

REDISTRICTING WITH ENDOGENOUS CANDIDATES

Paola Moscariello

Yale University

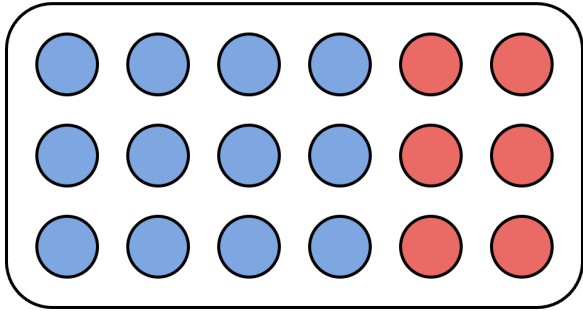
INTRODUCTION

- In the US, congressional district boundaries drawn by political partisans
- **Partisan gerrymandering**: “the practice of dividing a geographic area into electoral districts, often of highly irregular shape, to give one political party an unfair advantage by diluting the opposition’s voting strength”
- **This paper**: gerrymandering when district composition affects candidates’ policy positions, and thus voting behavior, at the district level

RECAP: STANDARD REDISTRICTING

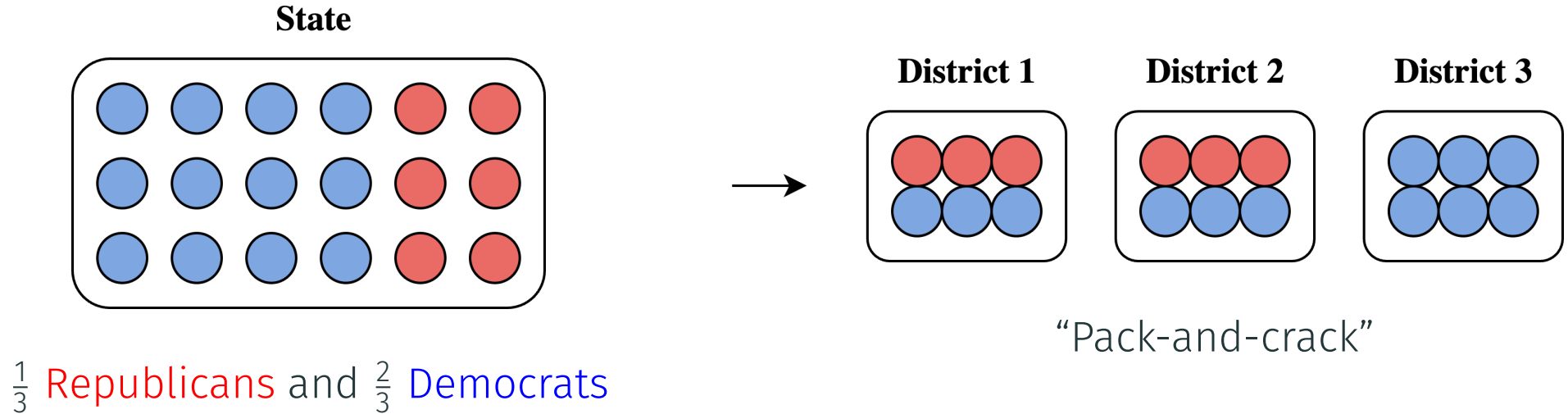
RECAP: STANDARD REDISTRICTING

State

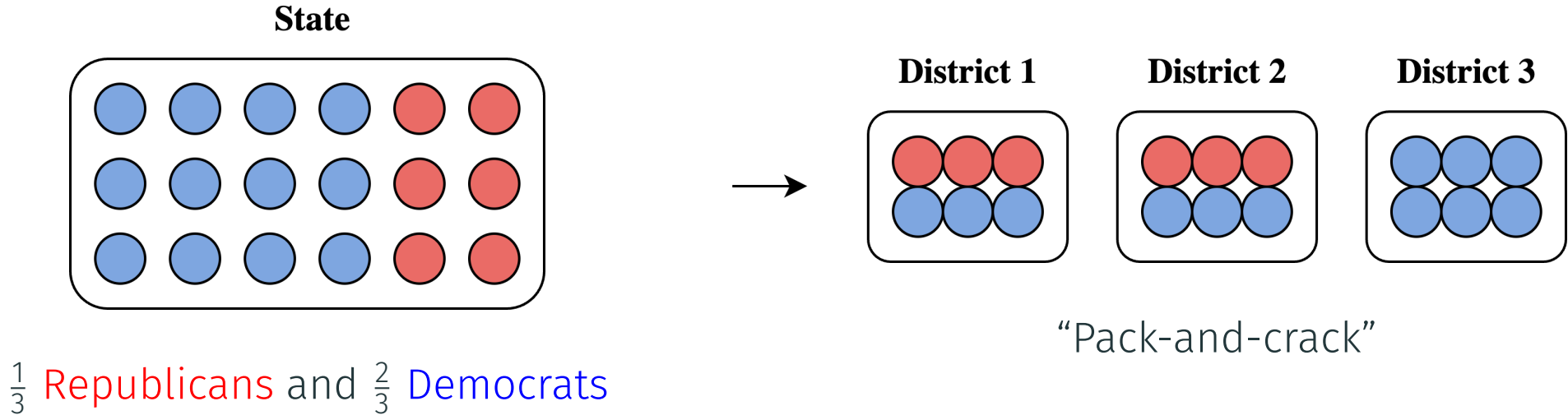


$\frac{1}{3}$ Republicans and $\frac{2}{3}$ Democrats

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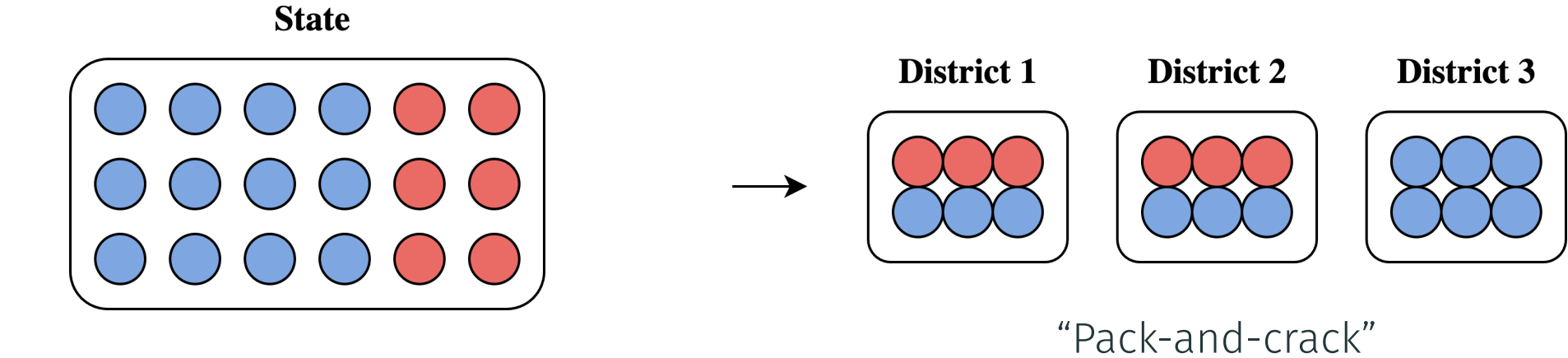


RECAP: STANDARD REDISTRICTING



- Considers party affiliation but not preference intensities
- Underlying assumption: voting behavior is fixed

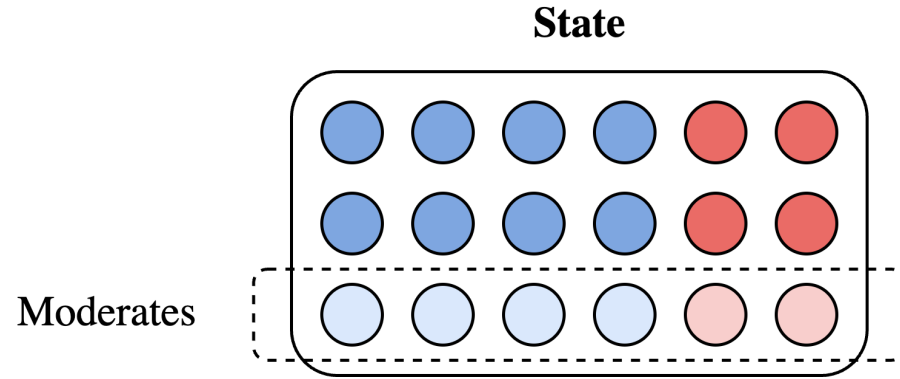
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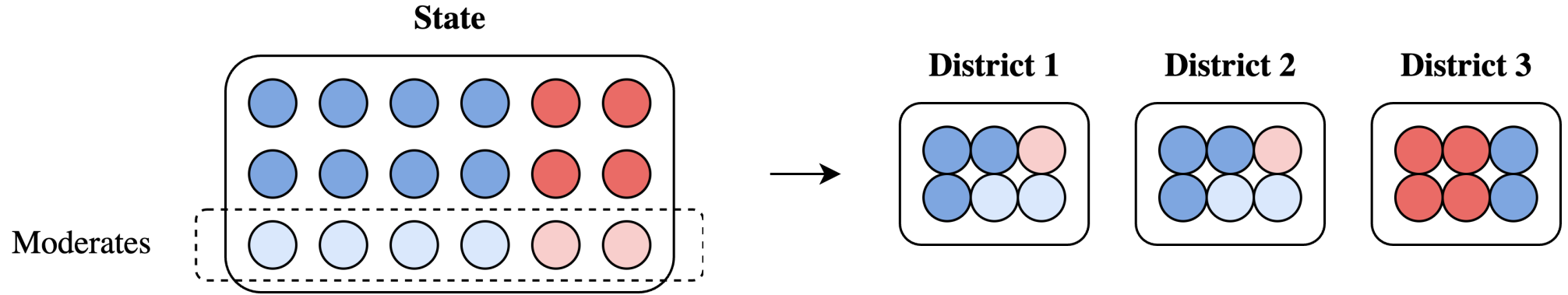
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- Considers party affiliation but not preference intensities
- Underlying assumption: voting behavior is fixed
- Behavior might be endogenous to districts through **primary elections**...

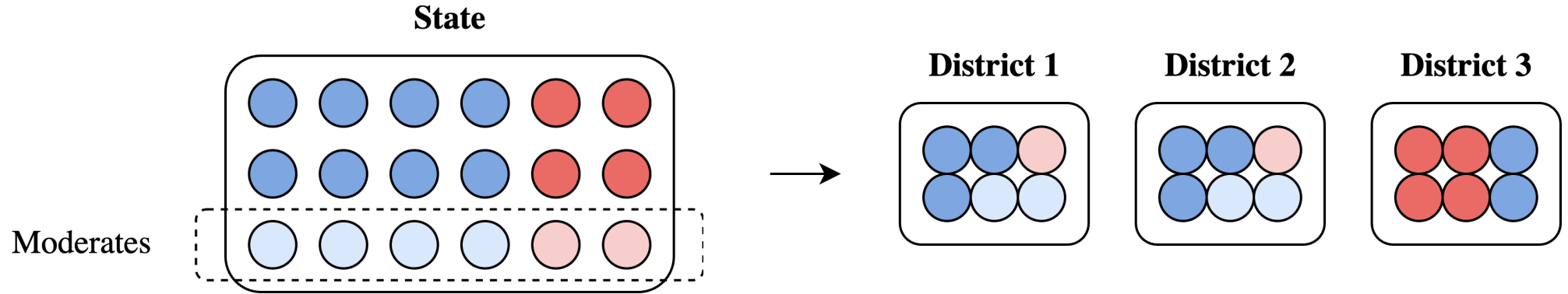
TAKING ELECTORAL INCENTIVES INTO ACCOUNT



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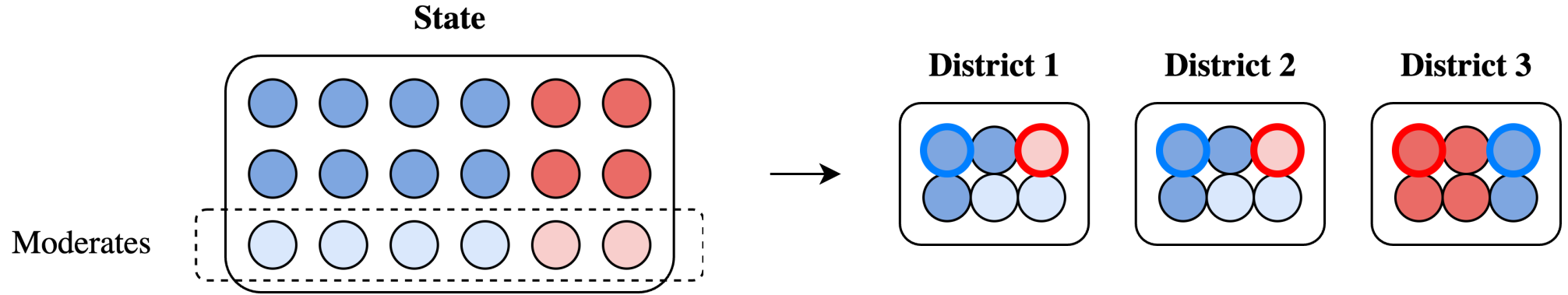


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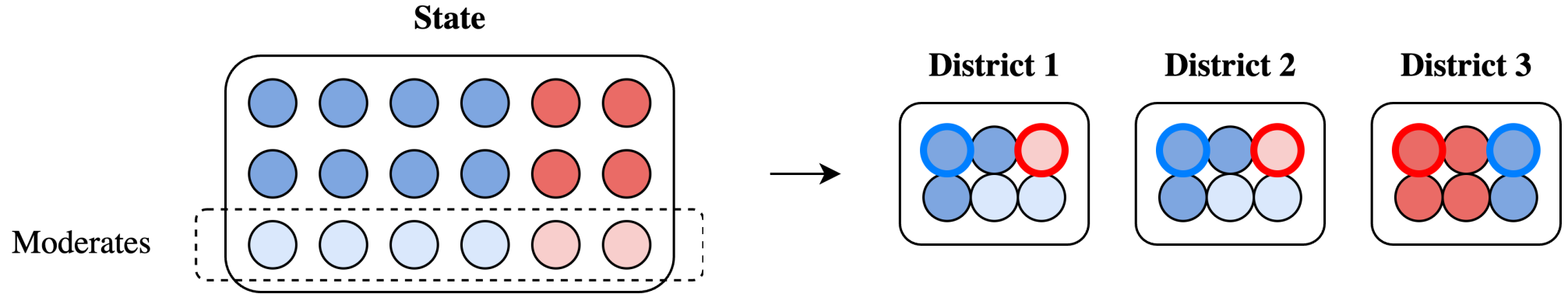
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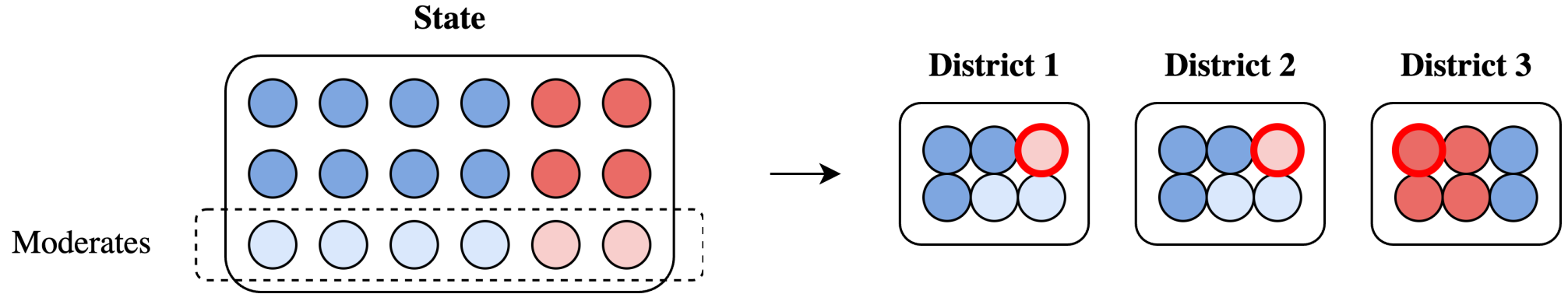
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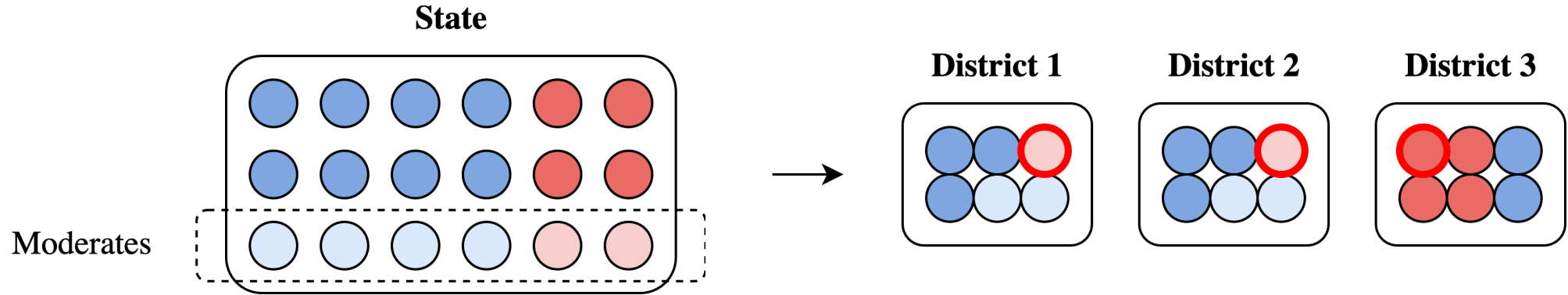
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TAKING ELECTORAL INCENTIVES INTO ACCOUNT



- Rep/Dem candidate is moderate or extremist, depending on party majority
- Moderate voters prefer a moderate of *either* party to an extremist of their own party
- Gerrymandering is even more powerful: win ALL districts

THE MODEL: REDISTRICTING WITH PRIMARY ELECTIONS

THE AGENTS

- Single-peaked voters' preferences, ideal points distribution $\phi \in \Delta([\underline{v}, \bar{v}])$
 - Strictly increasing and continuous CDF
 - Median $v^m = 0$
- Two parties: Republican and Democratic
- Voter affiliation:

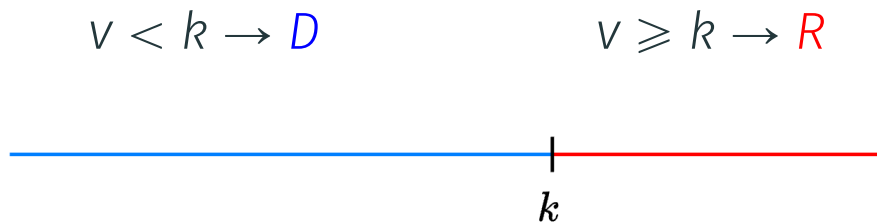
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- Designer allocates voters into districts to maximize districts won by Republicans

DISTRICTS AND REDISTRICTING PLANS

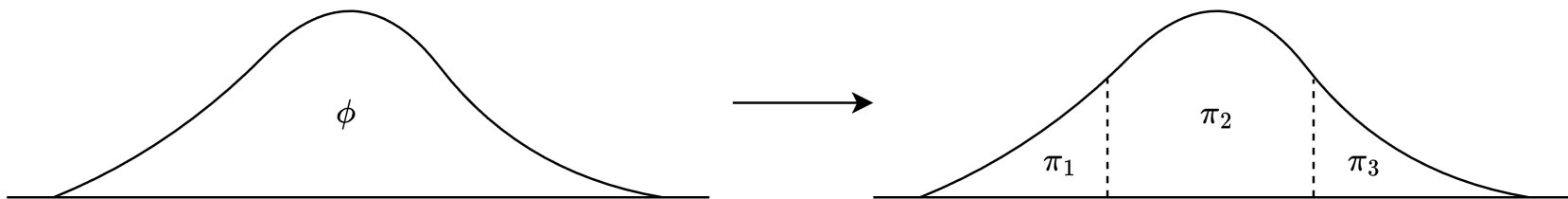
- A **district** is a distribution of preferences $\pi \in \Delta(\mathbb{R})$
- A **redistricting plan** is a distribution of districts $\mathcal{H} \in \Delta(\Delta(\mathbb{R}))$ s.t.

$$\int \pi d\mathcal{H}(\pi) = \phi \rightarrow \text{Feasibility}$$

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$$\int \pi d\mathcal{H}(\pi) = \phi \rightarrow \text{Feasibility}$$



$$\pi_1 \mathcal{H}(\pi_1) + \pi_2 \mathcal{H}(\pi_2) + \pi_3 \mathcal{H}(\pi_3) = \phi$$

ELECTIONS IN DISTRICT π

What determines whether a district is won?

- Two-stage elections: Party Primaries and General Elections
- In the first stage:
 - voters $v < k$ select D with position $c_{\pi,D}$
 - voters $v \geq k$ select R with position $c_{\pi,R}$
- In the second stage all voters select $c_{\pi} \in \{c_{\pi,D}, c_{\pi,R}\}$

For this talk: Assume primary candidates position at party medians

► Microfoundation

ELECTIONS IN DISTRICT π

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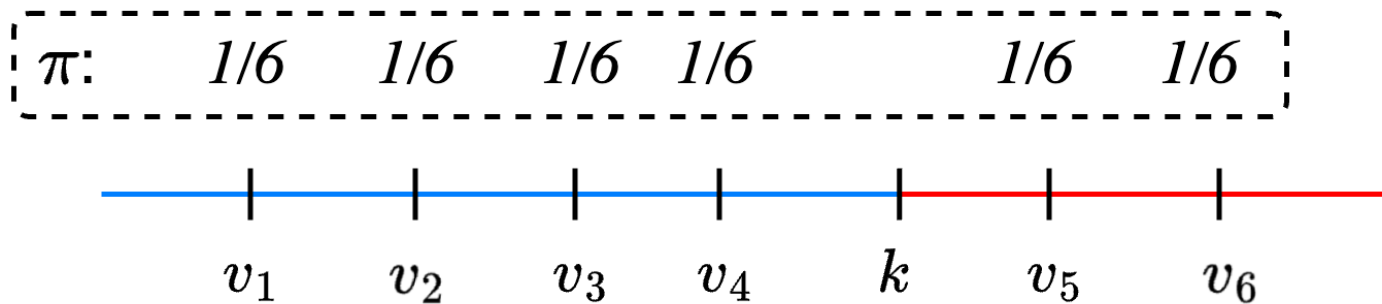
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Need candidates
to respond
to party base

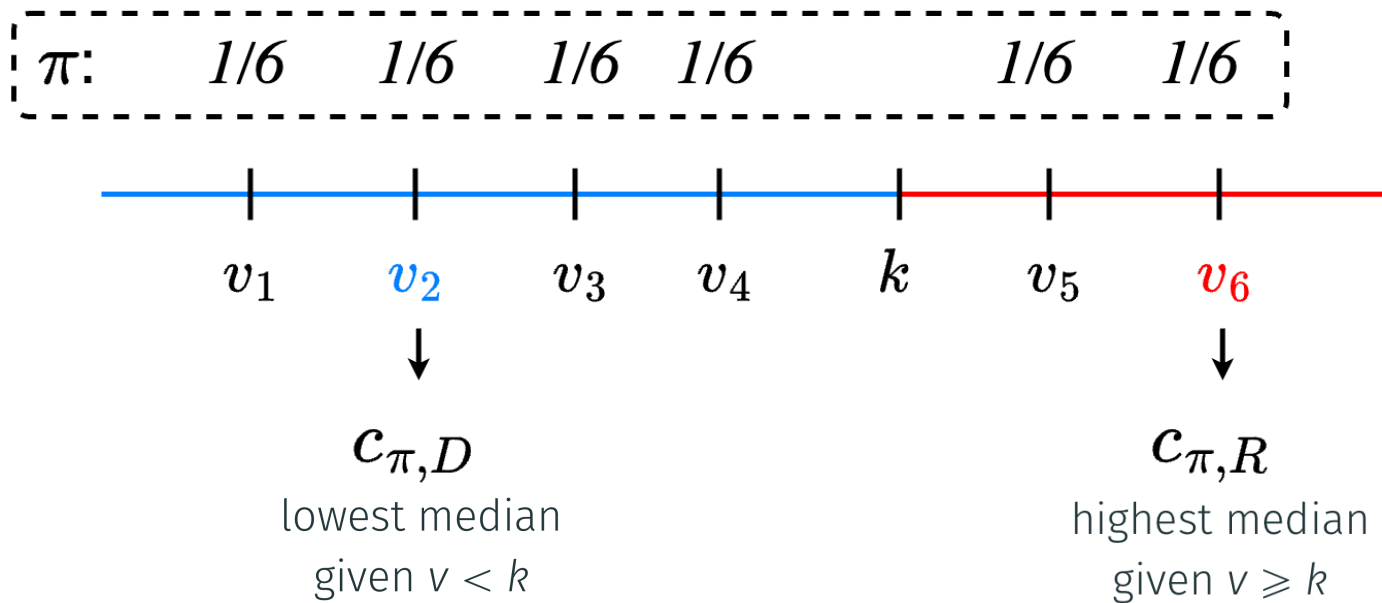
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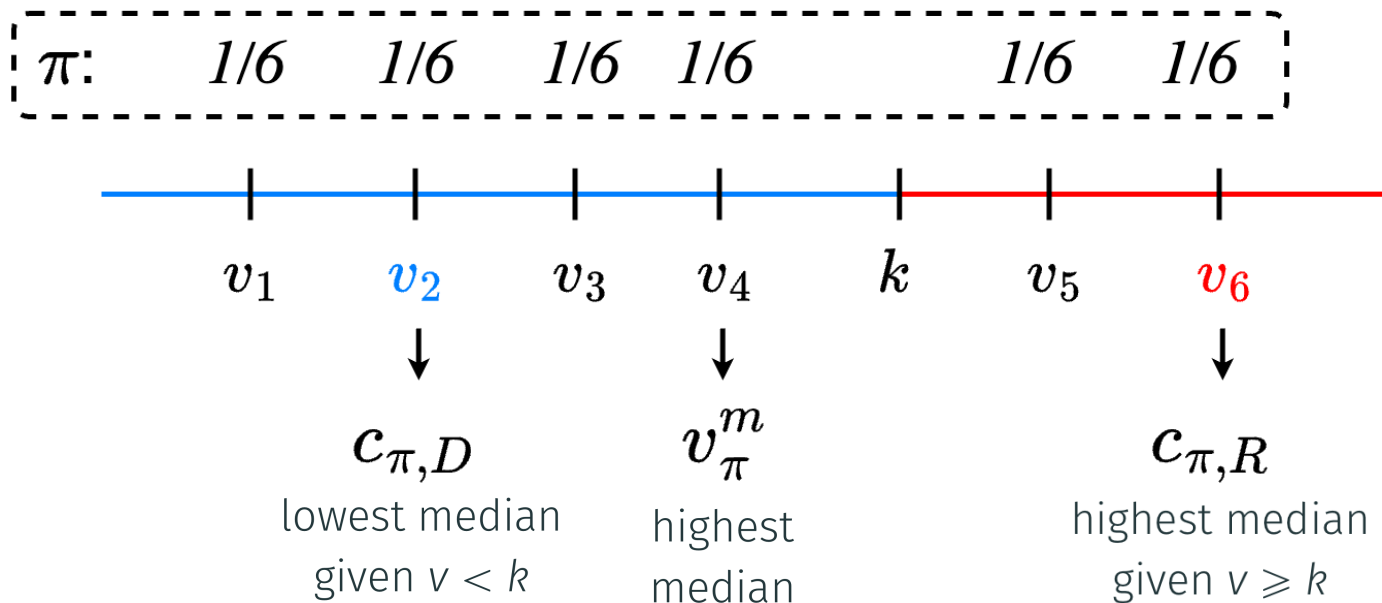
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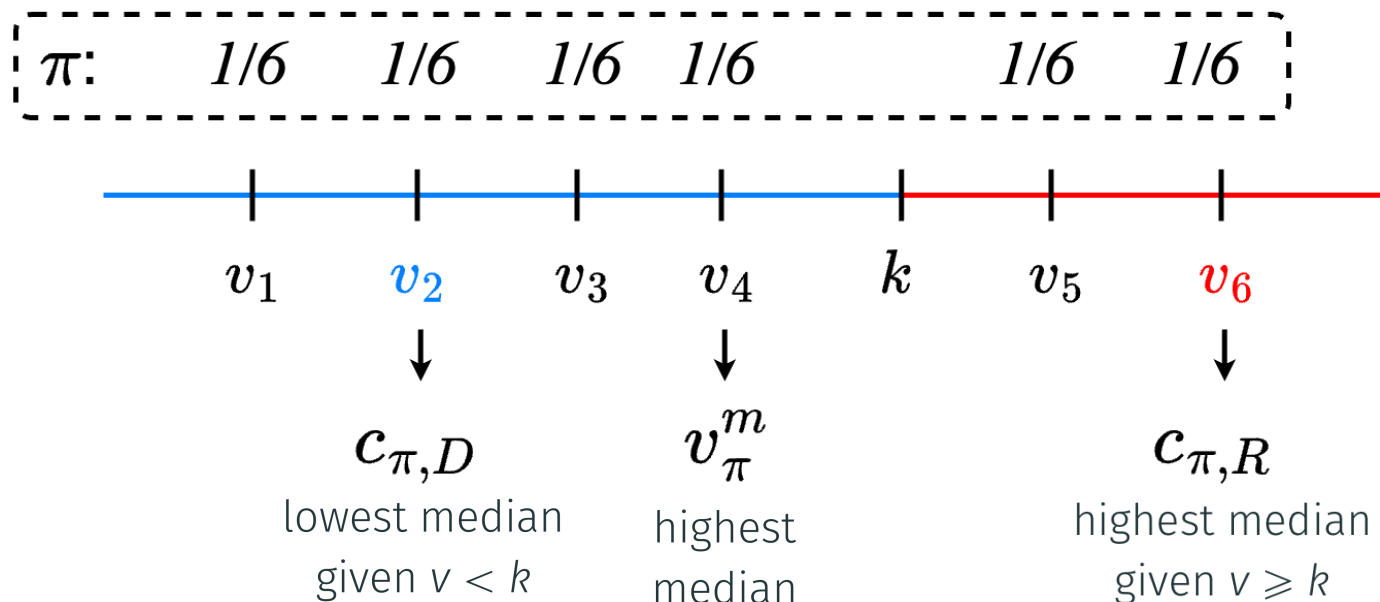
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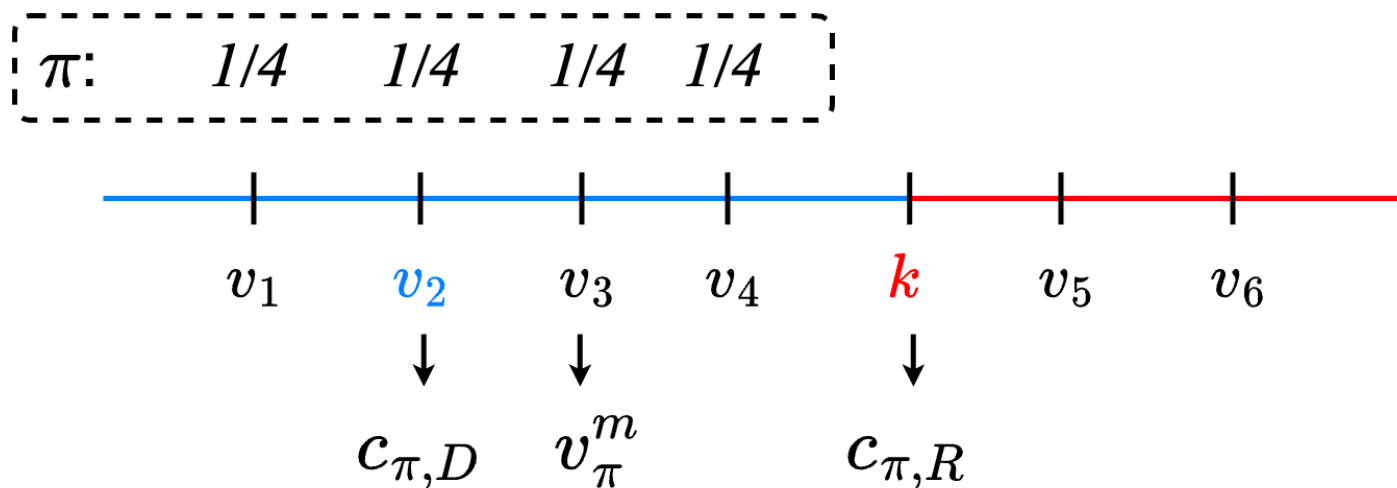
ELECTIONS IN DISTRICT π



Disclaimer: Tie-breaking “in favor” of Republicans. Does not matter given continuum of voters

ELECTIONS IN DISTRICT π

- If there are no **Republicans** in π ...



- Same for **Democrats**

ALLOWING FOR UNCERTAINTY

- Redistricting happens every 10 years
- Designer faces uncertainty about voters' preferences
- **Aggregate shock**: All voters experience common shock $\omega \rightarrow v - \omega$
- $\omega \sim \gamma \in \Delta(\mathbb{R})$, with CDF G increasing and continuous on $[2(\underline{v} - \bar{v}), 2(\bar{v} - \underline{v})]$
- $\pi \rightarrow \pi^\omega$

TIMING



THE REDISTRICTER'S PROBLEM

- Designer's problem is:

$$\begin{aligned} \max_{\mathcal{H} \in \Delta(\Delta([\underline{v}, \bar{v}]))} \quad & \int \int \mathbb{1} \left(v_{\pi^\omega}^m - \frac{C_{\pi^\omega, D} + C_{\pi^\omega, R}}{2} \geq 0 \right) d\mathcal{H}(\pi) d\gamma(\omega) \\ \text{s.t.} \quad & \int \pi d\mathcal{H}(\pi) = \phi \end{aligned} \tag{RP}$$

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How do we solve it?

SOLUTION

SOLUTION

MAPPING TO OPTIMAL TRANSPORT PROBLEM

FOCUS ON SUBSET OF FEASIBLE PLANS

Proposition 1

Any district π in an optimal plan is such that $\text{supp}(\pi) = \{v', v''\}$, with:

$$v' \geq 0 \geq v''$$

$$\pi(\{v'\}) = \pi(\{v''\})$$

→ Matching voters above the median with voters below the median

► Proof

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► Proof

- Define $\phi' = \phi(\cdot | v \geq 0)$ and $\phi'' = \phi(\cdot | v \leq 0)$
- $\mathcal{M}(\phi', \phi'')$ set of joint distributions over v', v'' with marginals ϕ', ϕ''
- Designer's problem becomes...

REDUCTION TO OPTIMAL TRANSPORT PROBLEM

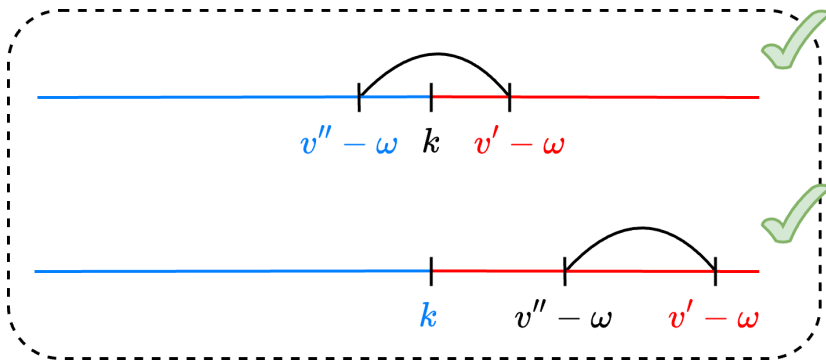
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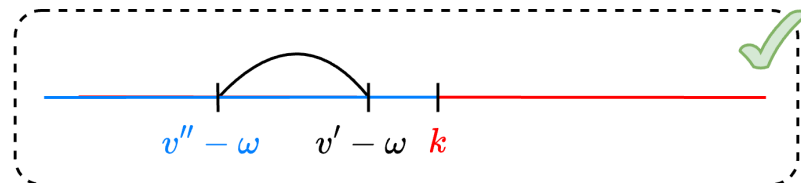
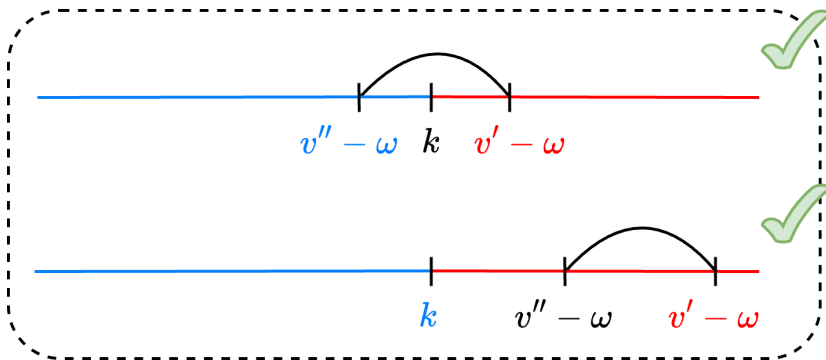
$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int \int \underbrace{\mathbb{1}(v' - \omega \geq k)}_{\text{50\% Rep voters}} +$$

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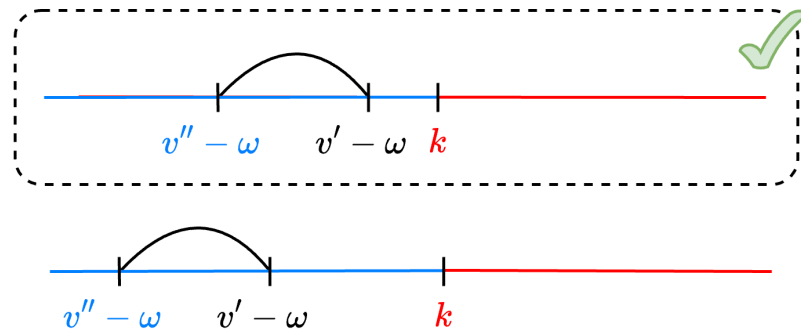
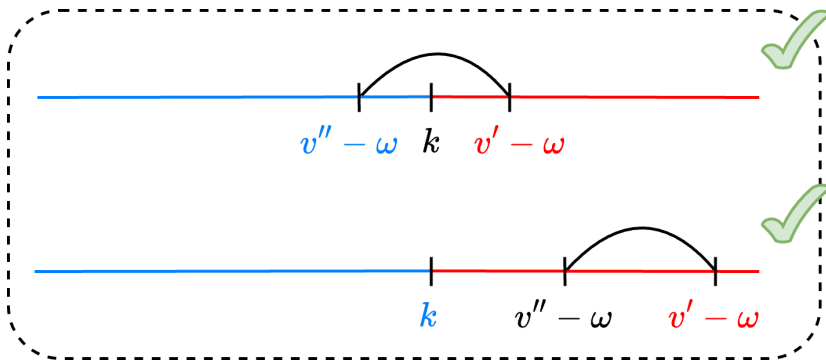
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- After some algebra...

$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int G(2v' - v'' - k) d\tau(v', v'') \quad (\text{OTP})$$

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- This is an optimal transport problem

THEOREM 1: RECAP

$$\begin{aligned} \max_{\mathcal{H} \in \Delta(\Delta([\underline{v}, \bar{v}]))} \quad & \int \int \mathbb{1} \left(v_{\pi^\omega}^m - \frac{C_{\pi^\omega, D} + C_{\pi^\omega, R}}{2} \geq 0 \right) d\mathcal{H}(\pi) d\gamma(\omega) \\ \text{s.t.} \quad & \int \pi d\mathcal{H}(\pi) = \phi \end{aligned} \tag{RP}$$

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Theorem 1

RP is equivalent to OTP

$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int G(2v' - v'' - k) d\tau(v', v'') \tag{OTP}$$

SOLUTION

SOLUTION TO OPTIMAL TRANSPORT PROBLEM

A CLOSER LOOK AT OTP

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Trade off:

Option 1 Some district with high $v' - v''$
and some districts with low $v' - v''$

Option 2 All districts with moderate
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\rightarrow Depends on concavity of G

BENCHMARK CASES

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G strictly concave \rightarrow

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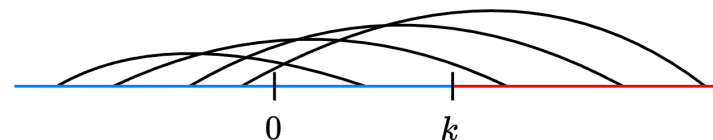
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positive assortative matching

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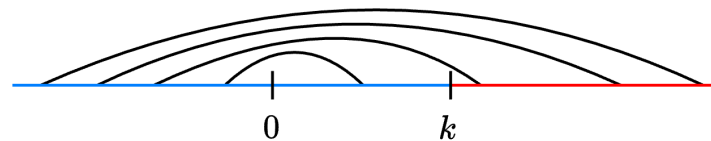
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negative assortative matching

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Marginal cost of decreasing $v' - v''$ in a district where it's low

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK

G S-shaped \rightarrow

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concrete if $\overbrace{2v' - v'' - k}^{\text{District won when } \omega=0} > 0 \rightarrow$

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concave if $\overbrace{2v' - v'' - k}^{\text{District won when } \omega=0} > 0 \rightarrow$

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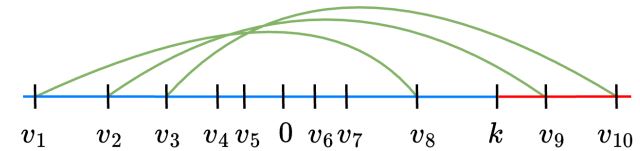
convex if $\overbrace{2v' - v'' - k}^{\text{District lost when } \omega=0} < 0 \rightarrow$

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK

District **won** when $\omega=0$
 concave if $\overbrace{2v' - v'' - k} > 0 \rightarrow$

G **S-shaped** \rightarrow

convex if $\overbrace{2v' - v'' - k} < 0 \rightarrow$
 District **lost** when $\omega=0$

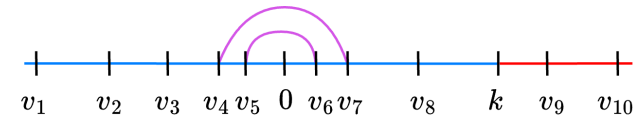
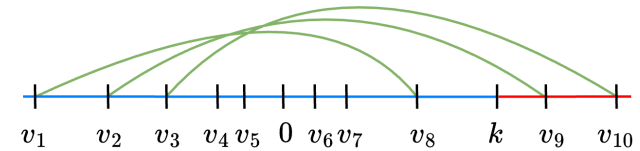


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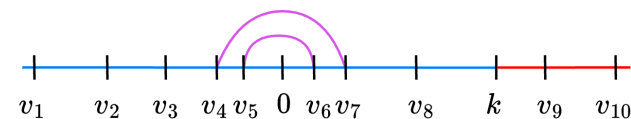
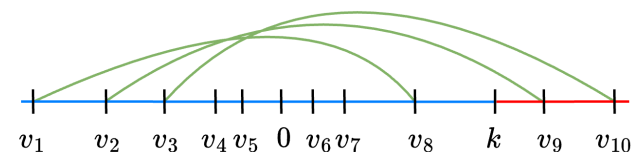


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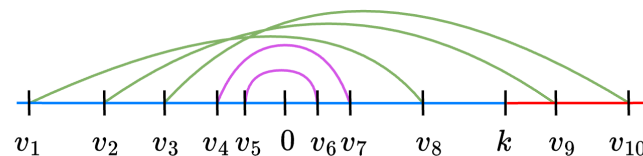
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G **S-shaped** \rightarrow

convex if $\underbrace{2v' - v'' - k}_{< 0} < 0 \rightarrow$
 District **lost** when $\omega=0$



- Solution is a combination of **positive** and **negative** assortative matching

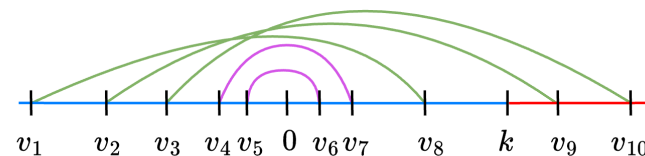
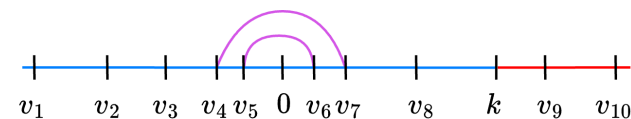
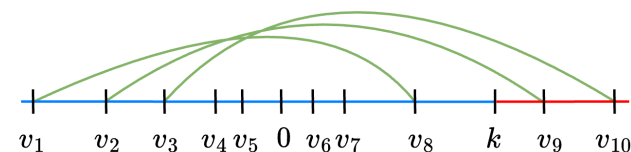


THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK

District **won** when $\omega=0$
 concave if $\underbrace{2v' - v'' - k}_{> 0} > 0 \rightarrow$

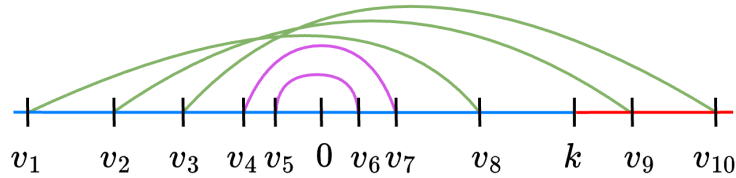
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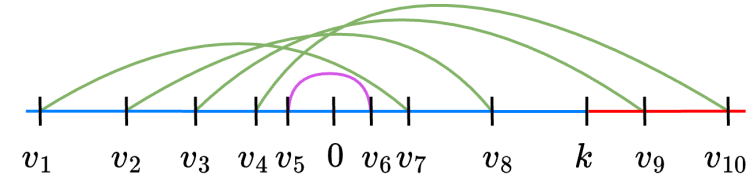


- Solution is a combination of **positive** and **negative** assortative matching
- ...**But which one?**

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK

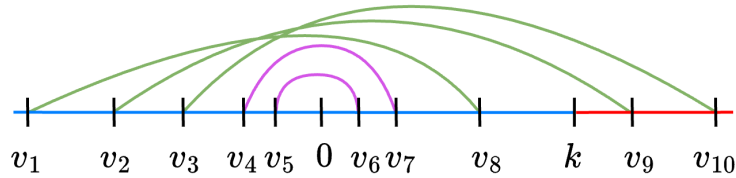


Option 1 Fewer **positive** matches, but
with higher distance each

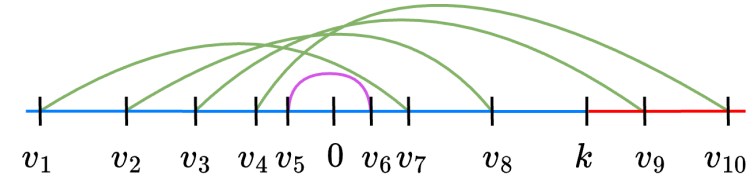


Option 2 More **positive** matches, but
with lower distance each

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK

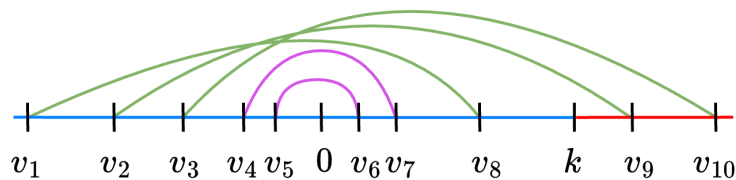


Option 1 Fewer **positive** matches, but
 with higher distance each
 safer when bad ω

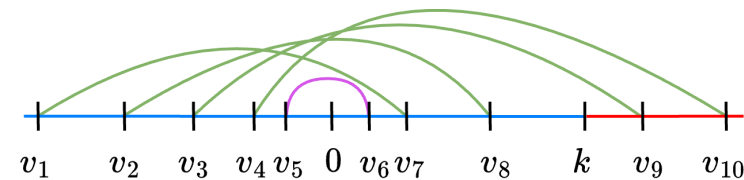


Option 2 More **positive** matches, but
 with lower distance each
 riskier when bad ω

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK



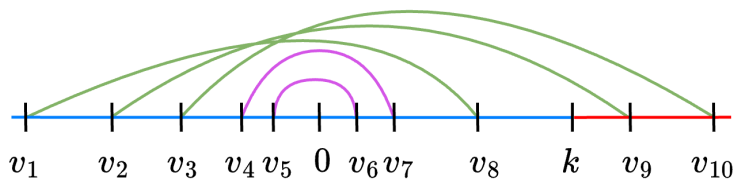
Option 1 Fewer won when $\omega=0$
 Fewer positive matches, but
 with safer when bad ω
 higher distance each



Option 2 More won when $\omega=0$
 More positive matches, but
 with riskier when bad ω
 lower distance each

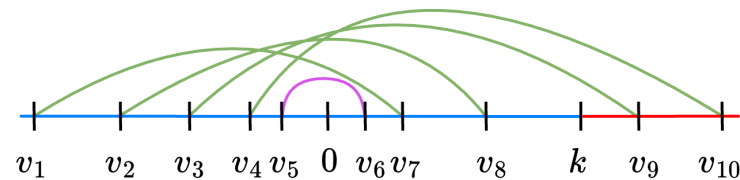
G symmetric \rightarrow Option 2

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK



Option 1 { Fewer positive matches, but
with { higher distance each
} safer when bad ω

G symmetric \rightarrow Option 2



Option 2 { More positive matches, but
with { lower distance each
} riskier when bad ω

Intuition: OTP linear in number of
districts won + symmetry \rightarrow As if
shock doesn't matter

THEOREM 2: S-SHAPED AND SYMMETRIC SHOCK

Theorem 2

There is a unique solution τ to OTP. Moreover, τ is such that:

- $\tau = \alpha\tau^+ + (1 - \alpha)\tau^-$ for appropriate:
 - $\alpha \in [0, 1]$
 - τ^+ *positive assortative*
 - τ^- *negative assortative*
- There is $v', v'' \in \text{supp}(\tau^+)$ such that $(1 - \alpha)(2v' - v'' - k) = 0$

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FOC: Either $\tau = \tau^+$ or $2v' - v'' - k \geq 0$ binding for at least one v', v''

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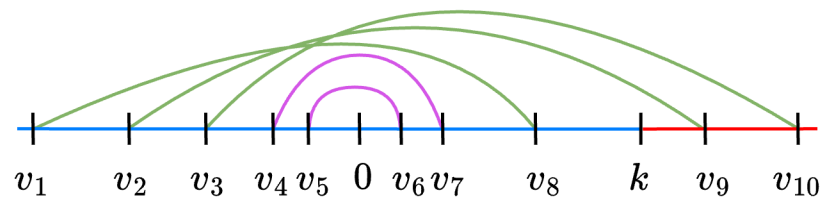
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Intuitively: Solution must “maximize” *positive* assortative matches

COMPARATIVE STATICS AND IMPLICATIONS FOR THE U.S. HOUSE

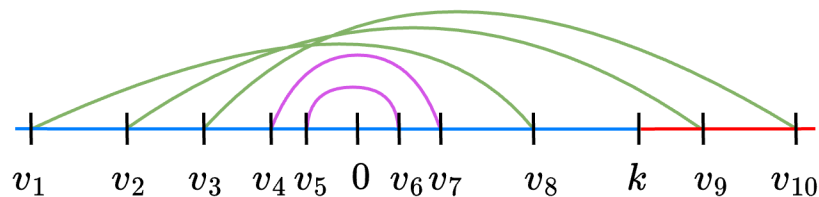
SOME COMPARATIVE STATICS



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SOME COMPARATIVE STATICS

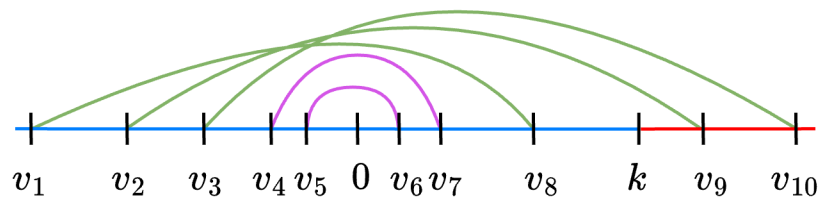


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- More Republican voters in $\phi \rightarrow$ More positive matches \rightarrow Better for designer

SOME COMPARATIVE STATICS

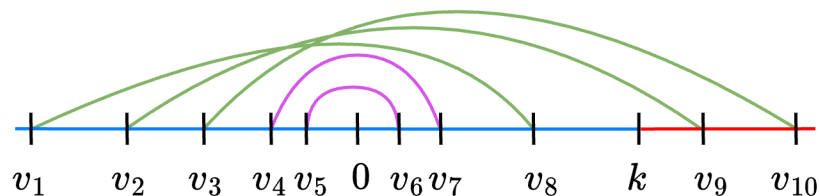


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- Median preserving spread of $\phi \rightarrow$ More positive matches \rightarrow Better for designer

SOME COMPARATIVE STATICS



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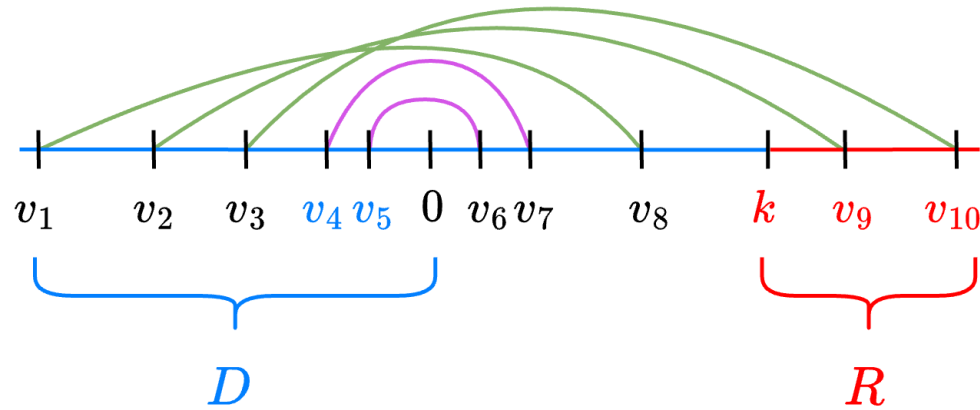
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- More Republican voters in $\phi \rightarrow$ More positive matches \rightarrow Better for designer
- Median preserving spread of $\phi \rightarrow$ More positive matches \rightarrow Better for designer

Corollary 1

If ϕ is “spread out” enough, the designer wins ALL districts

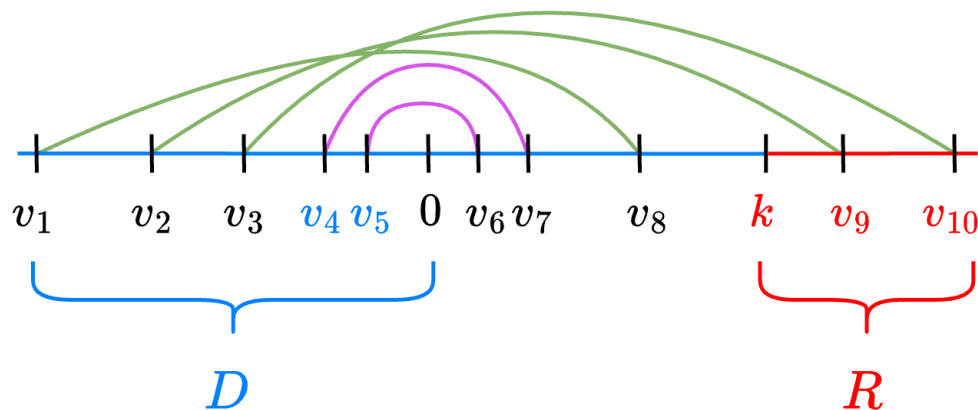
POLARIZATION IN THE U.S. HOUSE



Proposition 2

Distribution of representatives has a gap in $[-\omega, k]$

POLARIZATION IN THE U.S. HOUSE



Proposition 2

Distribution of representatives has a gap in $[-\omega, k]$

Dilution of moderate voters' power

EXTENSIONS

EXTENSIONS

Primary Elections

- Convex combination of party medians and median \rightarrow same characterization
- Different party quantile $q \rightarrow$ “three-wise matching” (in the paper)

Objective Function

- Designer has policy preferences \rightarrow pack supporters
- Majoritarian objective \rightarrow non-linear OT \rightarrow More negative assortment

Other

- Idiosyncratic uncertainty \rightarrow means instead of medians
- Exogenous/Endogenous turnout

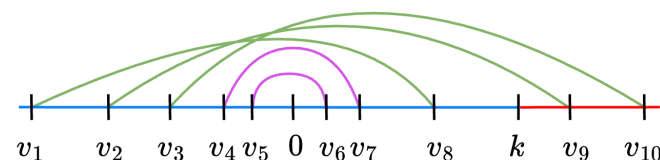
CONCLUSIONS

RECAP

Optimal redistricting with endogenous candidates' positions

- Designer's objective depends on districts' medians **AND** conditional medians

→ **optimal transport** characterization:



- Standard gerrymandering can **backfire**
- Designer exploits extreme opponents to turn moderate opponents into supporters

**Some
Implications:**

More spread out electorate
→ stronger gerrymandering

Polarized U.S. House

FOR FUTURE RESEARCH

- **Empirical follow-up:** “Supply Responses to Redistricting” (with Herman and Longuet-Marx)
 - Preliminary findings: candidates respond to district composition

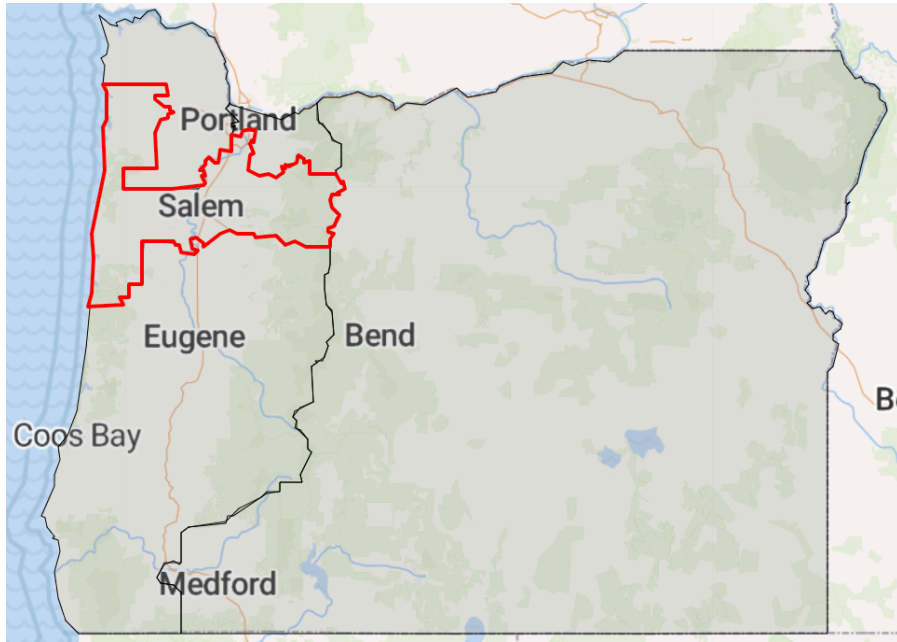
Application to other contexts

- Agenda setting in groups
- Information design with dependence on more than one statistic
 - Multiple signals
 - Behavioral preferences

EXTRA

CASE STUDY: OREGON 5th CONGRESSIONAL DISTRICT

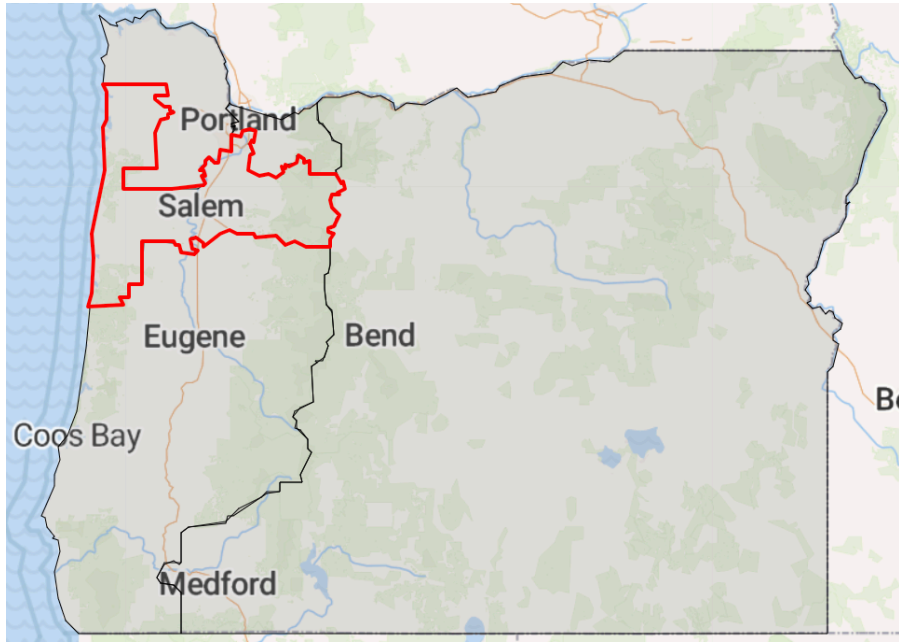
Until January 2, 2023



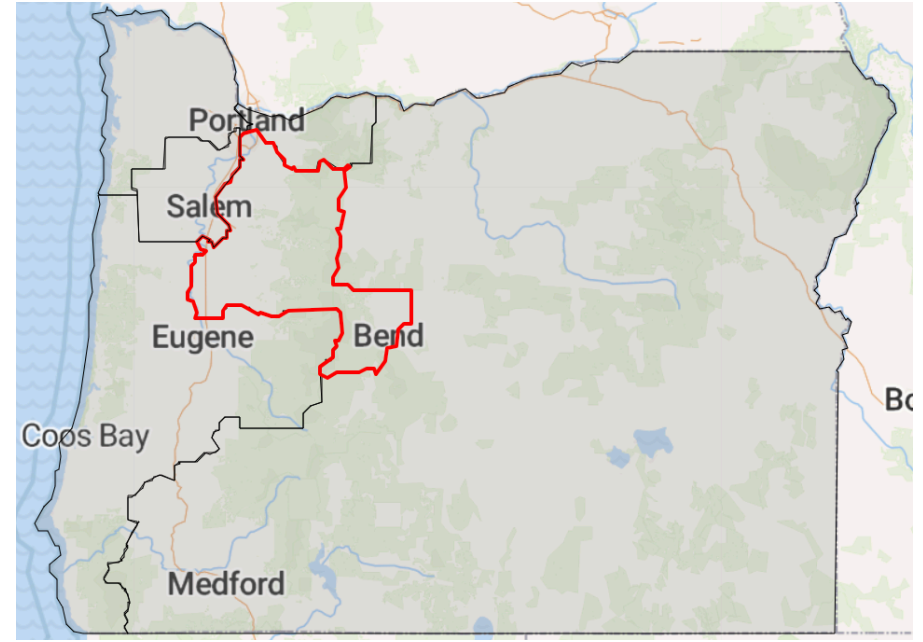
- Democratic gerrymandering
- 53.6% vs 43.9%
- 7th term incumbent *Kurt Shrader*
- Moderate Democrat, endorsed by Biden

CASE STUDY: OREGON 5th CONGRESSIONAL DISTRICT

Until January 2, 2023



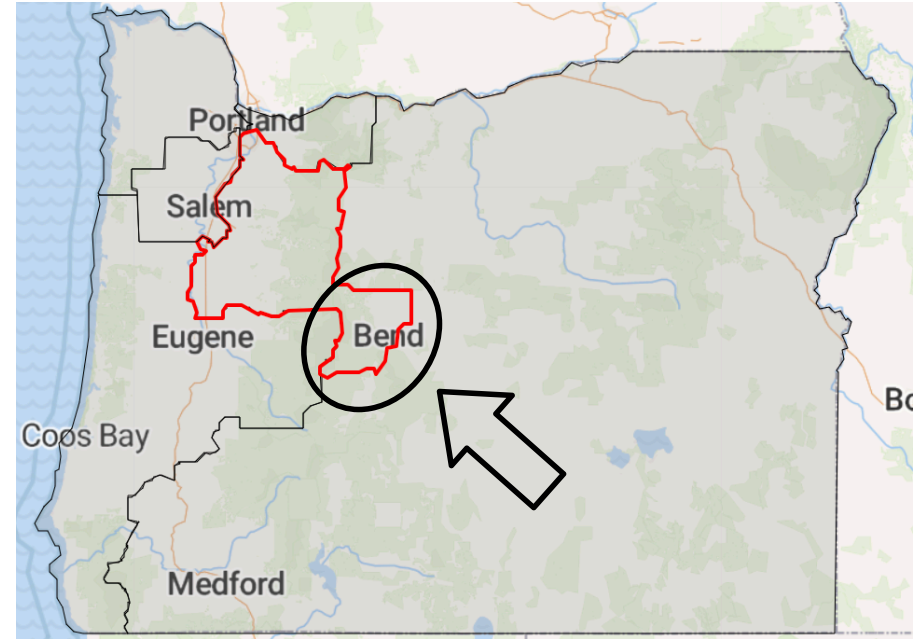
From January 3, 2023



CASE STUDY: OREGON 5th CONGRESSIONAL DISTRICT

From January 3, 2023

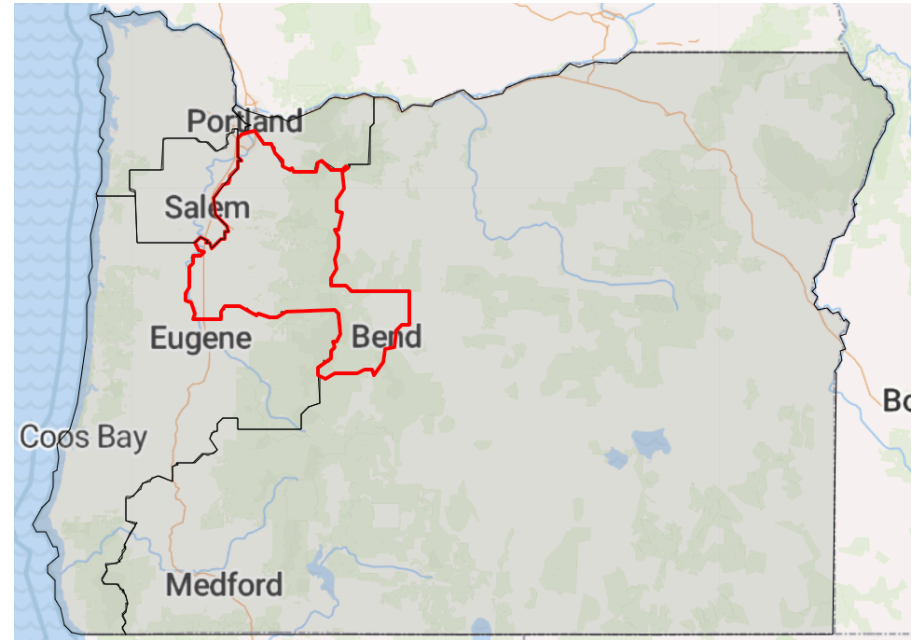
- Democratic gerrymandering
- 53.2% vs 44.4%
- Progressive Democrat *Jamie McLeod-Skinner* has 40 points advantage in Deschute county over incumbent



CASE STUDY: OREGON 5th CONGRESSIONAL DISTRICT

From January 3, 2023

- Shrader loses the Democratic primary to McLeod-Skinner
- McLeod-Skinner loses general elections to **moderate** Republican *Lori Chavez-DeRemer*

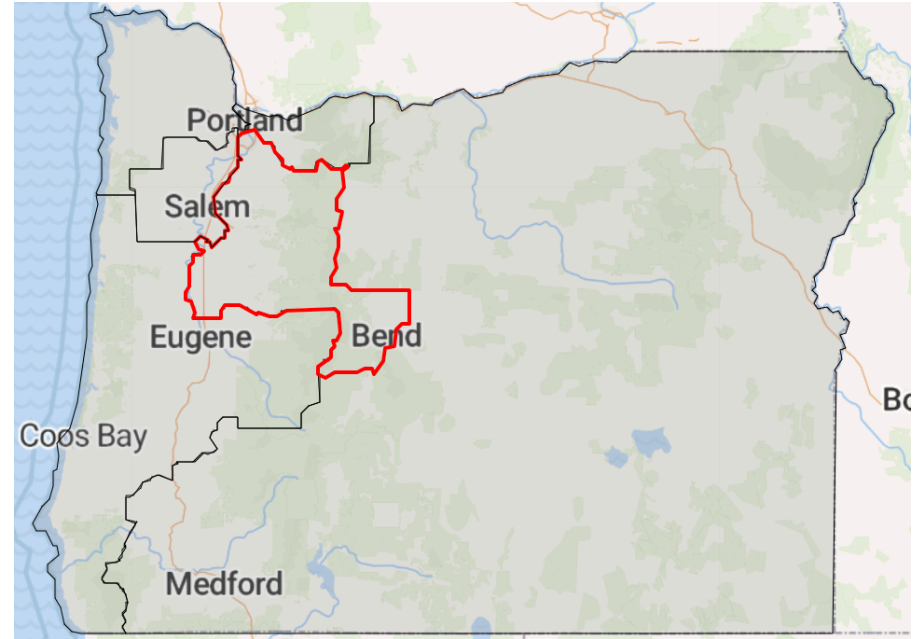


CASE STUDY: OREGON 5th CONGRESSIONAL DISTRICT

From January 3, 2023

Democrats ate their own [...] and now a standout Republican candidate will face-off against a far-too-liberal activist in Jamie McLeod-Skinner.

- Dan Conston for The Washington Post

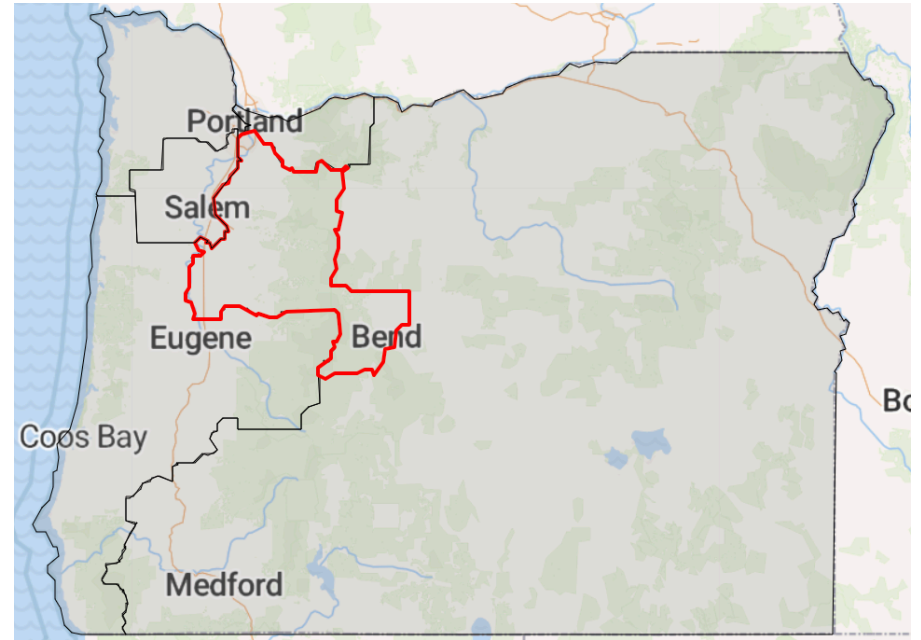


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Democrats ate their own [...] and now a standout Republican candidate will face-off against a far-too-liberal activist in Jamie McLeod-Skinner.

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Is gerrymandering is less powerful than we thought?

ELECTIONS IN DISTRICT π : PRIMARIES

- Primary positions:

$$(c_{\pi,D}, c_{\pi,R}) = \begin{cases} (v_{\pi,D}^m, k) & \text{if } \text{supp } \pi \subseteq (-\infty, 0] \\ (k, v_{\pi,R}^m) & \text{if } \text{supp } \pi \subseteq [0, \infty) \\ (v_{\pi,D}^m, v_{\pi,R}^m) & \text{otherwise} \end{cases}$$

- $v_{\pi,D}^m$ the lowest median of π conditional on $v < 0$
- $v_{\pi,R}^m$ the highest median of π conditional on $v \geq 0$

ELECTIONS IN DISTRICT π : GENERAL ELECTIONS

- **General elections:** Voters vote for the candidate closer to them
- v_{π}^m highest median of π . Then:

$$c_P = \begin{cases} c_{\pi,D} & \text{if } v_{\pi}^m < \frac{c_{\pi,R} + c_{\pi,D}}{2} \\ c_{\pi,R} & \text{if } v_{\pi}^m \geq \frac{c_{\pi,R} + c_{\pi,D}}{2} \end{cases}$$

ELECTIONS IN DISTRICT π : MICROFOUNDATIONS

- Single-peaked voters' utilities $u(\cdot, v_i)$, $v_i \in [\underline{v}, \bar{v}]$
 - v_{π}^m median
 - $v_{\pi,R}^m$ median given $v_i \geq k$
 - $v_{\pi,D}^m$ median given $v_i < k$
- Two candidates per party, purely office motivated, commit to policy before elections
- Voters and candidates believe v_{π}^m to have distribution $H \in \Delta([\underline{v}, \bar{v}])$
 - In addition, candidates know $v_{\pi,R}^m, v_{\pi,D}^m$

ELECTIONS IN DISTRICT π : MICROFOUNDATIONS

Primary Elections

- Given position y of opposing nominee, voter t votes for candidate maximizing

$$U(x; y, t) = u(x, t)p(x, y) + u(y, t)(1 - p(x, y))$$

where $p(x, y)$ probability of x winning against y

General Election

- Voters vote for candidate closer to them

ELECTIONS IN DISTRICT π : MICROFOUNDATIONS

Linear setting

Suppose $u(x, v_i) = -|x - v_i|$ and H is uniform on $[\underline{v}, \bar{v}]$

Proposition 3

There exists a unique Nash equilibrium where the Republican and Democratic candidates set positions $c_{\pi,R} = v_{\pi,R}^m$ and $c_{\pi,D} = v_{\pi,D}^m$, respectively.

ELECTIONS IN DISTRICT π : MICROFOUNDATIONS

Convex setting

$$u(x, v_i) = e^{-\alpha|x-v_i|}, \alpha > 0, H \sim \mathcal{N}(v_\pi^m, \sigma)$$

Proposition 4 (Owen and Grofman (2006))

If $\sigma \geq \frac{\max\{1-e^{1-\alpha(v_\pi^m-v_{\pi,D}^m)}, 1-e^{\alpha(v_{\pi,R}^m-v_\pi^m)}\}}{\alpha\sqrt{2\pi}}$, there exists a unique Nash equilibrium where the Republican and Democratic candidates set positions $c_{\pi,R} = v_{\pi,R}^m$ and $c_{\pi,D} = v_{\pi,D}^m$, respectively.

◀ Return

PROOF SKETCH: STEP 1

Intuition:

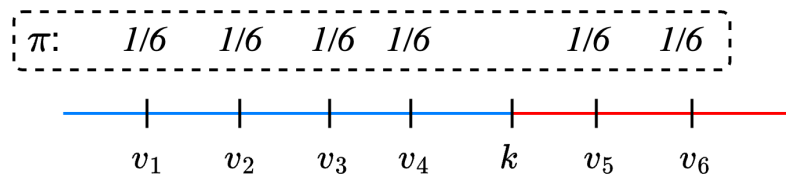
Step 1 For any district π , $\exists v', v''$:

$$\text{supp}(\pi) = \{v', v''\}$$

$$\pi(\{v'\}) = \pi(\{v''\})$$

PROOF SKETCH: STEP 1

Intuition:



suppose $|\text{supp}(\pi)| > 2$

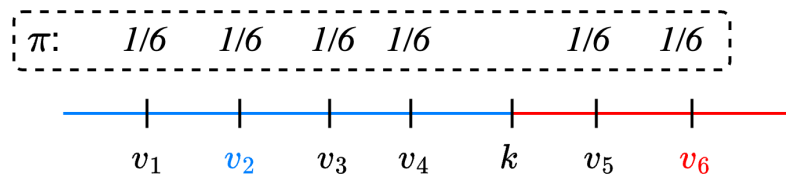
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PROOF SKETCH: STEP 1

Intuition:



$$C_{\pi,R} - V_{\pi}^m > V_{\pi}^m - C_{\pi,D} \rightarrow \pi \text{ is lost}$$

Step 1 For any district $\pi, \exists v', v''$:

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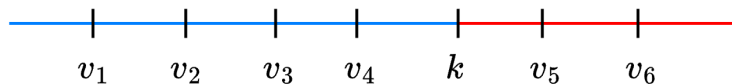
$$\pi(\{v'\}) = \pi(\{v''\})$$

PROOF SKETCH: STEP 1

Intuition:

π_3 :	$1/2$				$1/2$
π_2 :		$1/2$			$1/2$
π_1 :			$1/2$		$1/2$

π :	$1/6$	$1/6$	$1/6$	$1/6$		$1/6$	$1/6$
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can substitute π with π_1, π_2, π_3

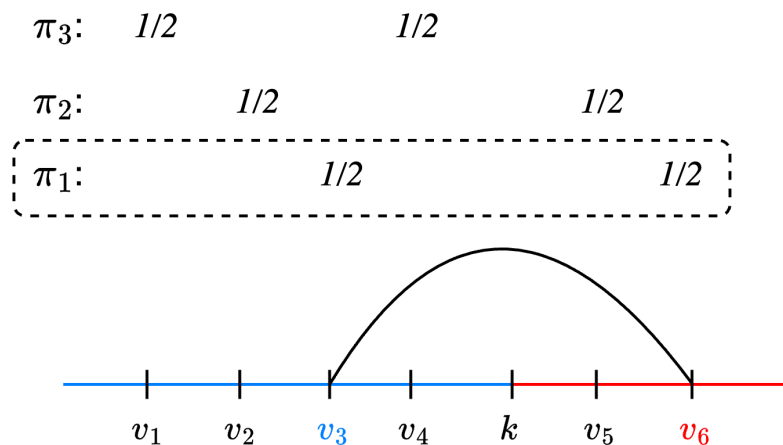
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$$\text{supp}(\pi) = \{v', v''\}$$

$$\pi(\{v'\}) = \pi(\{v''\})$$

PROOF SKETCH: STEP 1

Intuition:



$$C_{\pi_1, R} = V_{\pi_1}^m \rightarrow \pi_1 \text{ is won}$$

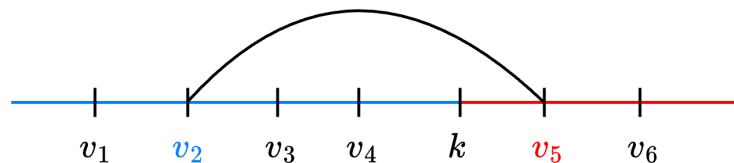
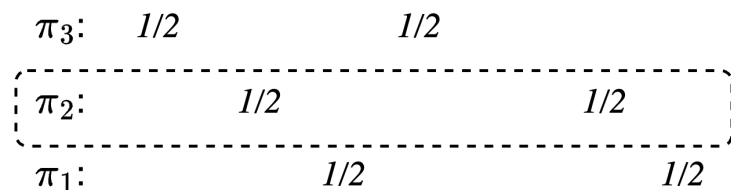
Step 1 For any district π , $\exists v', v''$:

$$\text{supp}(\pi) = \{v', v''\}$$

$$\pi(\{v'\}) = \pi(\{v''\})$$

PROOF SKETCH: STEP 1

Intuition:



$$C_{\pi_2, R} = V_{\pi_2}^m \rightarrow \pi_2 \text{ is won}$$

Step 1 For any district π , $\exists v', v''$:

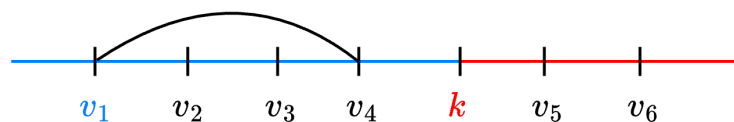
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$$\pi(\{v'\}) = \pi(\{v''\})$$

PROOF SKETCH: STEP 1

Intuition:

π_3 :	$1/2$	$1/2$
π_2 :	$1/2$	$1/2$
π_1 :	$1/2$	$1/2$



$$C_{\pi_3, R} - V_{\pi_3}^m < V_{\pi_3}^m - C_{\pi_3, D} \rightarrow \pi_3 \text{ is won}$$

Step 1 For any district π , $\exists v', v''$:

$$\text{supp}(\pi) = \{v', v''\}$$

$$\pi(\{v'\}) = \pi(\{v''\})$$

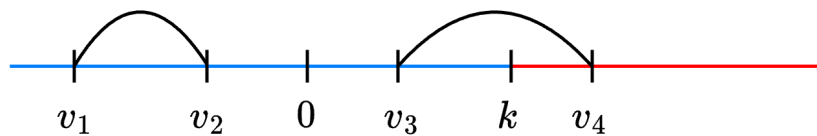
PROOF SKETCH: STEP 2

Intuition:

$$\boxed{\text{Step 2}} \quad v' \geq 0 \geq v''$$

PROOF SKETCH: STEP 2

Intuition:

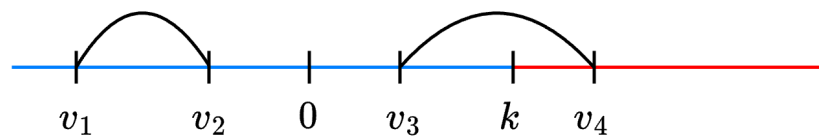


Only district with v_3, v_4 is won

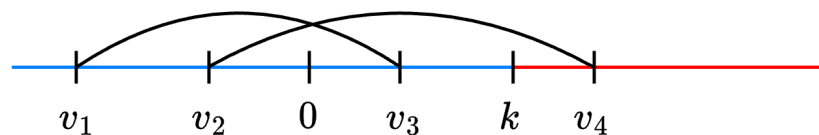
Step 2 $v' \geq 0 \geq v''$

PROOF SKETCH: STEP 2

Intuition:



Only district with v_3, v_4 is won



Both districts are won

Step 2 $v' \geq 0 \geq v''$

◀ Return

REDUCTION TO OPTIMAL TRANSPORT PROBLEM

- Define $\phi' = \phi(\cdot | v \geq v^m)$ and $\phi'' = \phi(\cdot | v \leq v^m)$
- $\mathcal{M}(\phi', \phi'')$ set of joint distributions over v', v'' with marginals ϕ', ϕ''
- Designer's problem becomes:

$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int \int \mathbb{1}(v' - \omega \geq k) + \mathbb{1}(v' - \omega < k) \mathbb{1}\left(v' - \omega - \frac{v'' - \omega}{2} \geq k\right) d\gamma(\omega) d\tau(v', v'')$$

REDUCTION TO OPTIMAL TRANSPORT PROBLEM

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$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int G(v' - k) + G(2v' - v'' - k) - G(v' - k) d\tau(v', v'')$$

REDUCTION TO OPTIMAL TRANSPORT PROBLEM

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- Designer's problem becomes:

$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int G(2v' - v'' - k) d\tau(v', v'') \quad (\text{OTP})$$

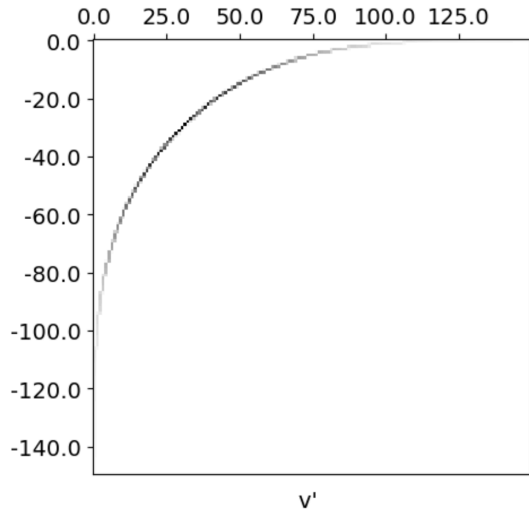
REDUCTION TO OPTIMAL TRANSPORT PROBLEM

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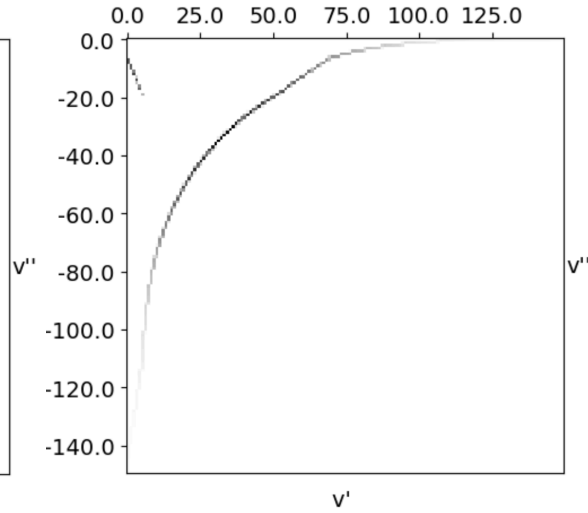
$$\max_{\tau \in \mathcal{M}(\phi', \phi'')} \int G(2v' - v'' - k) d\tau(v', v'') \quad (\text{OTP})$$

◀ Return

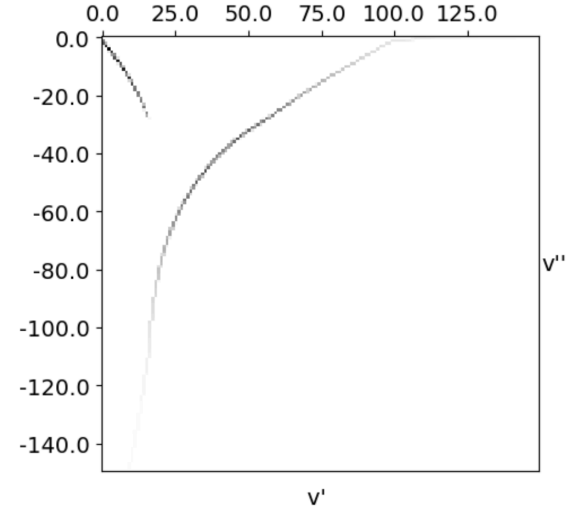
EXAMPLE WITH NORMAL SHOCK



(a) $k=60$



(b) $k=75$



(c) $k=100$

Solution for simulated F normal, G normal

REFERENCES

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