

Édouard Lucas:

The theory of recurrent sequences is an inexhaustible mine which contains all the properties of numbers; by calculating the successive terms of such sequences, decomposing them into their prime factors and seeking out by experimentation the laws of appearance and reproduction of the prime numbers, one can advance in a systematic manner the study of the properties of numbers and their application to all branches of mathematics.



Computational Approaches for Political Redistricting Part IV: Specific State Analyses

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CSAIL – GDP Group

IAP 2019
Massachusetts Institute of Technology
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MORAL:

Computational Redistricting is
NOT a solved problem!



Advertisements

- ① VRDI – 6 week summer program for graduate and undergraduate students (Deadline 2/1)
 - Application: tinyurl.com/apply-vrdi-2
 - Information: gerrydata.org
- ② Contact:
 - Email: [ddeford at mit.edu](mailto:ddeford@mit.edu)
 - Website: mggg.org
 - Slack channel: GerryChat.slack.com
- ③ Research Projects
 - Math Problems: tinyurl.com/gerryprojects
 - Data Problems: tinyurl.com/GerryChainProjects
- ④ IAP Info:
 - Resources: people.csail.mit.edu/ddeford/CAPR
 - Today 12-1 In-depth state examples

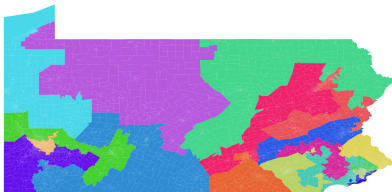


Outline

- ① Introduction
- ② Preliminaries
- ③ Pennsylvania: Partisan Gerrymandering
- ④ Virginia: Racial Gerrymandering
- ⑤ Wisconsin: Defining Competitiveness
- ⑥ Pennsylvania: Preserving Municipalities



Compactness Measures



Polsby–Popper

Theorem (Isoperimetry)

Let Ω be a bounded open subset of \mathbb{R}^2 with finite perimeter. Then:

$$4\pi A \leq P^2$$

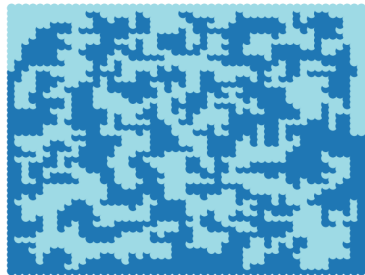
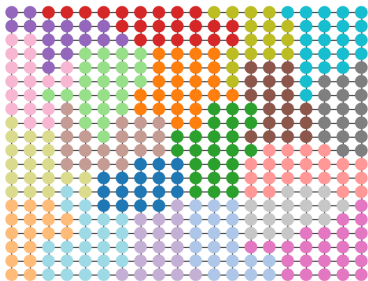
Definition (Polsby–Popper)

The Polsby–Popper score of a district is:

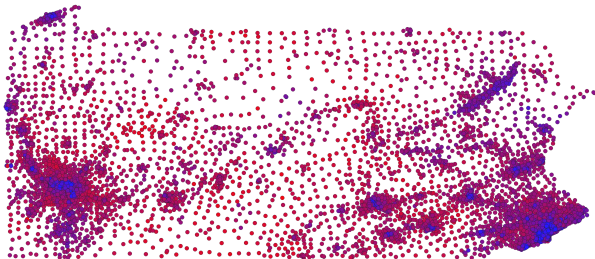
$$PP(\Omega) = \frac{4\pi A}{P^2}$$



(Discrete) Total Perimeter



Partisanship Measures



Seats–Votes Curves

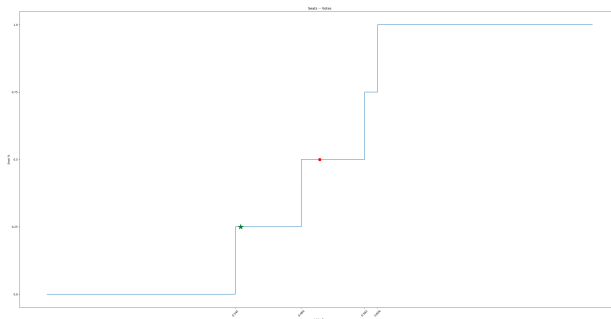


Figure: Dem %: [.249,.389,.273,.51]



Seats–Votes Curves

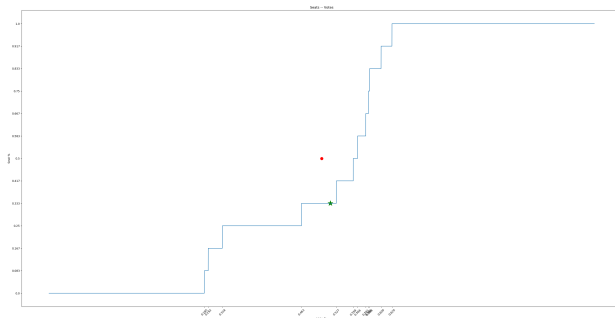


Figure: Dem %: [.698,.458,.724,.43,.435,.428,.553,.489,.407,.387,.731,.45]



Seats–Votes Curves

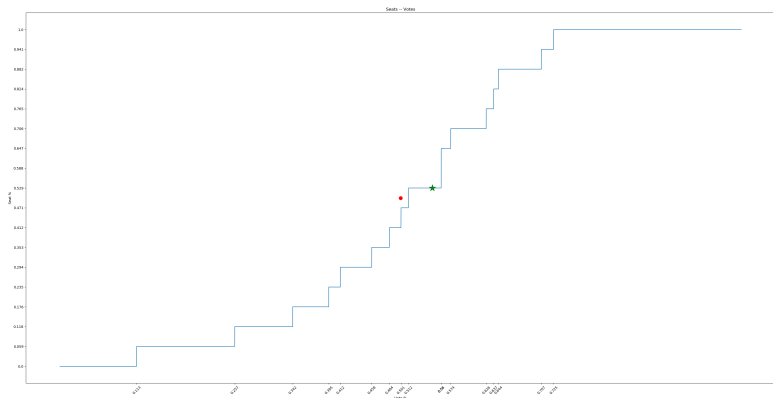


Figure: Dem %:

[.487,.79,.934,.635,.652,.589,.535,.546,.403,.487,.41,.34,.705,.421,.322,.473,.563]



Partisan Metrics

Definition (Mean–Median)

Horizontal distance between $(.5, .5)$ and the seats votes curve).
Alternatively, difference between the median and mean of the votes vector.

Definition (Partisan Bias)

Vertical distance between $(.5, .5)$ and the seats votes curve

Definition (Partisan Asymmetry)

Integral of the difference between the seats votes curve and its reflection around $(.5, .5)$.

Definition (Efficiency Gap)

$$\frac{W^A - W^B}{T}$$

With equal turnout: twice the seat margin minus the vote margin.

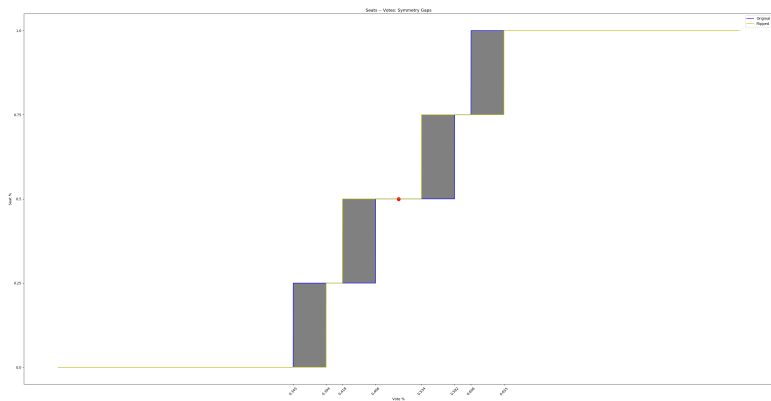


Partisan Examples

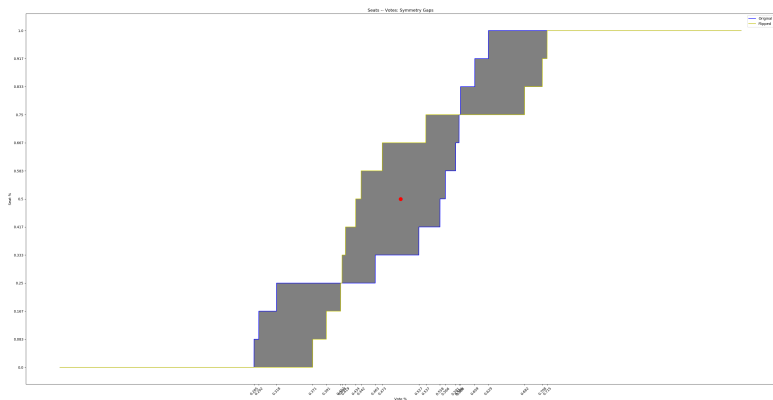
- Utah
 - Mean–Median: $-.024$
 - Efficiency Gap: $-.039$
 - Asymmetry: $.048$
- Pennsylvania
 - Mean–Median: $.011$
 - Efficiency Gap: $.063$
 - Asymmetry: $.050$
- North Carolina
 - Mean–Median: $.062$
 - Efficiency Gap: $.198$
 - Asymmetry: $.093$



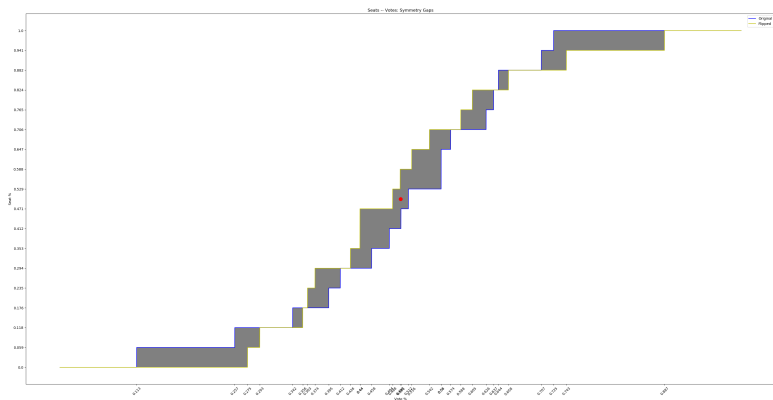
Seats–Votes Asymmetry



Seats–Votes Asymmetry



Seats–Votes Asymmetry



Court History



2011



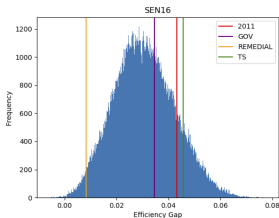
538 GOP



538 Dem



8th Grade



538 Compact



Gov



Remedial



TS



Data Setup

- Choice of units: Precincts
- Voting Data: Weighted Senate Results
- Initial Plans: TS/GOV/Enacted
- Demographics: Census



Theoretical Tool

Theorem (CFP¹)

Let $M = X_0, X_1, X_2, \dots$ be a reversible Markov chain with a stationary distribution π on the state space Ω and let $G : \Omega \rightarrow \mathbb{R}$ be a ranking function. If $X_0 \sim \pi$, then for any fixed k , the probability that $G(X_0)$ is an ε -outlier from among the list of values $G(X_0), G(X_1), G(X_2), \dots, G(X_k)$ is at most $\sqrt{2\varepsilon}$.

¹ M. Chikina, A. Frieze, and W. Pegden: Assessing significance in a Markov chain without mixing, PNAS, (2017).



Experimental Setup

- In order to apply the theorem we need a reversible chain
 - Uniform over permissible
 - Metropolis–Hastings
- Lots of choices to make!



Compactness



Figure: Average of reciprocal Polsby–Popper scores

Other Constraints

- Population Balance:
 - All within 1%
 - MH – L2
- VRA Compliance
 - Preserve two Philadelphia regions
 - Geoclusters more broadly
- County Splits:
 - Entropy of Counties split Districts
 - Entropy of Districts split Counties



Other Constraints

- Population Balance:
 - All within 1%
 - MH – L2
- VRA Compliance
 - Preserve two Philadelphia regions
 - Geoclusters more broadly
- County Splits:
 - Entropy of Counties split Districts
 - Entropy of Districts split Counties
- Glue together with linear coefficients for MH weighting



Initial Results

Gerrymandering Detected!



Problem Reformulation

- Move from Local to Global MCMC steps
- Reformulate constraints
 - Weaker population bound
 - Discrete instead of continuous compactness
 - Tree steps instead of single edge flip
 - Many seeds instead of single long walk
 - More election data
 - More comparison plans

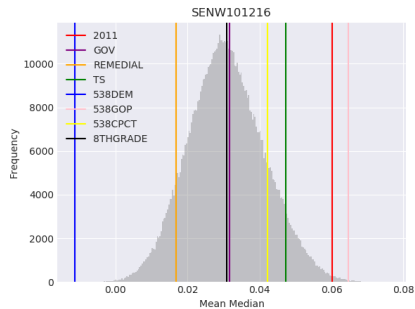
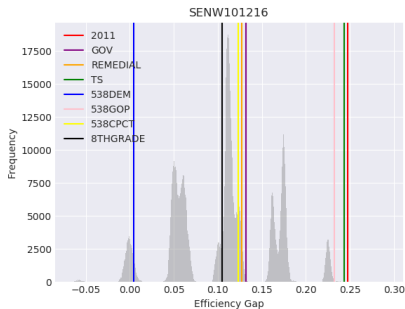


Problem Reformulation

- Move from Local to Global MCMC steps
- Reformulate constraints
 - Weaker population bound
 - Discrete instead of continuous compactness
 - Tree steps instead of single edge flip
 - Many seeds instead of single long walk
 - More election data
 - More comparison plans
- Better Geography?



Pennsylvania Landscapes

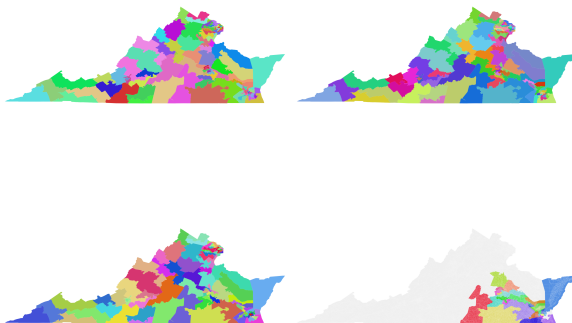


Initial Results

Gerrymandering Detected?



Legal History



Data Collection

- Choice of units: Blocks
- Voting Data: Prorated Presidential Results
- Initial Plans: (rounded) Enacted/Rep/Dem/Princeton
- Demographics: Virginia DLS



Tree Seeds Ensemble

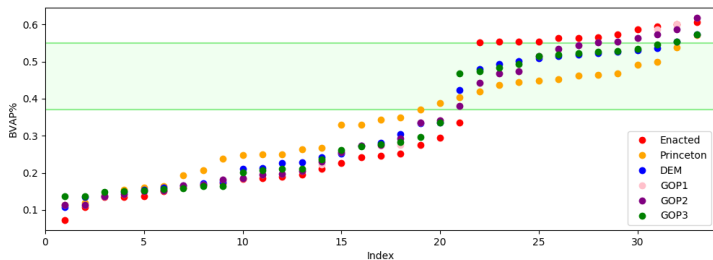


Research Question?

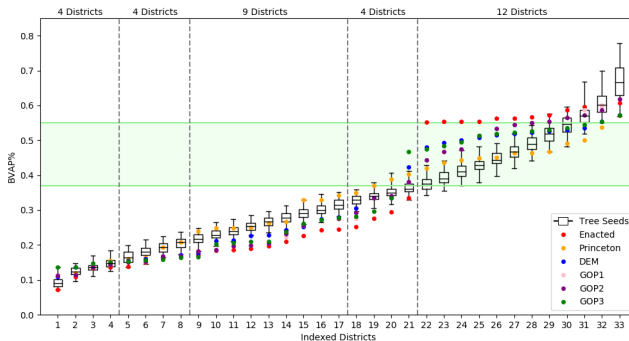
- What is best possible representation?
- What are impacts of packing?
- Is it possible to avoid packing?
- Partisan consequences of unpacking?



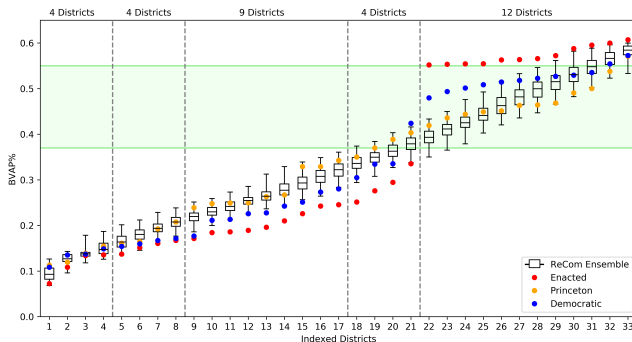
Proposed Plans



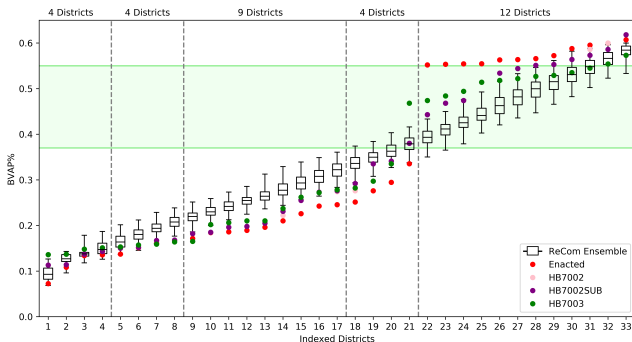
Seed Comparison



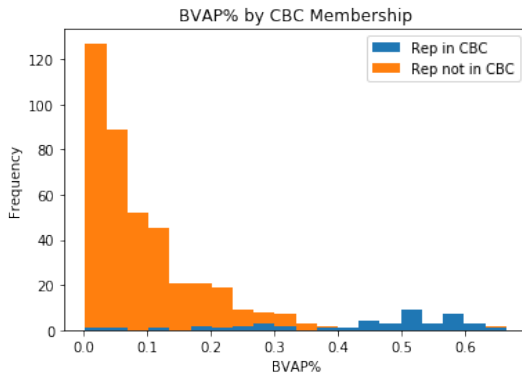
Full State Possibilities



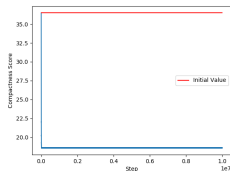
Full State Possibilities



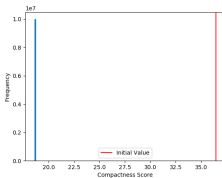
The 37% line



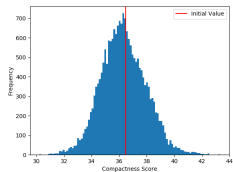
Compactness



(a) Single Edge



(b) Single Edge



(c) Tree Walk



Compactness

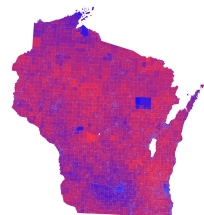
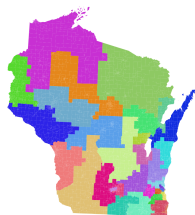
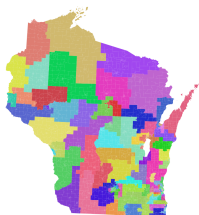


Initial Results

Gerrymandering Detected?



Legal History



Competitiveness

Definition (Competitive)

At least $x\%$ of districts are within $y\%$ of z . Where $z \in \{.5, \text{state mean, state median, plan mean, plan median} \}$

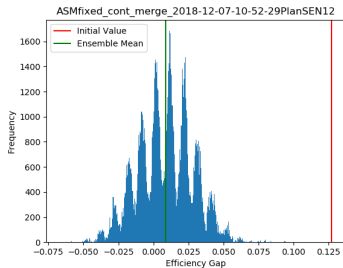


Data Collection

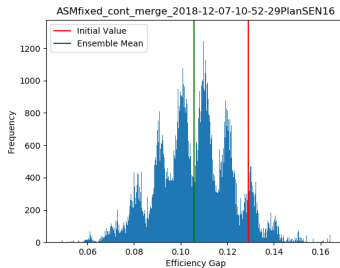
- Choice of units: Wards
- Voting Data: All Statewide
- Initial Plans: Enacted plans
- Demographics: Census



Senate Seats



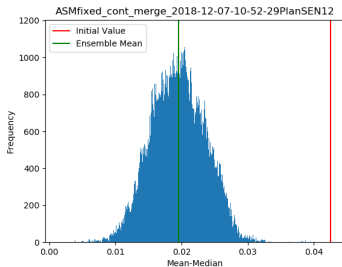
(a) SEN12



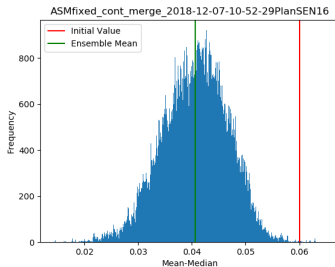
(b) SEN16



Senate Mean-Median



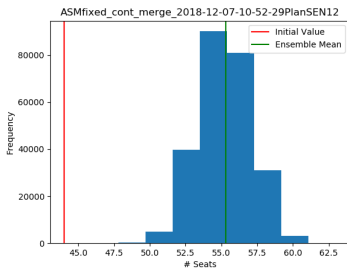
(a) SEN12



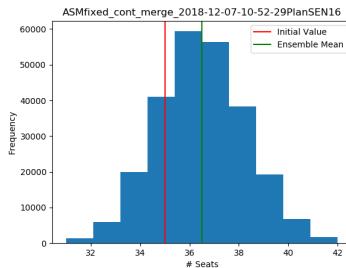
(b) SEN16



Senate Efficiency Gap



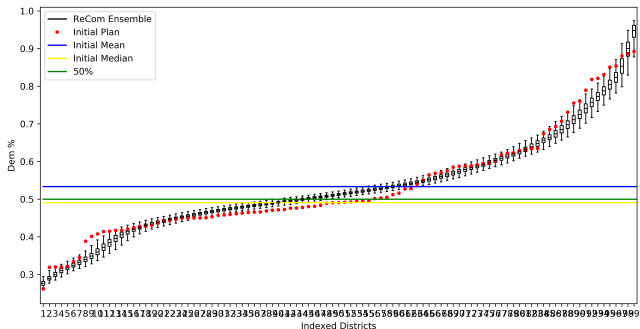
(a) SEN12



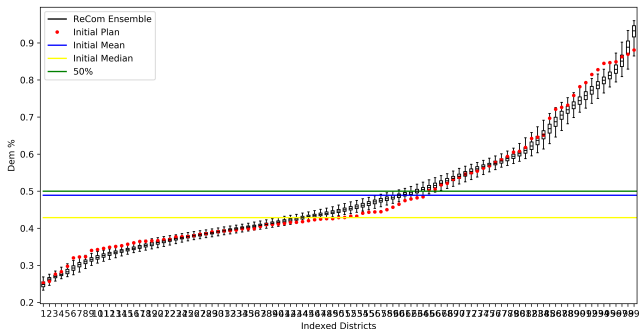
(b) SEN16



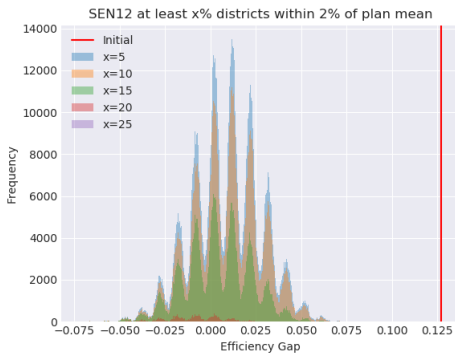
Senate 12 Box Plots



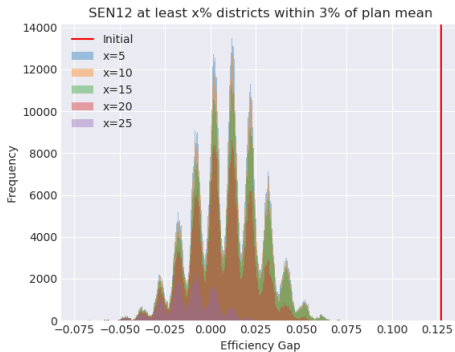
Senate 16 Box Plots



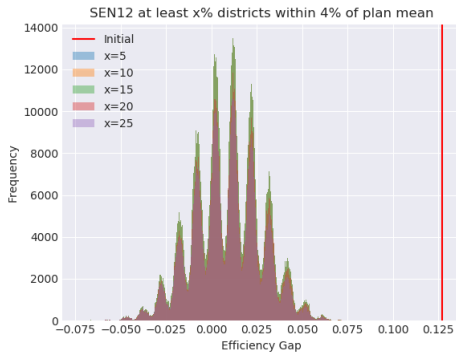
Senate 12 EG Competitiveness



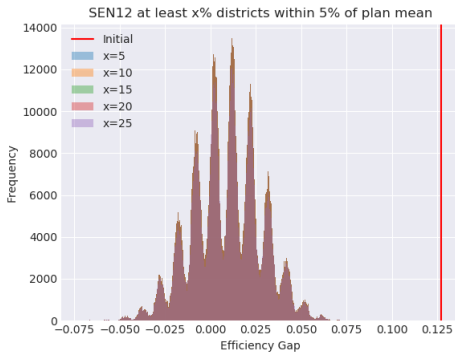
Senate 12 EG Competitiveness



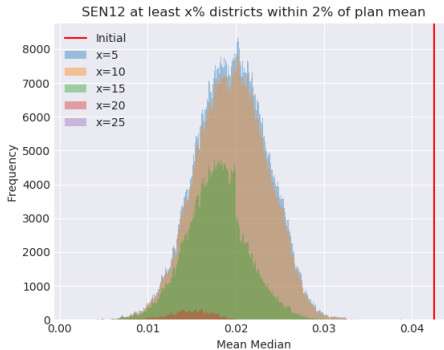
Senate 12 EG Competitiveness



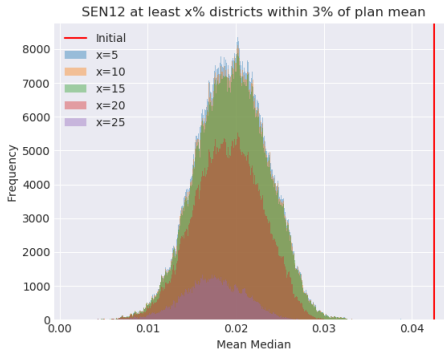
Senate 12 EG Competitiveness



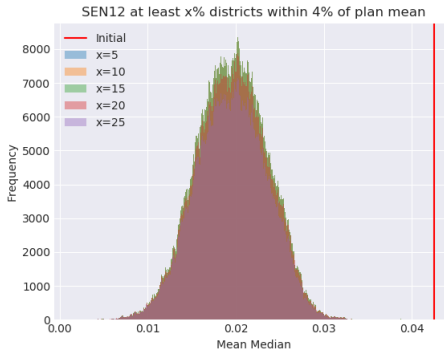
Senate 12 MM Competitiveness



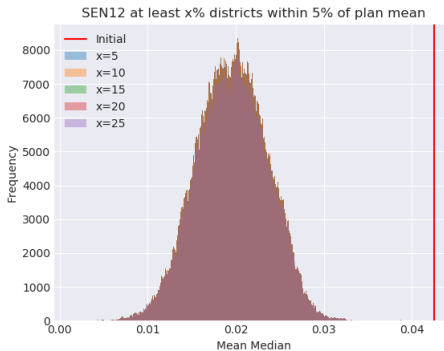
Senate 12 MM Competitiveness



Senate 12 MM Competitiveness



Senate 12 MM Competitiveness



Initial Results

Gerrymandering Detected?



Legal History

- Pressure for algorithmic version of municipality preservation
- Substitute for compactness
- Allows weaker population bounds
- Enforces a multiscale viewpoint on the redistricting problem



Levels of Resolution

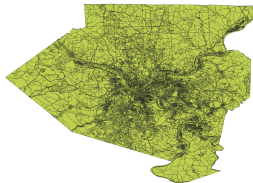
- Blocks
- Precincts
- Wards
- Municipalities
- Counties



Blocks



(a) Pennsylvania



(b) Allegheny

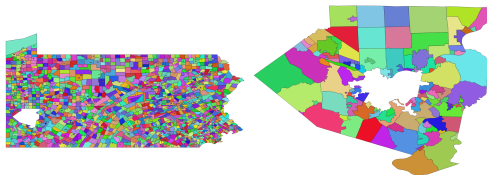


(c) Philadelphia

Counties



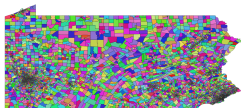
Municipalities



(a) Pennsylvania

(b) Allegheny

Precincts



(a) Pennsylvania

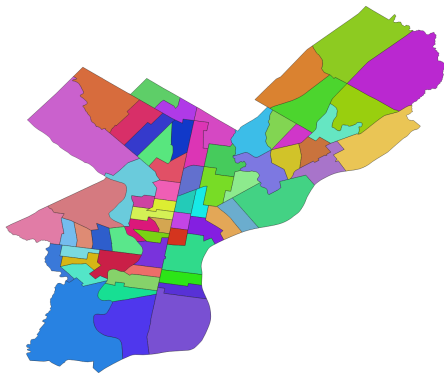


(b) Pittsburgh

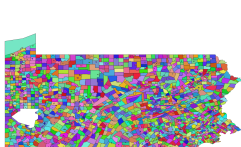


(c) Philadelphia

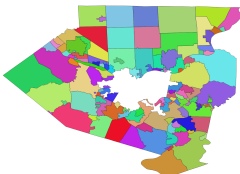
Wards



Putting Them Together



(a) Pennsylvania



(b) Allegheny



(c) Pittsburgh

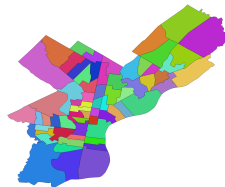
Putting Them Together



(a) Blocks

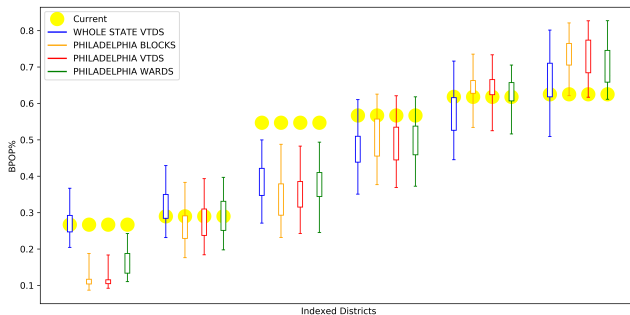


(b) Precincts

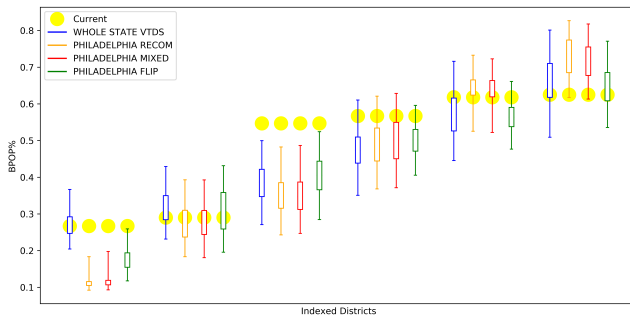


(c) Wards

Comparison of BPOP Districts



Comparison of BPOP Districts



Initial Results

Better Representation Possible?



MORAL:

Computational Redistricting is
NOT a solved problem!



The End

Thanks!

