# Combatting Gerrymandering with Social Choice: the Design of Multi-member Districts <br> Nikhil Garg <br> Cornell Tech <br> Joint with Wes Gurnee (MIT) <br> David Rothschild (MSR), and David Shmoys (Cornell) 

## Re-districting basics

- In district-based representative democracies (like the US), voters are partitioned into districts
- Each district runs independent elections to elect representatives
- District boundaries are redrawn semiregularly, potentially by political actors
- How boundaries are drawn matters
- Re-districting is a graph partitioning challenge


This bill requires (1) that ranked choice voting . . . be used for all elections for Members of the House of Representatives, (2) that states entitled to six or more Representatives establish districts such that three to five Representatives are elected from each district, and (3) that states entitled to fewer than six Representatives elect all Representatives on an at-large basis
-Fair Representation Act, H.R. 4000, 2019

Why are multi-member districts a good idea, and how does one (computationally) study such a thing?

## Re-districting potential desiderata

- Proportional: party vote share $v_{p}$ is close to winner seat share $w_{p}$
- Compact: districts reflect geographically cohesive communities
"Local": Representatives live close to the communities they represent


Proportional, not compact


Compact, not proportional

## Challenge 1: Intentional gerrymandering

Partisan gerrymanders: intentional drawing of maps to favor one party


HOW TO STEAL AN ELECTION


50 PRECINCTS 60\% BLUE 40\% RED

By Steven Nass [CC BY-SA 4.0]

## Challenge 2: "Natural" gerrymandering

"Natural" gerrymanders: distribution of voters makes it impossible to draw proportional maps - the "Massachusetts problem" [Duchin et al. 2019]

Why? Republicans have $30 \%$ of state-wide vote, but need $51 \%$ in a single district

=> might need to draw "unnatural" maps to be proportional, if possible

## Social choice \& multi-winner elections

Suppose we're electing $N$ people from each district

Winner takes all: Each voter votes for $N$ candidates. Top $N$ vote-getters are elected

STV: Candidates are not elected "independently." Each voter submits a ranking, and candidates are

| Sample Multi-Winner RCV Election |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Candidate | Round 1 | Round 2 | Round 3 | Round 4 | Round 5 |
| Armando Perez Democrat | $\begin{gathered} \mathbf{2 7 . 2 \%} \\ \text { 2,500 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0 \%} \\ \text { 2,300 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0} \% \\ \text { 2,300 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0 \%} \\ \text { 2,300 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0} \% \\ \text { 2,300 votes } \end{gathered}$ |
| Cathy Chan Democrat | $\begin{gathered} \mathbf{1 9 . 0} \% \\ 1,750 \text { votes } \end{gathered}$ | 20.1\% <br> 1,850 votes | $\begin{gathered} \mathbf{2 1 . 2} \% \\ \text { 1,950 votes } \end{gathered}$ | $\begin{gathered} 34.8 \% \\ 3,200 \text { votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0} \% \\ \text { 2,300 votes } \end{gathered}$ |
| Hannah Murphy Republican | 14.1\% <br> 1,300 votes | $\begin{gathered} \mathbf{1 4 . 3} \% \\ \text { 1,320 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 0 . 7} \% \\ \text { 1,900 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 2 . 3} \% \\ \text { 2,050 votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 7 . 2 \%} \\ 2,500 \text { votes } \end{gathered}$ |
| Charles Lorenzo Republican | 14.1\% <br> 1,300 votes | 14.1\% <br> 1,300 votes | 17.4\% <br> 1,600 votes | $\begin{gathered} \hline \mathbf{1 7 . 9 \%} \% \\ 1,650 \text { votes } \end{gathered}$ | $\begin{gathered} 18.9 \% \\ 1,740 \text { votes } \end{gathered}$ |
| Brad M. Jackson Democrat | 14.7\% <br> 1,350 votes | $\begin{aligned} & 15.5 \% \\ & 1,430 \text { votes } \end{aligned}$ | $\begin{aligned} & 15.8 \% \\ & 1,450 \text { votes } \end{aligned}$ | $\begin{aligned} & 0.0 \% \\ & 0 \text { votes } \end{aligned}$ | $\begin{aligned} & 0.0 \% \\ & 0 \text { votes } \end{aligned}$ |
| June Smith Republican | $\begin{aligned} & 10.9 \% \\ & 1,000 \text { votes } \end{aligned}$ | $\begin{aligned} & 10.9 \% \\ & 1,000 \text { votes } \end{aligned}$ | $\begin{aligned} & 0.0 \% \\ & 0 \text { votes } \end{aligned}$ | $\begin{aligned} & 0.0 \% \\ & 0 \text { votes } \end{aligned}$ | $\begin{aligned} & \hline 0.0 \% \\ & 0 \text { votes } \end{aligned}$ |

Proportional Ranked Choice Voting Example - FairVote selected sequentially.

In paper: we study the class of "Thiele" rules, that parameterize decreasing marginal returns for a voter getting multiple candidates that they approve of as part of the winning set.

## Intuition: why STV \& multi-member districts?

Theorem (Informal)*: Under a two-party system where within-party candidates are ranked above other-party candidates, STV is proportional up to rounding

$$
N=2:\left\{\begin{array}{c}
0-33 \% \rightarrow 0 \text { seats } \\
33-66.6 \% \rightarrow 1 \text { seat } \\
>66.6 \% \rightarrow 2 \text { seats }
\end{array}\right.
$$

Computational benefit: Don't have to construct individual rankings, which would be $\Theta$ (|Voters||Candidates|)
*Dummett 1985, Voting Procedures.

## Problem solved?

Why not just elect all members in single district with STV?

- California has 53 seats - can't ask voters to rank that many candidates
- "Local representation" - want winners to represent a cohesive set of people

Medium solution: have multiple districts, each with a few members each

| County Council At Large Vote for up to 4 Representando el Condado Vopre hastand 4 Vote hasta por 4 | Judge of the Circuit Court Circuit 6 <br> Vote for up to 7 <br> Juez de la Corte de Circuito Circuito 6 <br> Vote hasta por 7 | Democratic Central Committee Male At Large Vote for up to 4 Comité Central Demócrata Masculino Representando el Condado <br> Vote hasta por 4 |
| :---: | :---: | :---: |
| - Gabe Albornoz |  |  |
| - Rosemary O. Arkoian | - James A. Bonitant |  |
| - Marilyn Balcombe | - Jeannie E. Cho |  |
| - Charles Barkley | - Jill Reid Cummins | - Andy Aviles |
| - Shruti Bhatnagar | - Debra L. Dwyer |  |
| - Cherri L. Branson | - Kevin G. Hessler | - Christopher DelgadoBradbury |
| - Brandy H. M. Brooks | - David W. Lease |  |
| - Craig Carozza-Caviness | - Marylin Pierre | - Juan Miguel Cardenas |
| - Ron Colbert | - Margaret Marie Schweitzer |  |
| - Bill Conway | State's Attorney Vote for 1 Fiscal del Estado Vote por 1 | - Justin W. Chappell |
| - Hoan Dang |  |  |
| - Tom R. Falcinelli, Jr. |  | - Edward Fischman |
| - Lorna Phillips Forde | - John McCarthy |  |
| - Jill Ortman Fouse |  | - Scott E. Goldberg |
| - Loretta Jean Garcia | Clerk of the Circuit Court Vote for 1 Secretario de la Corte del Circuito Vote por 1 |  |
| - Paul S. Geller |  | - Dave Kunes |
| - Evan Glass |  |  |
| - Richard Gottried |  | Erwin David Rose |
| - Neill H. Greenberger | - Alan S. Bowser |  |
| - Seth Grimes | - Barbara H. Meiklejohn | Gabriel Sorrel |
| - Ashwani Jain | Register of Wills <br> Vote for 1 <br> Registrador Testamentario <br> Vote por 1 |  |
| - Will Jawando |  | Democratic Central <br> Committee Female <br> District 16 <br> Vote for 1 <br> Comite Central Demócrata <br> Femenino <br> Distrito 16 <br> Vote por 1 |
| - David V. Lipscomb |  |  |
| - Melissa McKenna |  |  |
| - Danielle Meitiv | Joseph M. Gr |  |
| - Hans Riemer |  |  |
| - Michele Riley | Sheriff Vote for Alguacil |  |
| - Graciela Rivera-Oven |  | - Ann Racuya-Robbins |
| - Darwin Romero |  | - Sarah Wolek |
| - Mohammad Siddique |  | Democratic Central Committee Male <br> District 16 <br> Vote for 1 <br> Comité Central Demócrata Masculino <br> Distrito 16 Vote por 1 |
| - Jarrett Smith | Darren Mark Popkin |  |
| Steve Solomon | Unopposed Sin Oponente |  |
| - Chris Wilhelm | Democratic Central <br> Committee Female At Large <br> Vote for up to 4 <br> Comité Central Demócrata <br> Femenino Representando el <br> Condado <br> Vote hasta por 4 <br> - Marjorie Goldman |  |
| County Council District 1 <br> Vote for 1 <br> Concejo del Condado <br> Distrito 1 <br> Vote por 1 |  |  |
|  |  | - Jordan Cooper |
|  |  | - Brian Michael Doherty |
|  |  | - Hrant Jamgochian |
| - Bill Cook | - Laura Henderson | Board of Education At Larg Vote for 1 <br> Junta de Educación <br> Representando el Condado Vote por 1 |
| - Pete Fosselman | - Martine Laney |  |
| - Andrew Friedson | - Marie Kathleen Mapes |  |
| Ana Sol Gutierrez | - Michelle Ngwafon |  |
| - Jim McGee | - Judith Ann Stephenson | - Ryan Arbuckle |
| - Regina "Reggie" Oldak |  | - Timur Edib |
| - Dalbin Osorio |  | - Marwa Omar Ibrahim |
| - Meredith Wellington |  | - Julie Reiley |
|  |  | - Brandon Orman Rippe |

## Research questions

How do multiple multi-member districts (MMDs) affect the distribution of possible outcomes, under either adversarial gerrymanders or neutral re-districting?

- What is the role of the social choice function used?
- How big is "big enough"? Do we need 8-member districts?
- How do MMDs affect intra-party measures, such as geographic and political diversity of winners?


## Contributions

Methodologically, we provide a scalable methodology to algorithmically study partisan gerrymandering and fair redistricting under MMDs, and in particular under STV

Applications-wise, we show that 2- or 3-member districts with STV are enough to both inhibit partisan gerrymanders and eliminate natural gerrymanders, without sacrificing "representative" democracy

No discrepancy between "natural" and proportional maps!

## Summary of related literature

## Gerrymandering

- Technical work in optimization and sampling
- Methods to evaluate and audit maps
- Everything Moon Duchin has written


## Social choice

- Properties of multi-winner election rules
- Empirical effects of implementing RCV + other reforms


## Multi-member districts

- Long history of MMDs in the United States (Klain 1955)
- At large elections + MMDs with Winner Takes All rules harm minorities
- Recent Duchin work: RCV with MMDs for city councils (evaluate non-partisan effects)


## Comparative politics

- Many other methods to achieve proportionality (especially within parliamentary systems)

Methods

## Technical challenge

Goal: calculate political outcomes under counterfactual maps.
Need to generate maps that are optimized for political outcomes

Intentionally gerrymandered for one party or the other Intentionally made as proportional as possible
"Neutral" maps that are unaware of underlying political geography

Challenge: Hard combinatorial optimization problem!

## Data

Historical vote shares for each party for each census tract

- Averaged across Senate, Congressional, and Presidential elections
- Use both average vote share and standard deviation
- This is all we need for the inter-party measures

Individual voter data - from a national voter file

- List of individual voters by census block
- Estimated opinions on a variety of dimensions
- Party preference, strength of partisan preference
- Ideology scores on 20+ dimensions (economy, criminal justice, environment, taxes, etc)
- Necessary for intra-party measures


## Fairmandering: tree-based optimization

## Step 1: Hierarchically generate districts in a tree structure

Step 2: Calculate outcomes for districts in the leaf nodes


Step 3: Use a dynamic program (or an IP) to aggregate into maps


## Tree-based optimization for MMDs

- This work: extend the method such that intermediate and leaf nodes can be different sizes

Recombination methods would require separate optimization for each combination of district sizes

- Step 2: Calculate outcomes for districts: needs to be efficient!

Cannot run STV as a sub-routine to the optimization

"(2) that states entitled to six or more Representatives establish districts such that three to five Representatives are elected from each district" - Fair Representation Act

## Method overview

For each parameter set, generate many possible maps
Most gerrymandered maps
Most "fair" (proportional) maps
"Neutral" maps - those drawn without knowledge of partisan distribution

For each map, calculate outcomes of interest

- Proportionality, competitiveness, compactness (just need party vote share)
- Intra-party measures, such as geographic or opinion diversity Need to construct counterfactual voter rankings \& simulate STV

Entire process used about $\sim 100$ s CPU-weeks

## Results

Proportionality and other inter-party measures

## Inhibiting partisan gerrymandering



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## Inhibiting partisan gerrymandering



## Eliminating "natural" gerrymanders



## Eliminating "natural" gerrymanders



## Eliminating "natural" gerrymanders



## Other inter-party results + recommendations

- Fair Representation Act analysis
- Competitiveness: Multi-member districts and STV increase competitiveness, monotonically in district size
- Analysis of various Thiele rules


## Design recommendations:

- Three member districts effective in most states in mitigating gerrymandering
- Larger districts needed in smaller and more partisan states

Methods \& results: Intra-party effects

## Research questions + challenge

| Sample Multi-Winner RCV Election |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
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| Armando Perez Democrat | $\begin{gathered} \hline \mathbf{2 7 . 2 \%} \\ 2.500 \text { votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0 \%} \\ 2.300 \text { votes } \end{gathered}$ | $\begin{gathered} \hline 25.0 \% \\ 2.300 \text { votes } \end{gathered}$ | $\begin{gathered} \hline 25.0 \% \\ 2.300 \text { votes } \end{gathered}$ | $\begin{gathered} \mathbf{2 5 . 0 \%} \\ 2,300 \text { votes } \end{gathered}$ |
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| Hannah Murphy Republican | $\begin{gathered} \hline \mathbf{1 4 . 1 \%} \\ 1,300 \text { votes } \end{gathered}$ | $\begin{gathered} \hline 14.3 \% \\ 1.320 \text { votes } \end{gathered}$ | $\begin{aligned} & \hline 20.7 \% \\ & 1,900 \text { votes } \end{aligned}$ | $\begin{gathered} \hline \mathbf{2 2 . 3 \%} \\ \text { 2,050 votes } \end{gathered}$ | $\begin{array}{\|c} \hline 27.2 \% \\ 2,500 \text { votes } \end{array}$ |
| Charles Lorenzo Republican | $\begin{gathered} \hline \mathbf{1 4 . 1 \%} \\ 1,300 \text { votes } \end{gathered}$ | $\begin{gathered} \hline \mathbf{1 4 . 1 \%} \\ 1,300 \text { votes } \end{gathered}$ | $\begin{array}{\|c\|} \hline \mathbf{1 7 . 4 \%} \\ 1,600 \text { votes } \end{array}$ | $\begin{gathered} \hline \mathbf{1 7 . 9 \%} \\ 1,650 \text { votes } \end{gathered}$ | $\begin{aligned} & \hline 18.9 \% \\ & 1.740 \text { votes } \end{aligned}$ |
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- Do STV and MMDs enable minority ideologies within parties?
- Do they ruin geographic "representation"?
- Challenge: constructing voter rankings
- For above results, we don't need to construct voter rankings or simulate STV: only need party vote shares (Theorem)
- Now, we need assumptions for how voters rank candidates within a party
- Simulate STV after constructing rankings
- Our assumptions: voters either rank

Based on partisan score (single dimensional strength of Dem-Rep)
Or based on geographic distance

## Suppose voters rank by partisan scores...

Minority ideologies supported: diversity of winners increases

Partisan diversity


Some cost to geographic cohesion: winners draw support from different areas

Geographic diversity


## Parting thoughts

- Not (just) a pipedream! 10 states have MMDs
- Rich research agenda in gerrymandering + social choice
- Can we prove proportionality guarantees for multiple MMDs?
- What are the effects at the city level, with non-partisan elections, single party dominance, or many third parties?
- Emergence of third-party winners?

Computational scientists have much to contribute to understanding and solving pressing challenges in politics and governing

## Questions?



Texas with 12 three-member districts

