	1	FALSE	NA	NA								
19	RT @LittleMelss: Imfao!!!"@bryanlaca: nahhh Melanie u i	FALSE	NA	8/9/2013 2:42	FALSE	NA	3.65664E+17	NA	web	bryanlaca	1	FALSE	NA	NA								
20	I wonder if Christian Colon will get a cup of coffee once th	FALSE	NA	8/9/2013 2:42	FALSE	NA	3.65664E+17	NA	<a href="http://www.my</td><td>Shauncore</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td></tr><tr><td>21</td><td>Shouldn't have drank coffee I'm jittery as fuck.</td><td>FALSE</td><td>NA</td><td>8/9/2013 2:42</td><td>FALSE</td><td>NA</td><td>3.65664E+17</td><td>NA</td><td><a href=" http:="" td="" twitter.co<=""><td>DylanBaur</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td>	DylanBaur	0	FALSE	NA	NA								
22	#good_morning <u+2615><ed><u+00a0><u+00bd><ed><u< td=""><td>FALSE</td><td>NA</td><td>8/9/2013 2:42</td><td>FALSE</td><td>NA</td><td>3.65664E+17</td><td>NA</td><td><a href="http://instagran</td><td>LadyMonyAna1</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td></tr><tr><td>23</td><td>@kungfupussy You might need to do a bulk shipment to N</td><td>FALSE</td><td>kungfupus</td><td>8/9/2013 2:42</td><td>FALSE</td><td>3.65664E+17</td><td>3.65664E+17</td><td>19478601</td><td><a href=" http:="" janetter.<="" td=""><td>Gridlock_Coffee</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td></td></u<></ed></u+00bd></u+00a0></ed></u+2615>	FALSE	NA	8/9/2013 2:42	FALSE	NA	3.65664E+17	NA	<a href="http://instagran</td><td>LadyMonyAna1</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td></tr><tr><td>23</td><td>@kungfupussy You might need to do a bulk shipment to N</td><td>FALSE</td><td>kungfupus</td><td>8/9/2013 2:42</td><td>FALSE</td><td>3.65664E+17</td><td>3.65664E+17</td><td>19478601</td><td><a href=" http:="" janetter.<="" td=""><td>Gridlock_Coffee</td><td>0</td><td>FALSE</td><td>NA</td><td>NA</td>	Gridlock_Coffee	0	FALSE	NA	NA								
24	Gold Coast JCC Friday News features profile on new coffe	FALSE	NA	8/9/2013 2:42	FALSE	NA	3.65664E+17	NA	web	GCJCC	0	FALSE	NA	NA								
25	Sometimes I start dancing on my coffee table because I ca	FAISE	NΔ	8/9/2013 2:42	FAISE	NΔ	3 65664F+17	NΔ														

- ID is for organization
- Text is the information we want to examine
- Meta adds context to our observations.

For Bag of Words, how is data organized?

Term Document Matrix								
	Tweet1	Tweet 2	Tweet3	Tweet4		Tweet_n		
Term1	0	0	0	0	0	0		
Term2	1	1	0	0	0	0		
Term3	1	0	0	2	0	0		
	0	0	3	0	1	1		
Term_n	0	0	0	1	1	0		

Document Term Matrix								
	Term1	Term2	Term3		Term_n			
Tweet1	0	1	1	0	0			
Tweet2	0	1	0	0	0			
Tweet3	0	0	0	3	0			
	0	0	0	1	1			
Tweet_n	0	0	0	1	0			

Code to Create the DTM/TDM and change to a matrix

11/14/2021

txtDtm<-DocumentTermMatrix(txtCorpus)
txtTdm<-TermDocumentMatrix(txtCorpus)
txtDtmM<-as.matrix(txtDtm)
txtTdmM<-as.matrix(txtTdm)</pre>

Why are DTM & TDM Sparse? What do they represent?

55

The matrices are sparse (many 0's) so additional steps may be needed to extract information.

Kwartler CSCI -96

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Let's Practice Review!

C_text_organization.R

