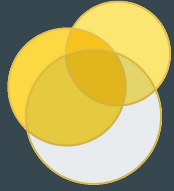


Fortune 500 Electoral Influence

1990-2012

...

Paul Mack, Alden Golab



SUNLIGHT
FOUNDATION

About the data

Sunlight Foundation State and
Federal Campaign Contributions
1990 - 2012

(Two Year Increments Corresponding to Cycle)

Federal law requires that campaigns and PACs disclose information about the identities of individuals, corporate or private, who donate over \$200 to a in a given year or cycle.

Name

Residence

Employer/Organization

Recipient Information

Date

15.1 GB

Or 50.7 Million transactions for all
Federal and State level campaigns

Top individual contributors tend to be lesser known

	Contributions	Individual		Contributions	Individual
1	\$729,005,408.00	Mr. Lee L Mercer Jr.	5	\$28,215,750.00	Thomas F. Steyer
2	\$54,756,566.00	Stephen L. Bing	11	\$26,798,373.20	James & Virginia Stower
3	\$53,822,872.00	Linda McMahon	13	\$19,516,336.04	James E. Pederson
4	\$39,830,810.31	Bob J. Perry	15	\$17,889,650.00	John R. Raese



Top organizations are well known heavy-weights

Rank	Contributions	Organization
1	\$1,348,150,439.38	National Republican Congressional Committee
2	\$991,885,410.28	Republican National Committee
3	\$777,393,014.00	DNC Services Corps
4	\$683,447,745.15	Democratic Congressional Campaign Committee
5	\$631,654,092.89	Democratic Senatorial Campaign Committee
11	\$137,855,333.64	Service Employees International Union
13	\$128,364,947.88	California Teacher's Association
15	\$97,952,177.43	Philip Morris
21	\$84,236,959.00	National Rifle Association
23	\$81,540,958.00	National Association of Realtors



**There is substantial variation
between the causes to whom Fortune
500 corporations donate and those
to whom their employees donate.**

Hypothesis 1

**Resolve entities with substantial
spelling variation and the occasional
unicode character.**

Challenge 1

Sample of Goldman Sachs Variations

GOLDMAN SAKS

GOLDRAN SACHS

GOLDMAN, SACHS & CO

GOLDMAN SACHS & CO.

GOLDMAN- SACHS & CO.

GOLDMAN SACH & COMPANY

GOLMAN SACHS

GOLDMAN SACHS & COMPANY

GOLDMAN SACHS GROUP

GOLDMAN SACHS ASIA LLC

Entity resolution algorithm

Read in each entry and
thoroughly clean all unicode

Loop through F500
authoritative list and match

Output JSON for later use

GOLDMAN SAKS

Prudential
Financial

Humana, Inc.

The Goldman Sachs
Group, Inc.

Tesoro Corporation

Liberty Mutual
Holding Company

```
[{ 'GOLDMAN SAKS':  
  'The Goldman Sachs  
  Group, Inc.' }]
```

Entity matching work

1. Remove stop words
2. Strip misc. Chars
3. Simple edit
distance score
using fuzzywuzzy

Runtime.

Challenge 2

Runtime issues, even with parallelization

Entity resolution algorithm

200,000 records:

37 minutes 10 seconds on local

512,729 records:

5x the work per node

AWS 20 nodes about 30 - 40 minutes

Data aggregation algorithm

1. Remove unicode encoding
2. Strip characters
3. Look-up organization name in JSON, held in memory on AWS using `configure_options()`
4. Determine whether corporate or individual contribution
5. Export to CSV

Achieved constant run time and could process the full dataset in 30 minutes on 40 nodes

Entity reduction results from 1 percent of total data

444 Uniques

2000 Aliases

FMC

28 Aliases

AIG

26 Aliases

Coca-Cola

18 Aliases

Goldman
Sachs

17 Aliases

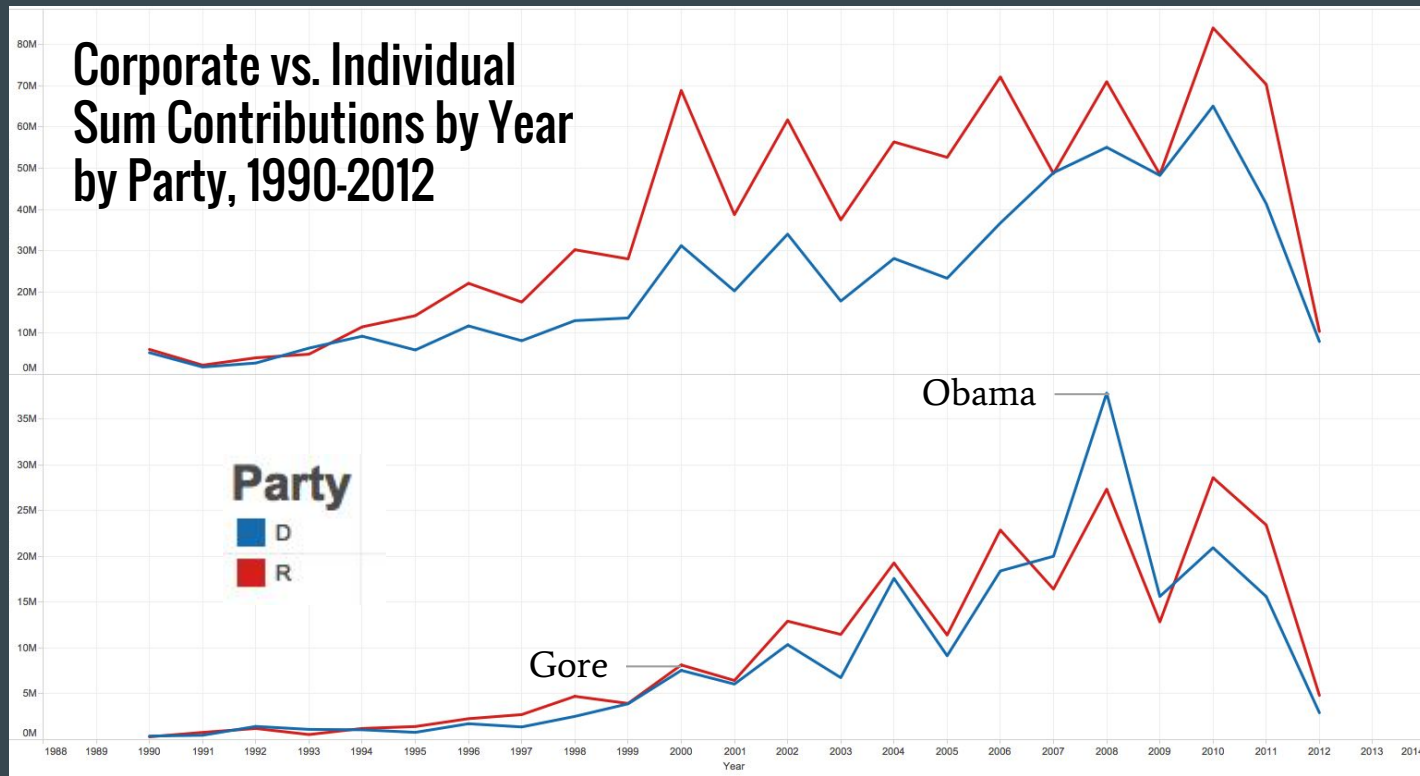
Confirmed.

Hypothesis 1

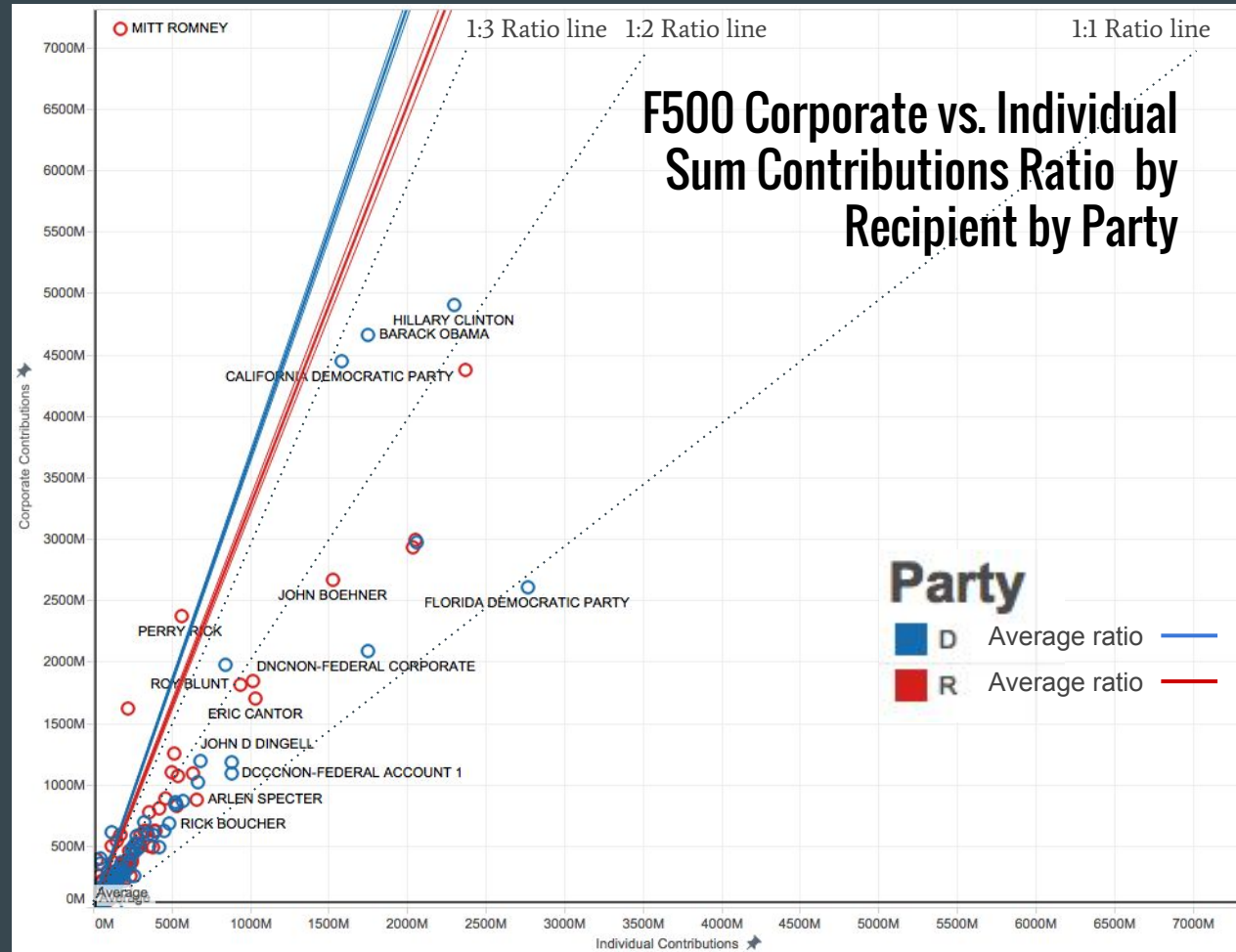
F500 Corporations don't always agree with employees

Corporate
Contributions

Individual
Contributions



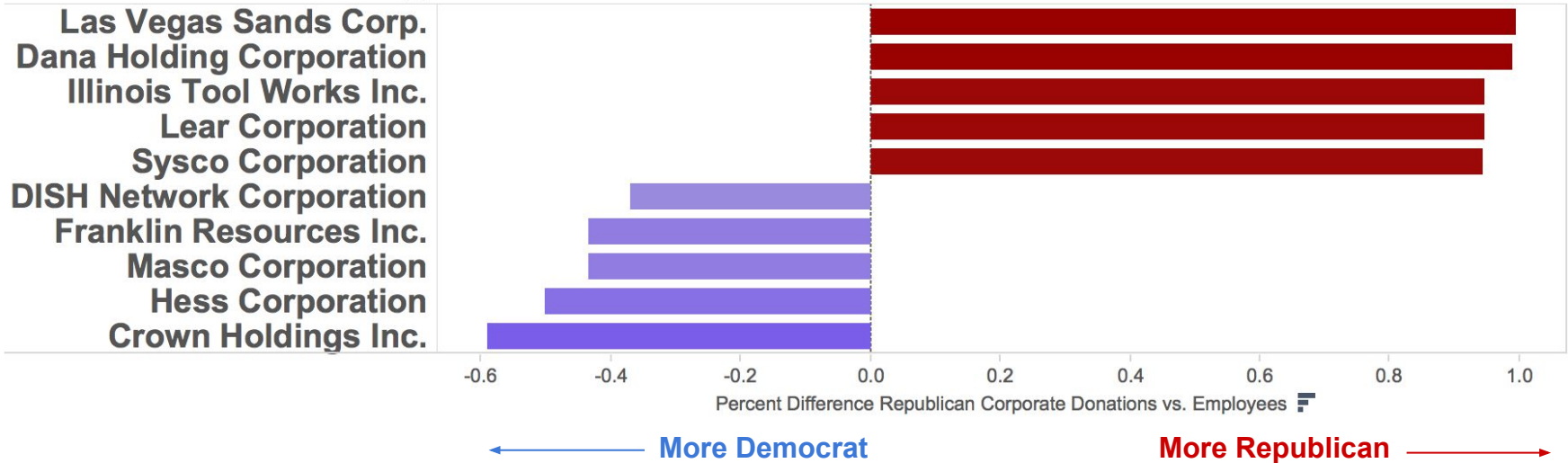
While overall F500 corporations donate more to Republican candidates, when compared to their employees at a dollar-to-dollar ratio, corporations tend to slightly outweigh their employees on *Democratic* candidate and committee contributions



Quantifying Disconnect



Difference Percent Republican Contributions for Corporations vs. Individual, by Co.



Stuff We Want to Do

More specifically, we ran out of time to do this stuff because of AWS issues

Analysis of Donor Networks

Extraction of all pairs and loading into a network analysis package, where edges represent money transfers, to study relationship of centrality to electoral success.

Full Dataset Entity Resolution

Because of time constraints and issues with MRJob on AWS, we were constrained to Fortune 500 companies and their employees.

Things We Learned

What we would tell ourselves

MRJob data passing protocols are difficult to understand, but useful

Reading in data from any source must deal with encoding issues by default

Entity reduction is computationally very expensive

AWS costs can balloon quickly

Thanks!



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