

# The Anatomy of Voting on the Long Ballot: Evidence from South Carolina Ballot Image Logs

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**Motivation:** Are *national* and *local* electoral politics contested on the same partisan dimension?  
**Contribution:** Observed behavior on actual (not self-reported) individual vote choice.

## Data: Ballot Image Logs

Past work relies on either opinion surveys or ecological inference (cf. Gerber and Lewis, 2004).  
**Ballot image logs** overcome measurement challenges inherent in surveys and aggregate data:

	Ballot Image Logs	Voter Files	Precinct Returns	Surveys
Individual-level?	✓	✓		✓
Actual Vote choice observed?	✓		✓	Self-report
Down-ballot races observed?	✓		✓	
No selection / sampling error?	✓	✓	✓	
Linkable to commercial data?		✓		✓

The South Carolina Election Commission makes public all voters' ballot images.


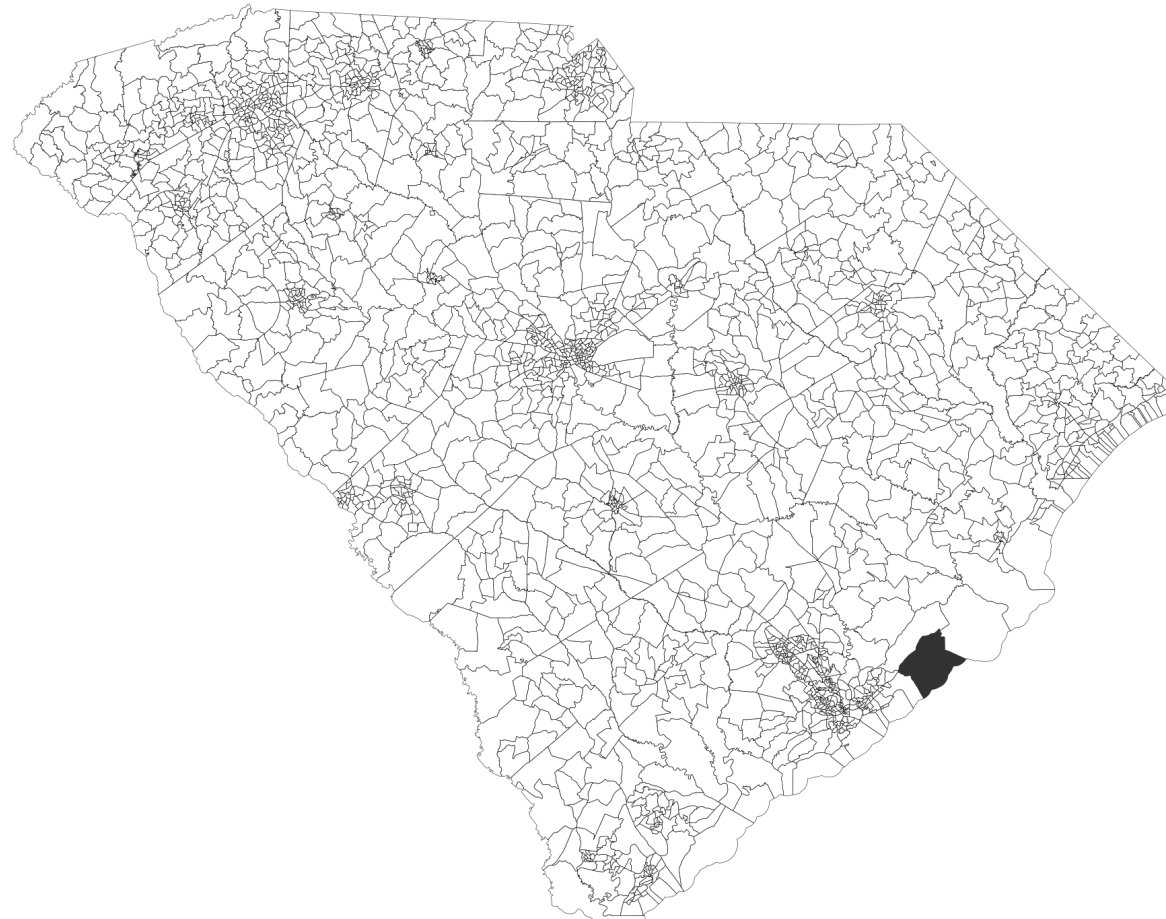
## Coverage: All votes cast in South Carolina state elections, 2010-2017

58 elections, including primaries, runoffs, and specials. The four generals featured many offices on the same ballot.

Election	Ballots Observed	Offices per Ballot
2010 Generals	1,132,656	21
2012 Generals	1,822,037	12
2014 Generals	1,193,467	20
2016 Generals	1,984,439	12

## Example log of three voters (Charleston County - Awendaw)

Each ballot image shows all the voter's actual votes (with precinct):

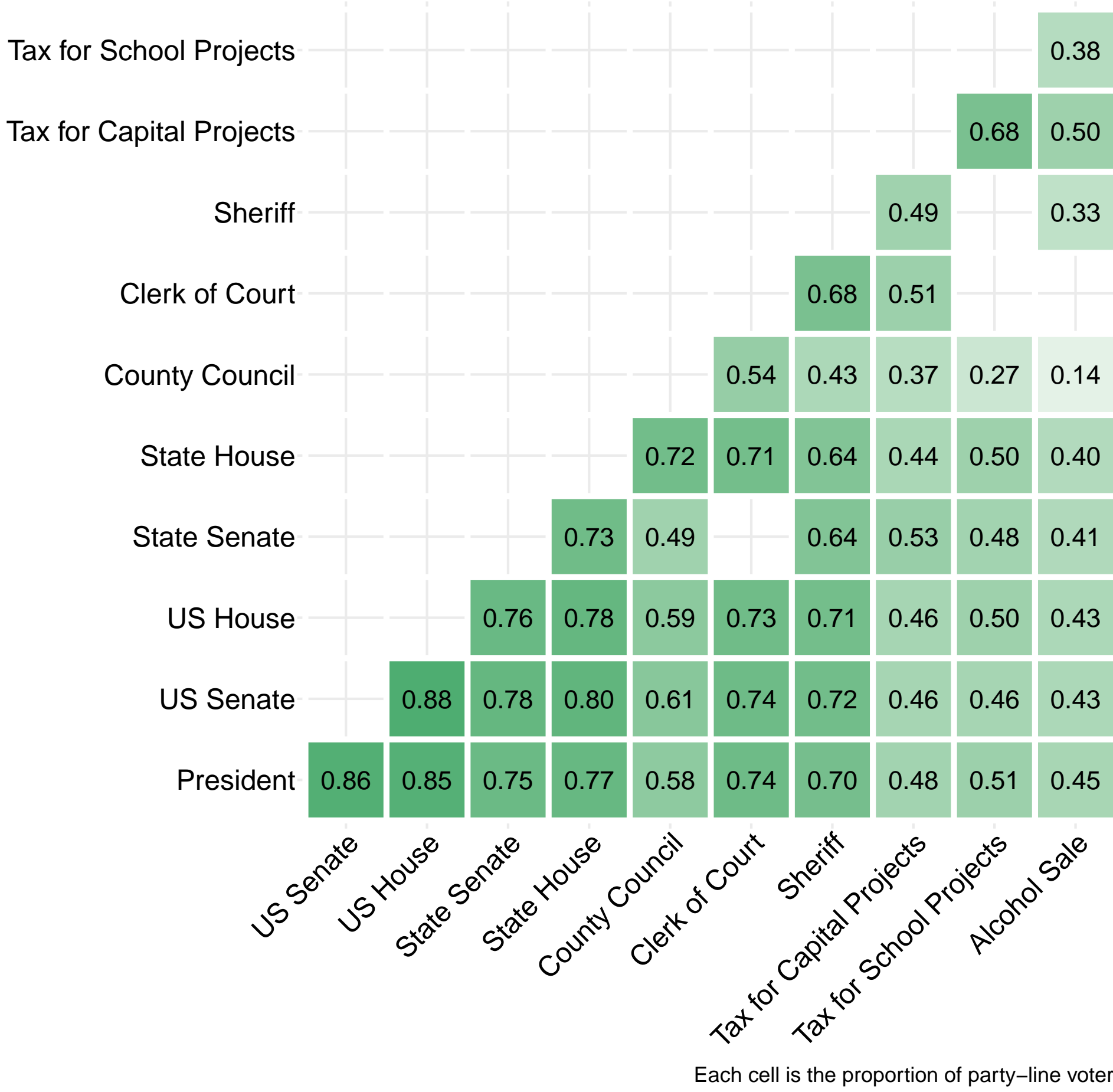
	VOTER A	
	10 Hillary Rodham Clinton	President and Vice President
	18 Thomas Dixon	U.S. Senate
	27 Dimitri Cherny	CON0001 U.S. House of Representatives
	53 Peter J Tecklenburg	Auditor
	61 Andrew C Smith.	County Treasurer
104 No		Question 1
107 No		Question 2
VOTER B		
14 Donald J Trump		President and Vice President
22 Tim Scott		U.S. Senate
30 Mark Sanford		CON0001 U.S. House of Representatives
35 Stephen Goldfinch		SEN0034 State Senate
38 Lee Hewitt		HOU0108 State House of Representatives
41 Scarlett Wilson		Solicitor Circuit 9
44 Al Cannon		Sheriff
47 Julie J Armstrong		Clerk of Court
50 Rae H Wooten		Coroner
54 Elizabeth Moffly		Auditor
59 Mary E Tinkler.		County Treasurer
64 John H Smoak		Soil and Water District Commission
68 Tony E Lewis		CSB City of Charleston
71 Chris Collins		CSB North Area
74 Louis L Smith		CSB North Area
78 Priscilla Jeffery		CSB West Ashley
80 Michael Miller		CSB West Ashley
84 Anita Renee Alston-Gore		SCH0001 Con SB St James Santee District
88 Juanita M Middleton		SCH0001 Con SB St James Santee District
89 Samuel N Robinson		SCH0001 Con SB St James Santee District
104 No		Question 1
107 No		Question 2
VOTER C		
1 Democratic		STRAIGHT PARTY
10 Hillary Rodham Clinton		President and Vice President
18 Thomas Dixon		U.S. Senate
27 Dimitri Cherny		CON0001 U.S. House of Representatives
44 Al Cannon		Sheriff
47 Julie J Armstrong		Clerk of Court
53 Peter J Tecklenburg		Auditor
58 Mary Tinkler		County Treasurer
84 Anita Renee Alston-Gore		SCH0001 Con SB St James Santee District
86 Thomas L Colleton Jr		SCH0001 Con SB St James Santee District
87 Erma J Harrell		SCH0001 Con SB St James Santee District
103 Yes		Question 1
106 Yes		Question 2

## Voters Split their Ticket between Federal and State Offices

Party-line Vote:  $(a, b)$ : Voter  $i$  votes for Republicans, or Democrats, in both race  $a$  and race  $b$

Between federal and state-wide offices, 85-95 percent of voters vote the party line. But among state legislator, county council, judicial, sheriff, and clerk races (all with party-labels), only 50-75 percent of voters vote the party line. The number is lower still with referenda.

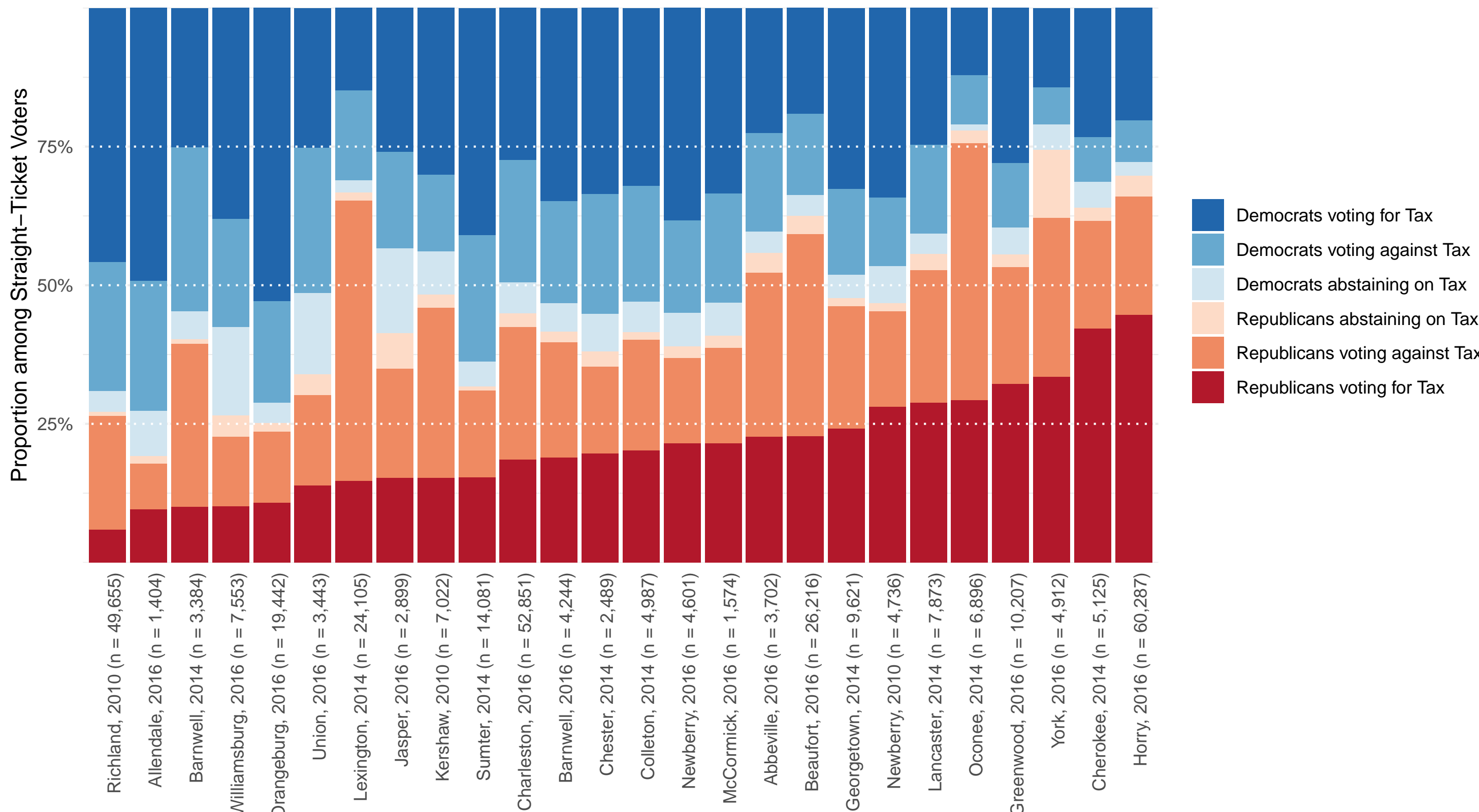
*Prevalence of Party-line Voting in the 2016 Generals, by Pairs of Offices (Contested Races only)*



## Preferences over Local Tax Hikes are not Partisan

When counties hold a referendum for a sales tax hike to fund local infrastructure, many Republicans vote *for* more Taxes; and a sizable amount of Democrats vote *against*.

*Breakdown of Vote Choice in 27 County Referenda*



\* Voter's parties are their choice on the straight ticket. Thus voters who did not select a ticket (about 50 percent) are excluded.

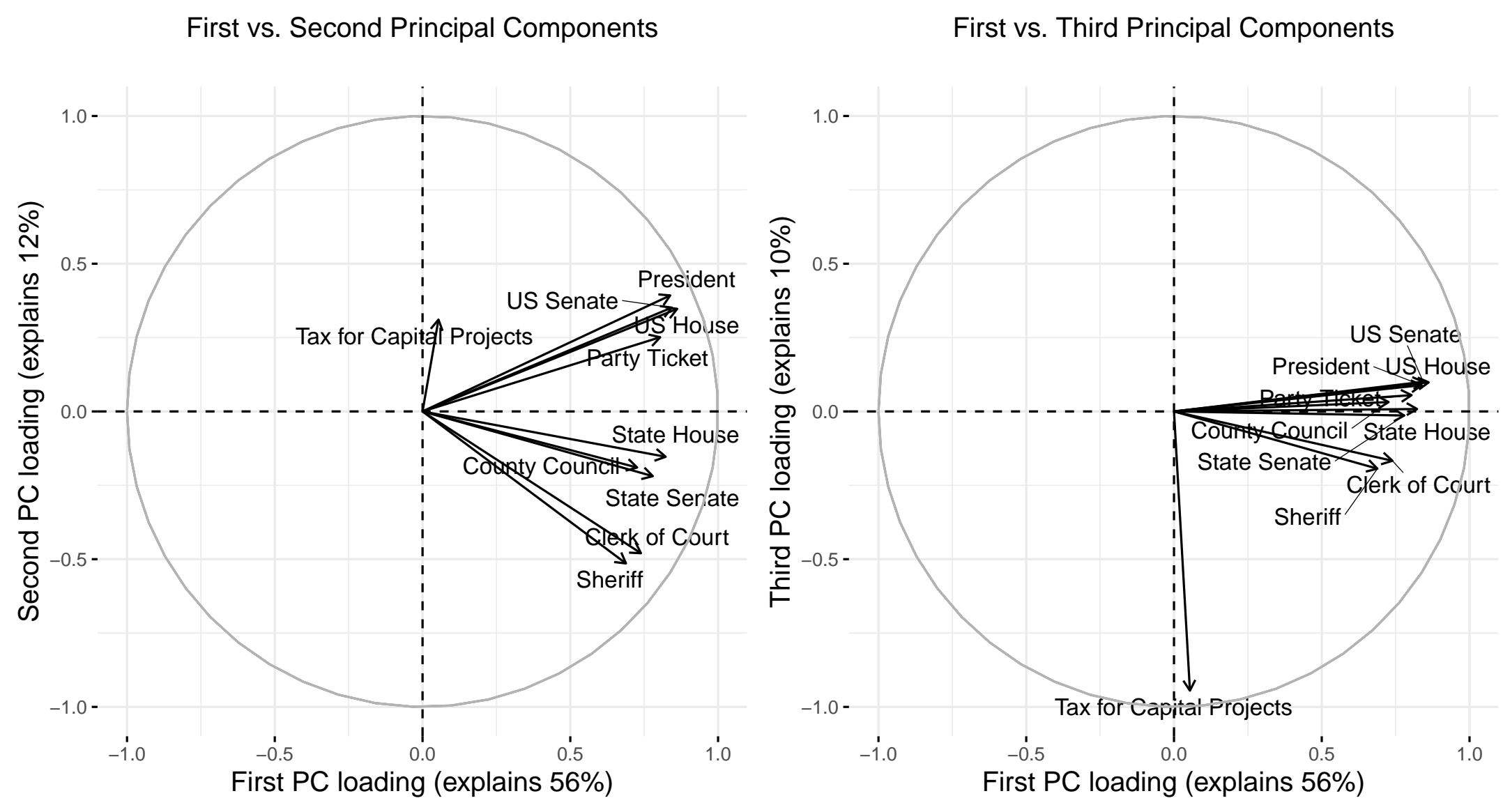
## Dimensionality Reduction: PCA, Hierarchical Clustering, IRT

Encode, for each voter's vote

- 1: Democrat candidate / Democratic party ticket / Yes on pro-tax referendum
- 0: Abstain / Write-In / No major party ticket selected
- +1: Republican candidate / Republican party ticket / No on pro-tax referendum

## Votes summarized by three principal components

Three linear combinations of votes explain around 80 % of the variance. They appear to separate (i) Democrat-Republican ( $\approx 56$  %), (ii) federal - subnational ( $\approx 12$  %), and (iii) a dimension specific to referendum ( $\approx 10$  %):



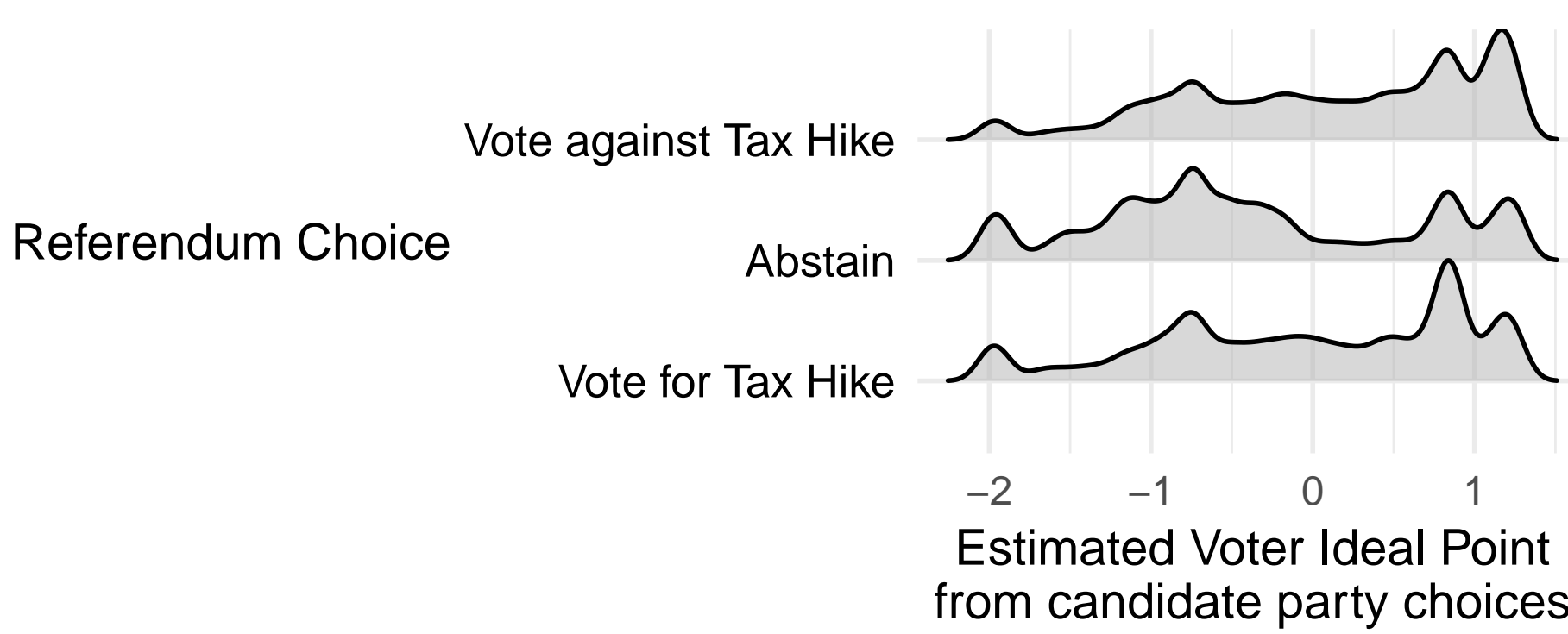
## Party as coalitions: Cluster analysis identifies subgroups within party

A hierarchical clustering algorithm constructs a tree-based group classification. Five clusters, for example, distinguish Trump Republicans and non-Trump Republicans:

	Vote for D Ticket	Vote for R Ticket	Vote for Trump (R)	Vote for R in State Sen.	Vote for Tax
Cluster 4 (n = 8,981) - 0%		• 27%	• 96%	• 49%	• 97%
Cluster 5 (n = 3,275) - 2%		• 14%	• 87%	• 69%	• 59%
Cluster 1 (n = 22,769) - 3%		• 40%	• 85%	• 74%	• 1%
Cluster 2 (n = 24,718) - 5%		• 45%	• 75%	• 90%	• 93%
Cluster 3 (n = 33,437) - 66%	• 66%	• 0%	• 1%	• 12%	• 59%

## One-dimensional ideal points do not capture preferences over tax hikes

Votes on partisan races can also be summarized by ideal points in a IRT model. Do ideal points predict races in other choices?



\* PCA computed with singular value decomposition via `prcomp`, Clusters by fast agglomerative hierarchical clustering via `hclust`, ideal points from partisan candidate races by an ordinal IRT model via `emIRT`. All figures use 2016 counties which held a Sales Tax Hike Referendum.