



MATHEMATICAL FRONTIERS

*The National
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MEDICINE

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**Board on
Mathematical Sciences & Analytics**

MATHEMATICAL FRONTIERS

2018 Monthly Webinar Series, 2-3pm ET

February 13: *Recording posted*
Mathematics of the Electric Grid

March 13: *Recording posted*
Probability for People and Places

April 10: *Recording posted*
Social and Biological Networks

May 8:
Mathematics of Redistricting

June 12:
Number Theory: The Riemann Hypothesis

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August 14:
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September 11:
Mathematical Analysis

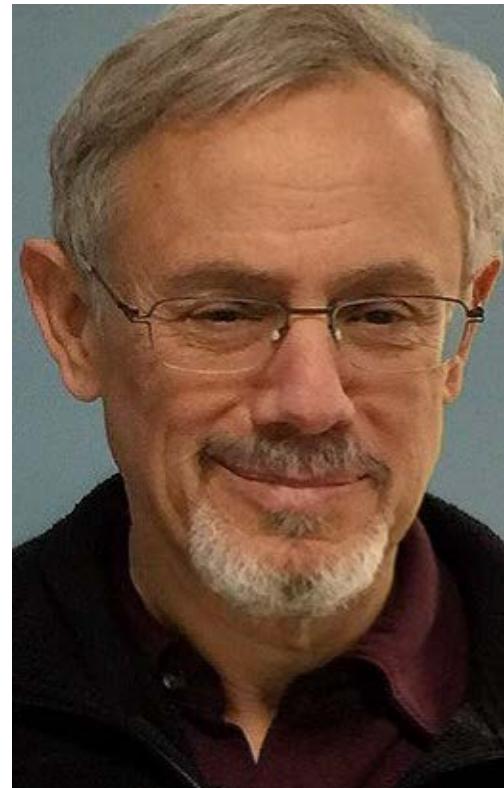
October 9: *Combinatorics*

November 13:
Why Machine Learning Works

December 11:
Mathematics of Epidemics

MATHEMATICAL FRONTIERS

Mathematics of Redistricting



Karen Saxe,
American Mathematical Society

Jonathan Mattingly,
Duke University

Mark Green,
UCLA (moderator)

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MATHEMATICAL FRONTIERS

Mathematics of Redistricting



Director

*Office of Government Relations
American Mathematical Society*

*DeWitt Wallace Professor of Mathematics
Macalester College*

Karen Saxe,
American Mathematical Society

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The US Congress



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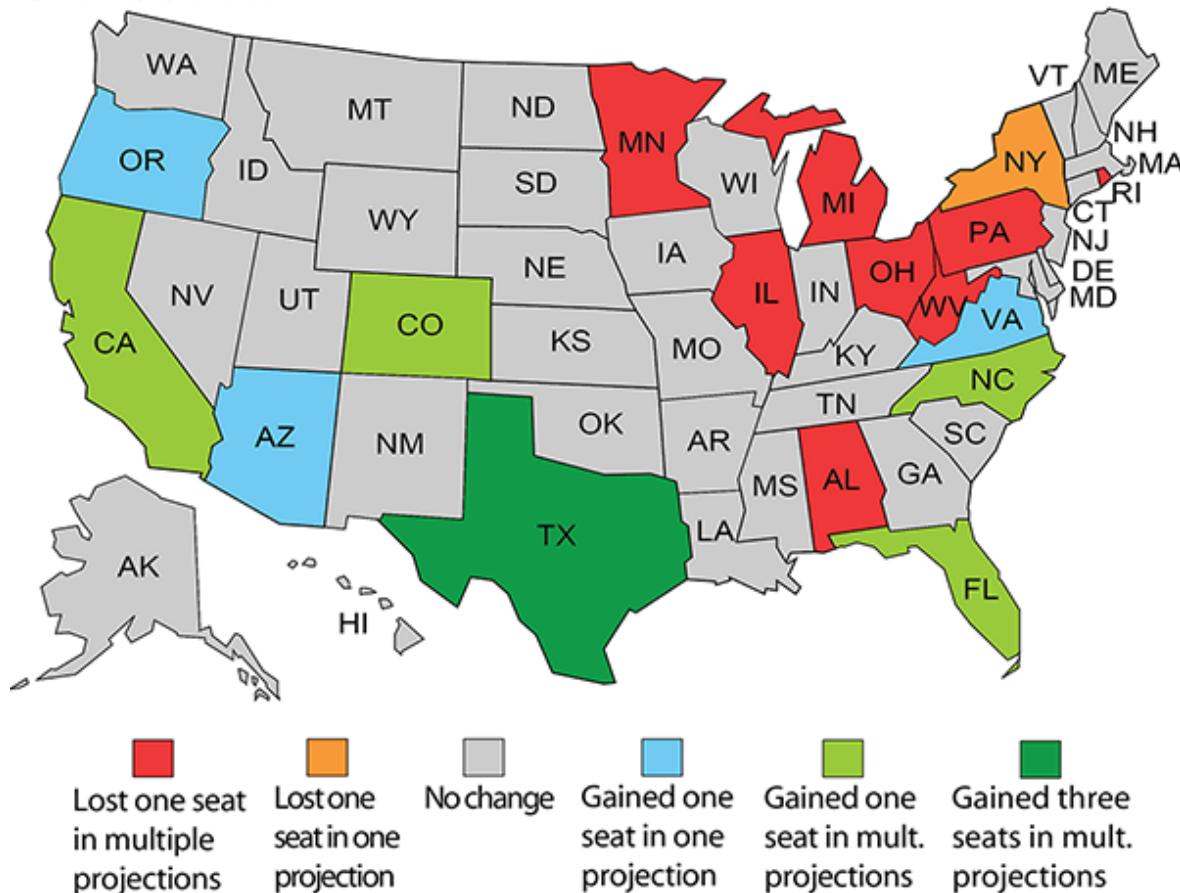
Census → Reapportionment → Redistricting

1. Perform the census to determine the population of the states.
2. Distribute the 435 House of Representatives seats to the states through reapportionment.
3. Redistrict each state, to partition into districts, one district per seat.

These 3 steps occur at least every decade, since 1790

2020 Apportionment Predictions

©2015 U.Va. Center for Politics



Redistricting Principles

1. Number – must have equal population
2. Shape – must be contiguous and **compact**
3. Race – must comply with Voting Rights Act of 1965
4. Political – attempt to keep cities, counties together

What else could be taken into consideration?

- *Communities of interest*
- *Incumbent protection*
- ***Partisan make-up of proposed districts***

Who does the redistricting?

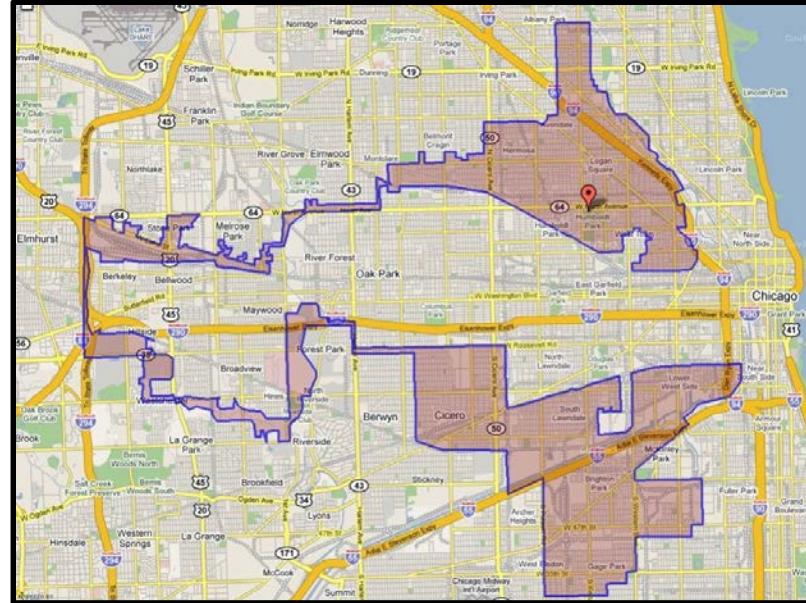
- 42 states give legislature primary control (includes 5 single district states)
 - 2 of these 42 (OH and RI) appoint advisory commissions to help the legislature
 - 2 of these 42 (CT and IN) have backup procedures if legislative process fails
- The other 8 states use commissions (includes 2 single district states)
 - HI and NJ use politician commissions
 - AL, AZ, CA, ID, MT and WA use independent commissions

Gerrymandering



“the intentional manipulation of territory toward some desired electoral outcome”

Example: IL 4



Representative: Luis Gutierrez (D)
Has won 13 elections; always with at least 75% of the vote & often unopposed

Measuring compactness using Polsby-Popper

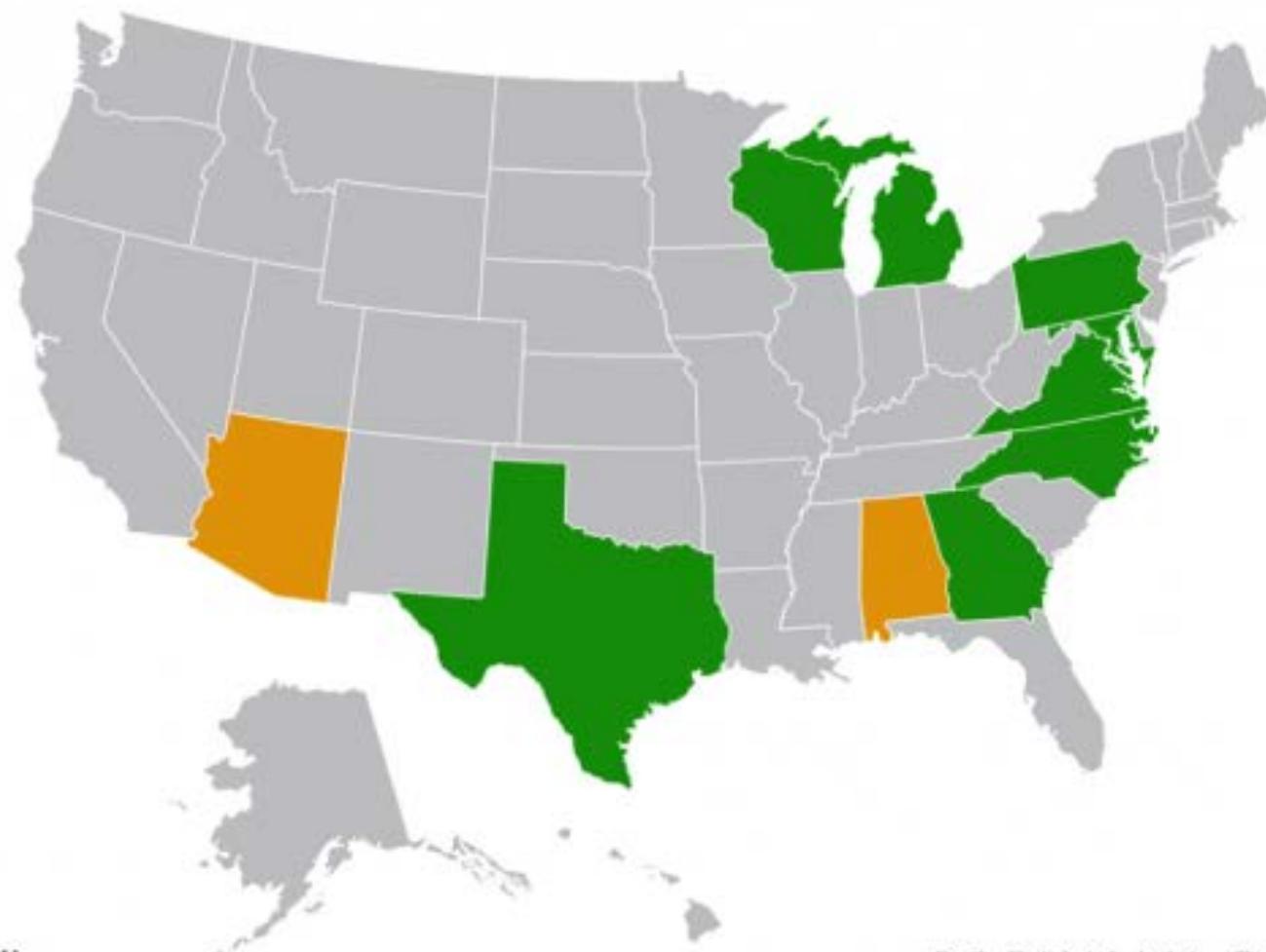
$$\frac{\text{area of district}}{\text{area of circle with same perimeter}} = \frac{4\pi A}{P^2}$$

One of many measures based on the **Isoperimetric Theorem**

Value always between 0 (bad) and 1 (good)

$A = 39.43 \text{ square miles}$ & $P = 116 \text{ miles}$
Rearrange perimeter into circle; circle has area $\sim 1071 \text{ square miles}$
Polsby-Popper = 0.037

Where Redistricting Cases Are Still Pending or Recently Resolved



 Pending
 Resolved

February 2018

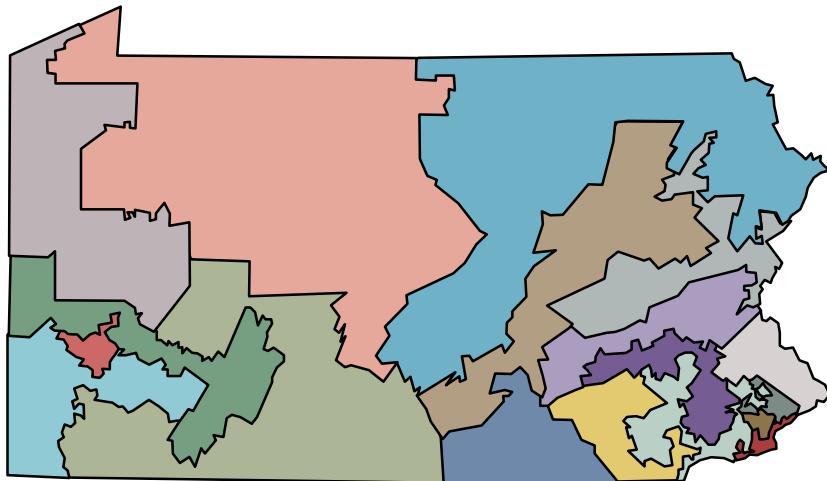
BRENNAN CENTER
FOR JUSTICE
TWENTY YEARS

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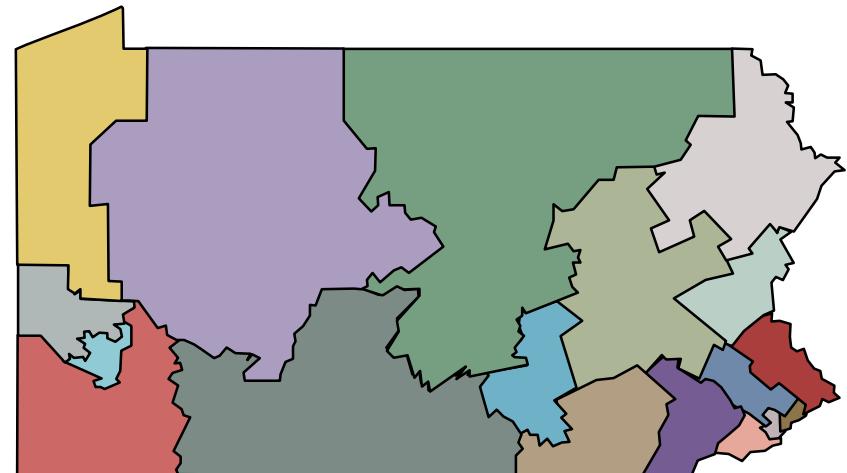
Changes in Pennsylvania congressional districts to address charge of *partisan* gerrymandering



Congressional districts, 2013-2017



Congressional districts, mandated by PA Supreme Court in 2018



MATHEMATICAL FRONTIERS

Mathematics of Redistricting



*Professor of Mathematics
Chair of the Department of Mathematics
Professor of Statistical Science
Duke University*

Quantifying Gerrymandering

*Revealing Geopolitical Structure
through Sampling*

Jonathan Mattingly,
Duke University

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Impact of Duke Team's work

Common Cause v. Rucho (N.C. Congressional):

- 3 judge conditional panel. Direct appeal to SCOTUS. Nov 2017
- Provided expert testimony and report in lawsuit
- Heavily cited in court judgment 2014 - present
(arXiv:1410.8796 - arXiv:1801.03783)

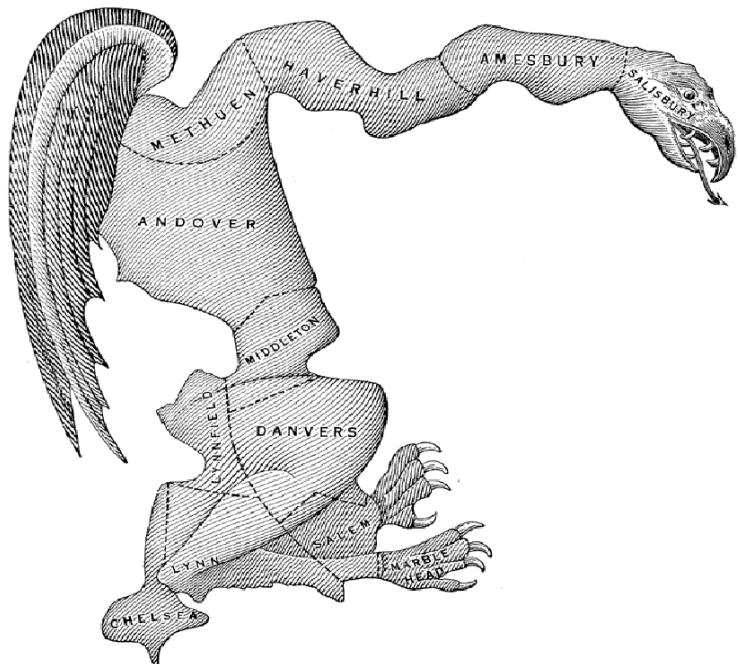
Gill v. Whitford (WI State Assembly) :

- Oral argument held in Supreme Court (SCOTUS) October 3, 2017
- Provide report supporting Amicus Brief by Eric S. Lander

North Carolina v. Covington (N.C. State Assembly):

- 3 judge panel rule *racial gerrymander*. Affirmed by SCOTUS in June
- Provide expert testimony on new maps produced at courts order
sites.duke.edu/quantifyinggerrymandering

Definition of Gerrymandering

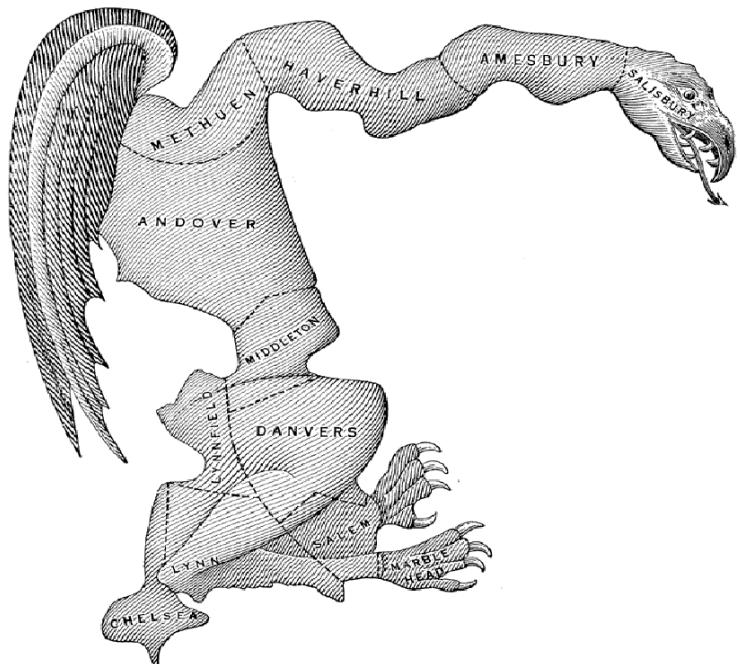


Gerrymander

- **Manipulate** district boundaries to favor one party (partisan) or class (racial)
- **Change** the outcome of an election
"gerrymander the results"

Implies the existence of an expected election result

Definition of Gerrymandering



Gerrymander

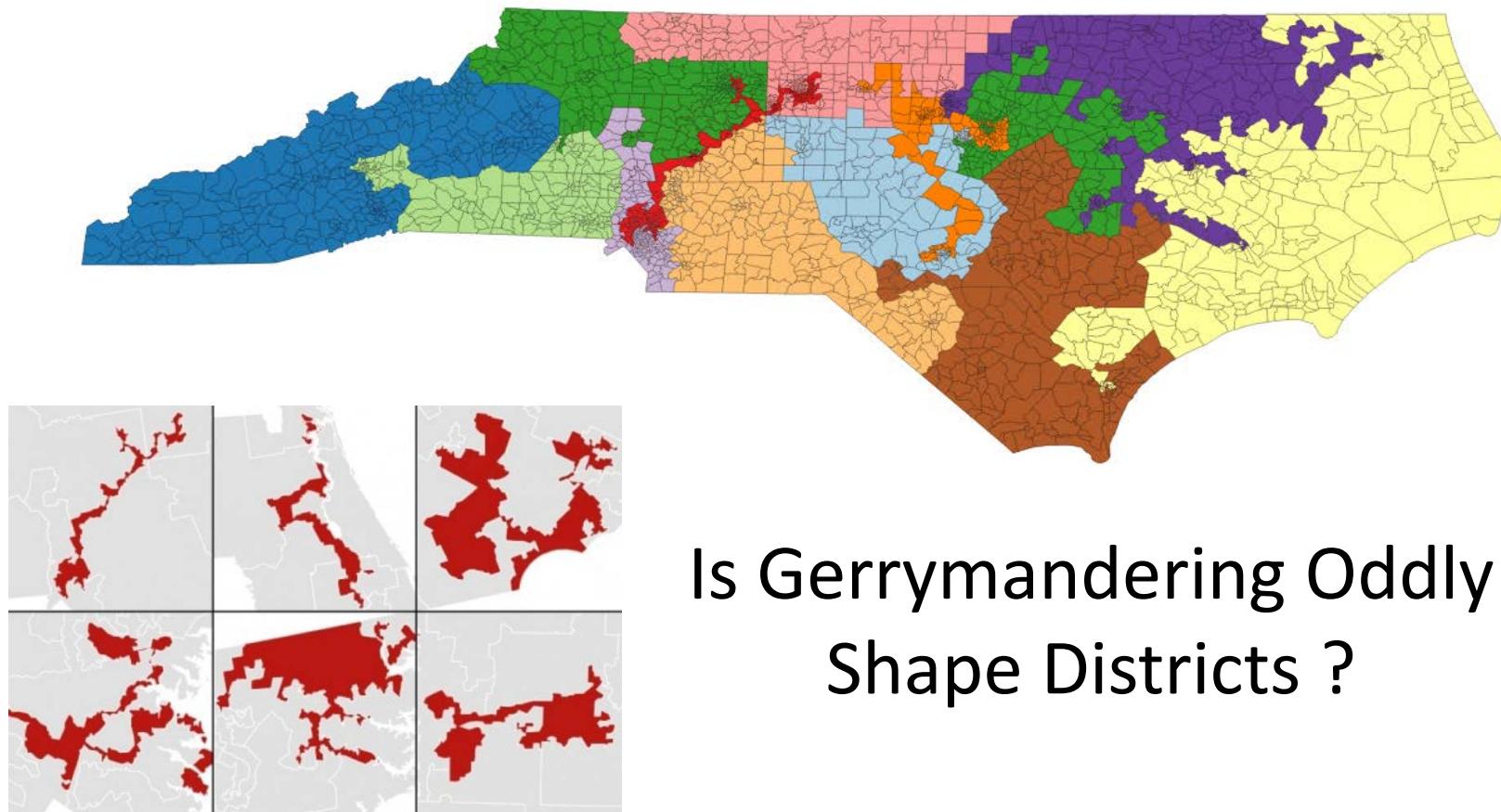
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racial vs *partisan* gerrymander

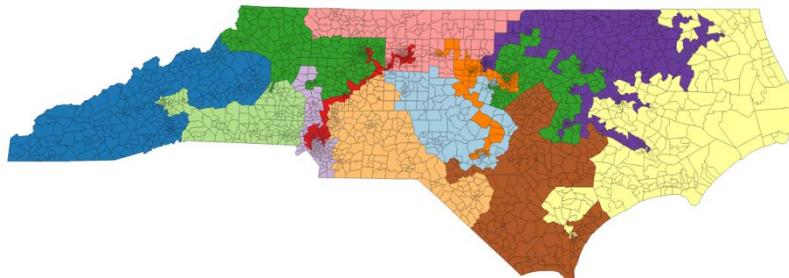
Implies the existence of an expected election result

NC 2012

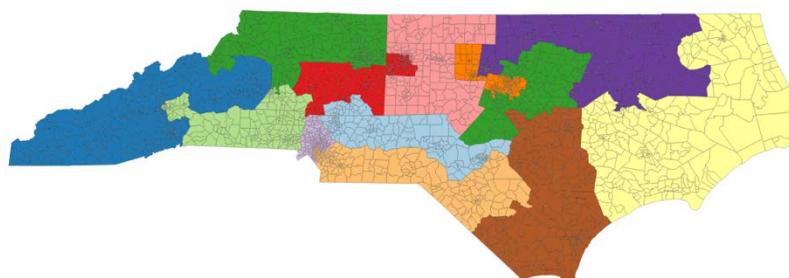
US Congressional Districts



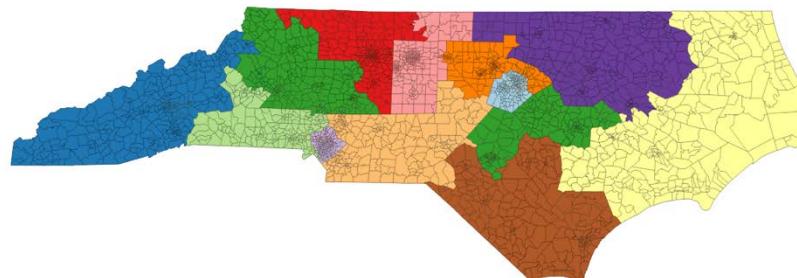
Which Doesn't Belong ?



Same



Same



Different

Gerrymandering as “Startling” Election Results

NC : US House 2012

	Vote	Seats
Democratic	50.65%	4 (31%)
Republican	48.80%	9 (69%)

MD : US House 2012

	Vote	Seats
Democratic	63%	7 (87.5%)
Republican	33%	1 (12.5%)

WI : Gen Assembly 2014

	Vote	Seats
Democratic	51.28%	36 (36%)
Republican	48.72%	63 (64%)

USA : US House 2012

	Vote	Seats
Democratic	50.65%	4 (31%)
Republican	48.80%	9 (69%)

Deviation from some expectation of symmetry

- The most Democratic district had 79.63% Democratic votes
- The most Republican district had 63.11% Republican votes.

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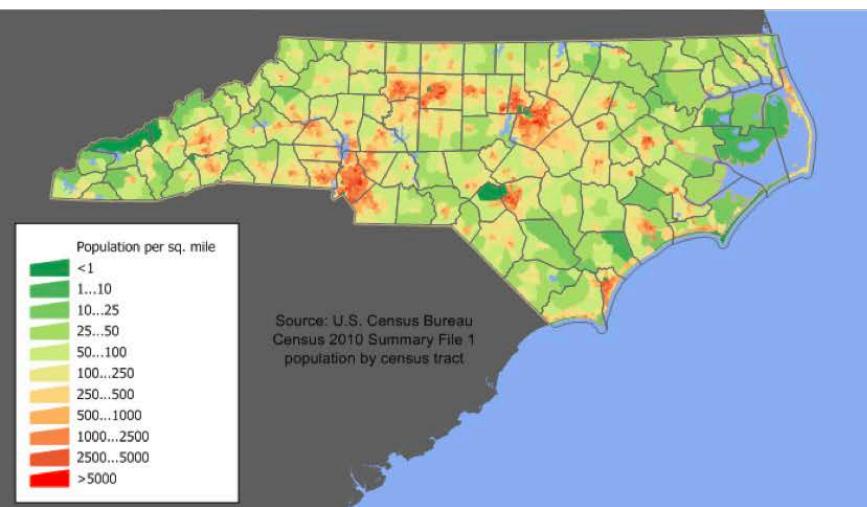
What is fair or correct ?

U.S. Not a Proportional Representation System

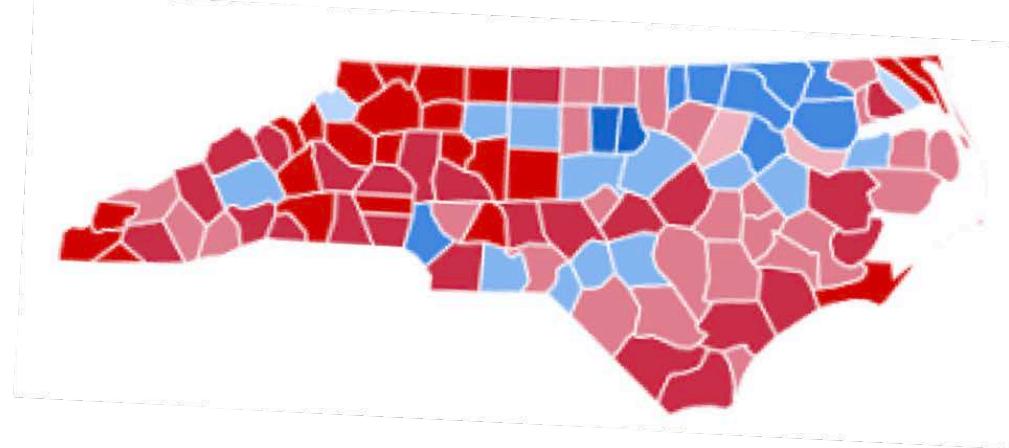
Geographically Localize Representation

Geographically Diverse

Population Density



Presidential Election 2016



States are inherently inhomogeneous and not symmetric

How to reveal a state's natural geopolitical structure?

What if we drew the districts randomly?

with no regard for party registration or most demographics

Look for the “likely” behavior of an ensemble of districting plans

create a null-hypothesis without partisan bias

A number of Groups using algorithmic generated maps to benchmark

- Jowei Chen (Michigan), Jonathan Rodden (Stanford)
- Wendy Cho (UIUC)
- Kosuke Imai, Benjamin Fife (Princeton)
- Alan Frieze, Wesley Pegden, Maria Chikina (CMU, Pitt)

All generating alternative maps.
Some sampling a defined distribution.
Some using actual surrogate districts.

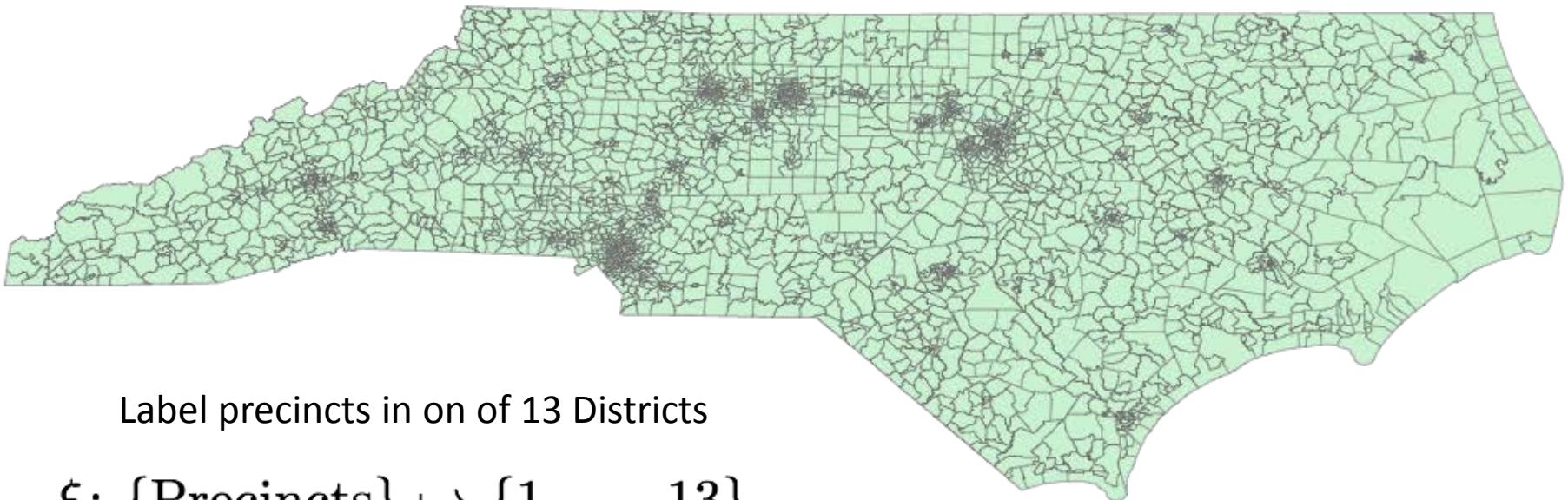
Focus on our group at Duke & N.C.
based on principled, explicit distribution on redistricting plans

N.C. HOUSE BILL 92

REDISTRICTING STANDARDS

- Districts within 0.1% of equal population
(we get close)
- Districts shall be reasonably compact
- Contiguous territory, attempting not to split cities or counties
- Comply with the Voting Rights Act of 1965
- Ignore: Incumbency, party affiliation, demographics

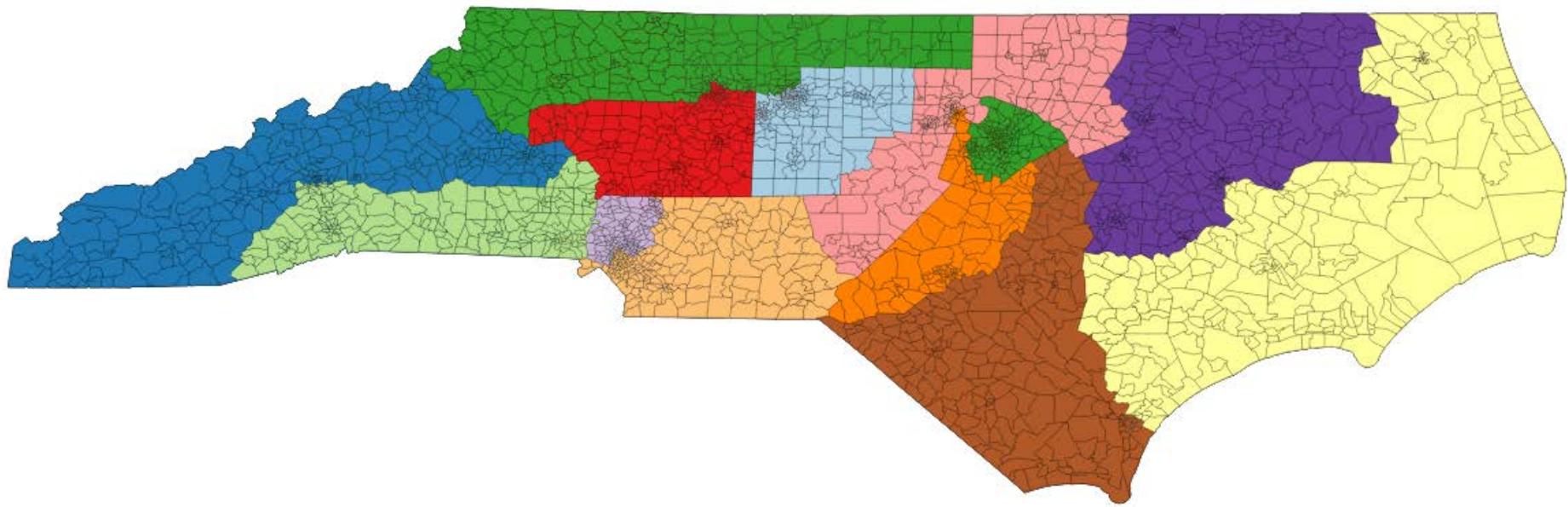
around 3,000 in Precincts N.C.



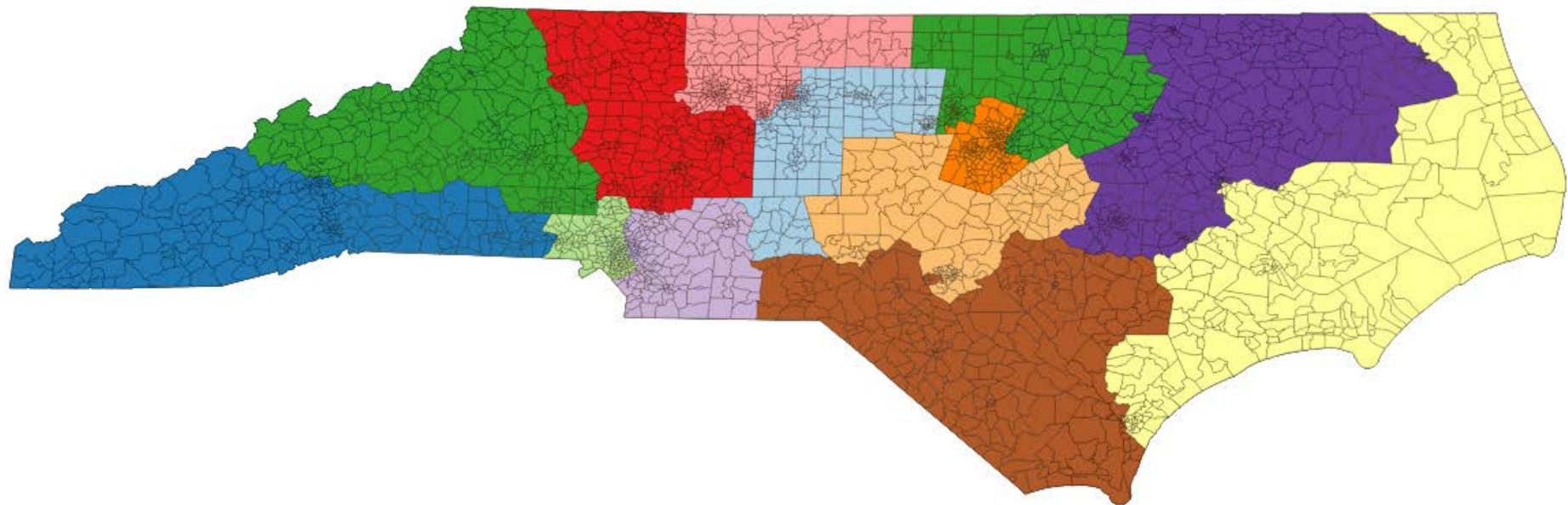
$$\xi: \{\text{Precincts}\} \mapsto \{1, \dots, 13\}$$

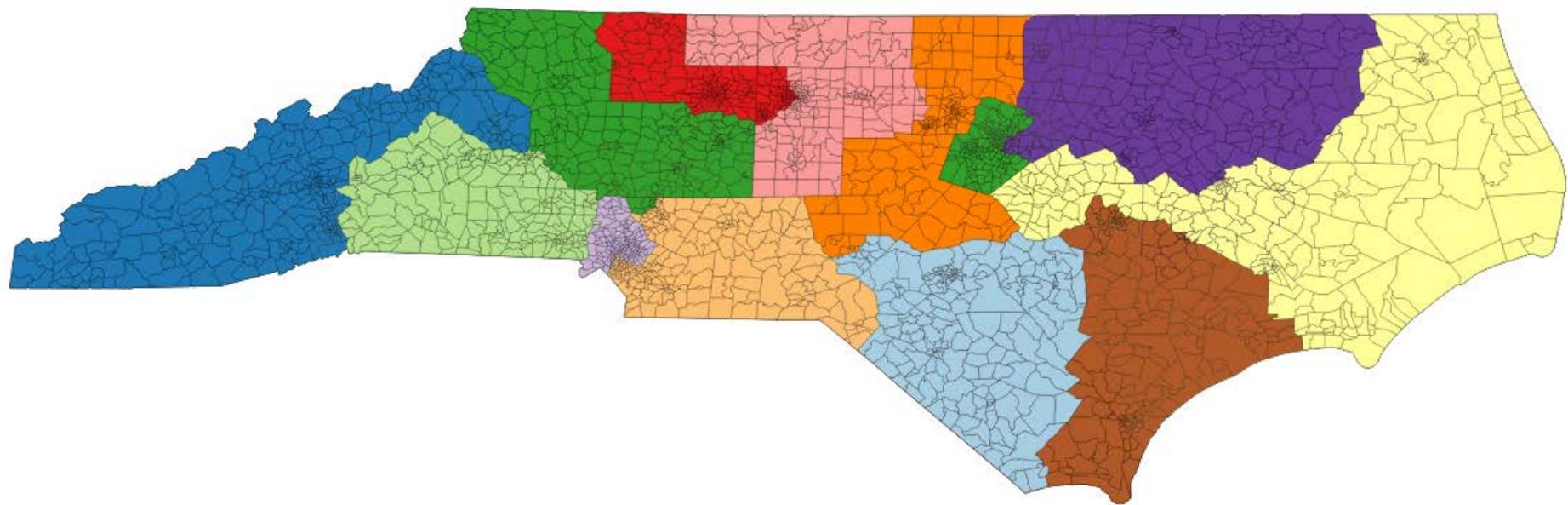
Place Distribution on admissible redistrictings: $P(\xi) = \frac{1}{Z} e^{-\beta J(\xi)}$

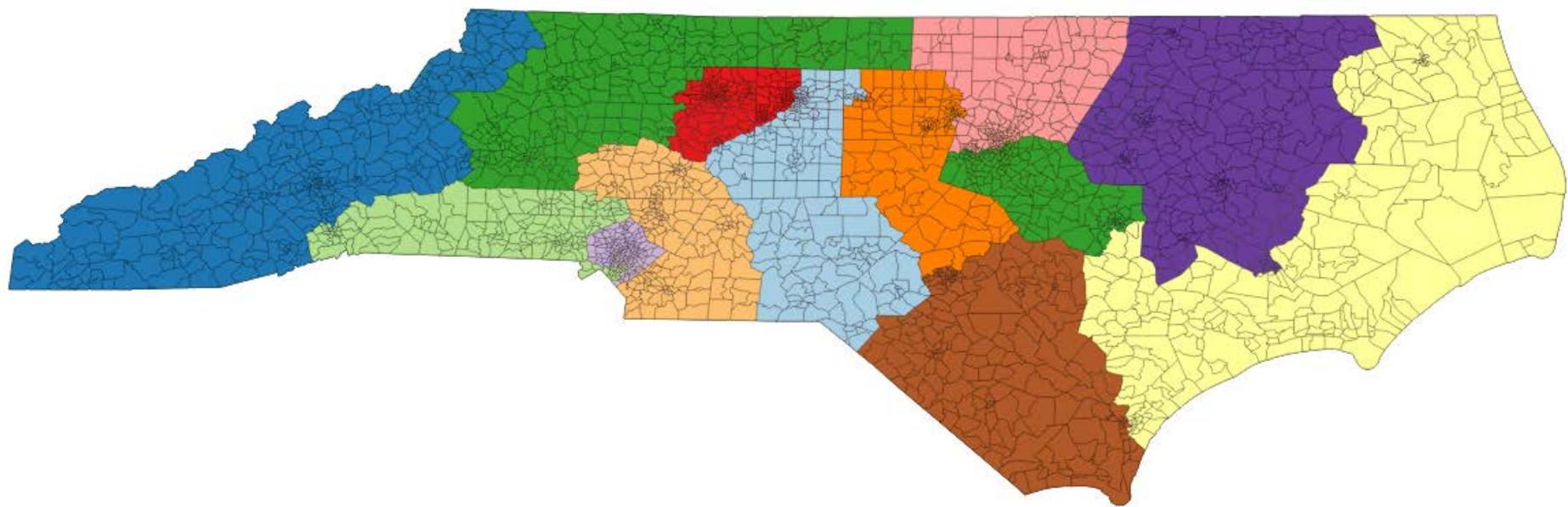
$$J(\xi) = w_p J_{pop}(\xi) + w_I J_{compact}(\xi) + w_c J_{county}(\xi) + w_m J_{mino}(\xi)$$

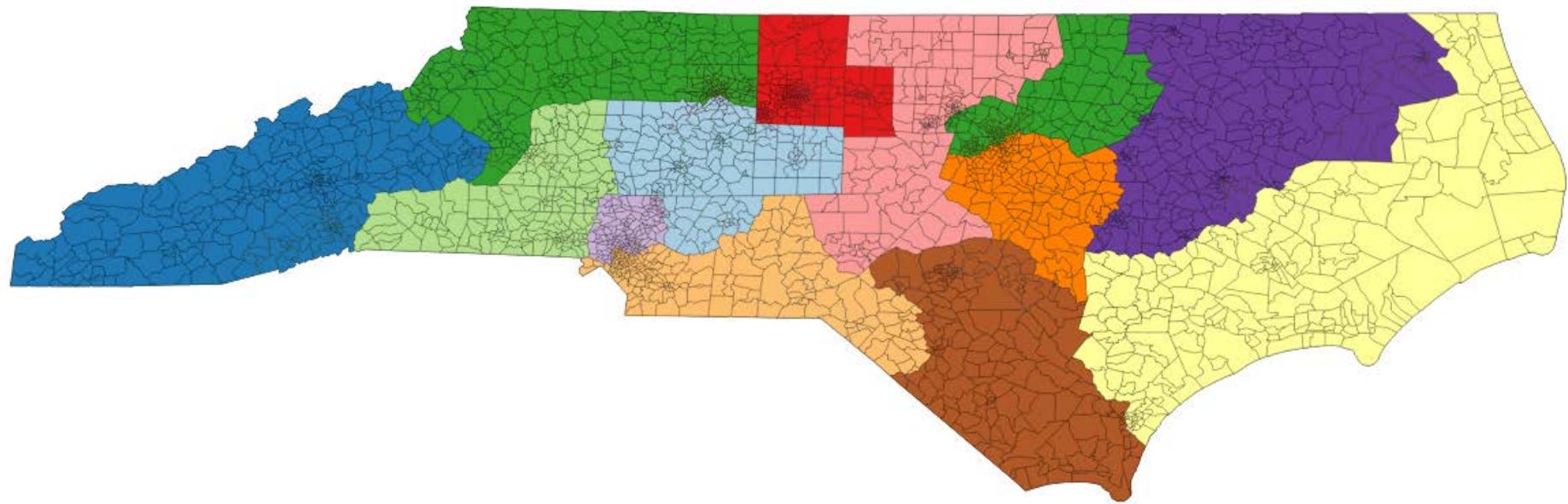


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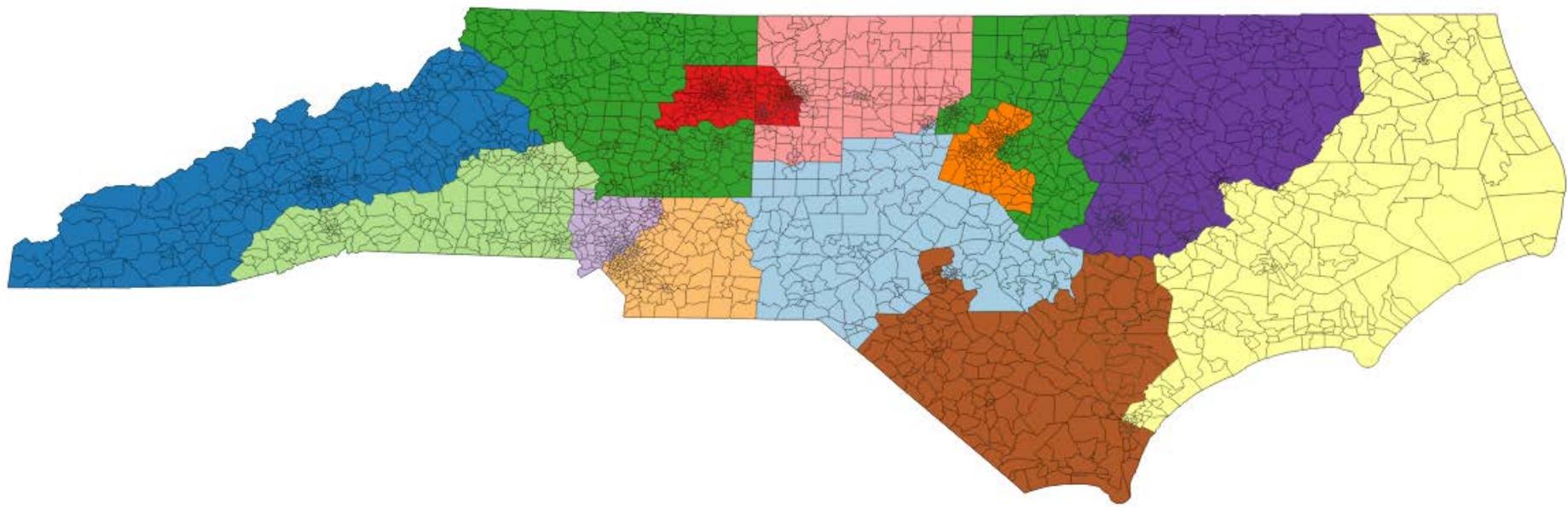




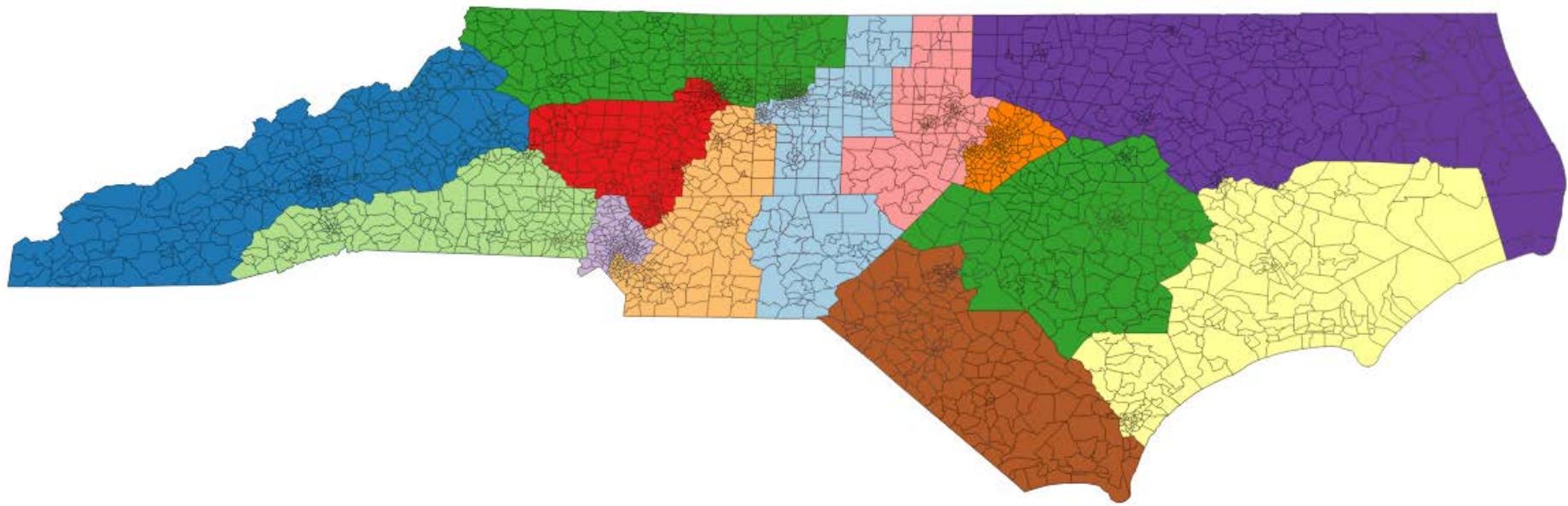




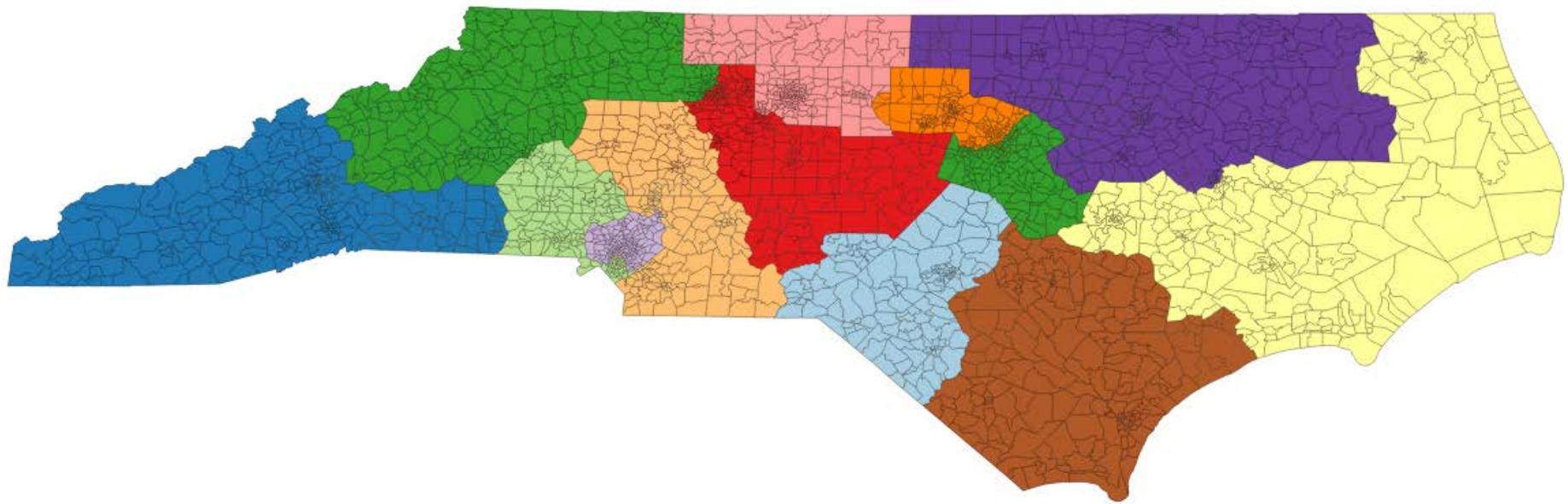
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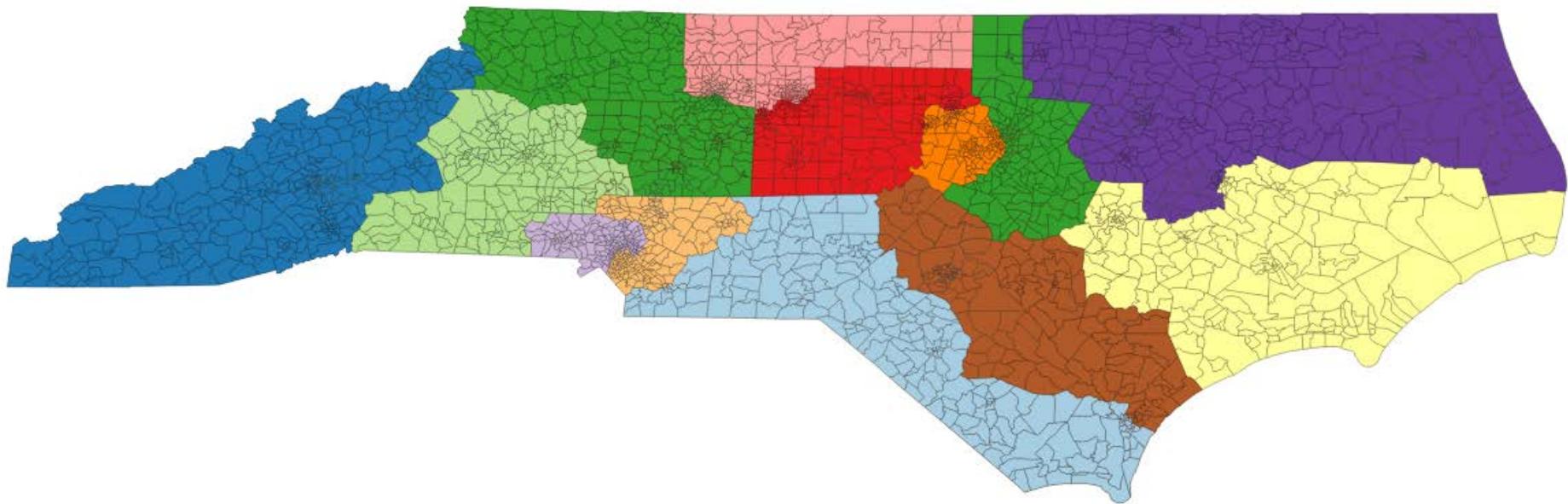
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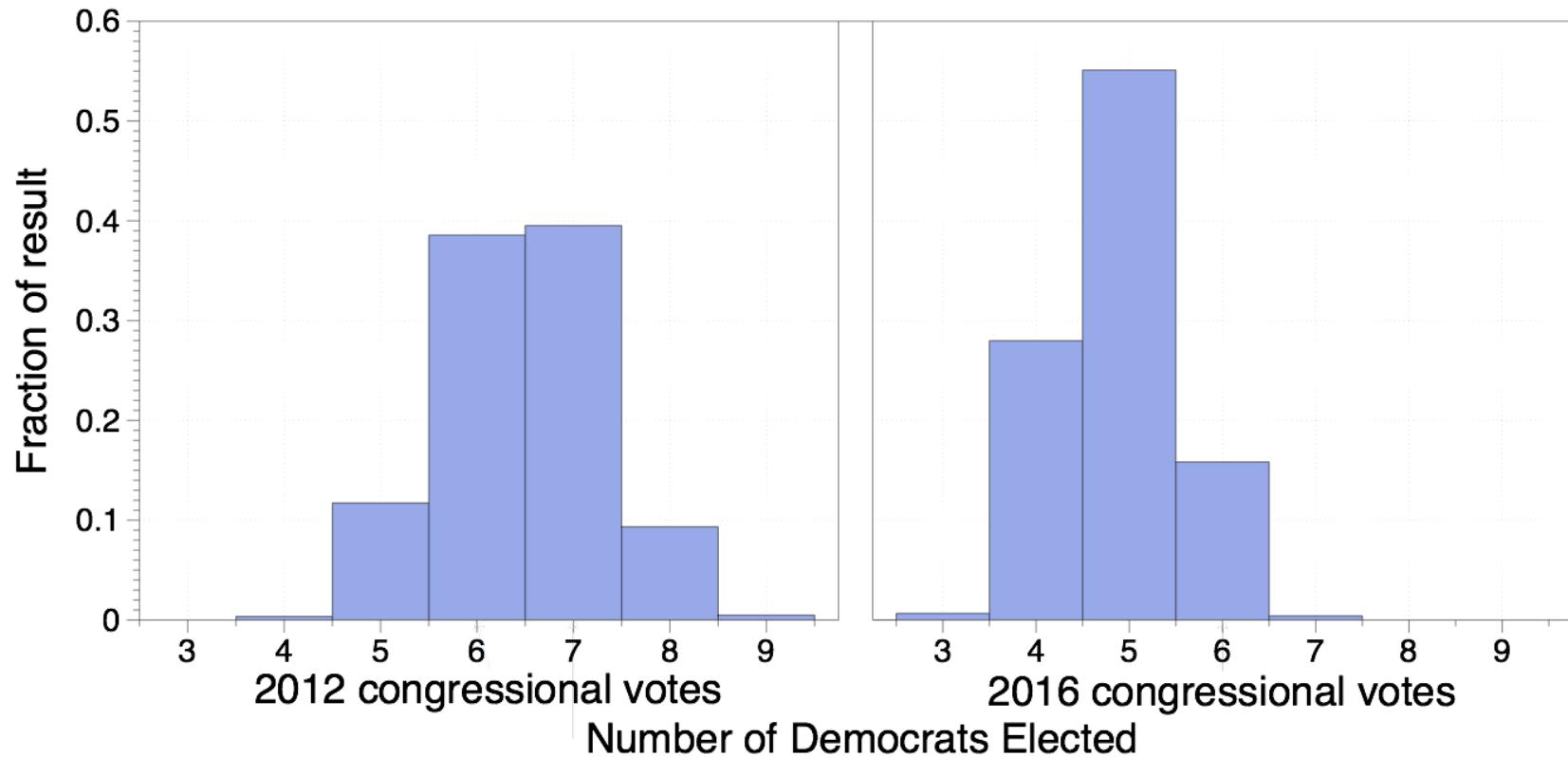


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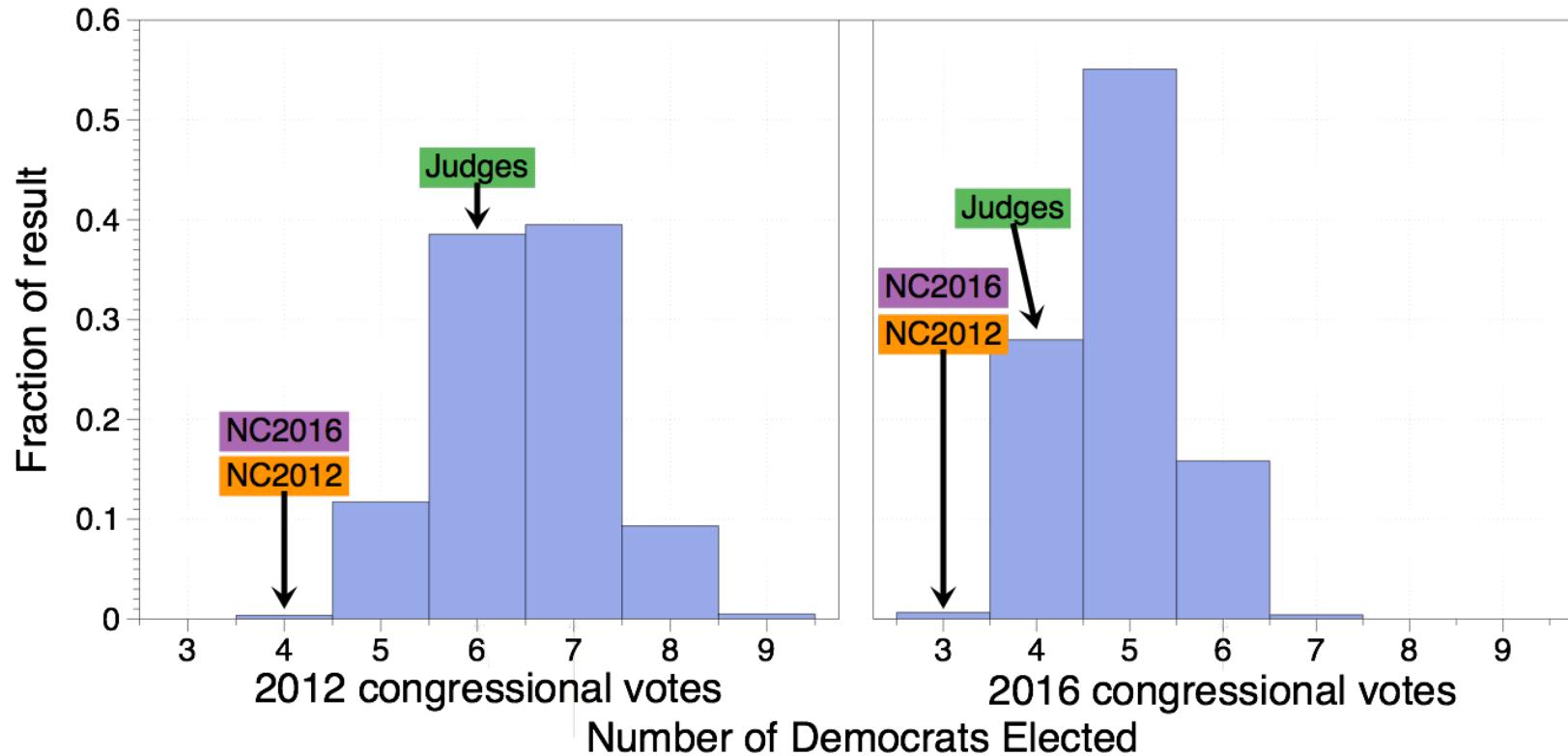


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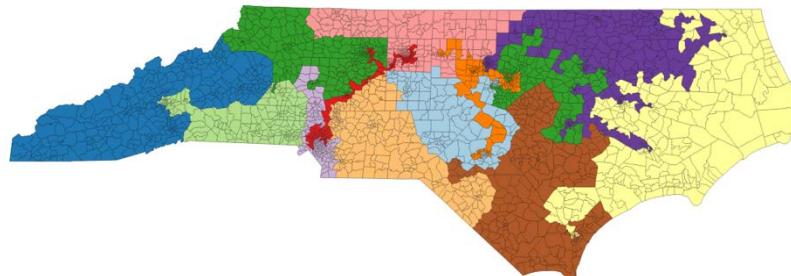
Ensemble of ~24,000 NC redistricting plans



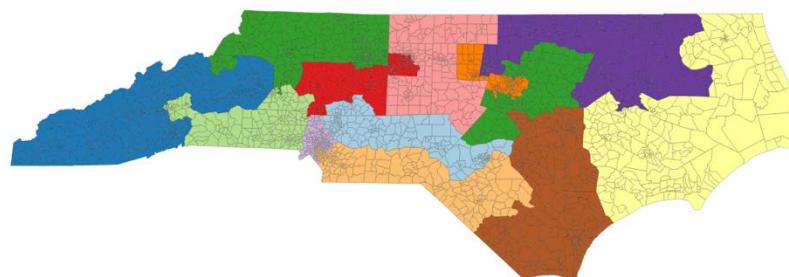
Situate maps in ensemble of 24,000 redistricting plans



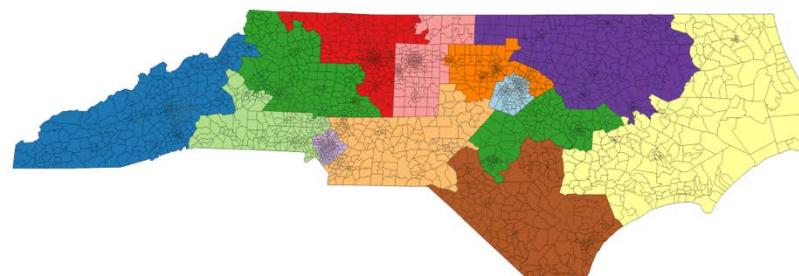
Gerrymandering can occur in the absence of oddly shaped districts



Atypical

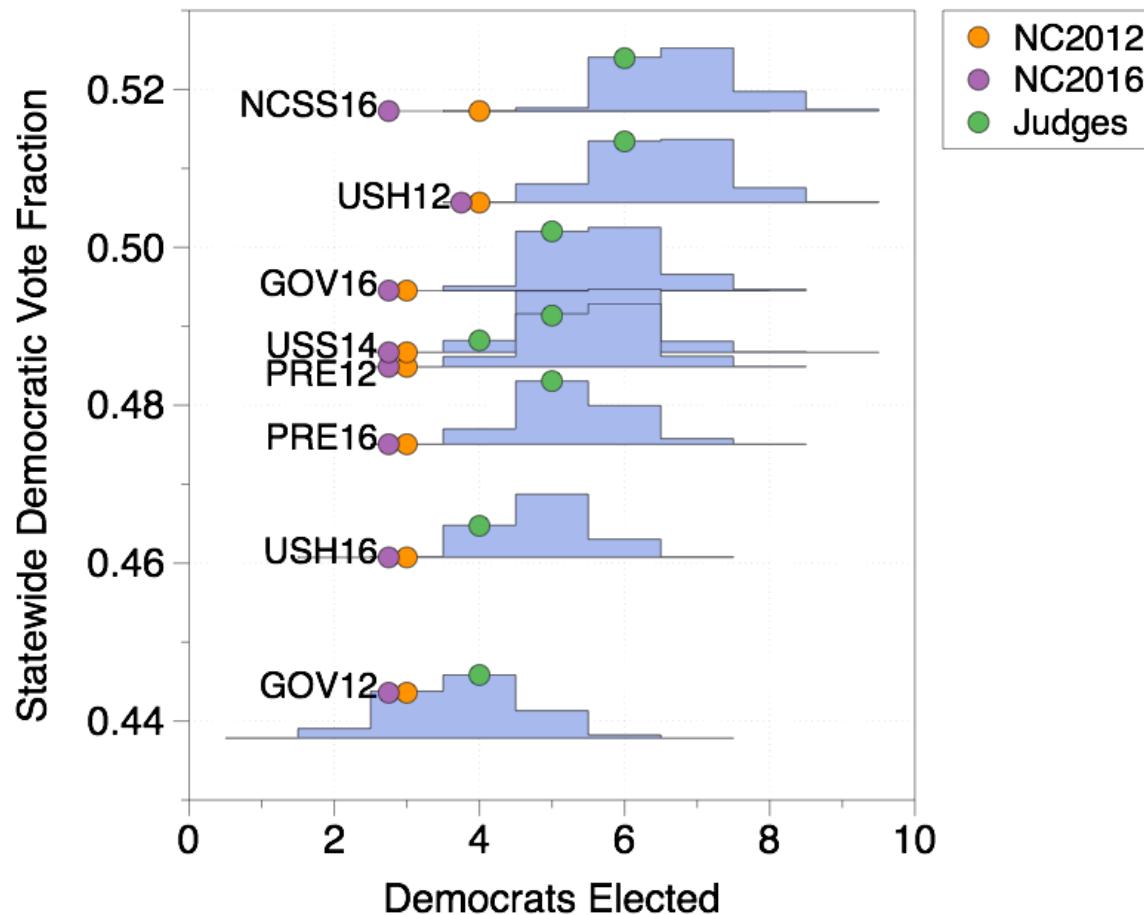


Atypical

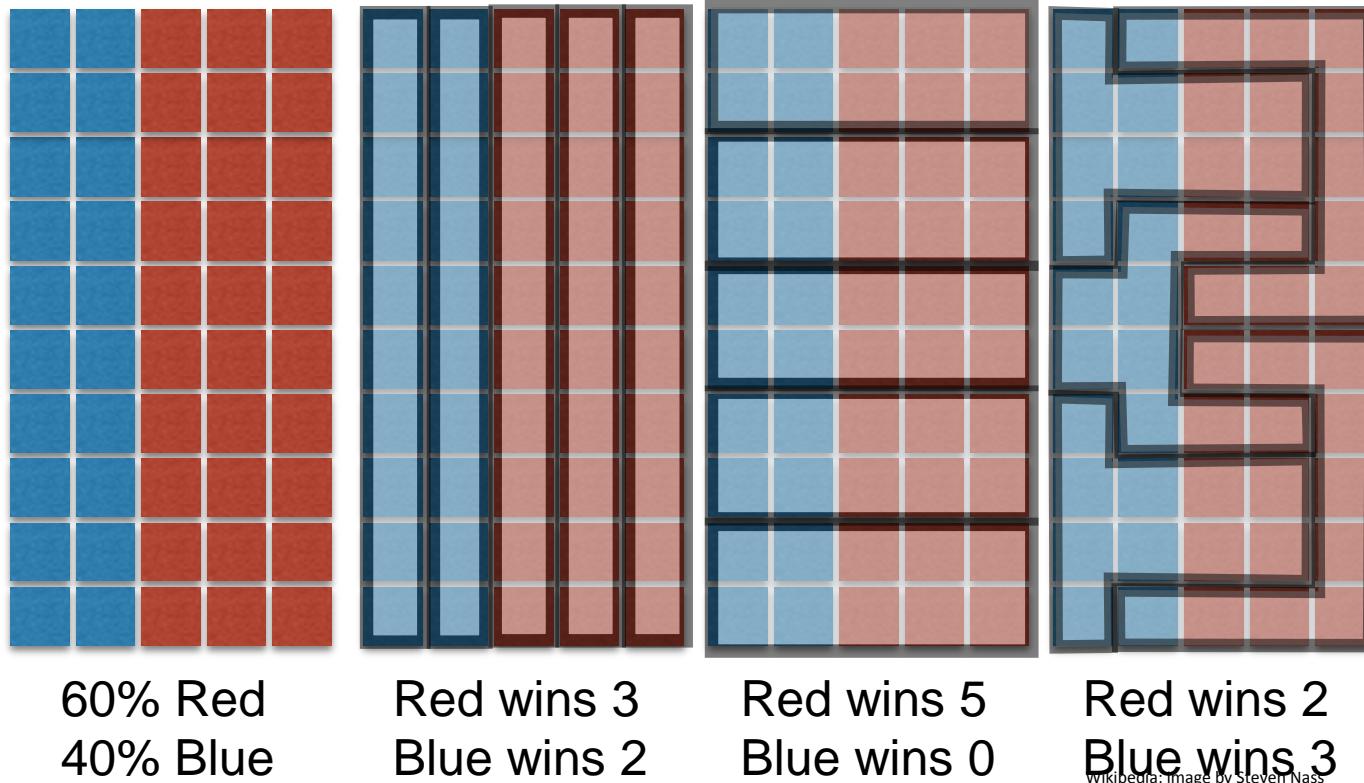


Typical

Unresponsiveness Across many elections



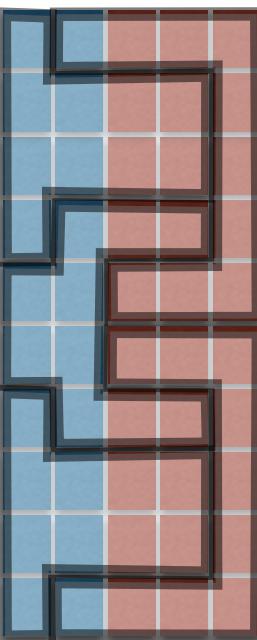
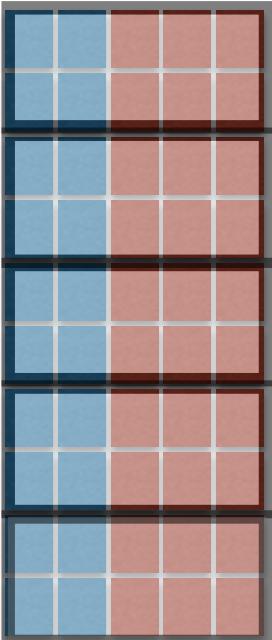
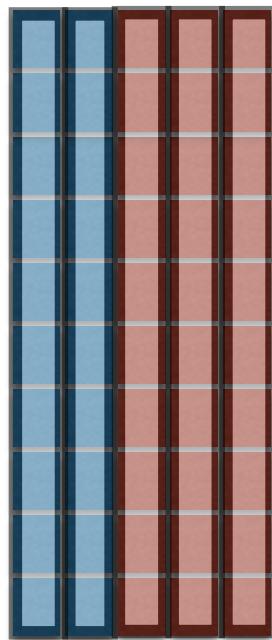
Explore the structure through an example



Wikipedia; image by Steven Nass

Wikipedia; image by Steven Nass

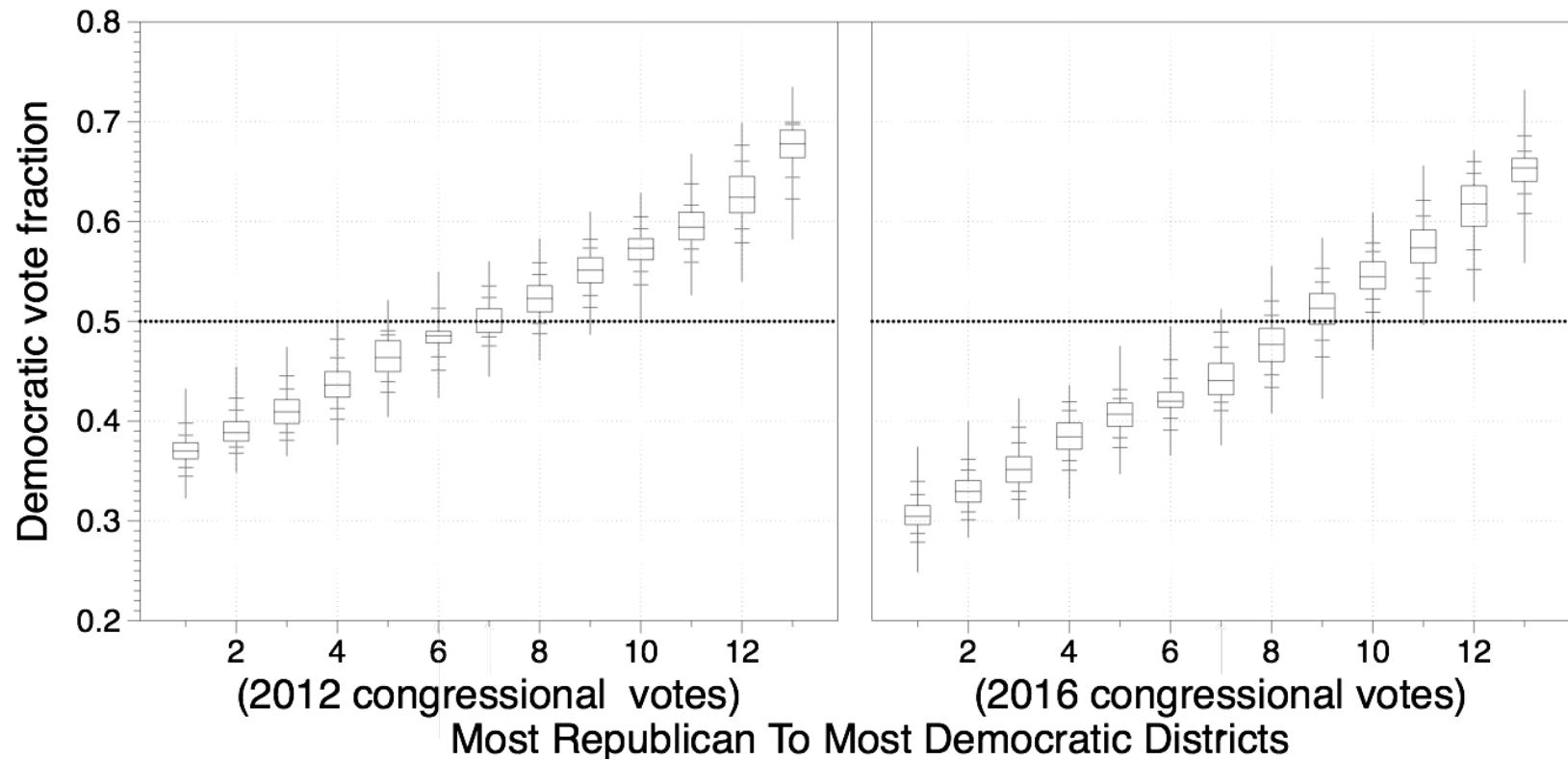
Packing and Cracking



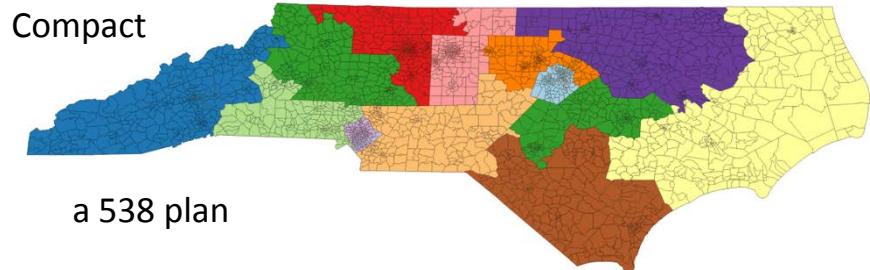
Percentage of Democrats from
lowest to highest

Most Red				Most Blue
10%	10%	60%	60%	60%
0%	0%	0%	100%	100%
40%	40%	40%	40%	40%

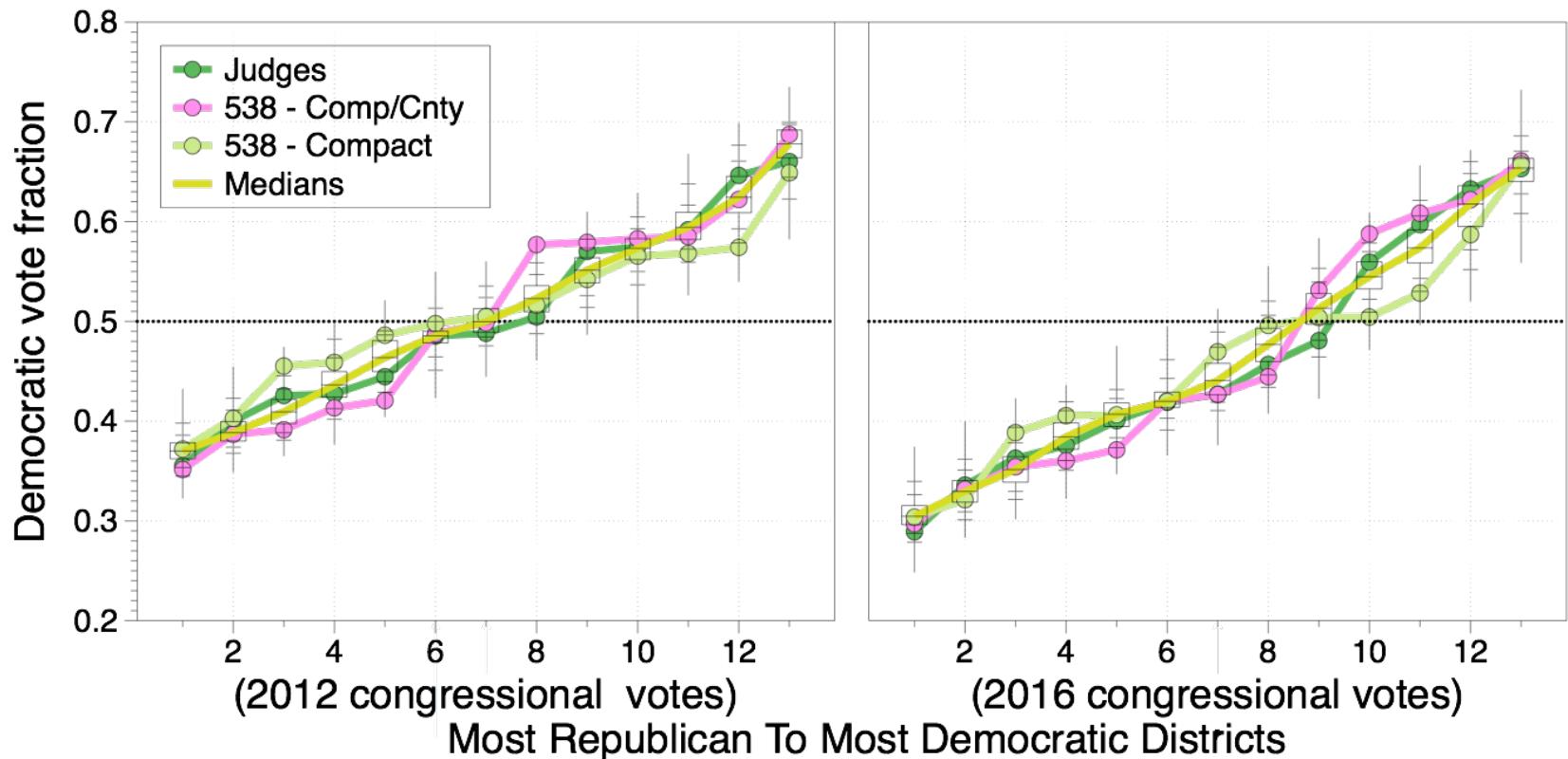
NC Congressional Delegation



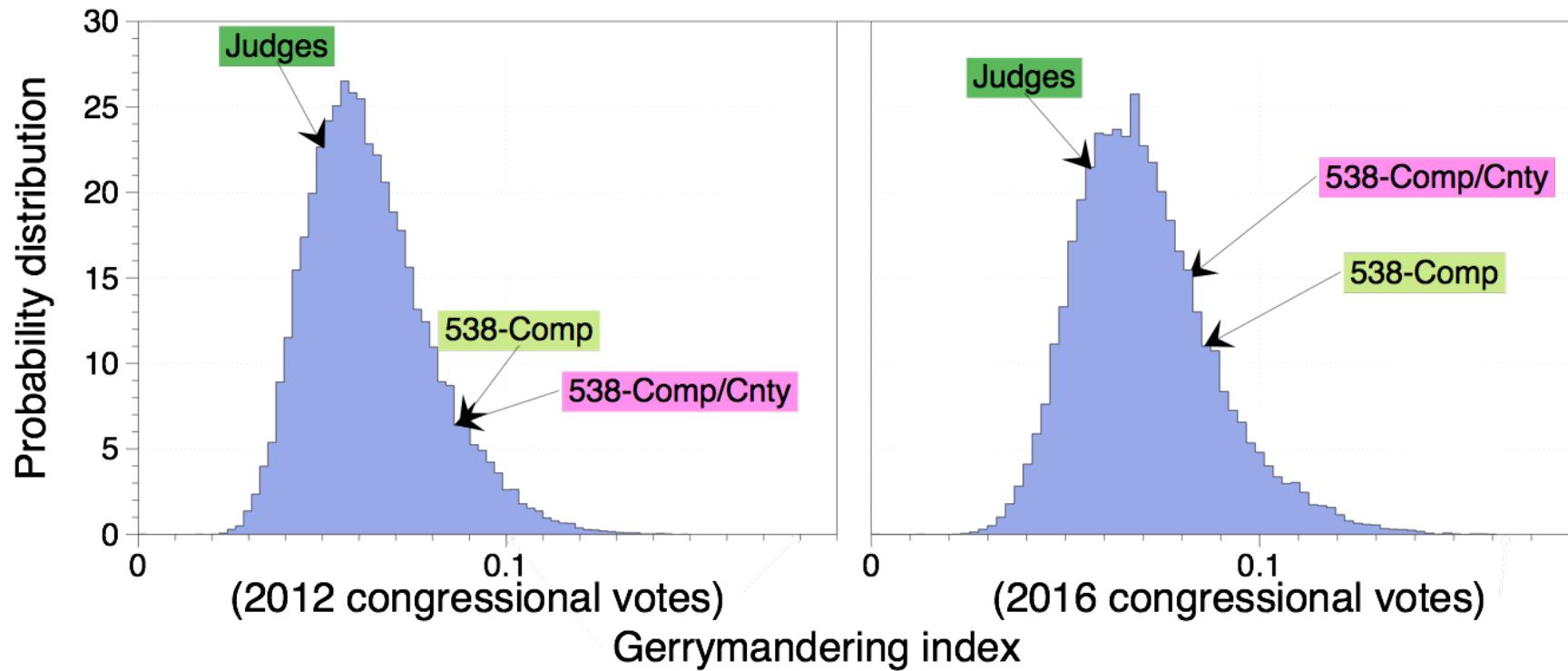
Baseline Maps



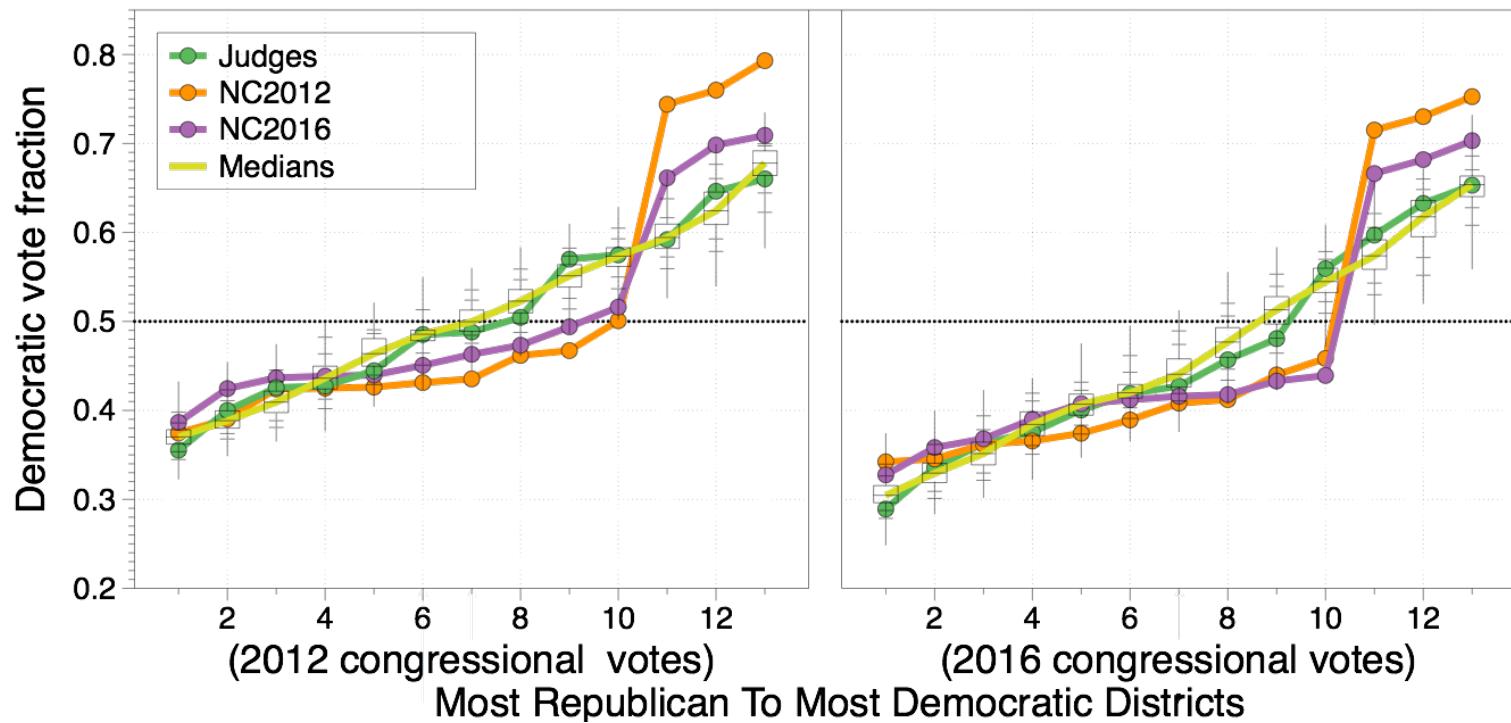
Similar to the median curve



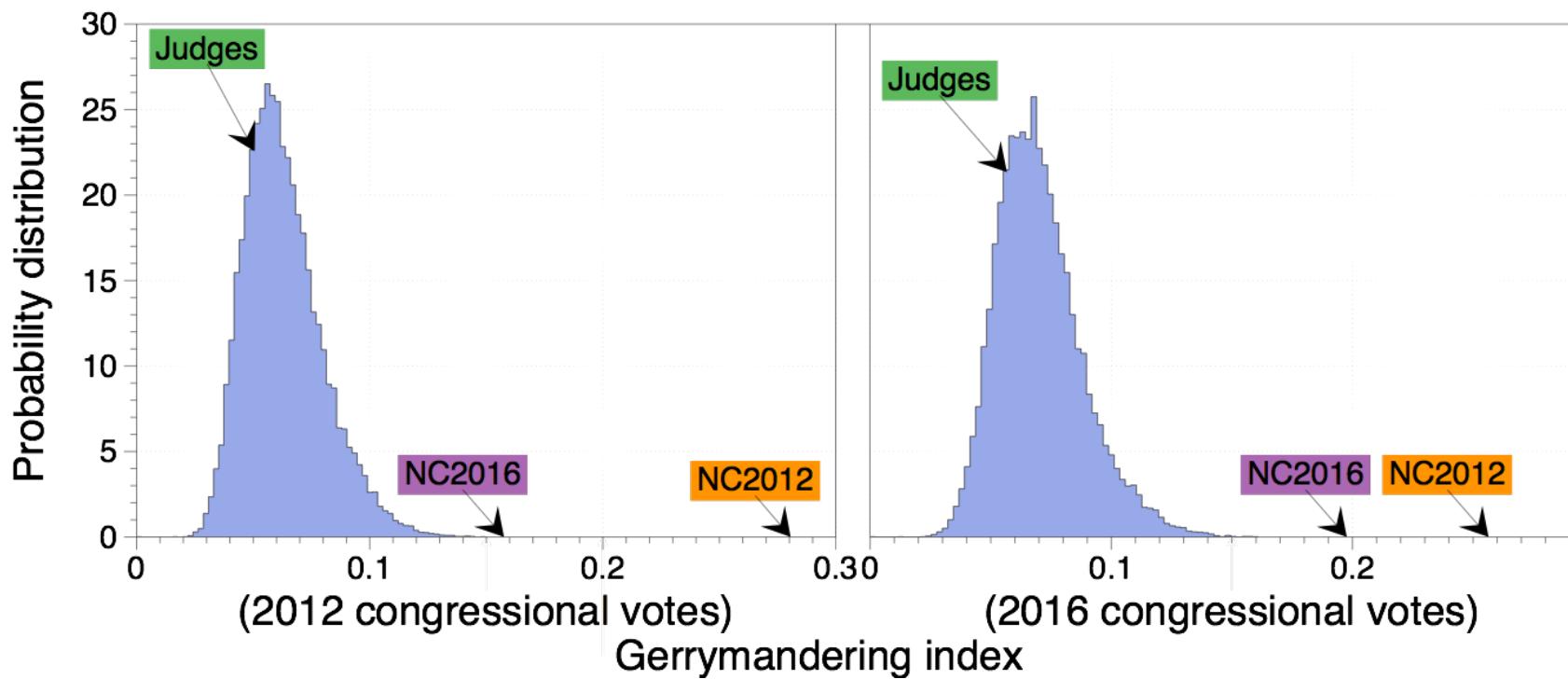
Gerrymandering Index



NC Congressional Delegation

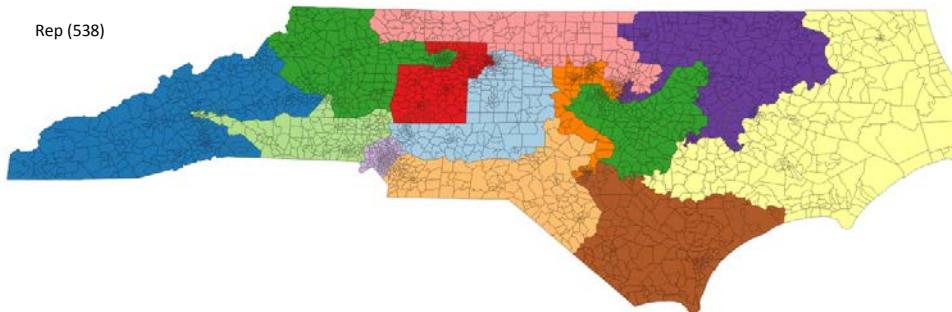


Gerrymandering Index

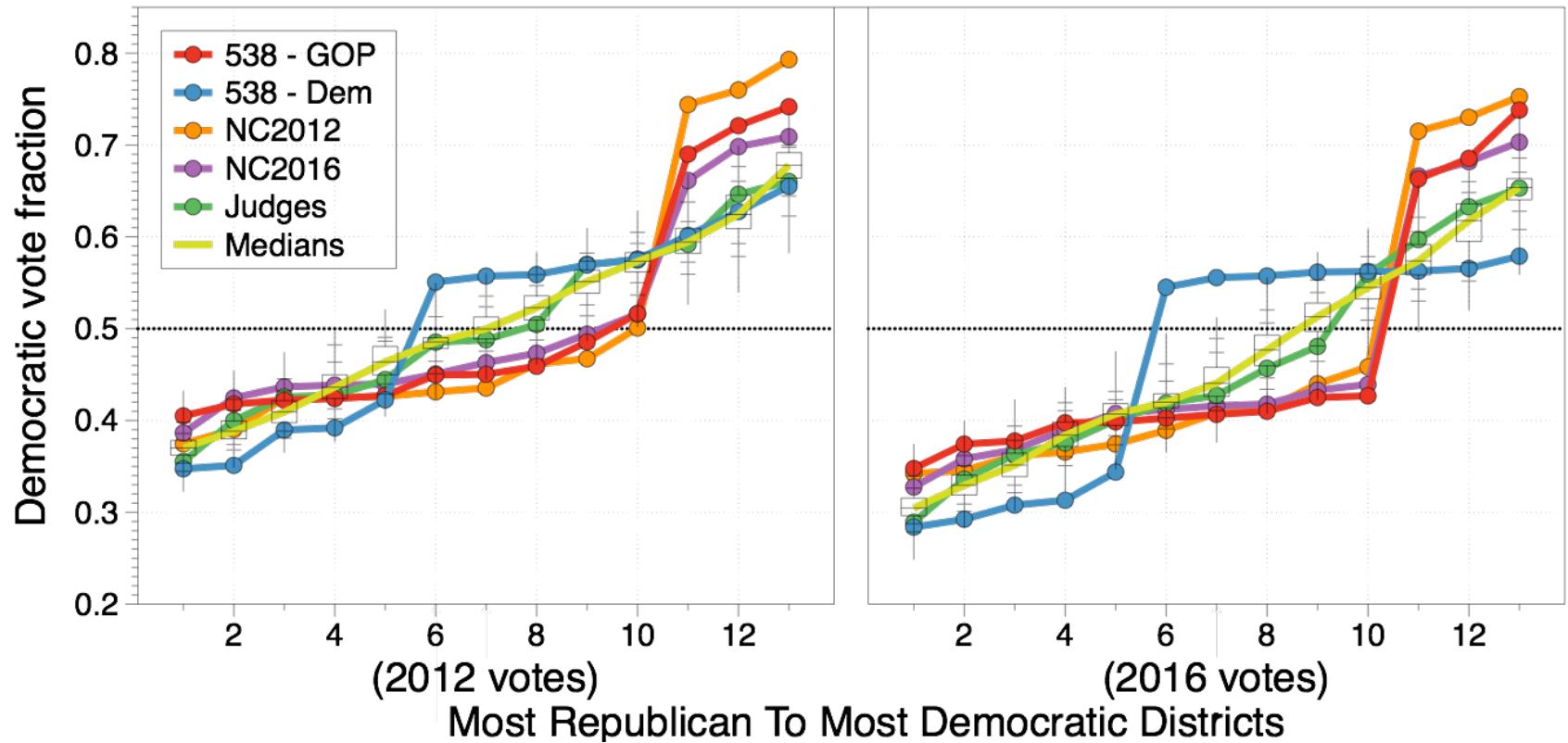


"Outlier analysis" Eric Lander's Amicus Brief in *Gill v. Whitford*

Extreme Maps



Signature of Gerrymandering



Wisconsin General Assembly

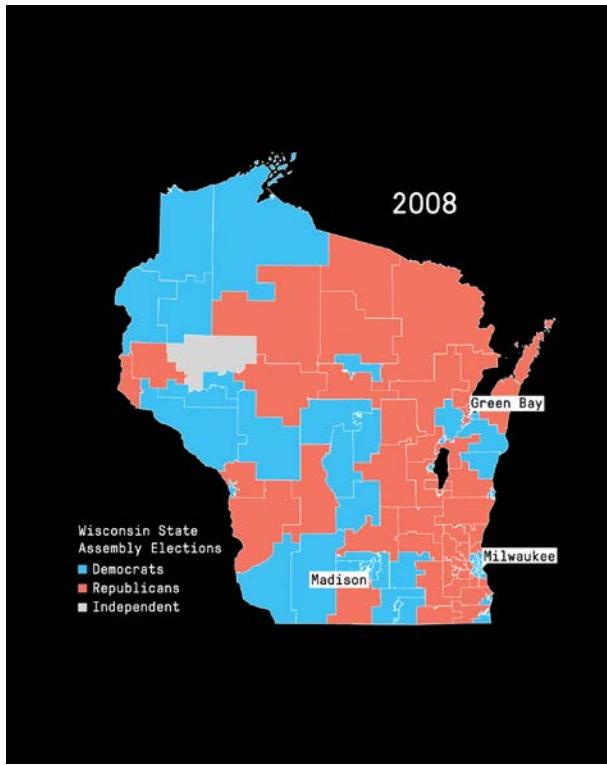
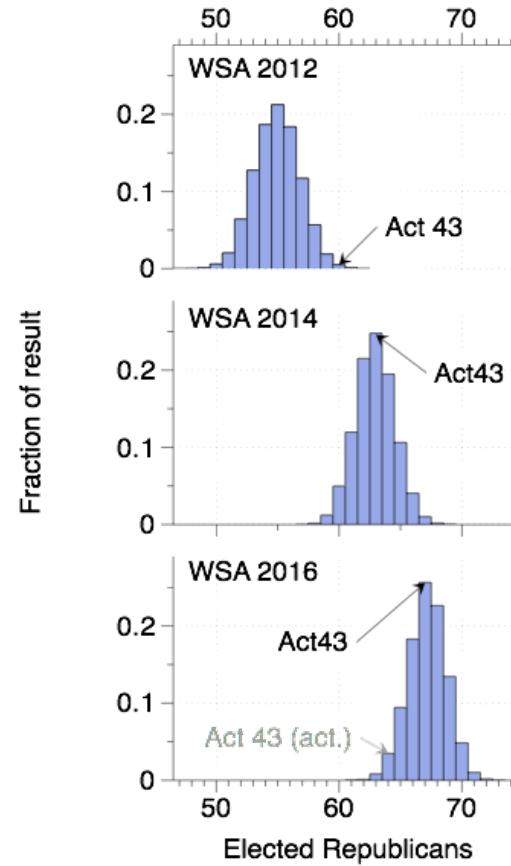
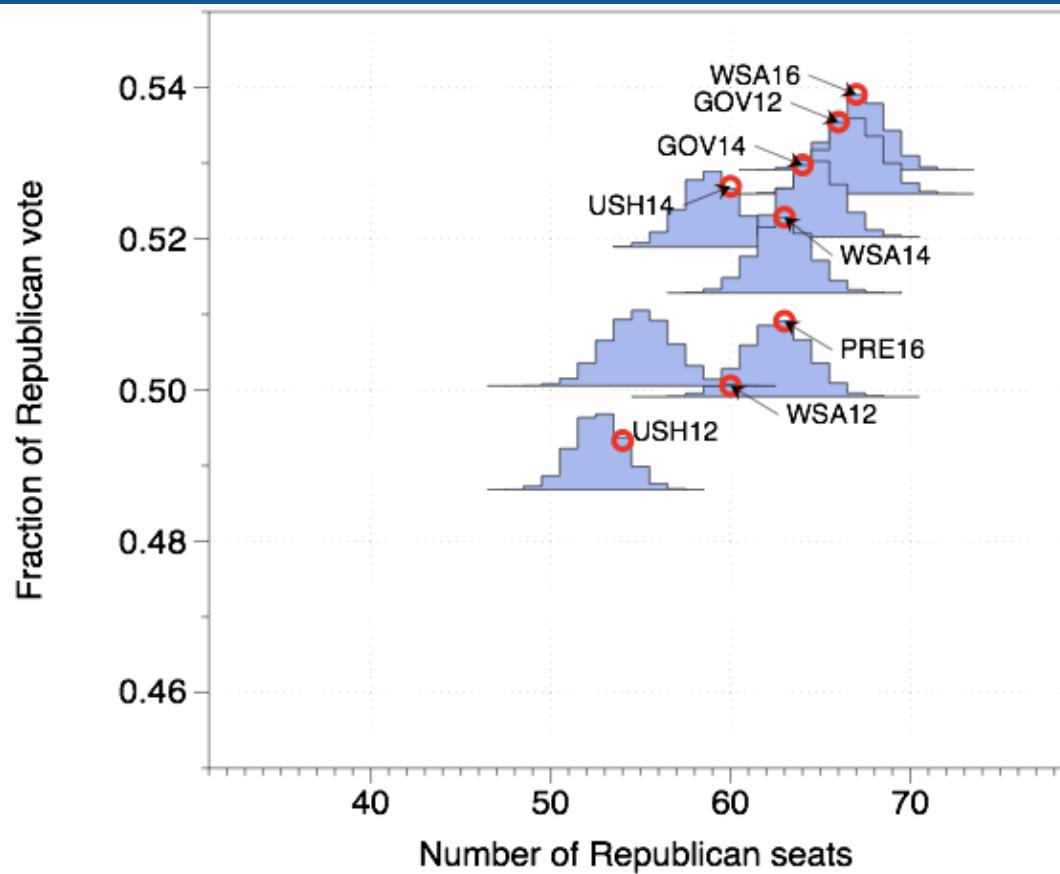


Image: NY Times

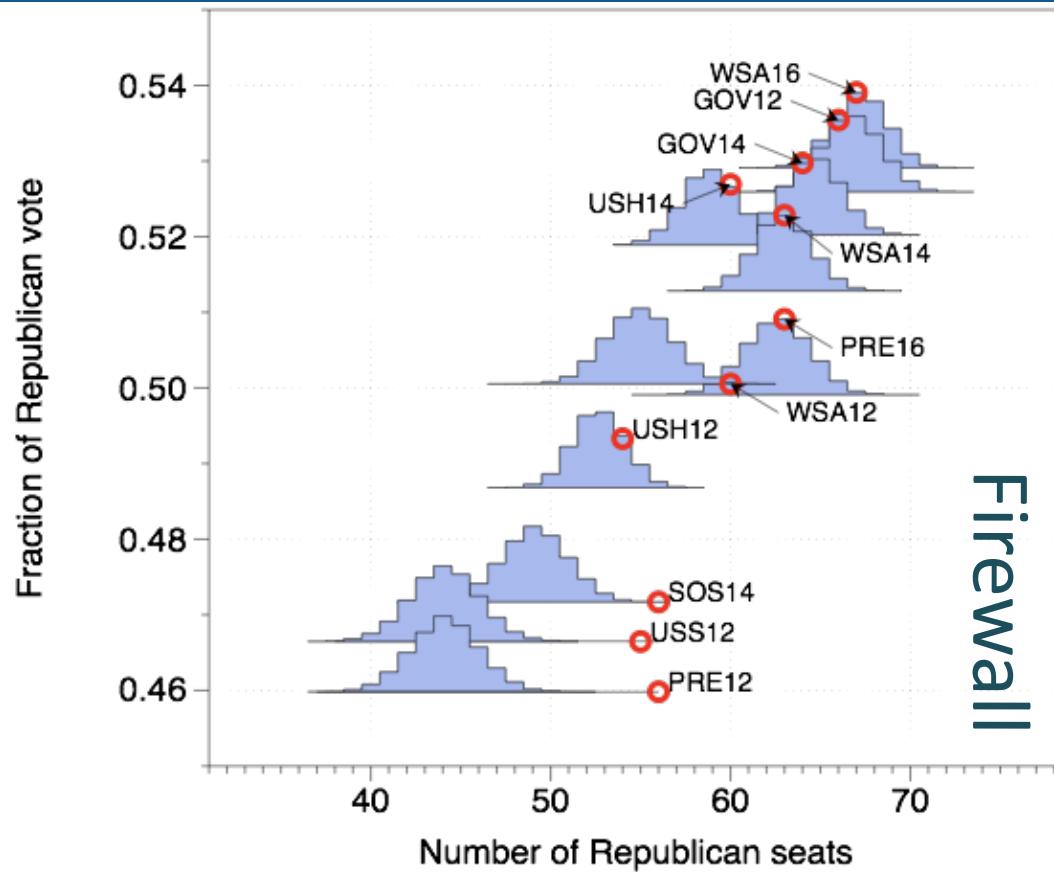


Ensemble of around 19,000 districting plans

Wisconsin historical elections



Wisconsin historical elections



The Team



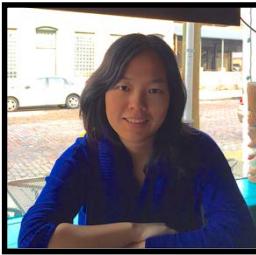
Jonathan
Mattingly



Christy Graves



Sachet Bangia



Sophie Guo

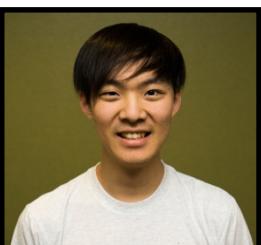


Bridget Dou

2013-Present



Justin Luo



Hansung Kang



Robert Ravier



Greg Herschlag



Michael Bell



<https://sites.duke.edu/quantifyinggerrymandering/>

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Mathematics of Redistricting – Q&A



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Common Metrics

- Efficiency Gap: (McGhee & Stephanopoulos)

$$\text{Waste} = \sum_{\text{districts won}} (\text{vote fraction} - 0.5) + \sum_{\text{districts lost}} \text{vote fraction}$$

$$\text{EG} = \text{Waste}(\text{Democrat}) - \text{Waste}(\text{Republican})$$

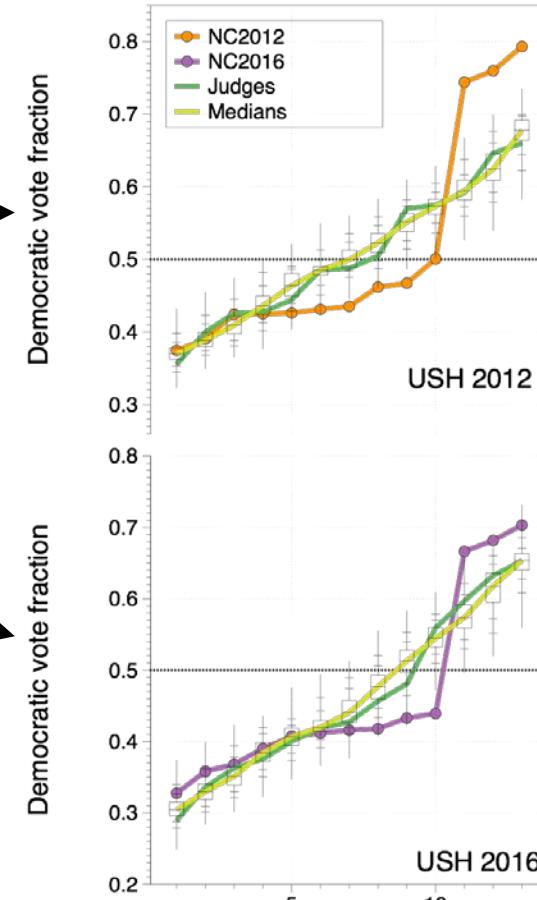
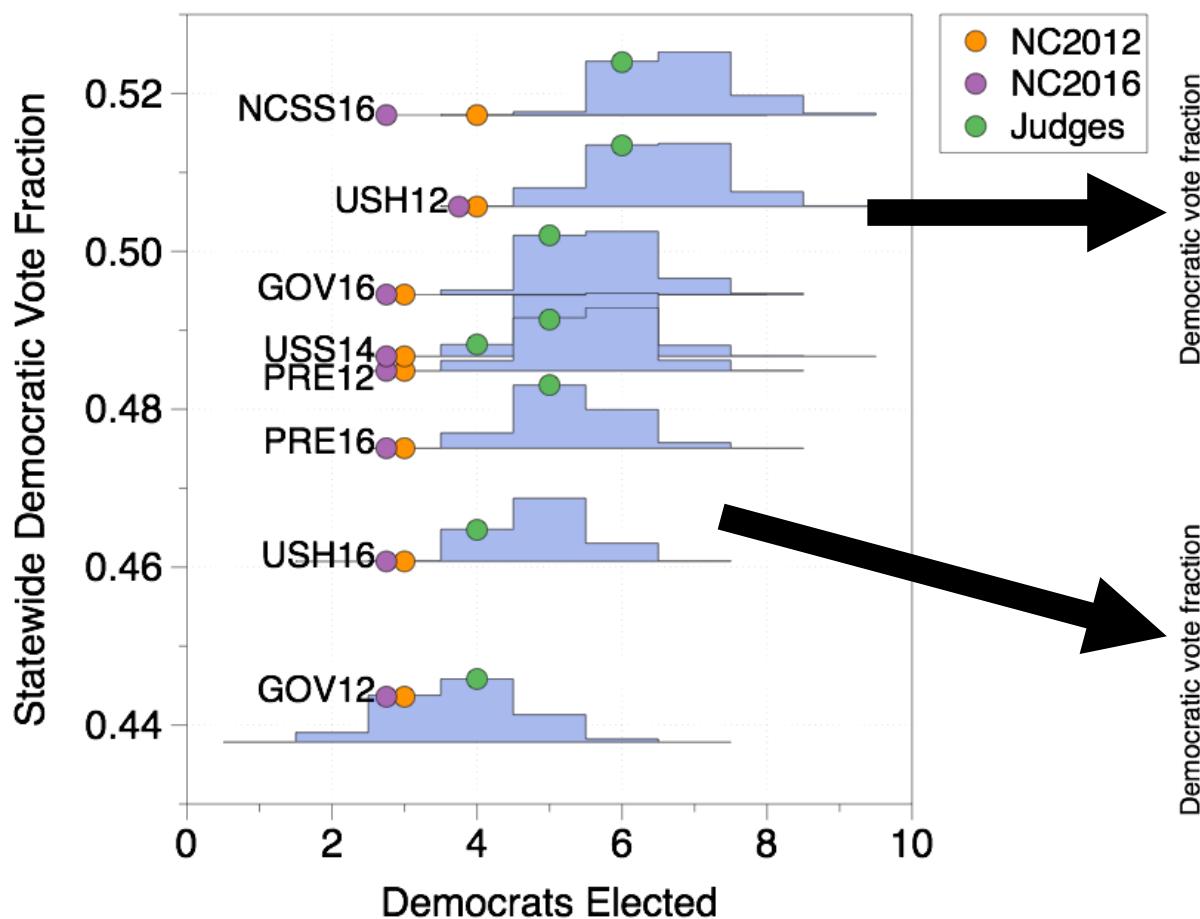
$$\approx [\text{Vote(Dem)} - \text{Vote(Rep)}] - \frac{1}{2}[\text{Seats(Dem)} - \text{Seats(Rep)}]$$

Bernstein & Duchin '16

- Partisan Bias: (Gelman and King)

difference in seat fraction won by the Republicans if they receive 55% of the vote and the seat fraction won by the Democrats if they receive 55% of the vote (under partisan swing assumption).

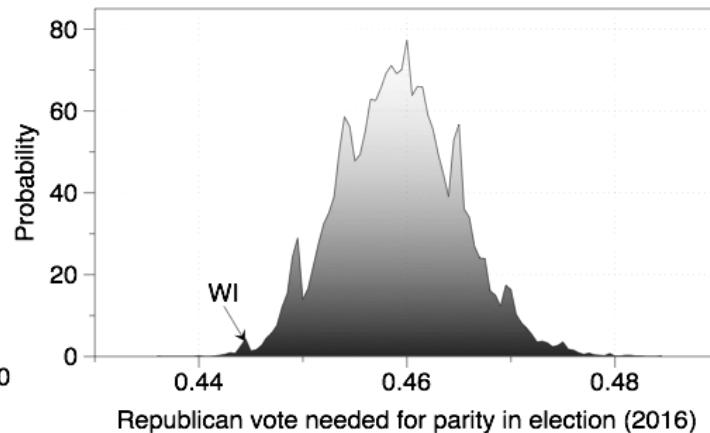
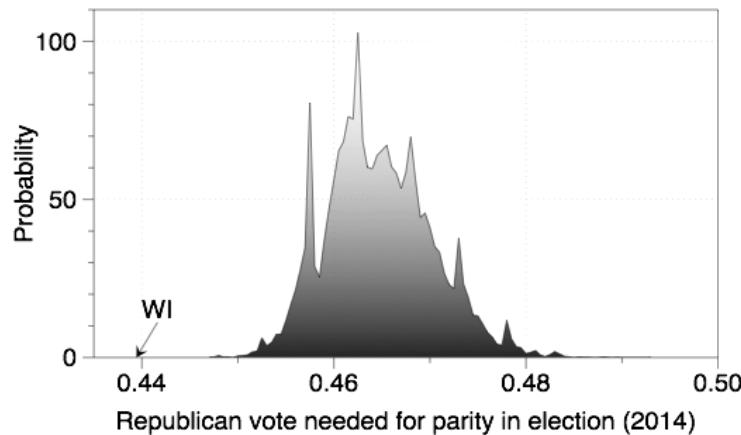
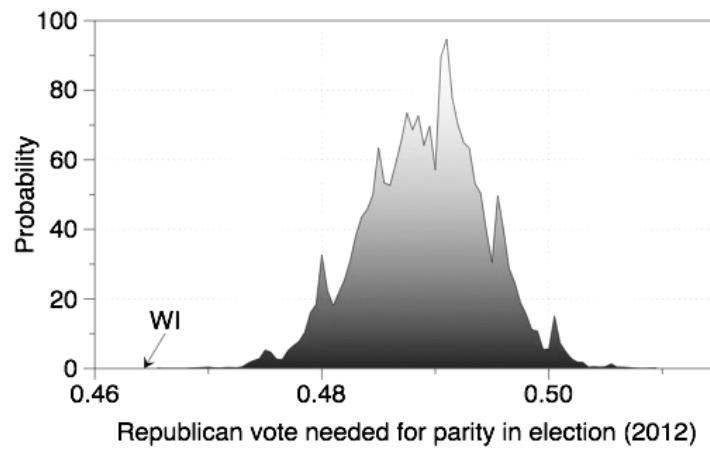
Stagnating NC election results due to Gerrymandering



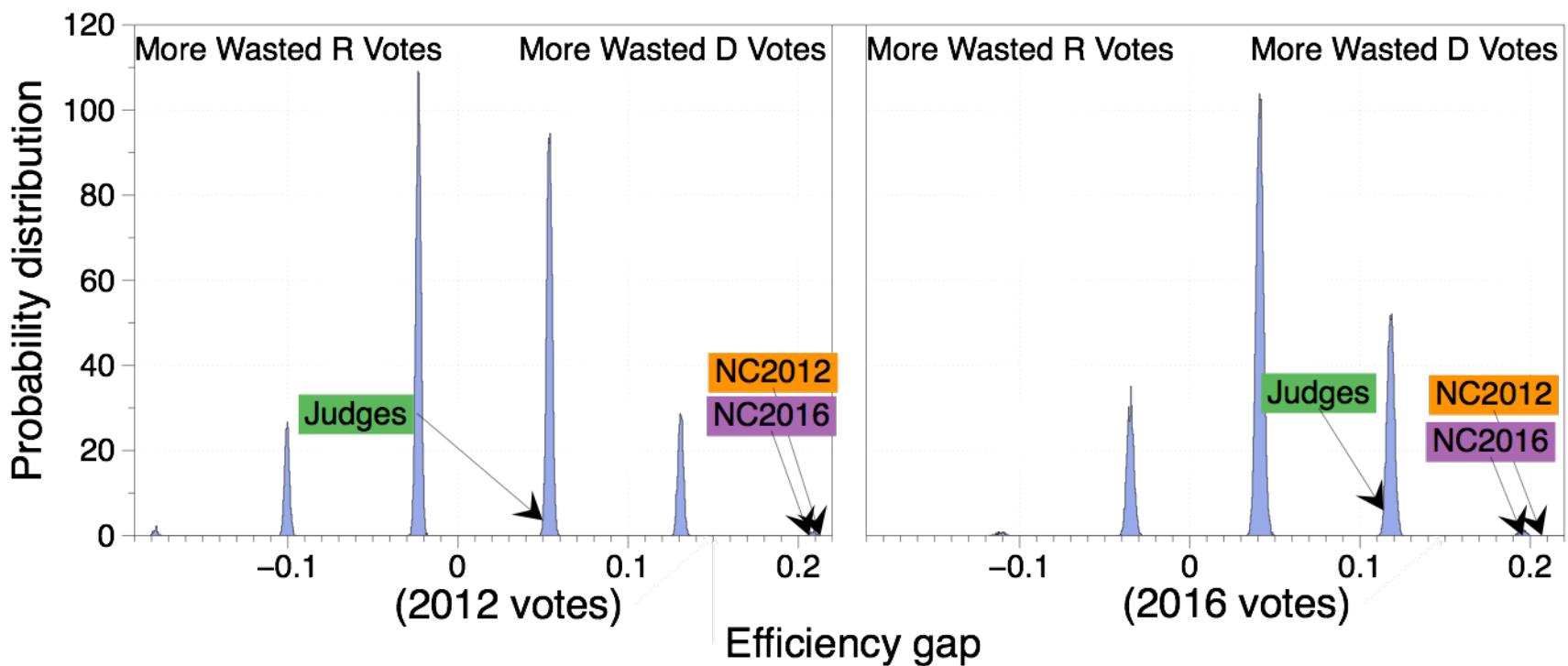
Structural advantage exists

Back
to
WI...

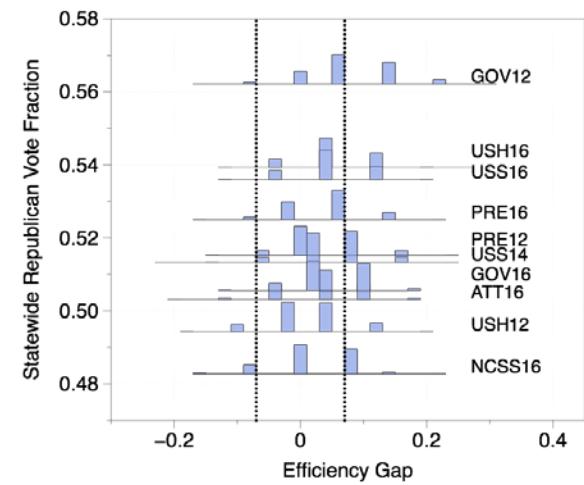
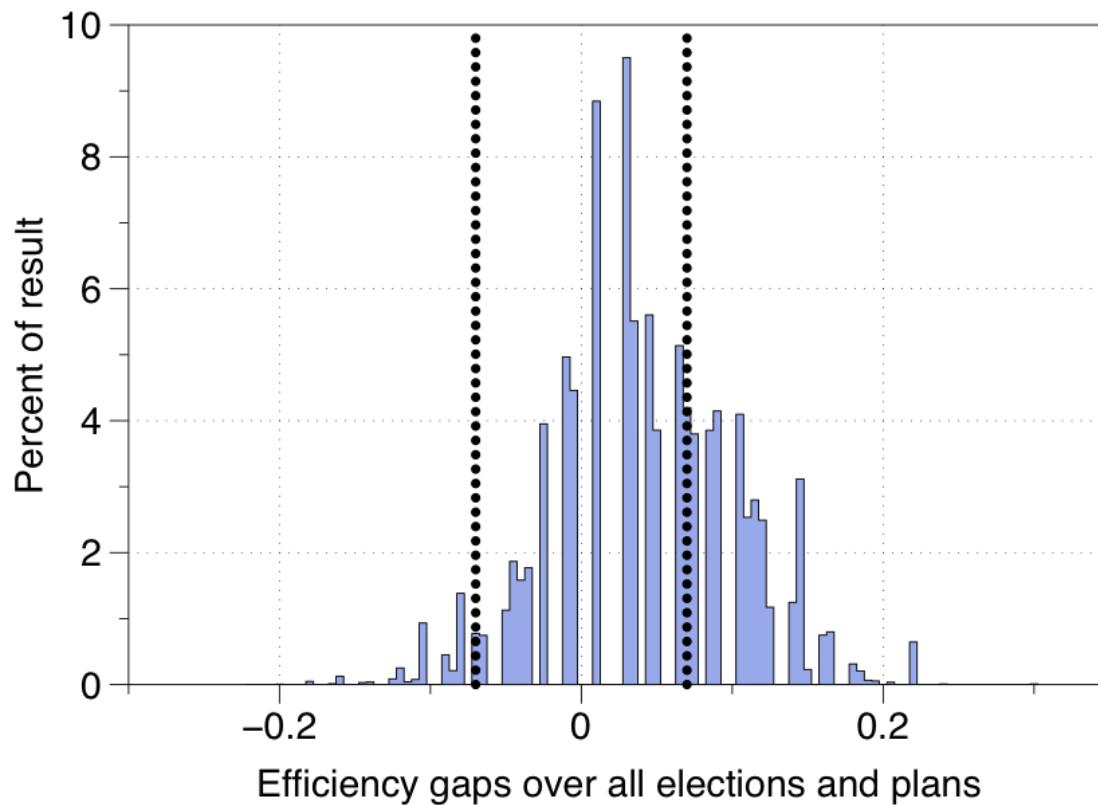
sampling decouples
geopolitical effects
from Gerrymandered
effects



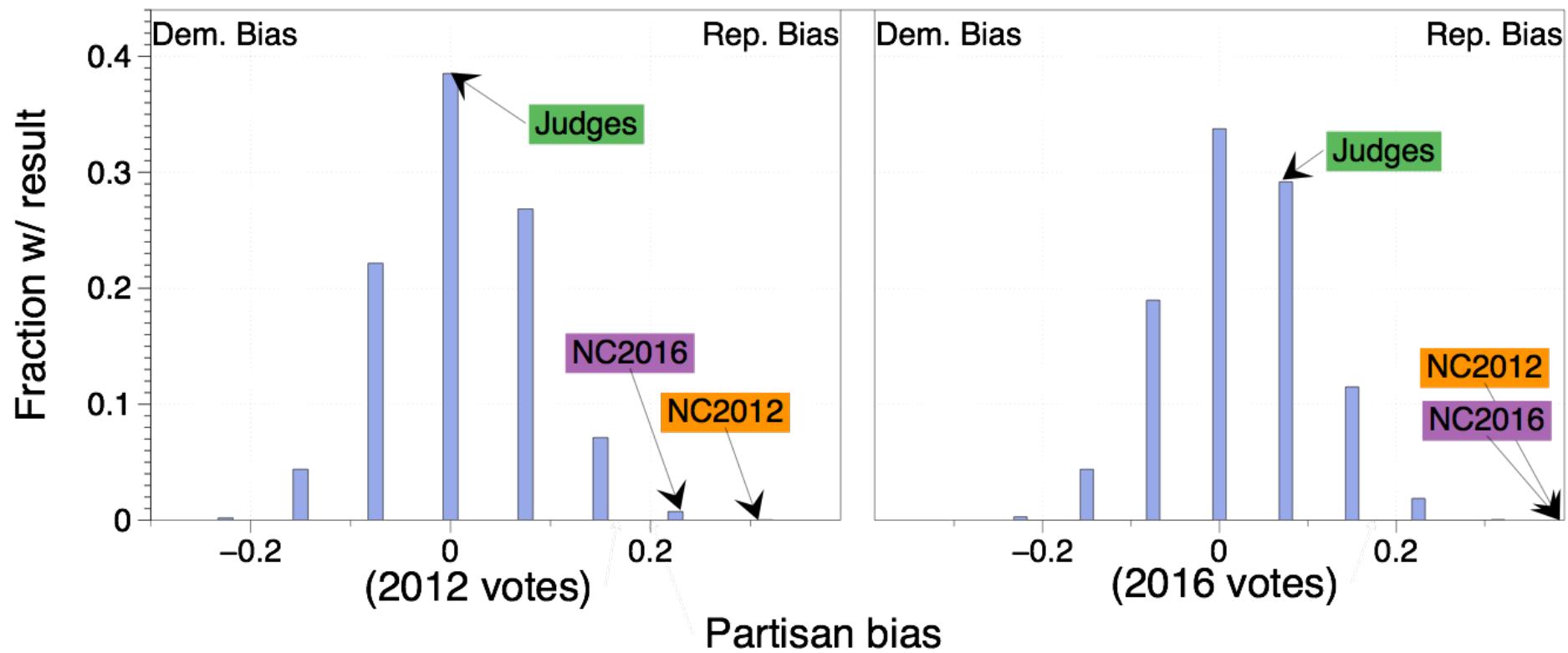
Efficiency Gap over Ensemble



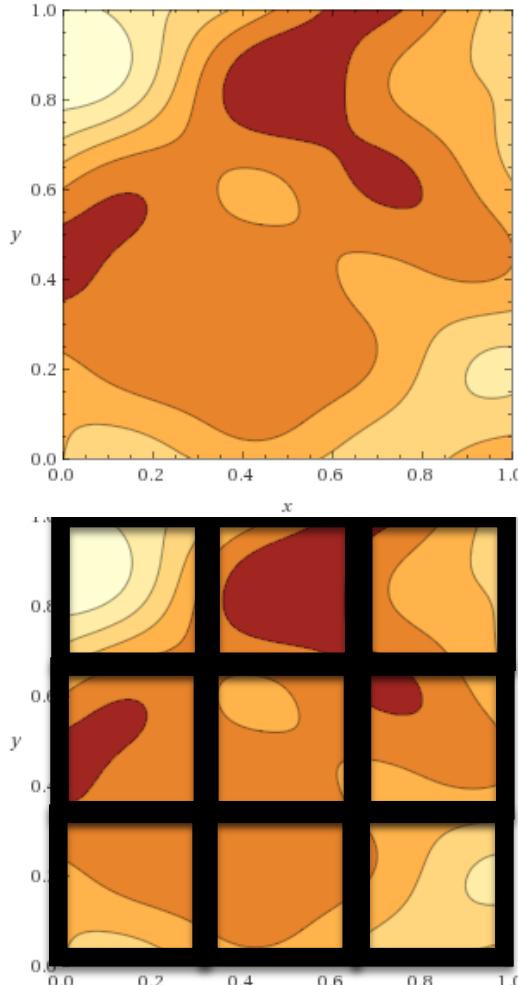
Efficiency Gap over Many Ensembles



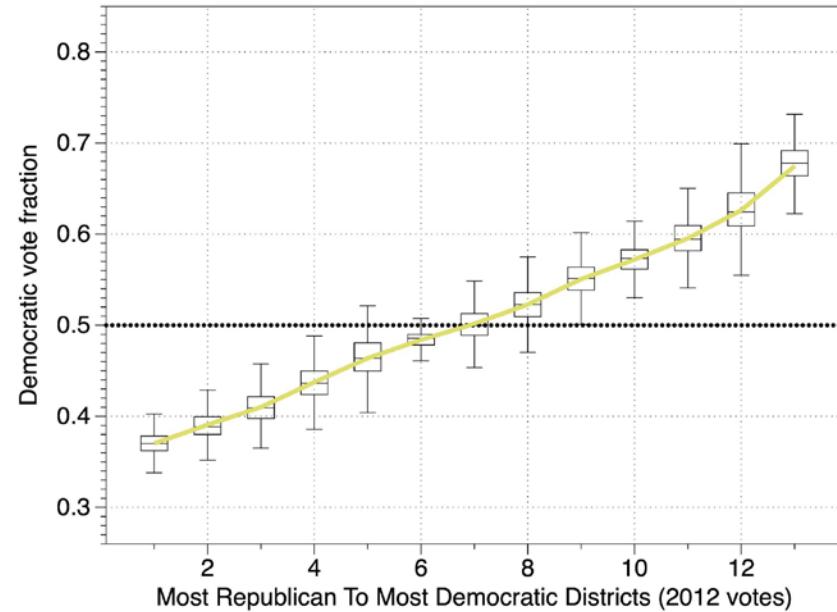
Partisan Bias over Ensembles



Q: Find null distribution of order statistics for district make up



Assume the population is uniform
model a random distribution of
political parties



Q: Give some form of stability of plots over a class of energy functions which have certain marginal statistics.

