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#### Equilibrium Gerrymandering

#### Isaac Swift

Hong Kong Baptist University

September 10, 2020

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## Gerrymandering

The legislative body (Congress) is made up of the Senate and the House of Representatives

- There are 435 member of the House of Representatives
- Each state elects some Representatives based on population
- Representative seats are allocated after every census

The state decides how to elect their representatives

- The state is divided into districts with each district electing one Representative
- The only restriction (almost) on the districts is that they are about the same size
- Some states have state congress draw the districts, others have a bipartisan committee
- Districts are redrawn after every census

State congress is also elected by districts.

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#### Simple State

#### State population

- 50% Democrat
- 25% Republican
- 25% Independent

The designer needs to divide up the population into districts.



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## **Proportional Districts**

Example

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We could separate the political ideologies (with Democrats getting twice as many districts because there are twice as many of them)



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## Proportional Districts

Example

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Rescale the bars to be proportions of the district.

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## **Proportional Districts**

Example

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With porportional districts, the fraction of districts won by a party matches the fraction of voters for that party.

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## Identical Districts (Democrat Favoring)

You could make every district identical.

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## Identical Districts (Democrat Favoring)

Rescaling the districts again, we see this favors the Democrats.

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## Packing and Cracking (Republican Favoring)

Here is the districting that most favors Republicans. It features "packing" and "cracking".

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#### Packing and Cracking (Republican Favoring)

Rescaling the districts again, we see that the Democrats win 37.5% of districts on average.

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Example

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Seat-vo	te Curv	es			

In this state, the Democrats will get between 50 and 75 percent of the vote.



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Seat-vo	te Curv	es			



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In this state, the Democrats will get between 50 and 75 percent of the vote.

In the proportional districts, the seat-vote curve is equal to the 45 degree line.



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Seat-vot	te Curv	<b>e</b> c			

In this state, the Democrats will get between 50 and 75 percent of the vote.

In the Republican favoring districts, the seat-vote curve still has a slope of one but is shifted down.



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Maximal Districting

- Find the districting scheme to maximize seats for a party
- Splitting distributions

Equilibrium Districting

- Find the districting scheme to maximize welfare of state's voters
- Seat-vote curves are important
- In equilibrium seat-vote curves are steep and slope is negatively related to state size

Empirical Evidence

- Estimate seat-vote curves for each state
- The curves are very steep
- Slope is approximated well by state size

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Setup					

The variable of interest is the policy.

- The policy is a number from 0 to 1 (0 being Democrat and 1 Republican)
- State *i* gets to elect *n<sub>i</sub>* fraction of the Representatives
- $S_i$  is the fraction of seats won Democrats
- The policy chosen is equal to the average Representative,  $1 \sum_{i=1}^{M} n_i S_i$

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There are M states each with a unit mass of voters.

- State *i* has  $\pi_{Di}$ ,  $\pi_{Ri}$ , and  $\pi_{Ii}$  fraction of Democrats, Republicans, and Independents
- A Democrat's preferred policy is 0, a Republican's is 1, and Independents' preferred policy is distributed between 0 and 1
- A voter gets a payoff of  $-(\hat{\theta} \theta)^2$  if  $\hat{\theta}$  is the chosen policy and  $\theta$  is their preferred policy
- Voters are not strategic
  - Democrats vote Democrat
  - Republicans vote Republican
  - The fraction of Independents that vote Democrat is drawn from a uniform distribution

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The Independent voters are uniformly distributed on an interval of length  $2\tau$ , but the mean of this interval is unknown.



The median Independent voter, *m*, is drawn from a uniform distribution over the interval  $\left[\frac{1}{2} - \tau, \frac{1}{2} + \tau\right]$ .

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The discrict designer's problem.

- Take state distribution,  $x = [\pi_D, \pi_R, \pi_I]$ , as given
- Choose a district distribution,  $x_k \in \Delta^2$
- Choose the fraction of districts to have the distribution  $x_k$ ,  $\mu_k$

The districts must add up to the state population.

$$\sum_{k=1}^{K} \mu_k x_k = \mathbb{E}[x_k] = x$$

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Call  $\chi_k(x_k)$  the probability of winning a district with distribution  $x_k$ . As long as  $\pi_{Dk}$  and  $\pi_{Rk}$  are less than  $\frac{1}{2}$ , this is equal to

$$\chi_k(x_k) = \frac{\frac{1}{2} - \pi_{Dk}}{1 - \pi_{Rk} - \pi_{Dk}}$$

The districter's problem is

$$\max_{\substack{x_k \subset \Delta^2, \mu \in \Delta^{K-1} \\ \text{s.t.}}} \sum_{k=1}^{K} \mu_k \chi_k(x_k)$$
$$\sum_{k=1}^{K} \mu_k x_k = x.$$

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If more than 50 percent is Republican, the Republican candidate will win.

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Triangle	2				



If more than 50 percent is Democrat, the Democrat candidate will win.

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The yellow districts are undominated.

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Triangle	9				



Holding  $\pi_D$  fixed,

$$\chi = \frac{\frac{1}{2} - \pi_D}{1 - \pi_R - \pi_D}$$

is a convex function of  $\pi_R$ .

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The optimal districting is to split the state up into the undominated districts.

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The optimal districting is to split the state up into the undominated districts.

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Optima	l Distric	cting			

If  $\pi_D > \pi_R$  you'll have some districts that are garunteed to lose.

• Fill  $\pi_D - \pi_R$  districts with only Democrats (Packing)

You can garuntee wins in  $2\pi_R$  districts.

- Fill the district exactly halfway with Democrats (any more is wasteful)
- Put remaining Democrats in districts garunteed to win (Cracking)

All remaining Independents are in their own districts.

• 50 percent of these districts are won in expectation

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Maxima	al Value				

The expected fraction of seats the Republicans can win with the optimal districting is

$$v_{R} = \begin{cases} 1 & \text{if } \pi_{R} \geq \frac{1}{2} \\ 2\pi_{R} + \frac{1}{2} \left( \pi_{I} - (\pi_{R} - \pi_{D}) \right) & \text{if } \pi_{D} < \pi_{R} < \frac{1}{2} \\ 2\pi_{R} + \frac{1}{2} \pi_{I} & \text{if } \pi_{R} \leq \pi_{D}. \end{cases}$$
(1)

This can be rewritten simply as

$$v_R = \min\left\{1, 2\pi_R + \frac{1}{2}(\pi_I - \max\{0, \pi_R - \pi_D\})\right\}.$$
 (2)

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Bipartis	san Dist	ricts			

In many states, a bipartisan committee or judicial group chooses the districts.

Consider the the districting to maximize the welfare of the state citizens. Remember the voter payoff equals

$$U(\hat{ heta}, heta) = -\left(\hat{ heta} - heta
ight)^2$$

where  $\hat{\theta}$  is the policy and  $\theta$  is the preferred policy of the voter.

First we'll worry about the optimal fraction of seats the designer would like to gives the Democrats. Later we can think about if it is implementable by a districting scheme.

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Seat-Vo	ote Curv	res			

Seat-vote curves are now necessary.

- The optimal policy depends on each voter's preferred policy.
- Since the independent voters move around each election,  $\pi_D$ ,  $\pi_R$ , and  $\pi_I$  aren't enough information
- The best policy will depend on the vote share as well, v.
- Call  $F_v(\theta)$  the distribution of preferred policies conditional on observing vote share v

The seat-vote curve is the fraction of seats allocated to Democrats as a function of the fraction of votes won by Democrats. The designer is choosing a seat-vote curve.

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One Sta	ate				

First think about a single state in isolation. Their problem is now

$$\max_{S(v)\in[0,1]} \int_0^1 -(1-S-\theta)^2 \, dF_v(\theta),$$

and has a simple solution,

$$\begin{split} 1-S^*(v) &= \int_0^1 \theta dF_v(\theta) \\ &= \mathbb{E}\left[\theta \ |v\right]. \end{split}$$

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One Sta	ate				

Most theory about seat-vote curve up until now comes from this equation.

$$1 - S^*(v) = \mathbb{E}\left[\theta \mid v\right]$$

One State		

Most theory about seat-vote curve up until now comes from this equation.

$$1 - S^*(v) = \mathbb{E}\left[ \theta \mid v 
ight]$$

Proportional seat-vote curve

- All voters are either an extreme Democrat or extreme Republican,  $supp(F(\theta)) \subset \{0,1\}$
- The optimal policy is then equal to the fraction of voters that vote Republican

• 
$$S^*(v) = v$$

• The slope of the seat-vote curve is equal to one

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Most theory about seat-vote curve up until now comes from this equation.

$$1 - S^*(v) = \mathbb{E}\left[\theta \mid v
ight]$$

Coate-Knight

- Most think the seat-vote curve should be flatter than proportional
- One additional vote is a more mild change in ideology
- Coate and Knight 2007, assumes independent voters are uniformly distributed on an interval with width  $2\tau$
- This equation becomes their optimum

$$S^*(\mathbf{v}) = rac{1}{2} + (\pi_D - \pi_R)\left(rac{1}{2} - au
ight) + 2 au\left(\mathbf{v} - rac{1}{2}
ight)$$

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In my model, there are many states and the national policy comes from the Representatives from every state.

$$\max_{S_i(v_i)} \mathbb{E}\left[\int_0^1 \left(1 - \sum_{j=1}^M n_j S_j(v_j) - \theta\right)^2 dF_{v_j}(\theta) |v_i\right]$$
$$1 - S_i^*(v_i) = \frac{1}{n_i} \left(\mathbb{E}\left[\theta |v_i\right] - \left(1 - \sum_{j=1}^M n_j \mathbb{E}\left[S_j(v_j)\right]\right)\right)$$

Still a simple solution

- The slope is now much higher.
- The slope is proportional to the state's size,  $\frac{1}{n_i}$
- You account for who you expect every other state to elect

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Explana	tion				

The slope is steep.

- A 1 percent change nationally is a 50 percent change locally
- Goal is to move the average, so everyone bids more extreme
- Electoral college is winner-take-all



## Figure: Seat-vote curves for Minnesota

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The slope larger for small states.

- A small state needs to flip all their Representatives to have much impact nationally
- Inversely proportional



## Figure: Seat-vote curves for Minnesota

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The optimal curve accounts for other states' actions.

 A state that leans Democrat should still elect Republicans if the rest of the country leans Democrat even more.



# Figure: Seat-vote curves for Minnesota

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#### Estimating Seat-Vote Curves

Data from Cooperative Congressional Election Study

- Individual survey
- 50,000+ data points
- Asked political identification
- Congressional disctrict

The number of representatives allocated to each state is also needed.

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Estimati	ing Seat	-Vote Curves			

Aggregating political identification

- Within each state to get  $\pi_{Di}$ ,  $\pi_{Ri}$ , and  $\pi_{Ii}$
- Within each district

Using the fraction of Democrats, Republicans, and Independents in each district, the seat-vote curve can be computed

- Draw the fraction of Independents to vote Democrat in a district from a uniform distribution
- Record the election winner and the Democrat vote share
- Add up across every district in the state to get a point on the seat-vote curve

Repeat 10,000 times and draw a smoothed average of fraction of seats won as a function of the fraction of votes won.

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#### Estimates



Figure: The estimated seat-vote curves for Colorado and Connecticut. Connecticut's curve is much steeper in the middle than Colorado's. Connecticut has the more responsive curve.

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odel1 75*** 0613) 613*** 00136)	Model2 -0.335*** (0.0649) 0.00560*** (0.00137) -3.805 (2.319)	-3.201** (1.316) 5.912***	Model3 -3.573** (1.378) 5.817***
75*** 0613) 613*** 00136)	-0.335*** (0.0649) 0.00560*** (0.00137) -3.805 (2.319)	-3.201** (1.316) 5.912***	-3.573** (1.378) 5.817***
0613) 613*** 00136)	(0.0649) 0.00560*** (0.00137) -3.805 (2.319)	-3.201** (1.316) 5.912***	-3.573** (1.378) 5.817***
613*** 00136)	0.00560*** (0.00137) -3.805 (2.319)	-3.201** (1.316) 5.912***	-3.573** (1.378) 5.817***
00136)	(0.00137) -3.805 (2.319)	-3.201** (1.316) 5.912***	-3.573** (1.378) 5.817***
-	-3.805 (2.319)	-3.201** (1.316) 5.912***	-3.573** (1.378) 5.817***
	(2.319)	(1.316) 5.912***	(1.378) 5.817***
		5.912***	5.817***
		(0.150)	
		(0.459)	(0.471)
			2.017
			(2.172)
77***	7.648***	3.849***	3.702***
.406)	(0.407)	(0.209)	(0.262)
50	50	50	50
.492	0.520	0.826	0.829
	77*** 406) 50 492 andard erro	77***     7.648***       406)     (0.407)       50     50       492     0.520       andard errors in parentheses	77***     7.648***     3.849***       406)     (0.407)     (0.209)       50     50     50       492     0.520     0.826

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#### Responsiveness vs Size

Figure: The responsiveness is approximately equal to  $a_{\overline{n_i}}^1 + \epsilon_{i}^2 \rightarrow \frac{1}{29/31}$ 

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Extensi	on				

National welfare computation

- National seat-vote curve should have low responsiveness
- Can be implemented by each state doing a low responsiveness
- Prisoner's Dilemma

Median congress member choosing policy.

- Only two real outcomes: Deomcrat majority or Republican majority
- Optimal for each state is a winner-take-all election
- Cutoff may not be exactly 50 percent
- Other states' strategies don't matter

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Thank you.

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