\$26,736. 10. Brian Scott, Chevrolet, 200, 100.2, 34, \$26,676. 11. Daniel Suarez, Toyota,

200, 85.5, 32, \$26,460.

13. Ryan Reed, Ford, 200, 79.4. 31 \$23,778. 14. Chris Buescher, Ford, 200, 86, 30, \$23,399. 15. Darrell Wallace Jr., Ford, 199. 81.3, 29, \$23,746. 16. Jeremy Clements, Chevrolet, 199, 72, 28, \$22,944, 17. Ryan Sieg Chevrolet, 199, 74.4, 27, \$22,741. 18. Dakoda Chevrolet, 199, 74.4, 27, \$22,741. 18. Dandda Armstrong, Ford, 199, 69.9, 26, \$22,539. 19. Dylan Lupton, Chevrolet, 199, 66.5, 25, \$22,362. 20. Mike Bliss, Toyota, 197, 66, 24, \$16,711. 21. David Starr, Toyota, 197, 64.9, 23, \$22,109, 22. Cale Conley, Toyota, 197, 56, 7, 22, \$21,978. 23. Harrison Rhodes, Chevrolet, 197, 55.5, 21, \$21,851. 24. J.J. Yeley, Toyota, 197, 57.8, 20, \$21,751, 25. Blake Koch, Toyota, 197.

1. Joey Logano, Ford, 200 laps, 150 rating, 0 points, \$81,148. 2. Matt Kenseth, Toyota, 200, 126.8, 0, \$60,886. 3. Kevin Harvick, Chevrolet, 200, 116, 0, \$42,789. 4. Austin Dillon, Chevrolet, 200, 114.7, 0, \$34,112. 5. Erik Jones, Toyotolet, 200, 111.8, 0, \$34,112. 5, Erik Jones, loyo-ta, 200, 111.8, 0, \$34,114. 6. Ty Dillon, Chev-rolet, 200, 100.3, 38, \$30,477. 7. Chase Elliott, Chevrolet, 200, 103, 37, \$29,998. 8. Brendan Gaughan, Chevrolet, 200, 92.4, 36, \$27,895. 9. Regan Smith, Chevrolet, 200, 98.2, 35, \$26,736. 10. Brian Scott, Chevrolet, 200, 100.2, 34, \$26,676. 11. Daniel Suarez, Toyota, 200, 91, 33, \$25,967. 12. Elliott Sadler, Ford,

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points \$81 148 2 Matt Kenseth Toyota 200 126.8, 0, \$60,886. 3. Kevin Harvick, Chevrolet 120.8, 0, \$60,886.3, Kevin Harvick, Chevrolet, 200, 116, 0, \$42,789. 4. Austin Dillon, Chevrolet, 200, 114.7, 0, \$34,114. 5. Erik Jones, Toyota, 200, 111.8, 0, \$34,114. 6. Ty Dillon, Chevrolet, 200, 100.3, 38, \$30,477. 7. Chase Elliott, Chevrolet, 200, 103, 37, \$29,998. 8. Brendan Gaughan, Chevrolet, 200, 92.4, 36, \$27,895. 9. Regan Smith, Chevrolet, 200, 98.2, 35, \$26,736. 10. Brian Scott, Chevrolet, 200, 100.2, 34, \$26,676. 11. Daniel Suarez, Toyota, 200, 91, 33, \$25,967. 12. Elliott Sadler, Ford, 200, 85.5, 32, \$26,460. 1. Joey Logano, Ford, 200 laps, 150 rating, 0

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At The Indian Wells Tennis Garden Surface: Hard-Outdoor

MEN'S SINGLES (second round)-Philipp Kohlschreiber (26), Germany, d. Tim Smyczek, 6-3, 6-1; Kevin Anderson (16), South Africa, d. Federico Delbonis. Argentina. 7-5, 6-4: Juan Monaco, Argentina, d. Marin Cilic (10), Croatia, 6-4, 6-4; Fernando Verdasco (28), Spain, d. James Duckworth, Australia, 6-2, 7-6 (3); Kei Nishikori (5), Japan, d. Ryan Harrison, 6-4, 6-4; Thanasi Kokkinakis, Australia, d Guillermo Garcia-Lopez (23), Spain, 7-5, 5-7, 6-3; Ernests Gulbis (14), Latvia, d. Daniel Gimeno-Traver, Spain, 6-4, 6-1; Andy Murray (4), Britain, d. Vasek Pospisil, Canada, 6-1, 6-3; Adrian Mannari no, France, d. Fabio Fognini (19), Italy, 7-6 (8), 6-3; Albert Ramos-Vinolas, Spain, d. Julien Benneteau (25), France, 6-2, 6-3; Pablo Cuevas (20), Uruguay, d. Jarkko Nieminen, Finland, 4-6, 7-5, 6-0; David Ferrer (8), Spain, d. Ivan Dodig, Croatia, 4-6, 6-1, 7-6 (6); Bernard Tomic (32), Australia, d. Borna Coric, Croatia, 6-3, 6-4; John Isner (18), d. Jurgen Melzer, Aŭstria, 6-3, 6-4; Novak Djokovic (1), Serbia, d. Marcos Baghdatis, Cyprus, 6-1, 6-3.
WOMEN'S SINGLES (second round)—Ana Iva

WOMEN'S SINGLES (second round)—Ana Iva-novic (5), Serbia, d. Yulia Putintseva, Kazakh-stan, 6-3, 6-1; Sara Errani (11), Italy, d. Zhu Lin, China, 6-0, 4-6, 6-2; Flavia Pennetta (15), Italy, d. Madison Brengle, 6-4, 6-2; Sabine Lisicki (24), Germany, d. Roberta Vinci, Italy, 6-1, 5-7, 6-4; Belinda Bencic (31), Switzerland, d. Bojana Jovanovski. Serbia. 6-2. 7-6 (2): Caroline Woz-

Novak Djokovic (1), Serbia, d. Marcos Baghdatis,

Cyprus, 6-1, 6-3.

MEN'S SINGLES (second round)-Philipp
Kohlschreiber (26), Germany, d. Tim Smyczek, 6-3, 6-1; Kevin Anderson (16), South Africa, d. Federico Delbonis, Argentina, 7-5, 6-4; Juan Monaco, Argentina, d. Marin Cilic (10), Croatia, 6-4, 6-4; Fernando Verdasco (28), Spain, d. James Duckworth, Australia, 6-2, 7-6 (3); Kei Nishikori (5), Japan, d. Ryan Harrison, 6-4, 6-4; Thanasi Kokkinakis, Australia, d Guillermo Garcia-Lopez (23), Spain, 7-5, 5-7, 6-3; Ernests Gulbis (14), Latvia, d. Daniel Gimeno-Traver, Spain, 6-4, 6-1; Andy Murray (4), Britain, d. Va-sek Pospisil, Canada, 6-1, 6-3; Adrian Mannarino, France, d. Fabio Fognini (19), Italy, 7-6 (8) 6-3: Albert Ramos-Vinolas, Spain, d. Julien Benneteau (25), France, 6-2, 6-3; Pablo Cuevas (20), Uruguay, d. Jarkko Nieminen, Finland, 4-6 7-5, 6-0; David Ferrer (8), Spain, d. Ivan Dodig, Croatia, 4-6, 6-1, 7-6 (6); Bernard Tomic (32), Australia, d. Borna Coric, Croatia, 6-3, 6-4; John Isner (18), d. Jurgen Melzer, Austria, 6-3, 6-4; Novak Djokovic (1), Serbia, d. Marcos Baghdatis, Cyprus, 6-1, 6-3.

WOMEN'S SINGLES (second round)-Ana Iva women's Singles (second round)—Anal va-novic (5), Serbia, d. Yulia Putintseva, Kazakh-stan, 6-3, 6-1; Sara Errani (11), Italy, d. Zhu Lin, China, 6-0, 4-6, 6-2; Flavia Pennetta (15), Italy, d. Madison Brengle, 6-4, 6-2; Sabine Lisicki (24), Germany, d. Roberta Vinci, Italy, 6-1, 5-7, 6-4; Belinda Bencic (31), Switzerland, d. Bojana Jovanovski. Serbia. 6-2. 7-6 (2): Caroline WozAxalta Faster. Tougher. Brighter. 200 At Avondale. Ariz.

Track: 1-mile oval

1. Joey Logano, Ford, 200 laps, 150 rating, 0 points, \$81,148, 2. Matt Kenseth, Toyota, 200, 126.8, 0, \$60.886. 3. Kevin Harvick, Chevrolet, 200, 116, 0, \$42,789. 4. Austin Dillon, Chevrolet, 200, 114.7, 0, \$34,112. 5. Erik Jones, Toyota, 200, 111.8, 0, \$34,114. 6. Ty Dillon, Chevrolet, 200, 100.3, 38, \$30,477. 7. Chase Elliott, Chevrolet, 200, 103, 37, \$29,998. 8. Brendan Gaughan, Chevrolet, 200, 92.4, 36, \$27,895 9. Regan Smith, Chevrolet, 200, 98.2, 35, \$26,736. 10. Brian Scott, Chevrolet, 200, 100.2, 34, \$26,676. 11. Daniel Suarez, Toyota,

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13. Ryan Reed, Ford, 200, 79.4, 31, \$23,778. 14. Chris Buescher, Ford, 200, 86, 30, \$23,399. 15. Darrell Wallace Jr., Ford, 199, 81.3, 29, \$23,746. 16. Jeremy Clements, Chev-\$22,109, 22, Cale Conley, Toyota, 197, 56,7, 22 \$21,978. 23. Harrison Rhodes, Chevrolet, 197, 55.5, 21, \$21,851. 24. J.J. Yeley, Toyota, 197, 57.8. 20. \$21,751. 25. Blake Koch, Toyota, 197,

Clustering of Articles by Theme and Sentiment

Natural Language Processing Term Project Proposal

Courtney Fiala and Anders Maraviglia

126.8, 0, \$60,886. 3. Kevin Harvick, Chevrolet 200, 116, 0, \$42,789. 4. Austin Dillon, Chevrolet, 200, 114.7, 0, \$34,112. 5. Erik Jones, Toyota, 200, 111.8, 0, \$34,114. 6. Ty Dillon, Chevrolet, 200, 100.3, 38, \$30,477. 7. Chase Elliott, Chevrolet, 200, 103, 37, \$29,998. 8. Brendan Gaughan, Chevrolet, 200, 92.4, 36, \$27,895 9. Regan Smith, Chevrolet, 200, 98.2, 35, \$26,736. 10. Brian Scott, Chevrolet, 200,

df. Lucie Hradecka, Czech Republic, 6-2, 6-2. WOMEN'S SINGLES (second round)-Ana Ivanovic (5), Serbia, d. Yulia Putintseva, Kazakhstan, 6-3, 6-1; Sara Errani (11), Italy, d. Zhu Lin China, 6-0, 4-6, 6-2; Flavia Pennetta (15), Italy, d. Madison Brengle, 6-4, 6-2; Sabine Lisicki (24), Germany, d. Roberta Vinci, Italy, 6-1, 5-7, 6-4; Belinda Bencic (31), Switzerland, d. Bojana

garia, 6-2, 6-3; Eugenie Bouchard (6), Canada, df 1 incie Hradecka Czech Renublic 6-2, 6-2 (20), Uruguay, d. Jarkko Nieminen, Finland, 4-6, 7-5, 6-0; David Ferrer (8), Spain, d. Ivan Dodig, Croatia, 4-6, 6-1, 7-6 (6); Bernard Tomic (32), Australia, d. Borna Coric, Croatia, 6-3, 6-4; John Isner (18), d. Jurgen Melzer, Austria, 6-3, 6-4; Novak Djokovic (1), Serbia, d. Marcos Baghdatis,

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Motivation

- RCOS project that is working on an app that displays news articles with differing viewpoints on the same theme
- There are sites that present opposing viewpoints for a theme – but they are hand selected
- We will attempt to use an in-depth theme extraction and sentiment analysis approach for the article clustering

Input and Output

Input

A set of articles

Output

Graph of articles clustered by theme and viewpoint

Extended Goal

- Find organizations and people mentioned in the articles using named entity extraction
- Then output each organization's views on all themes in the dataset

Example

Input:

Fictional Article Summaries

Article 1: CNN says Clinton wins presidential debate

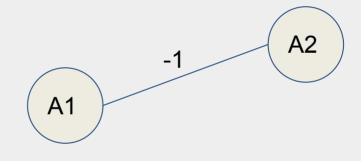
Article 2: Fox News determines Trump won first debate

Article 3: Onion says clown sightings across country increase

Output:

Themes

- presidential debate (A1, A2)
- clowns (A3)





System Architecture and Approach

- Determine best theme extraction and sentiment analysis tools (Alchemy API, nltk, Cloud Natural Language API (Google))
- 2. Write tool to determine the theme in an article
- 3. Write tool to determine the sentiments of an article towards it's topics
- 4. Combine tools into module to cluster set of articles by theme and sentiment
- 5. Use named entity extraction to find organizations and people mentioned in articles
- 6. Write tool to extract the viewpoints of these organizations and people

Time Table

1: Decide on outside tools and architectures 10/13 (1 week)

2: Theme extraction module 10/23 (1.5 weeks)

3: Sentiment analysis module 11/03 (1.5 weeks)

4: Combine modules to cluster set of articles 11/17 (2 weeks)

5: Named entity extraction module 11/22 (1 week)

6: Entity viewpoint extraction 12/06 (2 weeks)

Thank you! Any questions?