

# Exploration of News Corpora

By studying actor evolution &  
graph visualization over time

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# Motivation

Information Need: *How did Bill Clinton win the 1992 elections?*

Jan 1, 1992–Dec 31, 1993

## [THE 1992 ELECTION: CLINTON, BUSH AND PEROT IN HISTORY](#)

Pay-Per-View - Washington Post - Nov 5, 1992

50.1% 1992 ..... 55.0%+ +Estimate CLINTON Democrat **Bill Clinton** yesterday won a .... 50 Sitting presidents defeated in the general **election**: PRESIDENT . ...

[THE 1992 ELECTIONS: VOTERS -- THE...](#) New York Times

[THE 1992 ELECTIONS: PRESIDENT -- THE...](#) New York Times

[THE 1992 ELECTIONS: THE WORLD --...](#) New York Times

[New York Times](#) - [New York Times](#)

## [THE 1992 ELECTIONS: DISAPPOINTMENT -- THE REPUBLICANS;...](#)

New York Times - Nov 4, 1992

By MICHAEL WINES, At a gloomy and sometimes angry post-**election** ... Mr. Bush said he had called President-elect **Bill Clinton** to congratulate him and to ...

[THE 1992 ELECTIONS - DISAPPOINTMENT --...](#) nytimes.com

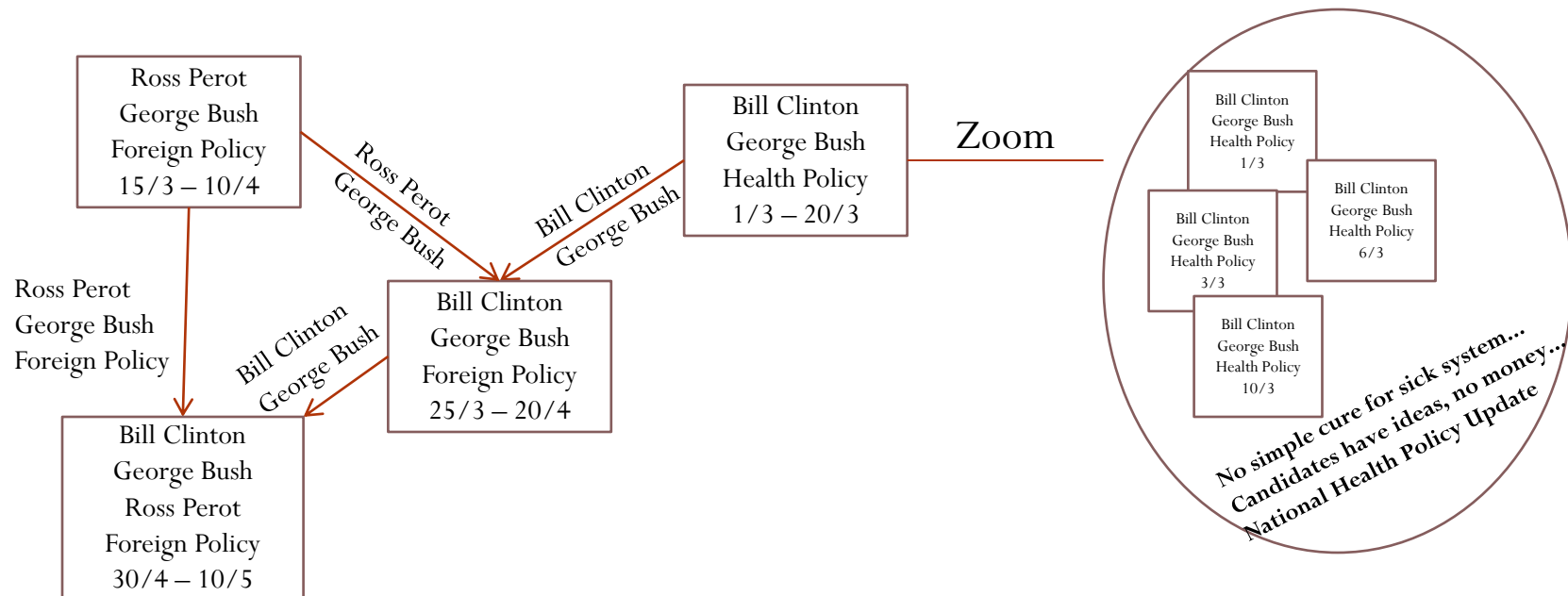
## [... GOP LEADER SAW MANDATE OF HIS OWN IN RESULTS OF \*\*ELECTION\*\*](#)

Source: Google News

- How to frame the query?
- Suffers from lack of temporal & contextual coherence
- Impossible to get a sense of issue relevance
- Where do I **start**?

# Motivation

Information Need: *How did Bill Clinton win the 1992 elections?*



- Set all relevant actors as filters {George Bush, Ross Perot, Bill Clinton}
- Set the time period in which articles are to be studied {1992}
- Immediately reveals how their relationships evolved temporally

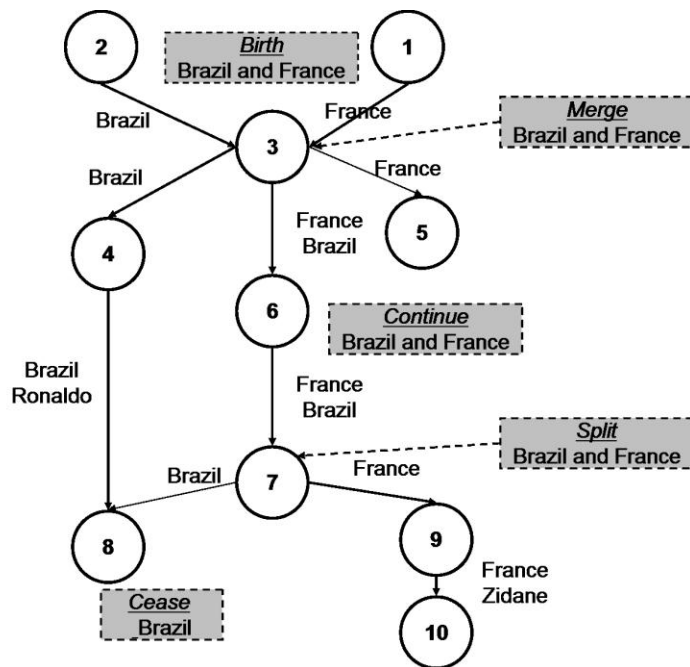
# Problem Statement

- Structure news articles as a directed graph for ease of analysis
- Derive meaning/context/connections from articles
- Create an easy to use news browsing tool
- Planned as an extension of work done in [1]



# A Framework for Exploration of News Corpora by Actor Evolution and Interaction [1]

- **Actors:** Dominant entities appearing in a news article
- Place a node for each article labelled by it's actors
- Model interactions as set of 5 *transformations*



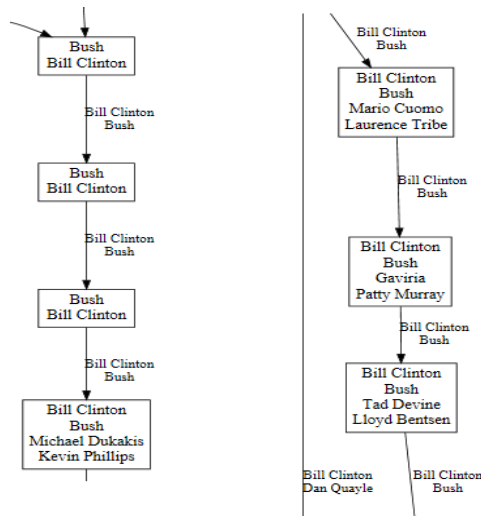
- Score each transformation and pick those above a threshold

# Our Dataset & Approach

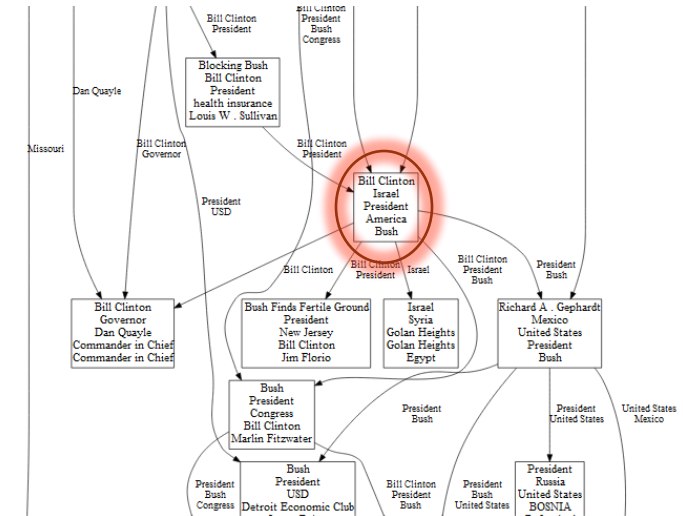
- Consider the articles from NYTimes archives
- Filter out articles related to 1992 US Elections
- Extract actors for each article using Open Calais API [3]
  - returns the dominant entities, topics, social tags, relationships
- Construct the graph of these articles as discussed in [1]
  - Analyze the graph for interesting properties
  - Improve the edge coherence of graph

# Results: Structure of the graph

- Linear chains in the graph
- Represent fast developing breaking news
- Articles of 'central' importance in the graph
- Summary articles



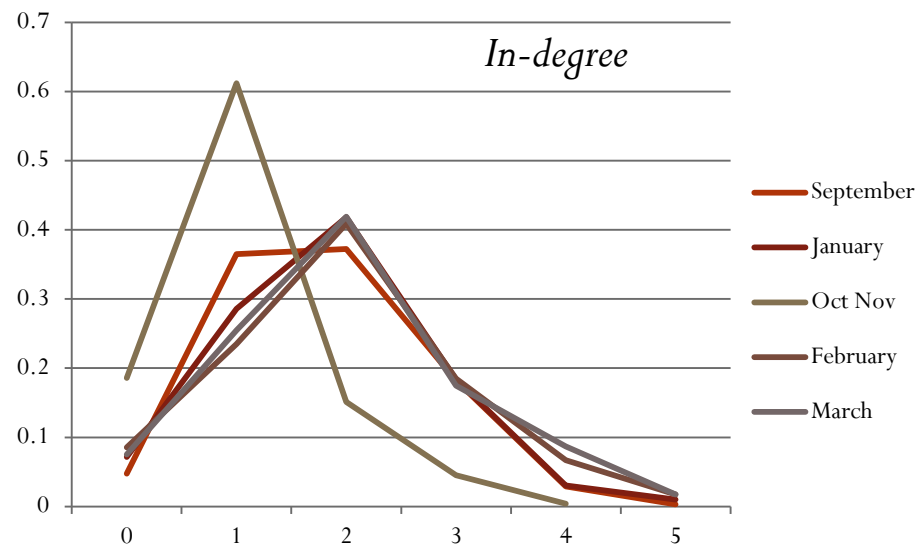
Bill Clinton & George Bush  
interacting with other actors



Article summarizing about all  
that happened the past week

# Results: Graph degree distribution

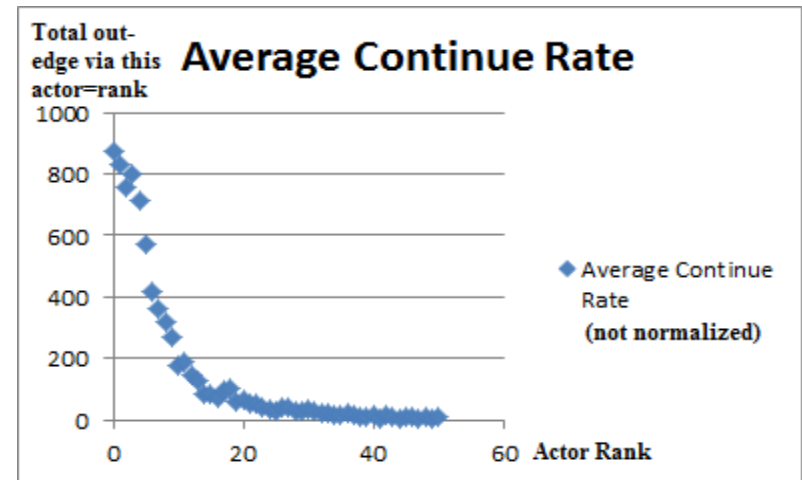
- Do degree distributions tell us something about significance of particular events and how to summarize graphs?





# Results: Actor Interactions

- Unpopular actors fade out quickly
- Popular actors interact amongst each other
- The actor '**Bill Clinton**' and '**President**' are the 2 most interacting entities

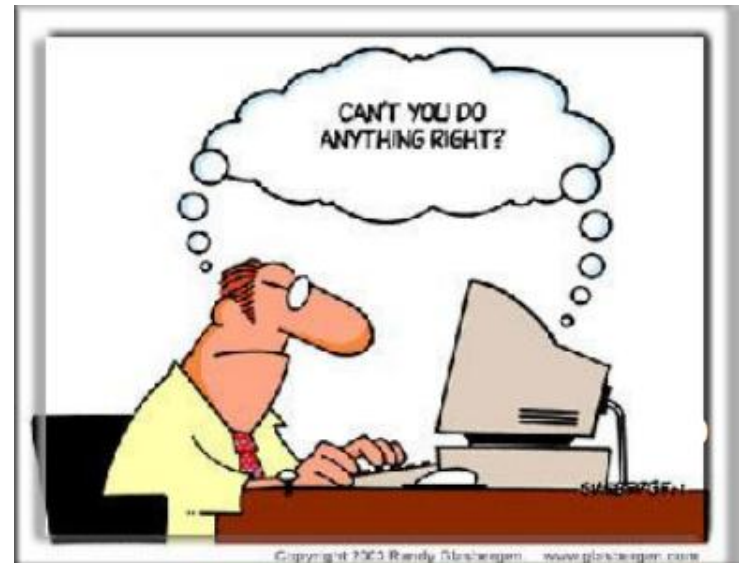


# Future Directions

- Current code will be rewritten so as to try other heuristics of generating graphs and summarization techniques
- Implement thematic tagging of nodes and using the tags to create independent themes from the graph
- Modeling news as an *open / closed system*.
  - Open system: Eg. Global Warming
  - Closed system: Eg. Cricket News
- Query based summarization
- Learn better summarization by user feedback

# Tool Demonstration & Interface

- We can click on a node to get the corresponding article
- If we pick out a path of articles, they are connected by a coherent story
- Other visualization interfaces need to be experimented



# Thank You!

## Questions & Comments.

### References

- [1] R. Choudhary, S. Mehta, A. Bagchi, and R. Balakrishnan. Towards characterization of actor evolution and interactions in news corpora. In *Advances in Information Retrieval*.
- [2] Shahaf, D., Guestrin, C.: Connecting the dots between news articles. Proceedings of the 16th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining
- [3] [api.opencalais.com](http://api.opencalais.com)
- [4] [http://en.wikipedia.org/wiki/United\\_States\\_presidential\\_election\\_1992](http://en.wikipedia.org/wiki/United_States_presidential_election_1992)