# Quantifying the Return on Investment (ROI) of Campaign Contributions

Hope Mullins

University of Central Florida

June 3, 2025

> Buckley v. Valeo (1976)

- > Buckley v. Valeo (1976)
- ➤ Citizens United v. FEC (2010)

- > Buckley v. Valeo (1976)
- ➤ Citizens United v. FEC (2010)
- ➤ McCutcheon v. FEC (2014)

- ➤ Buckley v. Valeo (1976)
- > Citizens United v. FEC (2010)
- ➤ McCutcheon v. FEC (2014)
- ➤ Relevance

- ➤ Buckley v. Valeo (1976)
- ➤ Citizens United v. FEC (2010)
- ➤ McCutcheon v. FEC (2014)
- ➤ Relevance
- ➤ Propose Question

† Production Function Models

- † Production Function Models
- † Marginal Analysis

- † Production Function Models
- † Marginal Analysis
- † Public Choice

- † Production Function Models
- † Marginal Analysis
- † Public Choice
  - ℜ Rent-seeking

- † Production Function Models
- † Marginal Analysis
- † Public Choice
  - ℜ Rent-seeking
- † Spatial Utility Politics

- † Production Function Models
- † Marginal Analysis
- † Public Choice
  - \* Rent-seeking
- † Spatial Utility Politics
- † Persuasion Theory

- † Production Function Models
- † Marginal Analysis
- † Public Choice
  - \* Rent-seeking
- † Spatial Utility Politics
- † Persuasion Theory
- † Regulatory Impact

- † Production Function Models
- † Marginal Analysis
- † Public Choice
  - Rent-seeking
- † Spatial Utility Politics
- † Persuasion Theory
- † Regulatory Impact
- † All-Pay Auction

#### **Relevant Literature**

➤ The Effects of Campaign Spending in Congressional Elections (Jacobson, 1978).

#### **Relevant Literature**

- ➤ The Effects of Campaign Spending in Congressional Elections (Jacobson, 1978).
- ▶ Using Repeat Challengers to Estimate the Effect of Campaign Spending on Election Outcomes in the U.S. House (Levitt, 1994).

## **Relevant Literature**

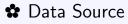
- ➤ The Effects of Campaign Spending in Congressional Elections (Jacobson, 1978).
- ◆ Using Repeat Challengers to Estimate the Effect of Campaign Spending on Election Outcomes in the U.S. House (Levitt, 1994).
- ▶ Buying Supermajorities (Groseclose & Synder, 1996).

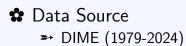
# Relevant Literature (Continued)

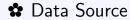
Measuring Campaign Spending Effects in U.S. House Elections (Jacobson, 2004).

# Relevant Literature (Continued)

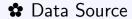
- Measuring Campaign Spending Effects in U.S. House Elections (Jacobson, 2004).
- ➤ Why Is There So Little Money in U.S. Politics? (Ansolabehere et al., 2003).







- **⇒** DIME (1979-2024)
- ⇒ Tables, number of variables



- **⇒** DIME (1979-2024)
- ⇒ Tables, number of variables
- Noteworthy Variables

- Data Source
  - **⇒** DIME (1979-2024)
  - ⇒ Tables, number of variables
- Noteworthy Variables
- **☆** Filtering/Cleaning Process

- Data Source
  - **⇒** DIME (1979-2024)
  - ⇒ Tables, number of variables
- Noteworthy Variables
- ♣ Filtering/Cleaning Process
  - ⇒ DuckDB

- Data Source
  - **⇒** DIME (1979-2024)
  - → Tables, number of variables
- Noteworthy Variables
- Filtering/Cleaning Process
  - ⇒ DuckDB
  - ⇒ cand: 23,379 rows, contrib: 97,864,851 rows, donor: 8,720,783 rows

- Data Source
  - **⇒** DIME (1979-2024)
  - ⇒ Tables, number of variables
- Noteworthy Variables
- Filtering/Cleaning Process
  - ⇒ DuckDB
  - ⇒ cand: 23,379 rows, contrib: 97,864,851 rows, donor: 8,720,783 rows
- Subsetting, Aggregating, Cleaning

# **Empirical Specifications**

## Logistic:

$$\Pr\big(W_i = 1 \mid S_i, OS, \mathbf{X}_i\big) = \mathsf{logit}^{-1}\big(\beta_0 + \beta_1 \log S_i - \beta_2 \log OS + \boldsymbol{\beta}_3^\top \mathbf{X}_i\big)$$

- $\beta_0$  is the intercept.
- $\beta_1$  captures how a candidate's own spending affects log-odds of winning.
- $\beta_2$  captures how an opponent's spending affects log-odds of winning.
- **\***  $\mathbf{X}_i$  are other covariates with coefficients  $\beta_3$ .

#### Linear:

$$VS_i = \beta_0 + \sum_{k=1}^K \beta_k X_{ik} + \varepsilon_i,$$

- ❖ X<sub>ik</sub> is the kth explanatory variable (e.g., total receipts, incumbency, number of donors, party—district fixed effects, etc.).
- $\beta_k$  is the marginal effect of covariate  $X_{ik}$  on vote share.
- $\varepsilon_i \sim (0, \sigma^2)$  is the error term.

#### Generalized Additive Models:

$$VS_i = \beta_0 + \sum_{j=1}^{p} s_j(X_{ij}) + \sum_{\ell=p+1}^{K} \beta_\ell X_{i\ell} + \varepsilon_i,$$

$$\Pr(\mathrm{Win}_{i} = 1 \mid \mathbf{X}_{i}) \ = \ \frac{\exp\left(\beta_{0} \ + \ \sum_{j=1}^{p} s_{j}(X_{ij}) \ + \ \sum_{\ell=p+1}^{K} \beta_{\ell} X_{i\ell}\right)}{1 + \exp\left(\beta_{0} \ + \ \sum_{j=1}^{p} s_{j}(X_{ij}) \ + \ \sum_{\ell=p+1}^{K} \beta_{\ell} X_{i\ell}\right)}.$$

- $\beta_0$  is the intercept.
- $X_{i,p+1},\ldots,X_{iK}$  may include discrete or dummy variables with linear coefficients  $\beta_{p+1},\ldots,\beta_{K}$

Ensemble Methods w/ SHAP

- Random Forest
- Gradient Boosting
- SHAP values

Model Evaluation & Metrics

★ Logistic: AUC-ROC, accuracy, precision/recall.

 $\Leftrightarrow$  OLS/GAM: adjusted  $R^2$ , RMSE.

☆ ML methods: out-of-sample AUC (classification) or RMSE (regression); compare to baseline methods.

# **Next Steps**

- ✓ Data Preparation
- ✓ Model Specification/Estimation
- ✓ Result Interpretation
- ✓ Summarize

#### References I

- Ansolabehere, Stephen, John M. de Figueiredo, and James M. Snyder Jr. "Why is There So Little Money in U.S. Politics?" Accessed May 25, 2025, *Journal of Economic Perspectives* 17, no. 1 (2003): 105–130. https://doi.org/10.1257/089533003321164976.
- Buckley v. Valeo. https://www.fec.gov/legal-resources/court-cases/buckley-v-valeo/. Decided January 30, 1976, 1976.
- Chamon, Marcos, and Ethan Kaplan. "The Iceberg Theory of Campaign Contributions: Political Threats and Interest Group Behavior". Accessed June 1, 2025, American Economic Journal: Economic Policy 5, no. 1 (2013): 1–31. https://doi.org/10.1257/pol.5.1.1. https://pubs.aeaweb.org/doi/pdfplus/10.1257/pol.5.1.1.

#### References II

0002828041464443.

- Citizens United v. Federal Election Commission.

  https://www.fec.gov/legal-resources/courtcases/citizens-united-v-fec/. Decided January 21,
  2010, 2010.
- Coate, Stephen. "Pareto-Improving Campaign Finance Policy".

  Accessed June 1, 2025, American Economic Review 94, no. 3 (2004): 628-655.

  https://doi.org/10.1257/0002828041464443.

  https://pubs.aeaweb.org/doi/pdfplus/10.1257/
- Eismeier, Theodore J., and Philip H. III Pollock. "Strategy and Choice in Congressional Elections: The Role of Political Action Committees". Accessed June 2, 2025, *American Journal of Political Science* 30, no. 1 (1986): 197–213.

#### References III

- Groseclose, Tim, and James M. Snyder Jr. "Buying Supermajorities". Accessed May 25, 2025, American Political Science Review 90, no. 2 (1996): 303–315. https://doi.org/10.2307/2082886.
- Jacobson, Gary C. "Measuring Campaign Spending Effects in U.S. House Elections". In *The American Voter in the Age of Big Data*, ed. by Michael P. McDonald and John Samples, 123–145. Accessed June 1, 2025. University of Michigan Press, 2004. https://www.press.umich.edu/pdf/0472099213-ch8.pdf.
- . "The Effects of Campaign Spending in Congressional Elections". Accessed May 25, 2025, American Political Science Review 72, no. 2 (1978): 469–491. https://doi.org/10.2307/1954105.

#### References IV

- Jacobson, Gary C., and Samuel Kernell. Strategy and Choice in Congressional Elections. Accessed May 25, 2025. Yale University Press. 1983.
- Levitt, Steven D. "Using Repeat Challengers to Estimate the Effect of Campaign Spending on Election Outcomes in the U.S. House". Accessed May 25, 2025, *Journal of Political Economy* 102, no. 4 (1994): 777–798.
- McCutcheon v. Federal Election Commission.
  https://www.fec.gov/legal-resources/courtcases/mccutcheon-et-al-v-fec/. Decided April 2, 2014,
  2014.

#### References V

- Public Consultation, Program for. Very Large Majorities
  Support Congressional Bills to Reduce Influence of Big
  Campaign Donors. Accessed June 1, 2025, 2018.
  https://publicconsultation.org/redblue/verylarge-majorities-support-congressional-bills-toreduce-influence-of-big-campaign-donors/.
- Stratmann, Thomas. "Some Talk: Money in Politics. A (Partial) Review of the Literature". Accessed May 25, 2025, Public Choice 124, numbers 1-2 (2005): 135–156. https://doi.org/10.1007/s11127-005-2590-3.
- Urvoy, Camille. "Organized Voters: Elections and Public Funding of Nonprofits". Accessed June 1, 2025, American Economic Review 115, no. 1 (2025): 183-219. https://doi.org/10.1257/aer.20230056. https://pubs.aeaweb.org/doi/pdfplus/10.1257/aer.20230056.