Retelling Princeton's History: A Textual Analysis

By David M. Liu '18

Adviser: Dr. Brian Kernighan

Motivation and Goals

- Capture historical trends related to college campus issues
- Take advantage of OCR'ed daily newspaper dataset
- Present the vast archive in a more digestible manner.

The Princetonian.

WOL 1.

PRINCETON, N. J., OCTOBER 5, 1876.

No. 4.

W. R. BREWS, Phy. 72. A. R. Bowen, D. C. Tt. Z. H. WARRISON, Ju., Sla., Th.

J. F. Winanaperon, D., 177.

B. F. McFarmer, N. V., 77, S. S. M. O. SMINY, Ja., D. C. '78. W. McDounts, N. Y., 78. R. H. McCarren, N. J., 70.

The Presence in a published horoigists during the college year. Texas, \$2.00, always in advance, per volume of twenty numbers. All concentrations should be addressed to

> WHATAN ARREST, Ju. Testions. P. O. Box 115, Princeton, N. J.

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DITORIALS 1	REP
ONTRIBITIONS 4	Pitti
I. Turne Street.	PER
II. THE PERCEDOS CHLAME NATURAL SCHEEN	
Association.	HER
III. THE GREAT NATURALIST.	(KEH)
IV. PLAIN LANGUAGE FROM TRUTHFUL JAMES.	COL

TOSIAN a change of printers takes place. Al- morning. The Freshman, who looked forward though the change had to be made in the midst | to this exercise as his stay and support in the of a great pressure of work, still there will be | midst of College temptations, will sit under the no delay in its issue. The typographical part | old elms at midnight, and chant its solemn reof the business has been put into the hands of | quiem; and the grave Senior, who has served. Mr. Wm. S. Sharp, of Trenton. We feel that under its tutorship a sad three years, will hanwe can assure our renders that there will be no ish the sarcastic smile which played on his lips occasion to mock and say, "Where is the pro- as he thought of the "hollow mockery," while mise of its coming?" for all things will be singing in chapel "Sweet Subbath of Rest;" better than they were from the beginning.

The world does move, and Princeton moves with it. The charge of conservatism so often remoraelessly harled against as by sister Colleges, has again received a blow. We have at | Sunday morning and the lecture Sunday afterlast obtained the "substance of things hoped | noon, in another article. Another reform, for." Sunday morning chapel and the Sunday | hardly less important, but as much desired, has afternoon lecture have been abolished. In lieu | been accomplished in the substitution of a study thereof, a service of about twenty minutes has of the "Word" in King James' version, in been placed at five o'clock in the afternoon of | place of Greek Testament, on Monday mornthat day. But what of that? It serves, you ling. The object aimed at is to study the Bible know, as a sort of "grace before ment." The in the spirit of honest inquiry after the real ancient custom of ushering in the sacred day by | truth contained in its pages. The President ana meeting for praise and prayer—that bugbear | nounced in his talk to the Senior Class last of our fathers and joy of our children's child- | Monday morning, that we would study, this dren, that they will have it not-hath doubled | year, the life of Christ, as recorded in the New op and floated away like a kite on a spring day. Testament. And surely no one ever saw Dr. It has gone to the land of its fathers, and, so | McCosh to better advantage than when his eye far as we know, its end was peace. It has brightened and his face beamed with a radiance

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With the present number of THE PRINCE- So we all pass-pass by the chapel door in the and in his morning slumbers he will hum over in his dreams, in the low, sweet voice of a contented spirit, "Day of all the week the best,"

We have spoken of the abolition of chapel passed away, slowly passed, but still has passed. that seemed to be caught from the Master of

Prior Work: Sentiment Analysis



- Definition
- •Implementations
- Unigram model
- Machine learning Classifiers
- Applications
- Social Media (e.g. Twitter)

Questions

1. Will modern sentiment analysis techniques still apply to century-old data?

2. If so, what historical trends can be found?

Scraping

128

20,000+

390K

Years

Issues

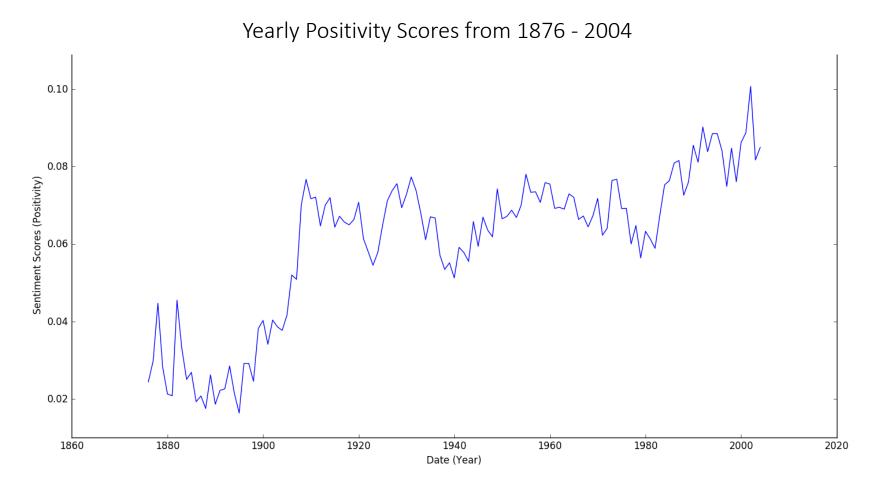
Headlines

VADER: A Sentiment Analysis Library

Gold Standard List (Excerpt)				
Word	Positive Valence			
"okay"	0.9			
"good"	1.9			
"great"	3.1			
"horrible"	-2.5			

- •NLTK Module
- "Gold Standard" Vocabulary List
- •Five Additional Heuristics
- 1. Punctuation (!)
- 2. Capitalization
- 3. Degree Modifiers (eg: extremely)
- 4. Contrastive Conjunction (eg: but)
- 5. Negation Detection

Results: Sentiment Analysis



Pros

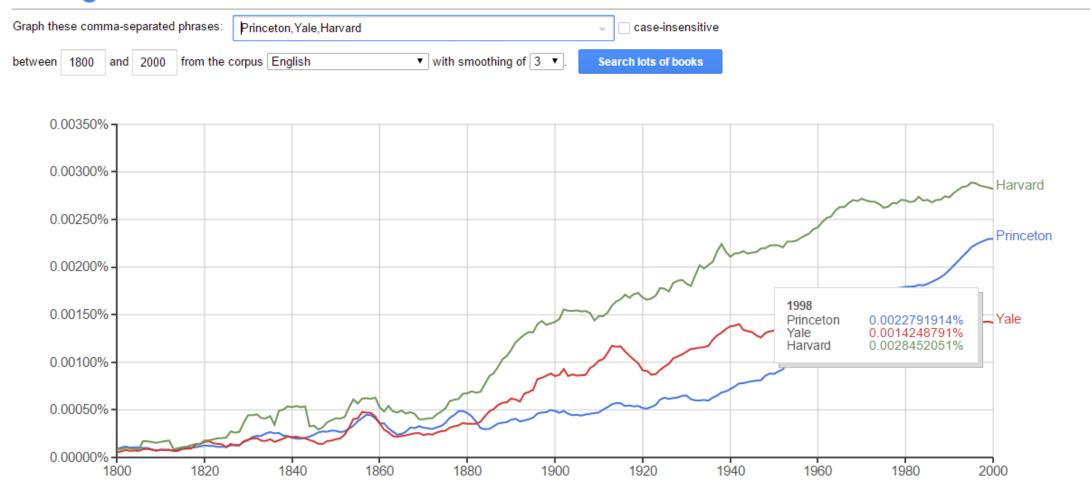
- NLTK library usable on historical dataset
- Computationally efficient and convenient

Cons

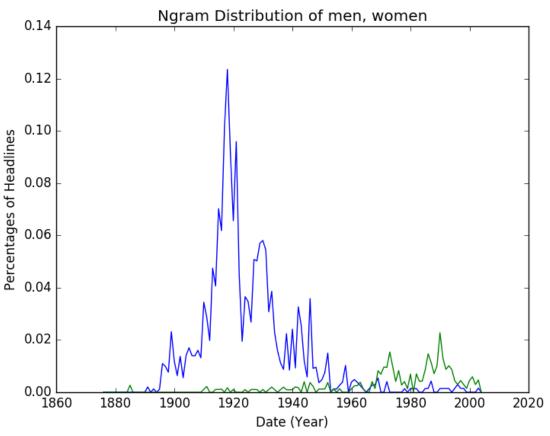
- Difficult to make conclusions without grand assumptions
- Lack of clear trends

Prior Work: N-grams

Google Books Ngram Viewer



Results: N-gram + Sentiment Analysis



```
Most Negative Headlines
19510418 five men suspended 0.608
19101031 more men forced to strike. 0.614
19930421 women complain of harassing calls 0.667
19120403 strikers trouble station men 0.683
```

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Most Positive Headlines
19110309 sophomore honor men 0.615
19720922 women join security forces 0.697
```

Extremes > Trends



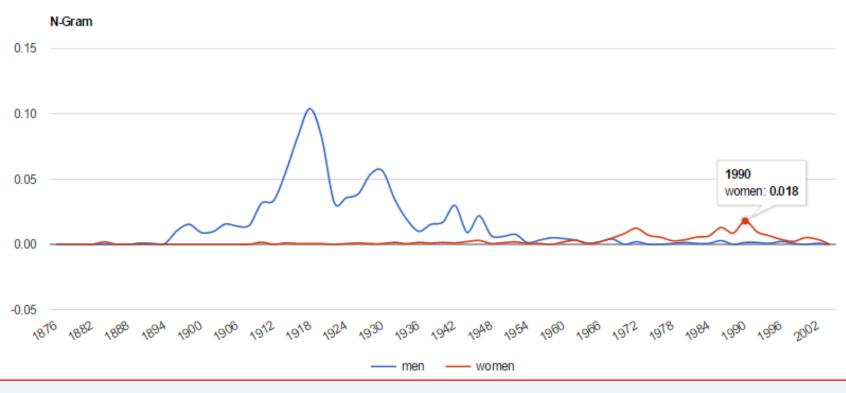
Most Positive Headlines

Year	Score	Link
1972	0.697	women join security forces
1911	0.615	sophomore honor men
1927	0.587	army strong men win over tiger grapplers

Most Negative Headlines

Year	Score	Link
1912	0.683	strikers trouble station men
1993	0.667	women complain of harassing calls
1910	0.614	more men forced to strike.



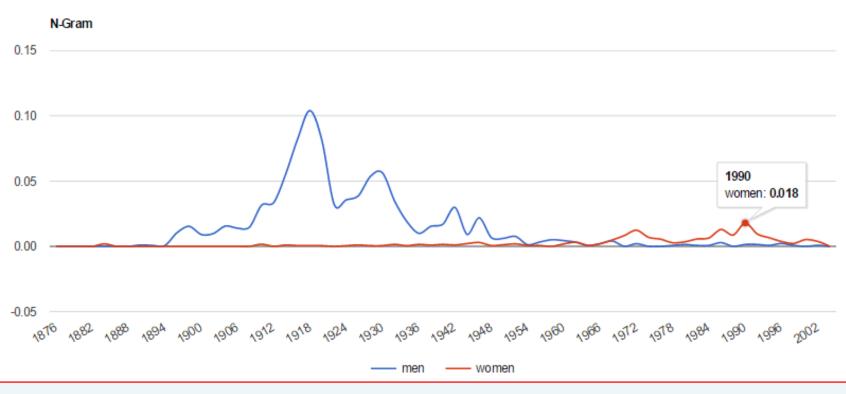


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PRINCETON UNIVERSITY Library Website

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Princeton Periodicals > The Daily Princetonian > Daily Princetonian 21 April 1993

☑ Issue PDF (19.21 MB)





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Daily Princetonian, Volume 117, Number 54, 21 April 1993

Article Issue Text Why may this text contain mistakes?

Women complain of harassing calls By JILL SCOTT

After one African-American woman described her experience with telephone harassment at Saturday's Take Back the Night march, several minority women on campus have complained of similar incidents. Minority women said the caller claims he is responding to their advertisement for worn underwear. which he says he read either in The Daily Princetonian or a local adult magazine. One African-American famala conhamora avalained hour the



ever, on computer users on col-

Nexis, which adds to repetitive

Women complain of harassing calls

After one African-American day's Take Back the Night march, several minority women on campus have complained of similar inci-

Minority women said the caller two years ago. claims he is responding to their advertisement for worn underwear, which he says he read either in The Daily Princetonian or a local adult magazine.

caller introduces himself. "Is this Princeton University? Is this a dorm room? I am calling in response to your personals ad selling worn underwear for \$100," "

Since similar calls have been made in the past few years, several minority women said they believe this reflects a general trend.

"A few years ago it was a differ-

The nature of the prank and woman described her experience reoccurring trend of the calls sugwith telephone harassment at Satur- gest that some organization is responsible, said Jan Strout, Women's Center director. Strout added that minority women first alerted her to these harassment calls

> "(The calls have) a pattern in two ways. It has affected more than one woman, and it has gone on for more than one year," she explained.

While stories change from year One African-American female to year, several minority women sophomore explained how the allege that the harassment has targeted the minority community in a similar manner.

> Last year, a male caller - estimated to be the age of an average college student - claimed to be 'the official panty sniffer" and said he hoped to purchase dirty underwear, said Machin.

> While some non-minority women have received similar phone calls, most believe these calls are



179 Nassau Street Princeton, New Jersey Tel: (609) 497-EARL (3275) 6:30 a.m. to 10:00 p.m.

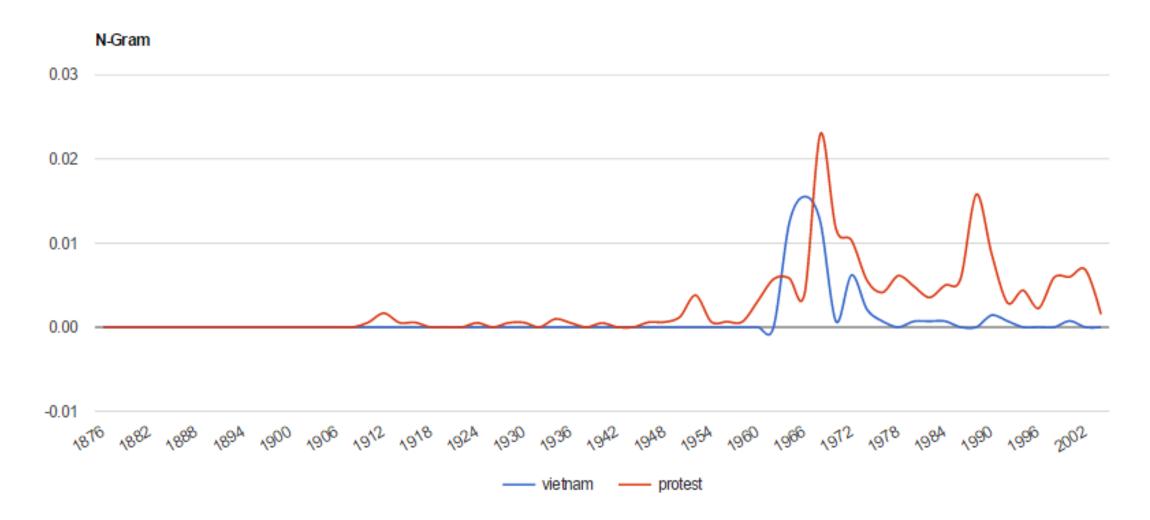
American Studies Pro

SPACES ARE AVAILABLE I

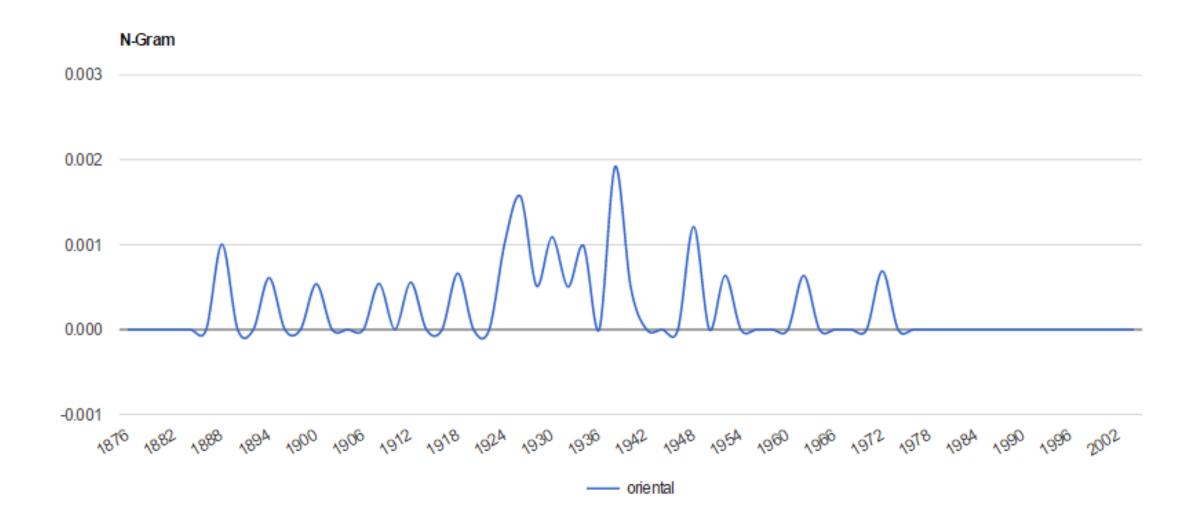
321 Landscape in the Production of th (ARC 321) - Alessandra Ponte, School

The frontier is depicted in the literary and cinematic genre ing and heroic landscape. Typically, the setting is a tabupromise - a blank page waiting to be written. This land staging of the familiar but questionable opposition between the mythical years of the discovery and conquest of the We But what is the West and what role did the lar

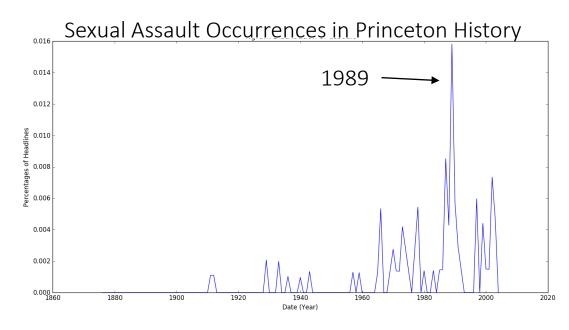
Examples: Major Campus Events



Examples: Patterns in Language



Evaluation and Next Steps



- Topics to study:
 - Gender Inequality
 - Racial Discrimination
 - Crime Rates
- Automate keyword detection
- Compare with national data (NDEA)

The New Hork Times

N.Y. / Region

WORLD	U.S.	N.Y. / REGION	BUSINESS	TECHNOLOGY	SCIENCE	HEALTH	SPORTS
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Accused Princeton Professor to Retire Early

AP Published: May 27, 1989

Acknowledgements

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Sources

Godbole, Namrata, Manja Srinivasaiah, and Steven Skiena. 2007. Large-scale sentiment analysis for news and blogs. *Icwsm* 7 (21): 219-22.

Hutto, C.J. & Gilbert, E.E. (2014). VADER: A Parsimonious Rule-based Model for Sentiment Analysis of Social Media Text. Eighth International Conference on Weblogs and Social Media (ICWSM-14). Ann Arbor, MI, June 2014.

Jean-Baptiste Michel*, Yuan Kui Shen, Aviva Presser Aiden, Adrian Veres, Matthew K. Gray, William Brockman, The Google Books Team, Joseph P. Pickett, Dale Hoiberg, Dan Clancy, Peter Norvig, Jon Orwant, Steven Pinker, Martin A. Nowak, and Erez Lieberman Aiden*. *Quantitative Analysis of Culture Using Millions of Digitized Books*. **Science** (Published online ahead of print: 12/16/2010)

Liu, Bing, and Lei Zhang. 2012. A survey of opinion mining and sentiment analysis. In Mining text data., 415Springer US.

Pang, Bo, and Lillian Lee. 2008. Opinion mining and sentiment analysis. *Foundations and Trends in Information Retrieval* 2 (1-2): 1-135.