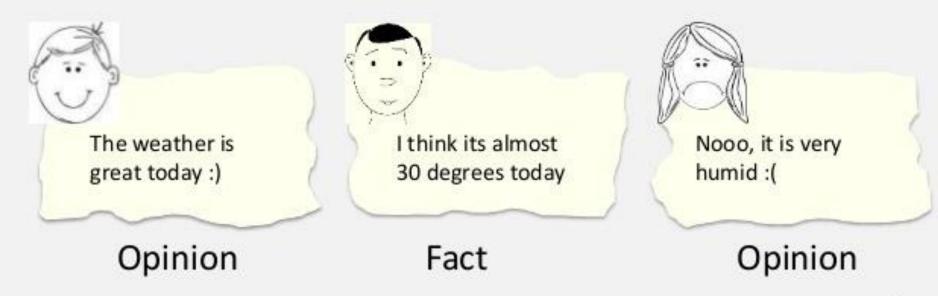
Sentiment Analysis using Modified Naive Bayes Classifier

Sentiment Analysis

"Sentiment analysis is the task of identifying positive and negative opinions, emotions and evaluations in text"



Introduction

 Sentiment analysis (opinion mining) is a Natural Language Processing and information extraction task.

• Identify opinion expressed in text as positive, negative and neutral.

Need

Mainly built for commercial use.

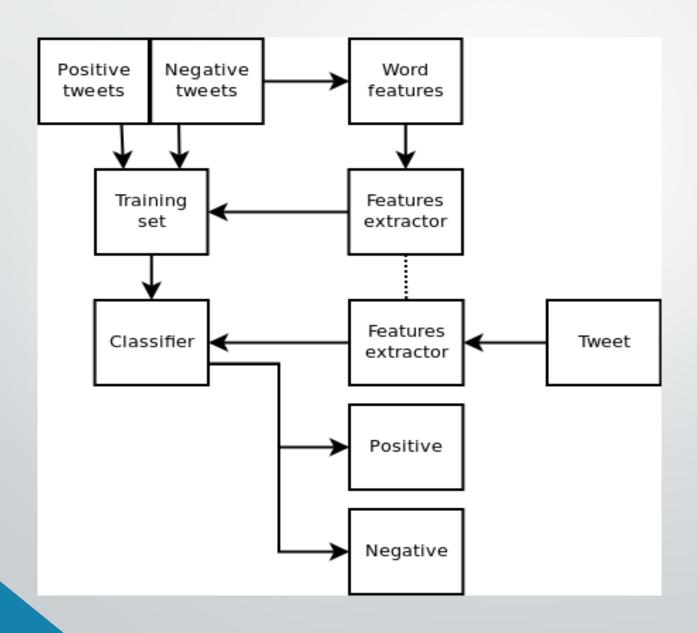
Journal ob Engineening Associates (188N: Paper published in, International 2320-0804) # 92 | Volume 5 1884e 3' Modibied Naive Bayes classifien, «sentiment Analysis using

Aim

To analyze the sentiments about a particular movie of user's interest which is discussed on twitter.



Here is a summary of what we did



Implementation Details

EXAMPLE

Good: 506

Bad: 507

Goodness: 506/(506+507) = 0.5

Badness: 507/(506+507)= 0.5

Good: 10

Bad: 14

Goodness: 10/(14+10) = 0.41

Badness: 14/(14+10)=0.59

"it's rather like a lifetime special -- pleasant , sweet and forgettable . "

Good: 15

Bad: 6

Goodness: 15/(6+15) = 0.71

Badness: 6/(6+15)= 0.29

Good: 46

Bad: 22

Goodness: 46/(46+22) = 0.68

Badness: 22/(46+22)=0.32

"it's rather like a lifetime special -- pleasant, sweet and forgettable."



	#GOOD	#BAD	GOODNESS	BADNESS
it's	506	507	0.5	0.5
rather	42	63	0.4	0.6
like	242	396	0.61	0.39
a	3446	3112	0.53	0.47
lifetime	3	5	0.38	0.62
special	29	40	0.42	0.58
pleasant	15	6	0.71	0.29
sweet	46	22	0.68	0.32
and	3198	2371	0.57	0.43
forgettable	10	14	0.42	0.58

"BAG OF WORDS" model



SUM: 5.22 4.8

So we should classify this as a POSITIVE review!

PLAN

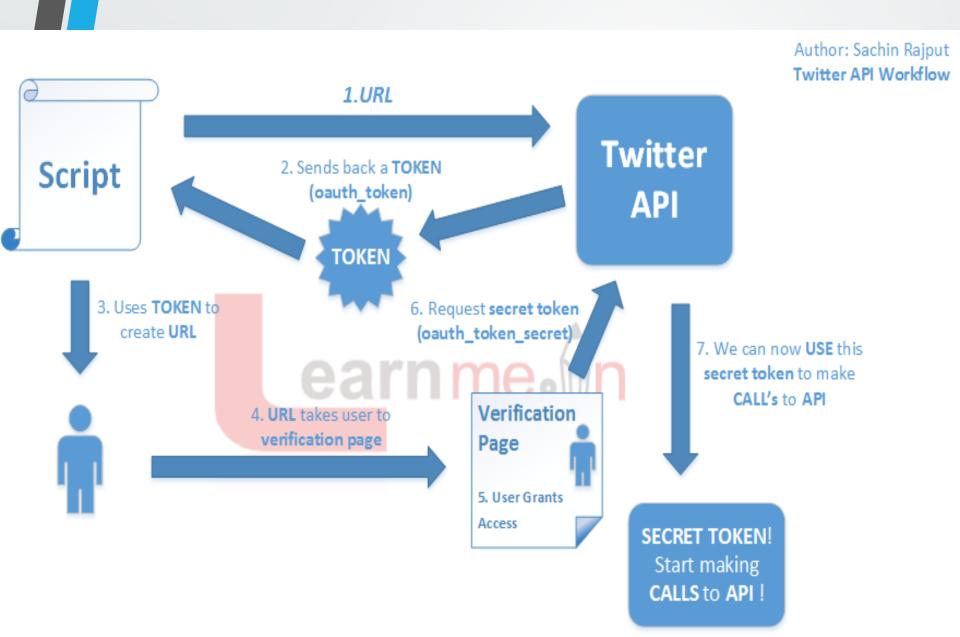
- Unigram tokenizer (look at one word at a time)
- •Tokens were stemmed (with the <u>Porter stemmer algorithm</u>; this converts "greater", "greatest", and "greatly" all to "great", thereby giving us more data points for the concept "great" and reducing our entropy)
- •Flag any word to the left and right of a negation term (i.e., put an exclamation point in front of any word next to "not" or "never" or similar; this turns that word into a different, negatively-connotated word as far as Bayes is concerned. "great" becomes distinct from "!great", which implies "not great".)
- •Deal with rare tokens by pulling them towards 50% "wordicity" (a term I use in the Bayes article) with a weight of 3 (i.e., words we've seen fewer times are forced closer to 50%, because we don't trust them as much).
- •Only label a document if we determine the probability to be 75% or greater.

Dataset

Positive and Negative classified dataset of Movie Reviews is obtained from website of University of Cornell

Neutral dataset of Movie Reviews is **manually** collected and classified from twitter.

TWITTER API + OAUTH2



Create an application

Name: *	
BresponZive Pro	
our application name. This is used to a	ttribute the source of a tweet and in user-facing authorization screens. 32 characters max.
Description: *	
BresponZive Pro Social Counter	r Widget
our application description, which will	be shown in user-facing authorization screens. Between 10 and 200 characters max.
Website: *	
http://themepacific.com/	
source attribution for tweets created by	ome page, where users can go to download, make use of, or find out more information about your application. This fully-qualified URL is used in the your application and will be shown in user-facing authorization acreens.
Callback URL:	

specify their cauch_callback URL on the request token step, regardless of the value given here. To restrict your application from using calibacks, leave this field blank.





Technical site http://www.ciphergig.com@

Organization

Information about the organization or company associated with your application. This information is optional.

Organization	None
Organization website	None

OAuth settings

Your application's OAuth settings. Keep the "Consumer secret" a secret. This key should never be human-readable in your application.

Access level	Read-only About the application permission model	
Consumer key	zHb1YHPPGJprLAMGb9sSw	
Consumer secret	Ekwc4LcMUSPH9wkaeiufR4D0vglYFIm5yQTxPOyEVd0	
Request token URL	https://api.twitter.com/oauth/request_token	
Authorize URL	https://api.twitter.com/oauth/authorize	
Access token URL	https://api.twitter.com/oauth/access_token	
Callback URL	http://www.ciphergig.com/	
Sign in with Twitter	No	

OTHER NEEDED PYTHON SUPPORTING LIBRARIES...

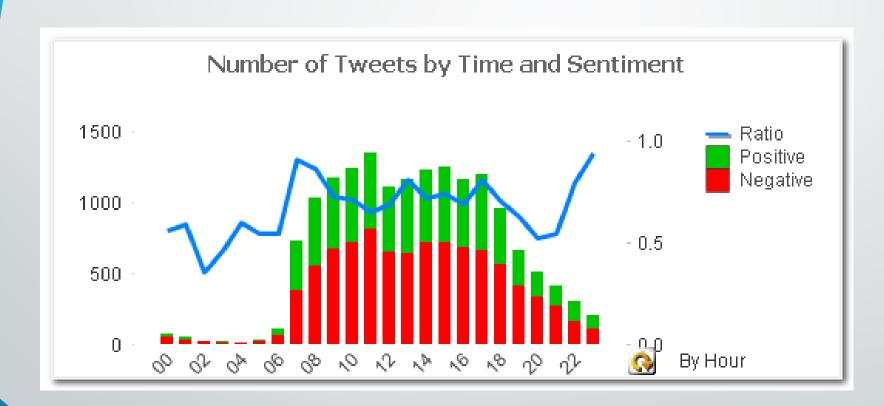


Setuptools-0.6c11

web.py- 0.37

What is a Pickle file?

Use of Google Charts.



Cinderella Drece #ShonPricelese

Positive

"@girlposts: These Disney paintings &Y-3

Cinderella one as a puzzle! I need the rest!

"Cinderella" was enchanting! I especially

loved the "brave & kind" theme. Incredibly

empowering words girls need to hear. Bravo!

RT @shoppriceless: ðŸ'›ðŸ" Modern Day

Cinderella Dress: http://t.co/6HjqjdVy6X

fun fact: anna cried 10 minutes into

LOVED ðŸ ðŸ overy minute of this

movie!!! #Cinderella #Disney Lily James

really brought the character & story to life

Cinderella was absolute perfection âpâpâp

http://t.co/xKlgacvY3G

http://t.co/iYkTJxwarL

I'm seeing Cinderella xox

Cinderella

http://t.co/3Z8esVxAkW" I have the

B

RT @DisneyStudiosCA: #LilyJames hit the	About to start watching Last Cinderella		
red carpet in Toronto this week. #Cinderella is now playing! Get tix here: http://t.co/VIUsdAyxb4 hã€	RT @Gr8DisneyQuotes: Have faith in your dreams and someday your rainbow will come smiling through. å&"Cinderella		
Absolutely loved it!! Beautiful telling of a classic! #courage #kindness â€" watching Cinderella at Santikos	Watched Cinderella🹙🹎🙌		
http://t.co/q11RjDlzB4	Will someone go see Cinderella with me? Pls		
I will be 80 years old and still going to see the latest Disney film #Cinderella #disneykid4life	Omg Cinderella was soooo good!! δŸ*™		
RT @ellabigg: Romantic movies with baeðÝŽ€ðÝ'• @EmmaSlotabec #Cinderella	RT @StarplexCinemas: Who are you seeing #Cinderella w/ this weekend? TAG them in a tweet w/ @StarplexCinemas to ENTER TO WIN a prize pack! â€		
I wanted to go see the Cinderella movie today	RT @CinderellaMovie: Watch what happens		
icī, the new #Cinderella @drafthouse with the whole family! #HaveCourageBeKind http://t.co/z7XYwQXJrL	when the live-action #Cinderella trailer meet the animated version. [via @OhMyDisney] https://t.coâ€		
RT @annaujwala 26: Just saw Cinderella it	RT @jessicapak: I wanna see Cinderella		
was Amazing ðŸ ^{ŦM}	RT @MacyCalder: Cinderella is officially		
Obsessed with Cinderella m. I cried like at	my favorite disney movieðŸāœ"		
every sad part. BEST MOVIE I'VE SEEN YET.	@twolfhes i thought it was amazing but ive always been obsessed with cinderella soo		
Cinderella: A Night at the Ball - \$1.44 - http://t.co/3SDSQrUgab - #Cinderella2015	RT @KingBach: Yayyyy there was 1 black		

#Wow http://t.co/wNk4rALPb1

Saw the new #Cinderella last night, and

LOVED IT. Like the cartoon come to life, with added layers. And gorgeous visuals.

Cinderella was so magical and perfecta of

I need to see Cinderella ðŸ ðŸ

Cinderella was so good. I'm tore up.

Will someone go see Cinderella with me? Pls Omg Cinderella was soooo good!! ðŸ™ RT @StarplexCinemas: Who are you seeing #Cinderella w/ this weekend? TAG them in a tweet w/ @StarplexCinemas to ENTER TO WIN a prize pack! â€ RT @CinderellaMovie: Watch what happens 3 when the live-action #Cinderella trailer meets the animated version. [via @OhMyDisney] https://t.coâ€ RT @jessicapak: I wanna see Cinderella RT @MacyCalder: Cinderella is officially my favorite disney movie...ôŸâœ" @twolfhes i thought it was amazing but ive always been obsessed with cinderella soo RT @KingBach: Yayyyy there was 1 black guy in the Cinderella movie. We've come a long way the Cinderella movie was alright lol @lindseyduquette I wanna see Cinderella again dY C Watching Cinderella! 🎥 @BataFish94 i thought we were watching cinderella ôŸ~

Cinderella Dress #ShopPriceless http://t.co/RZRpMLeY1x Does the shoe fit? #Cinderella #Disney #GC3 http://t.co/kKNcguTOWh

HARDWARE & SOFTWARE REQUIREMENTS

Hardware requirements:

RAM:8 GB

Processor: Intel i5

Software requirements:

Ubuntu 12.04

Python 2.7





NLTK 3.0

Twitter API 1.1

Natural Language Processing with NLTK



Google Charts

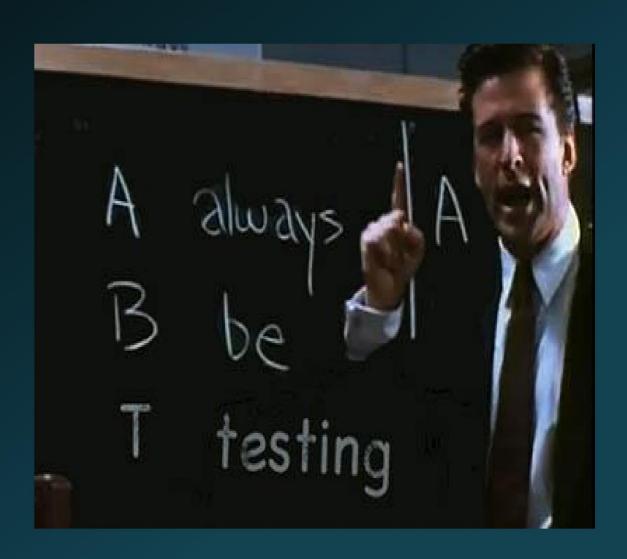
OAuth 2.0





Testing Methods

Testing The Code



Testing Algorithm Accuracy

- **★** BASELINE ALGORITHM
- **★** NAIVE BAYES ALGORITHM
- **★** MAXIMUM ENTROPY ALGORITHM

Testing Different Movies

The Theory of Everything

Fury

Inception

The Interview

Badlapur

Birdman

Foxcatcher

The Imitation Game

American Sniper

Interstellar

The Dark Knight

The Grand Budapest Hotel



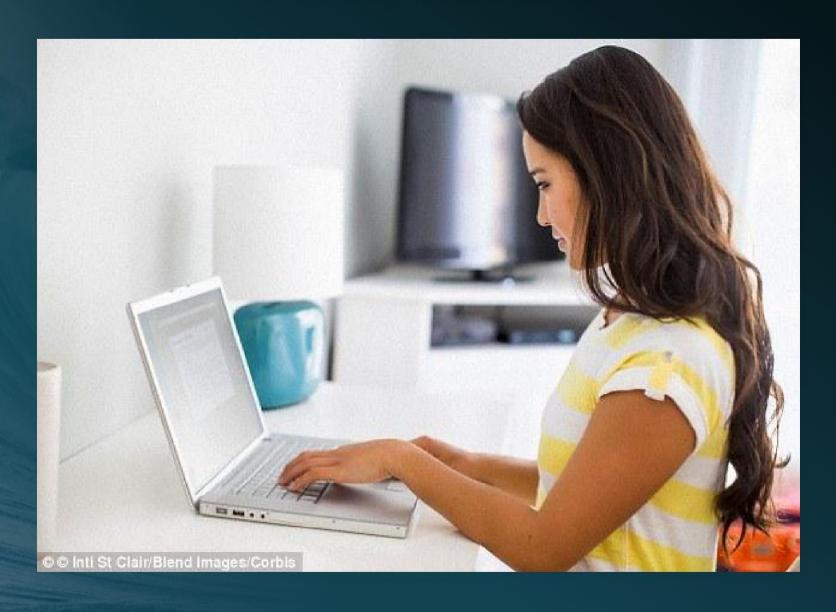
Movie Reviews



Understanding Potential Customers

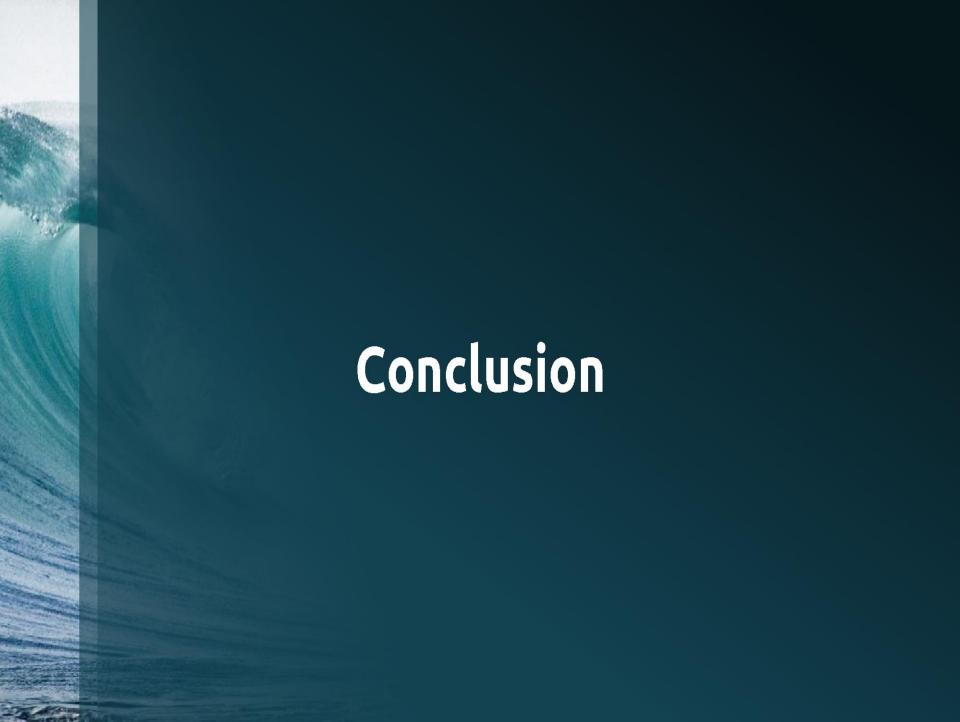


Automated Feedback



Predicting Poll Results





- → Very High Scope for Further Improvements
- → Can be Combined with Emoticons to Improve Efficiency
- → Emotions can be added like angry, happy, etc
- → Applications Can Further Be Extended to Include Artificial Intelligence, Speech Recognition, etc

THANKYOU!!