

Twitter & Feminism

Pilot Study

What is a pilot study?

Pilot Study

- A pilot study is an initial run-through of the procedures to be used in an investigation; it involves selecting a few people and trying out the study on them. It is possible to save time, and in some cases, money, by identifying any flaws in the procedures designed by the researcher.
- A pilot study can help the researcher spot any ambiguities (i.e. unusual things) or confusion in the information given to participants or problems with the task devised.
- Sometimes the task is too hard, and the researcher may get a floor effect, because none of the participants can score at all or can complete the task – all performances are low. The opposite effect is a ceiling effect, when the task is so easy that all achieve virtually full marks or top performances and are “hitting the ceiling”.

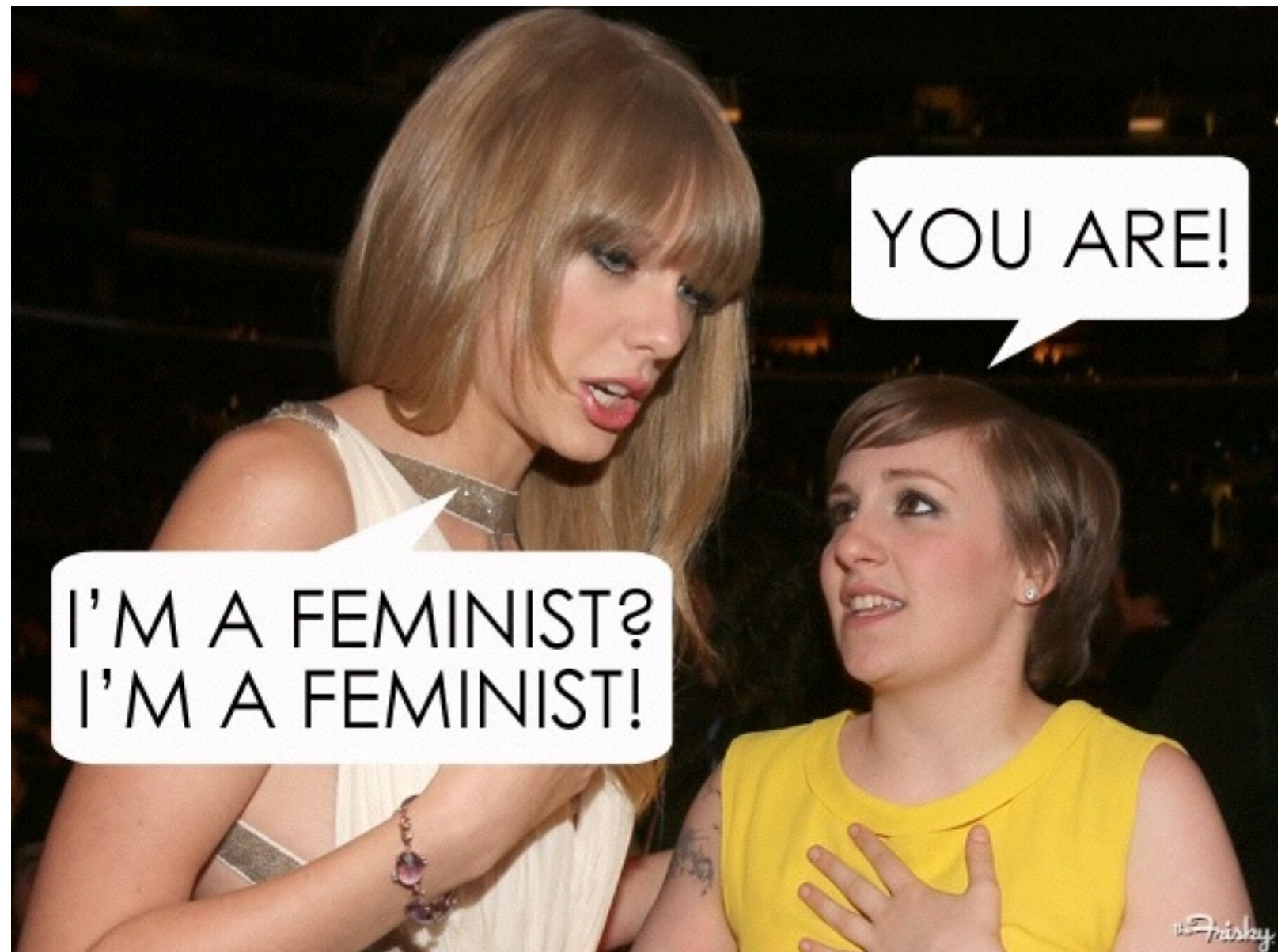
Why Twitter?

- Twitter is becoming a recognized and valid measure of the zeitgeist.
- Twitter is being used to collect data by social scientists.
 - Using Twitter for Demographic and Social Science Research: Tools for Data Collection
<http://paa2013.princeton.edu/papers/130624>
- Viral marketing, memetic theory and the ability of small groups to control the space create new and more polarized dialogues.
- Current debate on extremism — “The Counter Extremism Project welcomes press reports that Twitter Chief Executive Officer Dick Costolo has publicly acknowledged his platform’s failure to combat online abuse. This is clearly – even dangerously – overdue.” <http://www.counterextremism.com/press/counter-extremism-project-calls-twitter-confront-all-abuse#sthash.bjDAXHzU.dpuf>



Why Feminism?

- Renewed interest and dialogue on new media
- Attention in traditional media, celebrities taking visible stances - 2014 as a bumper year for pop feminism, contraceptives, legal abortion, etc.
- Potential backlash
- Hunger Games and Frozen to 50 Shades of Grey and Meninism

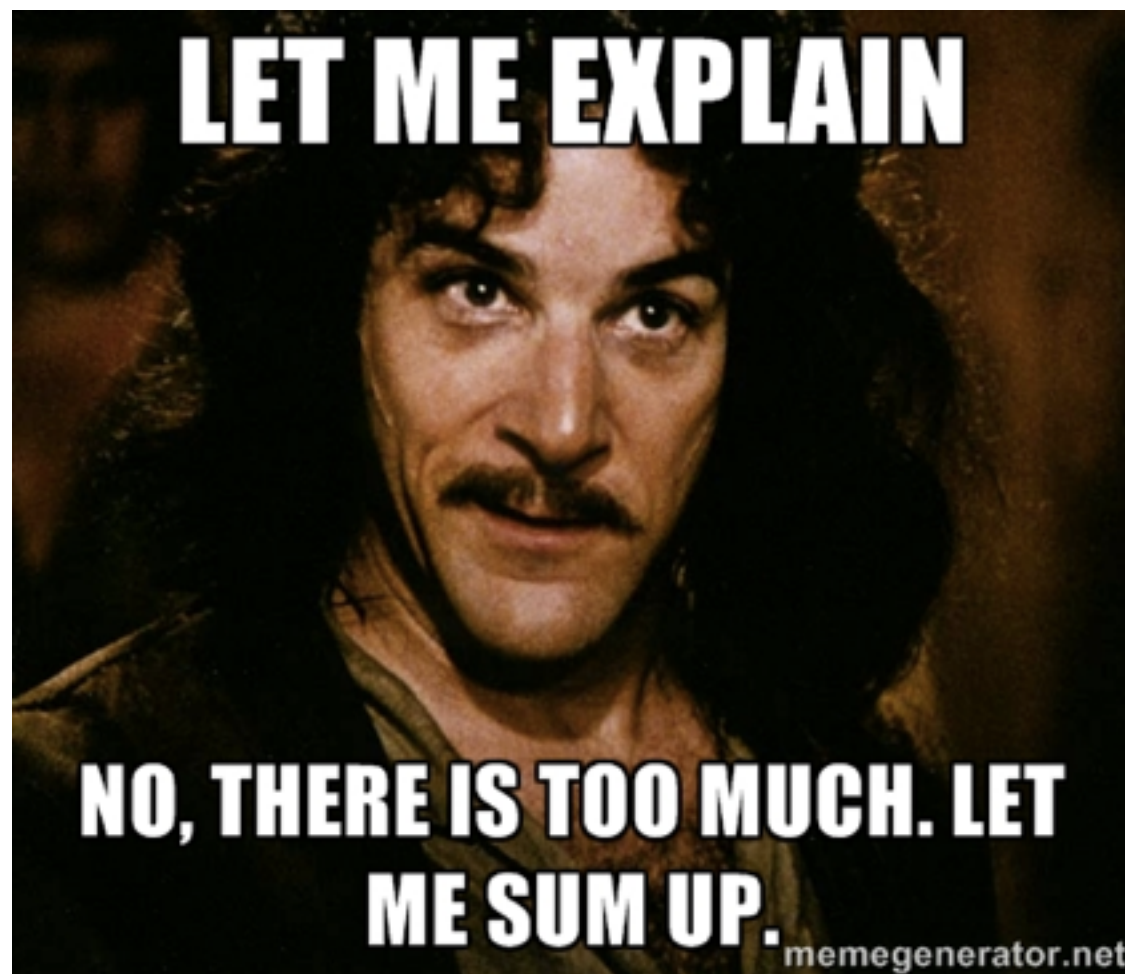




Current Feminism: A Refresher

Feminism :

A Very Short History



- First Wave: Women's suffrage and basic political inequalities.
- Second Wave: Mid-60s onward, social and cultural inequalities beyond basic political inequalities.
- Third Wave: 90s and ongoing, focus on queer/trans/PoC and other diversity voices. Intersectionality, gender discrimination, and the normalization of BMO.



IWF @IWF · 4h

When [#feminists](#) go to the movies every single movie is about [#sexism](#) & nothing but sexism. shar.es/1olkuL

Charlotte Allen and IWF



← ↻ 3 ★ 2 ...

[View photo](#)

your logical fallacy is



the texas sharpshooter

You cherry-picked a data cluster to suit your argument, or found a pattern to fit a presumption.

This 'false cause' fallacy is coined after a marksman shooting randomly at barns and then painting bullseye targets around the spot where the most bullet holes appear, making it appear as if he's a really good shot. Clusters naturally appear by chance, but don't necessarily indicate that there is a causal relationship.

Example: The makers of Sugarette Candy Drinks point to research showing that of the five countries where Sugarette drinks sell the most units, three of them are in the top ten healthiest countries on Earth, therefore Sugarette drinks are healthy.

Feminism is having a fascinating moment and is noteworthily well documented via social media in a way that captures, more precisely and more accurately than before, the public opinion as it evolves on modern feminism.

Method

- Participants: The people with public twitter feeds who tweeted, during the 7 random times of day I ran the code, with the word “feminist” or “feminism.
- Materials: The twitter API (accessed via Python and Tweepy) returns JSONs containing data about the tweet as well as the text of the tweet, which were then stored by MongoDB as BSONs.
- An example datum: { "_id" : ObjectId("54c6f420700d5a918cc47e0c"), "lang" : "en", "text" : "Why do people use the word feminist like it's a bad thing that irritates me so much", "fem" : 0 }

Method- Cont. : Procedure

- Tweets captured by API at various times, to account for time of day bias in location. Only tweets in English.
- Sub-section of random tweets hand-coded for valence:
 - 0 : positive or neutral opinions on feminism
 - 1: negative opinions of feminism or hate speech
- Coded tweets used to train various machine learning model, and then test them. Models then extrapolated onto the much larger corpus of tweets to measure them for perceived valence on feminism.
- Pros: Some context and humor controlled for by human coding
- Cons: Time consuming, low context, uncaught irony

- Semi-Supervised Learning : Trained on codified subsample and used Multinomial Naive Bayes, Logistic Regression, Linear SVC and Bernoulli Naive Bayes in the sklearn library on the data.
- Un-Supervised Learning:
 - Used gensim library to find most common tweets and construct a LDA model yielding 50 topics/clustering within the data.
 - Used sklearn MiniBatchKMeans to cluster data into 10 main groups.
 - Used textstat to determine grade level of average negative or positive tweet.

Results: Semi-Supervised

Twitter Doesn't Love Feminism

- Most Accurate models:
 - Linear SVC models Twitter as 52% negative on feminism
 - Logistic Regression models Twitter as 54% negative on feminism



Results: Unsupervised Learning

Most retweeted tweets:

- RT @MeninistTweet: Today, a feminist asked me how I view lesbian relationships... Apparently "in HD" was not the right answer
- RT @vanbadham: Why feminism? Because you can sell 30 MILLION copies of a single book and when you die, The Australian prints this: ->
- RT @vanbadham: Why feminism? Because she was ALSO a FREAKIN' NEUROPHYSICIST at YALE & this is how The Australian begins her obituary
- RT @JessicaKRoy: finally a feminist snowstorm
- RT @hayleyestxll: Feminism has never made me hate men but men's reaction to feminism definitely has.
- RT @TheBlackVoice: It's amazing how threatened men are by the term feminist while not even being able to provide a working definition
- T @clementine_ford: I keep hearing that feminism is bad for women, and I think what that's supposed mean is that feminism is bad for men



Main Clusters/ MiniBatchKMeans

- White feminism and intersectionality ->
- Feminism isn't necessary
 - “ellekersten because theres a difference between a women who is a feminist and a women who wants equal rights feminist are crazy”
- General shaming, profanity and MRA
 - 'do not rape a feminist it would fulfill her hot rape fantasies and let us be honest what kind of animal would want to make a feminist happy'
- New Feminism
 - 'disturbedfan132 i believe myself to be a feminist and tho i disagree with the new femfad they sometimes make points'
- Feminists hate men
 - rt lxlayyy being a feminist doesnt give you the right to talk bad about guys'
- Feminism is still needed
 - 'people who say we dont need feminism and everyone is already equal clearly arent aware of whats going on around the world'
- Feminism and new media
 - 'i have never said i was feminist bc i dont want all of you dragging me saying im only feminist on twitter or tumblr'



Smaller Clusters/LDA

Intersectionality? never, one, make, women, misconceptions, base, movement, black, people, feminist/misandriuc,, non-feminists, poster, posters

YesAllWomen: it's, women, equal, incomprehensibly,, and, still, acknowledge, #ineedfeminismbecause, @prowomanchoice:, men., #yesallwomen, 2015, want, tube

Media Response: forced, chapter, perspectives, normal,, man's., cuoco, kaley, apologize, respects, interesting, cissexist, ('females'), extending, simplistic

Trendy Feminism: equality, support, gender, believe, women, want, tumblr,, aspe..., "trendy"

Media Representation: people, annoying, "hollywood's, year", languages,, #girlsmatter, silent?,, acculturated

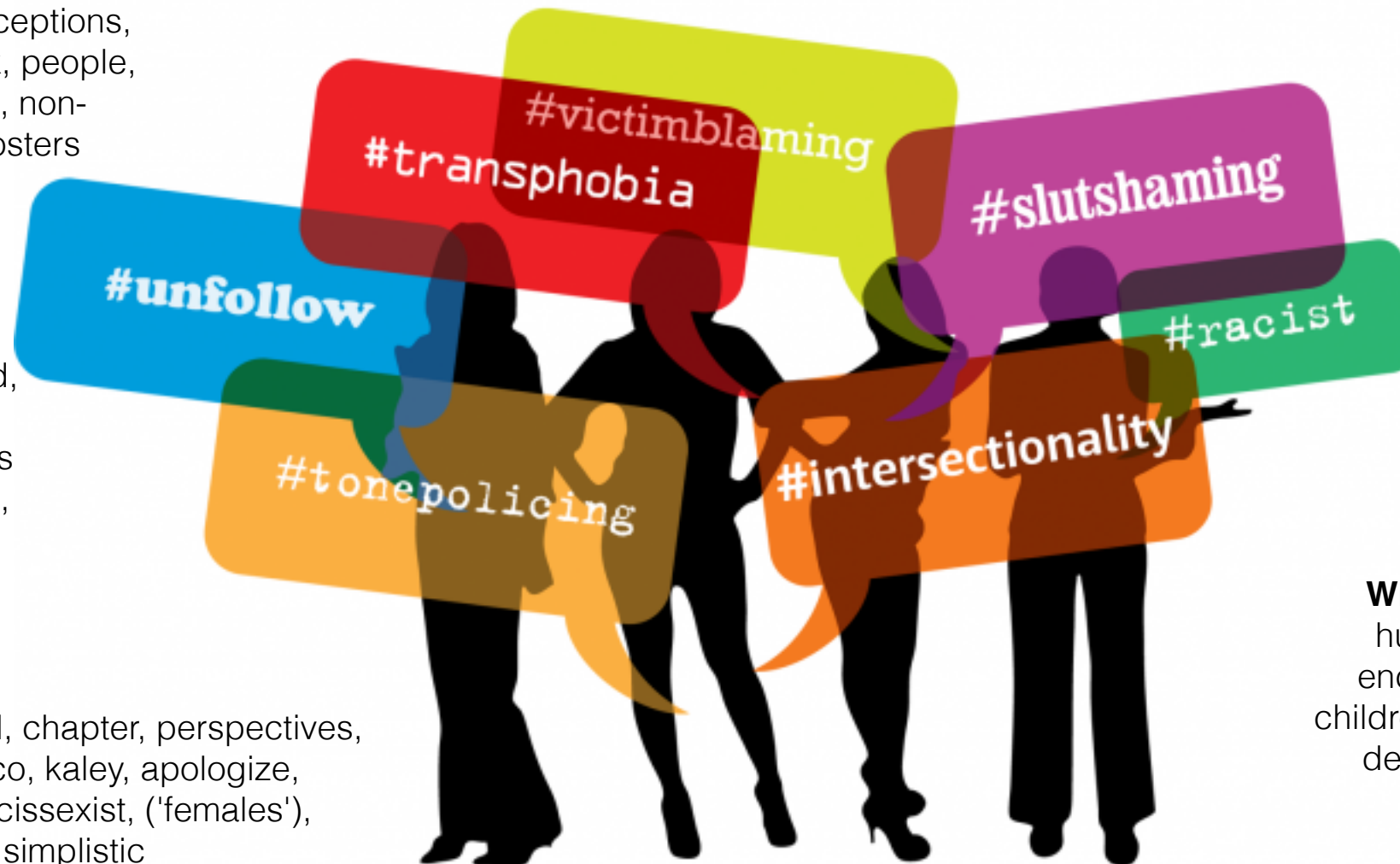
Intersectionality: white, room, appropriation, responds,, feminist™, cultures, obligation, claiming, racist

Anti-Feminist Pro-Equality Paradox:≠, calling, making, women...i, theory,, #equalist, @victorialwalton, #stoptheimmaturity, #misandrist, #letsbere

Humor as Defense? u, jokes, r, it's, don't, ,, joke!, seriously!, toxic!!, haha!

@NoToFeminism women, teaches, stupid, lol, entice,, enthrall, enchant, and, berate,, nag,, tradition, demand, how's, freeing,

Witchcraft? kill, woman, husbands, witchcraft,, encourages, lesbianism, children,, capitalism, practice, destroy, leave, become, movement, need





mascha. @Totgeschwiegen · Feb 7

"#FeministsAreUgly"

really?



26



48



[View photo](#)

Discussion

- Grade level of negative tweets consistently measured as at least a grade level below neutral/pro-feminist tweets
- Higher levels of profanity and misspelling in negative tweets

much because support
social believe women woman
only females community call other
rights gender <http://t.co/Ie3kQIV9pj>
more time real feminist misogynist even
gay don't YesAllWomen base BELIEVER realize
know female about amp male just rape
new ur one yourself NON Gandhi person girls
dont Beauty tumblr im meninist fact mean make book
sad making still bc punkthetic using u'I being
u"I sexes feminists all against says
it's amaraconda thing Many racist
ever stop economic movement
girl hate white people most wrong
black u'If both AlexisDerikSmit equal like
need really equality u"RT easy
think Emma u'RT wearing
SHUNNN feminism."\\n\\nSHUN

feminism

WordItOut

Word Cloud of Positive Tweets



WordItOut

Word Cloud of Negative Tweets

Improvements Required to Progress Beyond Pilot

- Constrained by small codified samples and the need to have both test and train sub-sets, accuracy could be improved by increasing number of codified tweets, ideally codified by multiple people to control for individual bias.
 - Sample size is 217 negative and 217 positive tweets to 30k uncoded tweets
- Goal: Have the script running constantly to display a stock market value of feminism on Twitter and how real time events affect it.
 - Be able to monitor twitter-verse for how events impact the public's view on feminism, what causes backlashes, measure impact of Beyonce, etc

