

# The Modern Gatekeepers in Mass Media

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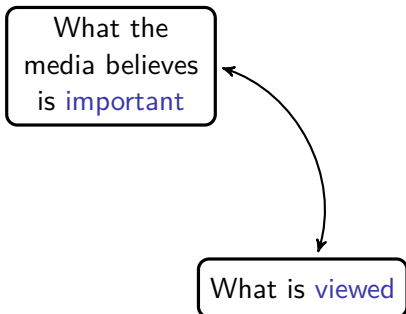
Stony Brook University



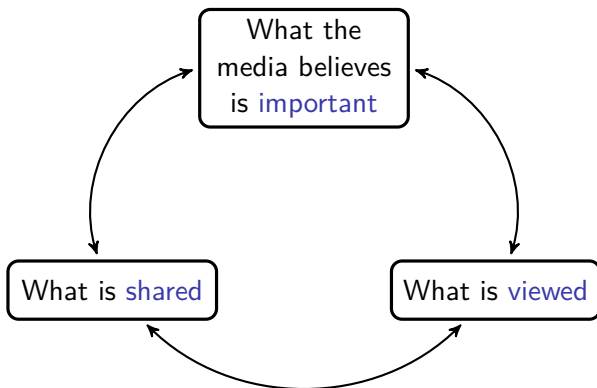
# Introduction

How does social media change the agenda-setting role of traditional news media?

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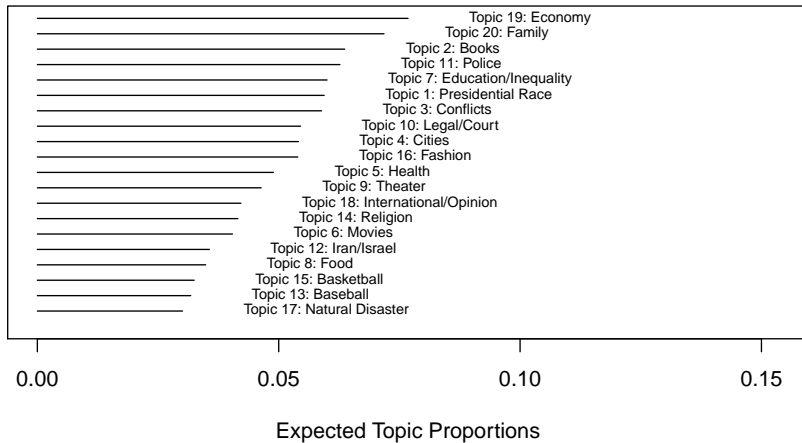
# Data Overview

- ▶ Scraped articles from [New York Times](#) website between February 18 and April 28, 2015.
- ▶ [Article categories](#): printed front page, digital front page (top, bottom & opinion section), most viewed, most emailed, most shared on Facebook, most shared on Twitter
- ▶ [Extracted information](#): title, author, date, time, URL, full text
- ▶ [Total number of unique articles](#): 5504

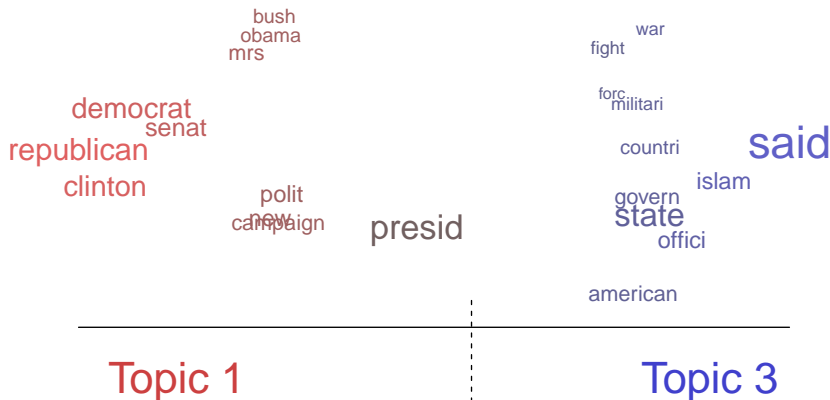
# Content of New York Times Articles

- ▶ Summarize content using **structural topic model** (Roberts et al., 2014; Roberts, Stewart, and Tingley, 2014)
  - ▶ Each document is modeled as a **mixture** of  $K$  topics
  - ▶ **Prevalence** of topics in documents can be influenced by a set of covariates
  - ▶ (Word use within each topic can be influenced by a set of covariates)
- ▶ **Number of topics**: 20

# Topic Proportions

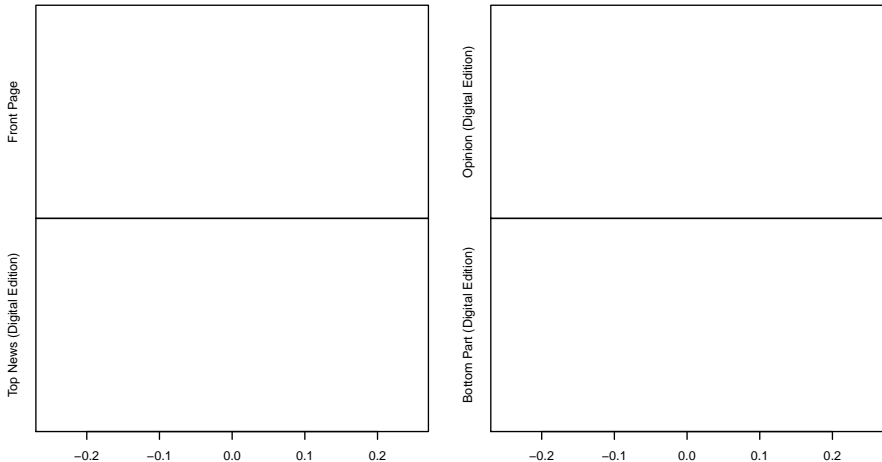


# Example for Topic Perspectives

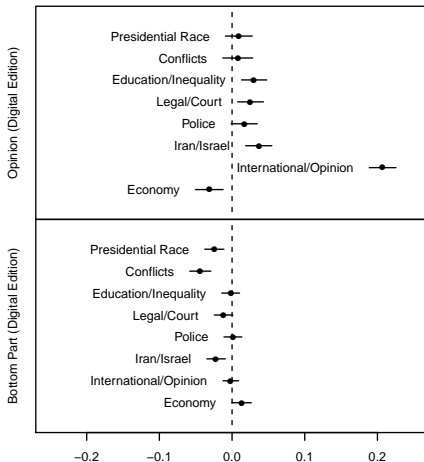
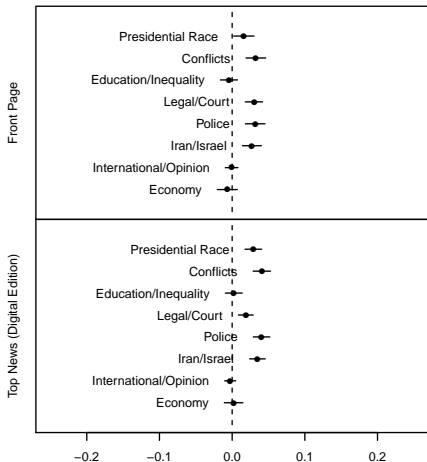




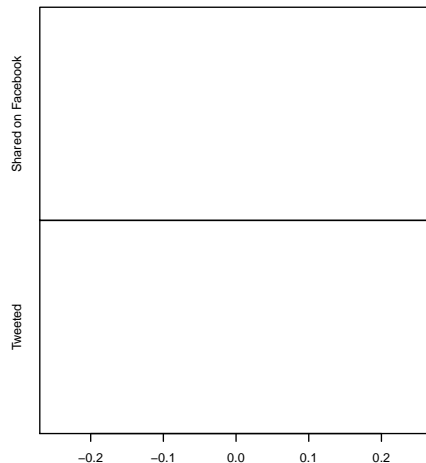
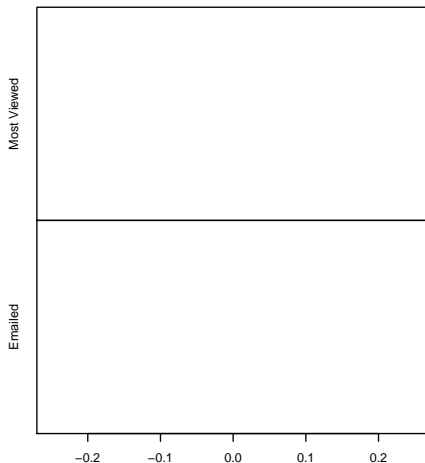
# Changes in Topic Distributions (Newspaper Section)



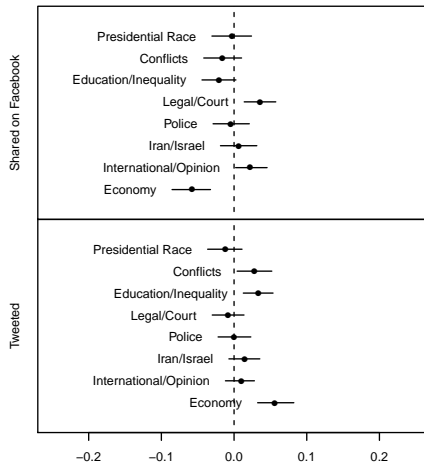
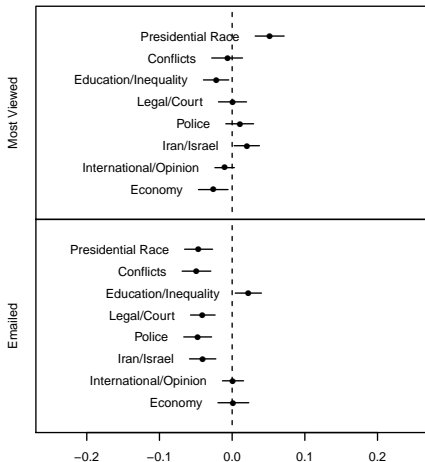
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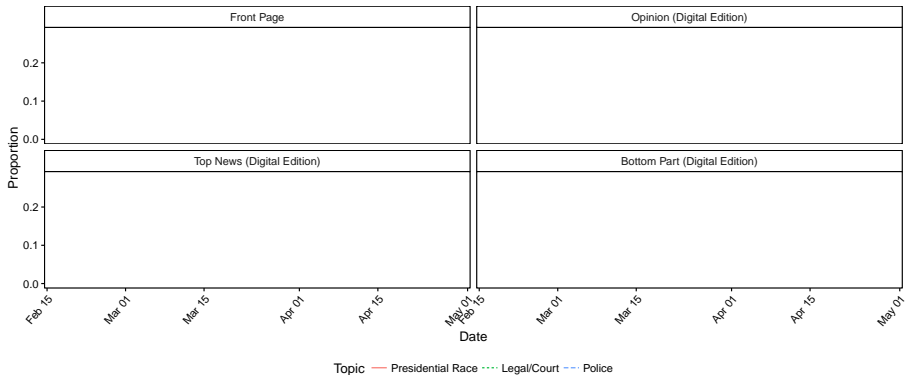
# Changes in Topic Distributions (Shared/Viewed)



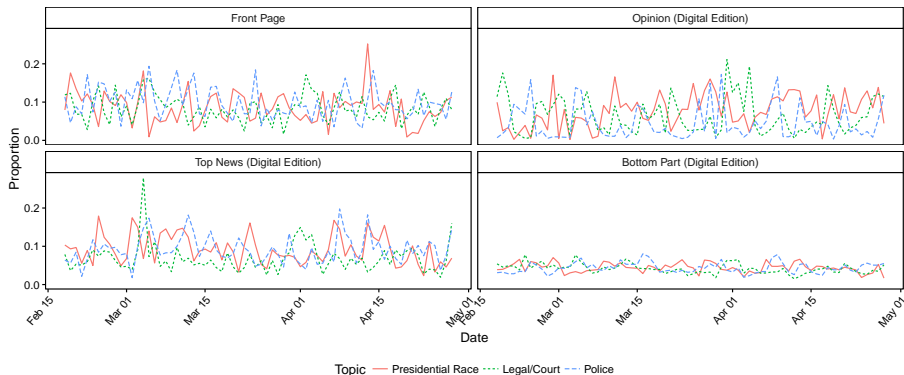
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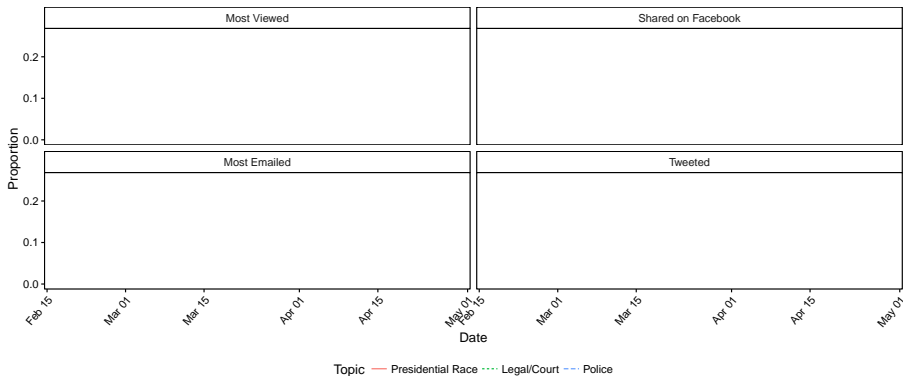
# Topic Proportions over Time (Newspaper Section)



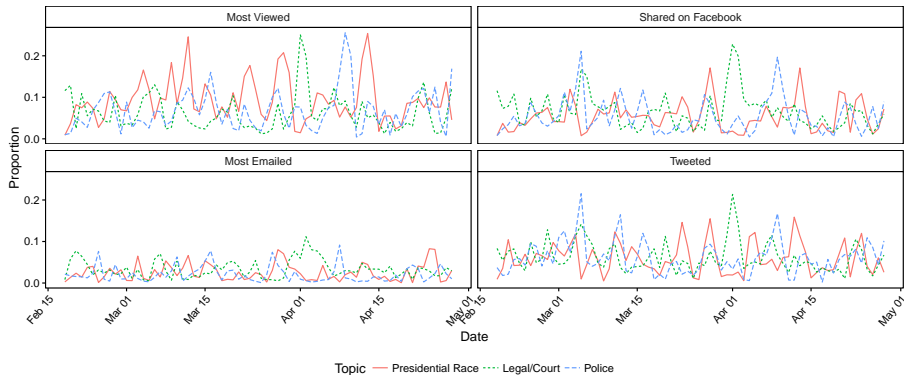
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# Topic Proportions over Time (Shared/Viewed)

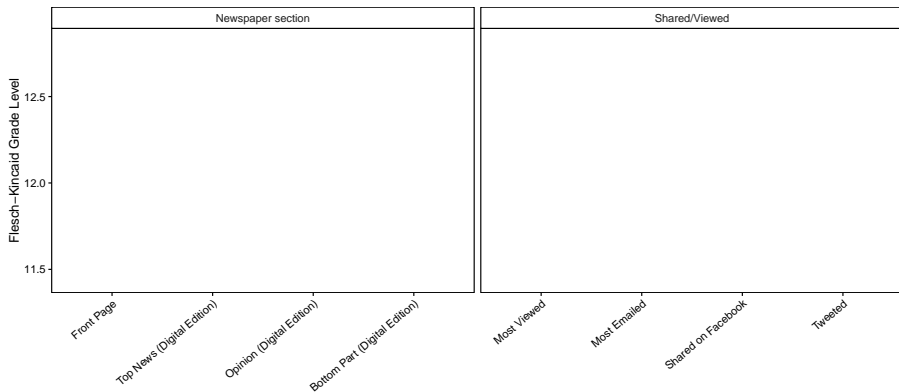


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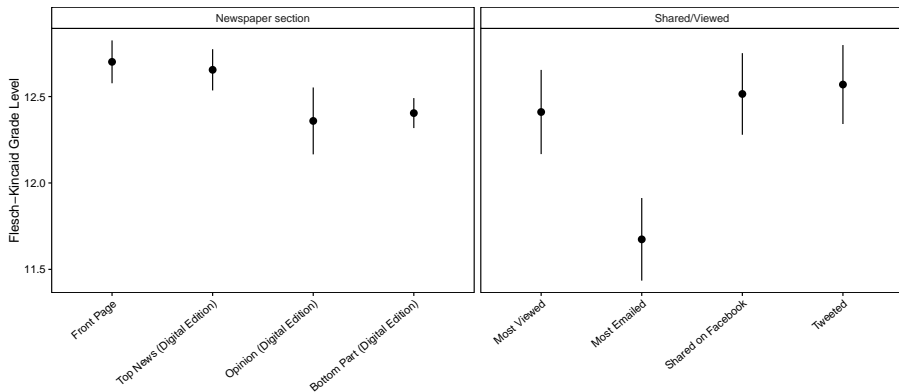




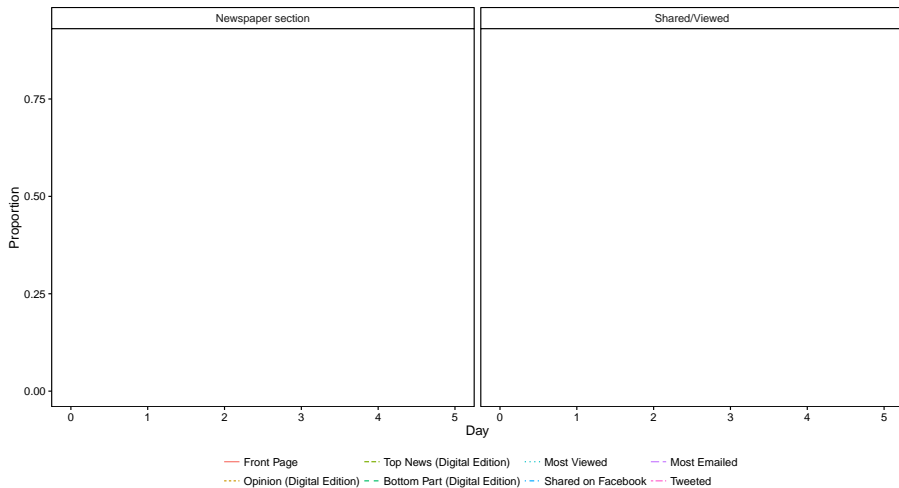
# Article Readability by Category



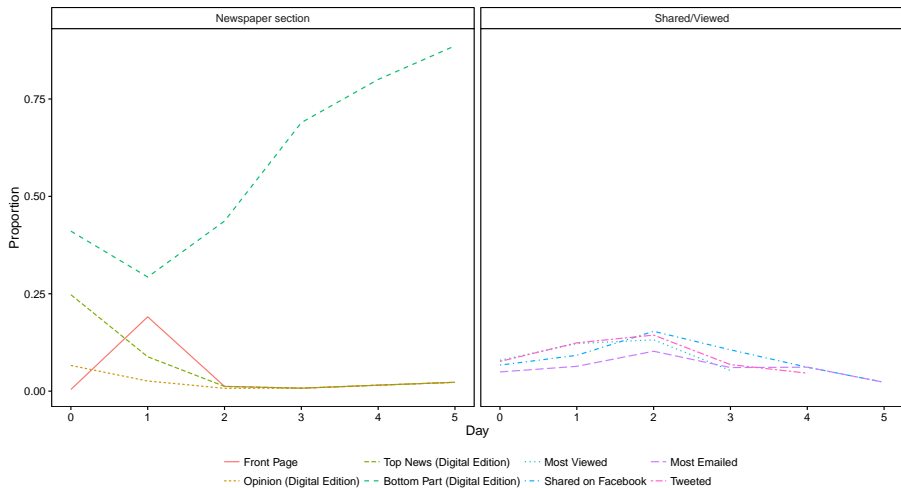
# Article Readability by Category



# What stays in the loop?



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# Conclusion

- ▶ There are differences in types of articles that are shared across media, as well as articles that the [New York Times](#) places on its front page
  - ▶ Disagreement on importance of certain news stories
- ▶ [Limitations:](#)
  - ▶ Reader of the New York Times may be different than readers of other news sources.
  - ▶ The editorial team of the New York times may be less influenced by social media than other news outlets.
- ▶ [Subsequent analyses:](#)
  - ▶ Closer analysis of temporal development of articles, track how long articles remain popular in a given cycle
  - ▶ Matching individual articles to broader news stories
  - ▶ Take into account additional meta information (length etc.)

Thank you very much for your attention!

Comments, questions?

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# Topic Words I

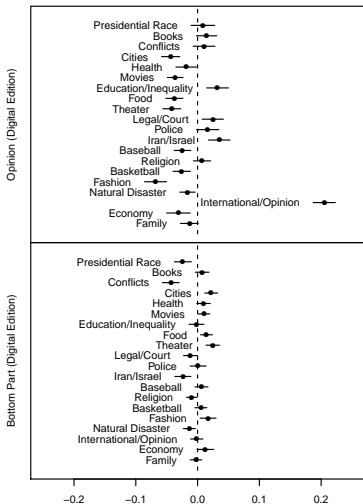
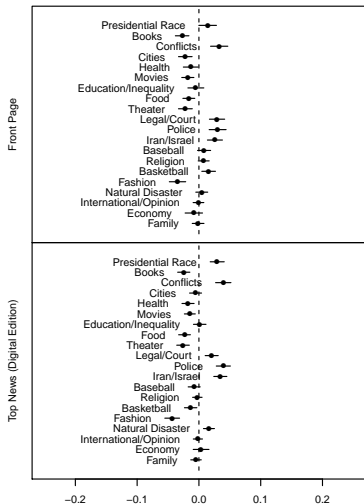
<p>Topic 1: republican, clinton, democrat, senat, presid, said, new, mrs, polit, campaign, obama, bush, candid, parti, presidenti, will, hous, voter, elect, state</p>	<p>Topic 6: film, said, movi, music, year, new, show, will, also, includ, award, watch, like, time, televis, record, song, star, band, play</p>
<p>Topic 2: book, one, like, work, stori, can, time, write, way, life, think, say, world, make, read, peopl, will, novel, even, seem</p>	<p>Topic 7: percent, year, school, student, will, tax, peopl, rate, educ, work, job, like, colleg, new, program, worker, mani, pay, polici, univers</p>
<p>Topic 3: said, state, islam, offici, govern, presid, american, countri, war, militari, fight, forc, group, attack, year, kill, unit, russian, two, citi</p>	<p>Topic 8: water, food, like, use, can, wine, restaur, cook, fish, one, make, chef, also, eat, new, chicken, anim, sandwich, will, recip</p>
<p>Topic 4: new, citi, build, said, park, york, hous, street, year, room, home, open, like, neighborhood, live, hotel, place, art, will, one</p>	<p>Topic 9: show, play, new, music, theater, like, charact, seri, perform, time, open, broadway, star, york, one, critic, direct, actor, product, also</p>
<p>Topic 5: said, patient, studi, health, research, medic, doctor, new, can, use, peopl, drug, year, care, one, found, diseas, hospit, test, scientist</p>	<p>Topic 10: said, state, law, court, feder, rule, case, justic, legal, right, conserv, wildlif, vote, bill, republican, member, occup, say, refug, govern</p>

# Topic Words II

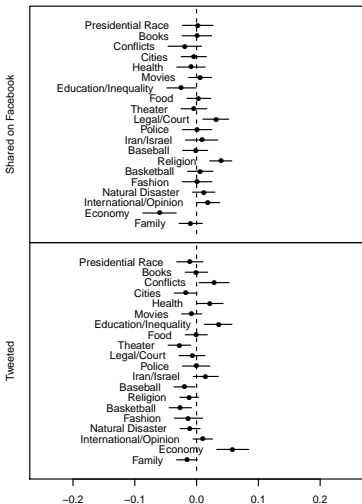
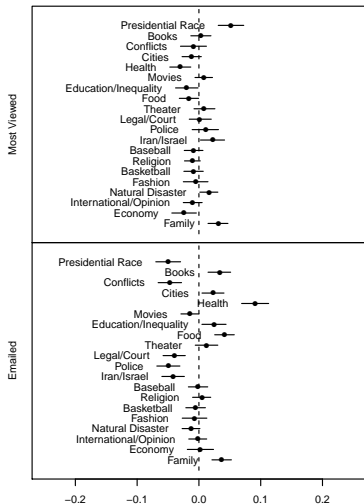
<p>Topic 11: said, offic, polic, new, report, depart, citi, investig, charg, offici, case, year, arrest, york, prison, kill, death, two, last, time</p>	<p>Topic 16: show, new, fashion, art, design, collect, week, said, one, look, work, like, york, made, dress, artist, wear, model, way, see</p>
<p>Topic 12: iran, said, state, israel, nuclear, deal, unit, presid, obama, american, negoti, will, offici, agreement, netanyahu, iranian, isra, minist, saudi, countri</p>	<p>Topic 17: said, crash, two, pilot, year, flight, day, ebola, one, plane, gas, peopl, mile, report, ship, last, offici, airlin, passeng, earthquak</p>
<p>Topic 13: said, player, game, team, year, sport, one, play, yanke, last, season, leagu, first, run, will, basebal, met, time, like, two</p>	<p>Topic 18: american, govern, new, will, russia, countri, support, agreement, allow, european, histori, strategi, exist, approv, depend, doesnt, regim, hope, scandal, least</p>
<p>Topic 14: women, said, univers, year, black, student, nation, white, church, men, one, school, mani, peopl, first, war, die, histori, right, presid</p>	<p>Topic 19: compani, said, bank, year, busi, will, market, percent, servic, like, execut, new, million, billion, industri, also, last, investor, now, use</p>
<p>Topic 15: game, team, said, season, player, coach, play, state, basketbal, point, iowa, year, two, one, second, first, made, tournament, win, kentucki</p>	<p>Topic 20: said, one, like, peopl, day, just, want, time, get, famili, friend, back, home, live, now, know, look, dont, work, ask</p>



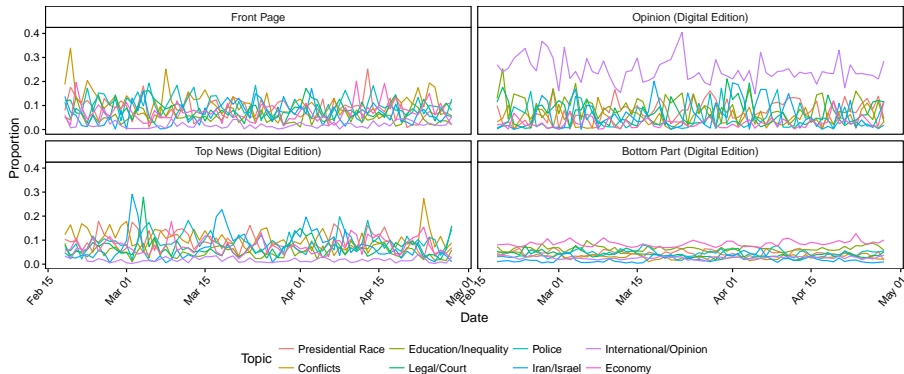
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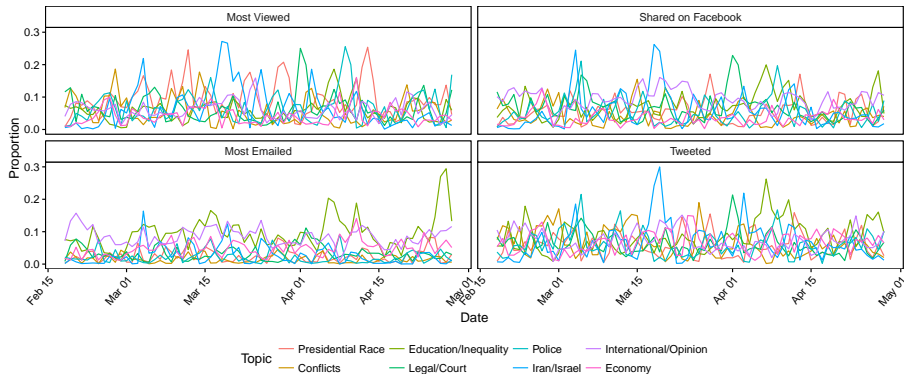
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# Topic Proportions over Time (Newspaper Section)



# Topic Proportions over Time (Shared/Viewed)



# References

- Roberts, Margaret E, Brandon M Stewart, and Dustin Tingley. 2014. "stm: R package for structural topic models." *Journal of Statistical Software* 1: 1–49.
- Roberts, Margaret E., Brandon M. Stewart, Dustin Tingley, Christopher Lucas, Jetson Leder-Luis, Shana Kushner Gadarian, Bethany Albertson, and David G. Rand. 2014. "Structural Topic Models for Open-Ended Survey Responses." *American Journal of Political Science* 58 (4): 1064–1082.