

# Benford’s Law and the 2020 General Elections

## Goal

The goal of the following note is to determine whether and to what extent the (unofficial) election results of the 2020 general election satisfy (the strong version of) *Benford’s Law*.

## Method

Unofficial election results are obtained from official sources for various states and counties, and are tested using the Kolmogorov-Smirnov test (with  $\alpha = 0.01$ ) whether they satisfy strong version of Benford’s Law.

## Background on Benford’s Law and Fraud Detection

*Benford’s law* is the counter-intuitive notion that the leading digits of “organic” numbers tend *not* to be uniformly distributed, but rather according to *Benford’s distribution*:

$$P(d) = \log_{10}(d + 1) - \log_{10}(d).$$

This distribution of digits follows immediately from the *strong* version of Benford’s law, which states that the fractional part  $\log_{10}(X) \bmod 1$  of the logarithm of an “organic” random variable  $X$  is uniformly distributed.

What exactly “organic” should mean here is the non-trivial part of Benford’s Law, which is yet to be made precise by someone. However, one should roughly think of things like electricity bills, street addresses, stock prices and the like.

The whole point of Benford’s Law (from a practical viewpoint) is not which numbers satisfy but rather which numbers don’t satisfy it. For instance, uniformly distributed (i.e. “random”) numbers do not satisfy Benford’s law, which means—given Benford’s law—that most numbers aren’t as random as you think they are.

Most importantly, the numbers people come up with when they have to produce some tend not to satisfy Benford’s law, which makes it possible to *detect fraud* using statistical methods.

## Results

### Alabama

The test results for the state-wide election results (per county) of Alabama are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.076720
- dcrit: 0.165919
- N: 67

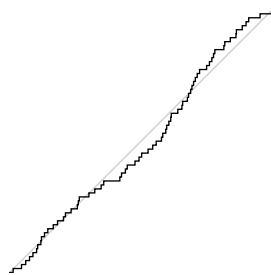


Figure 1: Empirical distribution of fractional part of decimal logarithm of votes for Alabama (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.069288
- dcrit: 0.165919
- N: 67

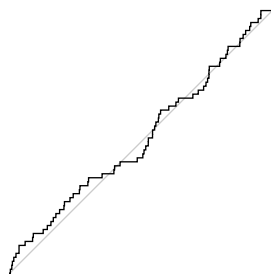


Figure 2: Empirical distribution of fractional part of decimal logarithm of votes for Alabama (R) (black line) and uniform distribution (gray line)

## Alaska

The test results for the state-wide election results (per precinct) of Alaska are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.129968
- dcrit: 0.064893
- N: 438



Figure 3: Empirical distribution of fractional part of decimal logarithm of votes for Alaska (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.080107
- dcrit: 0.064819
- N: 439

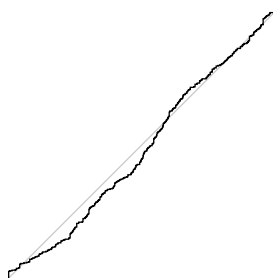


Figure 4: Empirical distribution of fractional part of decimal logarithm of votes for Alaska (R) (black line) and uniform distribution (gray line)

## Arizona

The test results for the state-wide election results (per county) of Arizona are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.171921
- dcrit: 0.338000
- N: 15

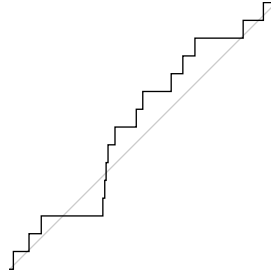


Figure 5: Empirical distribution of fractional part of decimal logarithm of votes for Arizona (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.149234
- dcrit: 0.338000
- N: 15

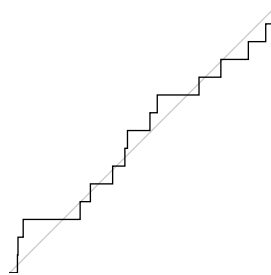


Figure 6: Empirical distribution of fractional part of decimal logarithm of votes for Arizona (R) (black line) and uniform distribution (gray line)

## Maricopa

The test results for the county-wide election results (per precinct) of Maricopa County, Arizona are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.228547

- dcrit: 0.049857
- N: 742

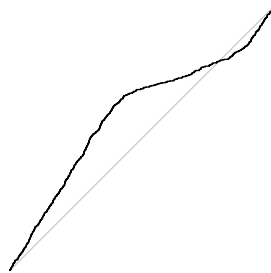


Figure 7: Empirical distribution of fractional part of decimal logarithm of votes for Maricopa, Arizona (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.100022
- dcrit: 0.049857
- N: 742

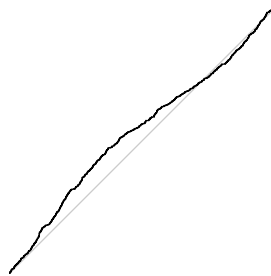


Figure 8: Empirical distribution of fractional part of decimal logarithm of votes for Maricopa, Arizona (R) (black line) and uniform distribution (gray line)

## Pima

The test results for the county-wide election results (per precinct) of Pima County, Arizona are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.112712
- dcrit: 0.061104
- N: 494

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

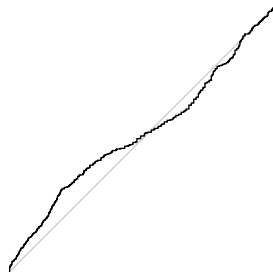


Figure 9: Empirical distribution of fractional part of decimal logarithm of votes for Pima,Arizona (D) (black line) and uniform distribution (gray line)

- dmax: 0.055297
- dcrit: 0.061166
- N: 493

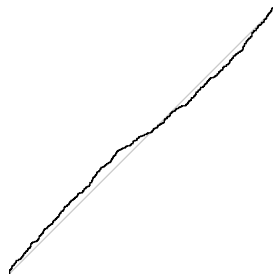


Figure 10: Empirical distribution of fractional part of decimal logarithm of votes for Pima,Arizona (R) (black line) and uniform distribution (gray line)

## Arkansas

The test results for the state-wide election results (per county) of Arkansas are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.049463
- dcrit: 0.088405
- N: 236

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.095244
- dcrit: 0.088218
- N: 237

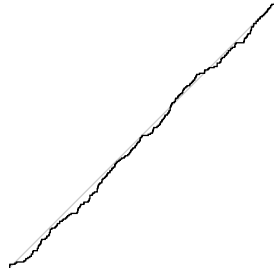


Figure 11: Empirical distribution of fractional part of decimal logarithm of votes for Arkansas (D) (black line) and uniform distribution (gray line)

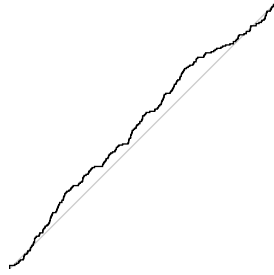


Figure 12: Empirical distribution of fractional part of decimal logarithm of votes for Arkansas (R) (black line) and uniform distribution (gray line)

## California

The test results for the state-wide election results (per county) of California are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.115905
- dcrit: 0.178327
- N: 58

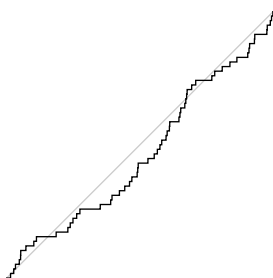


Figure 13: Empirical distribution of fractional part of decimal logarithm of votes for California (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.092923
- dcrit: 0.178327
- N: 58

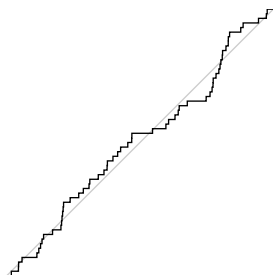


Figure 14: Empirical distribution of fractional part of decimal logarithm of votes for California (R) (black line) and uniform distribution (gray line)



## Florida

The test results for the state-wide election results (per county) of Florida are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.064655
- dcrit: 0.165919
- N: 67

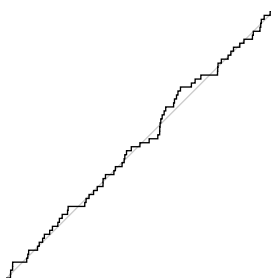


Figure 15: Empirical distribution of fractional part of decimal logarithm of votes for Florida (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.140142
- dcrit: 0.165919
- N: 67

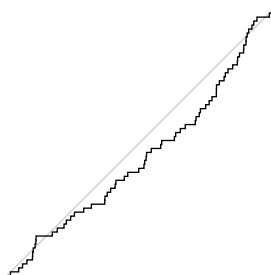


Figure 16: Empirical distribution of fractional part of decimal logarithm of votes for Florida (R) (black line) and uniform distribution (gray line)

## Martin

The test results for the county-wide election results (per precinct) of Martin County, Florida are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.127541
- dcrit: 0.148181
- N: 84

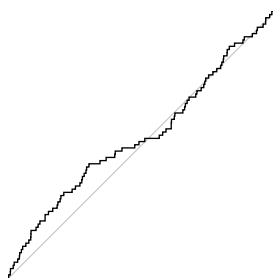


Figure 17: Empirical distribution of fractional part of decimal logarithm of votes for Martin,Florida (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.093213
- dcrit: 0.148181
- N: 84

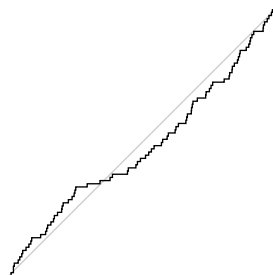


Figure 18: Empirical distribution of fractional part of decimal logarithm of votes for Martin,Florida (R) (black line) and uniform distribution (gray line)

## Miami-Dade

The test results for the county-wide election results (per precinct) of Miami-Dade County, Florida are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.070467
- dcrit: 0.047485
- N: 818

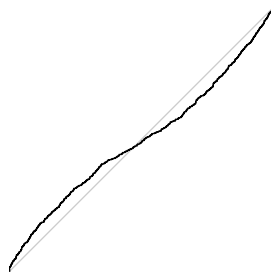


Figure 19: Empirical distribution of fractional part of decimal logarithm of votes for Miami-Dade,Florida (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.096724
- dcrit: 0.047514
- N: 817

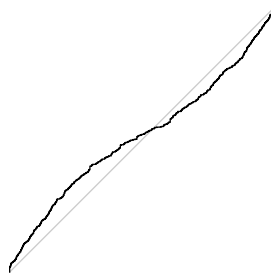


Figure 20: Empirical distribution of fractional part of decimal logarithm of votes for Miami-Dade,Florida (R) (black line) and uniform distribution (gray line)

## Osceola

The test results for the county-wide election results (per precinct) of Osceola County, Florida are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.072245
- dcrit: 0.089942
- N: 228

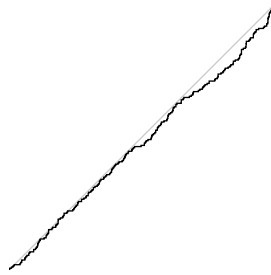


Figure 21: Empirical distribution of fractional part of decimal logarithm of votes for Osceola,Florida (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.061158
- dcrit: 0.088405
- N: 236

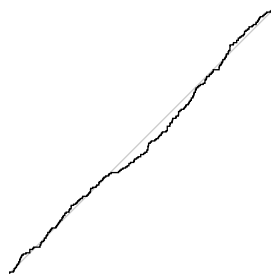


Figure 22: Empirical distribution of fractional part of decimal logarithm of votes for Osceola,Florida (R) (black line) and uniform distribution (gray line)

## Georgia

The test results for the state-wide election results (per county) of Georgia are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.050332
- dcrit: 0.056392
- N: 580

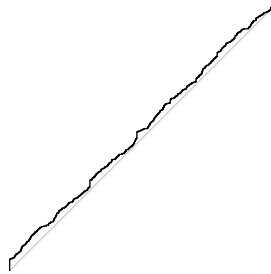


Figure 23: Empirical distribution of fractional part of decimal logarithm of votes for Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.035176
- dcrit: 0.055583
- N: 597

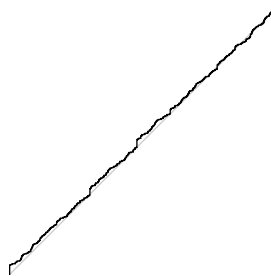


Figure 24: Empirical distribution of fractional part of decimal logarithm of votes for Georgia (R) (black line) and uniform distribution (gray line)

### Bartow

The test results for the county-wide election results (per precinct) of Bartow County, Georgia are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.136727
- dcrit: 0.318000

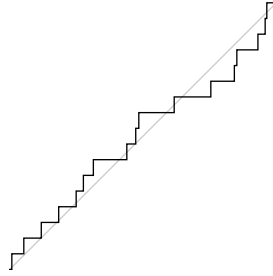


Figure 25: Empirical distribution of fractional part of decimal logarithm of votes for Bartow,Georgia (D) (black line) and uniform distribution (gray line)

- N: 17

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.277048
- dcrit: 0.318000
- N: 17

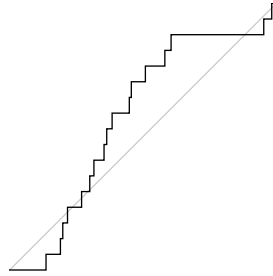


Figure 26: Empirical distribution of fractional part of decimal logarithm of votes for Bartow,Georgia (R) (black line) and uniform distribution (gray line)

## Chatham

The test results for the county-wide election results (per precinct) of Chatham County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.227369
- dcrit: 0.141592
- N: 92

The election results for Trump **violate** Benford's law with 99% certainty:

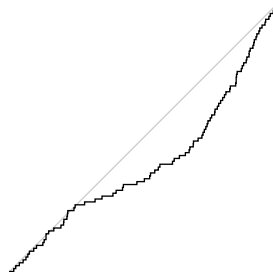


Figure 27: Empirical distribution of fractional part of decimal logarithm of votes for Chatham,Georgia (D) (black line) and uniform distribution (gray line)

- dmax: 0.144906
- dcrit: 0.141592
- N: 92

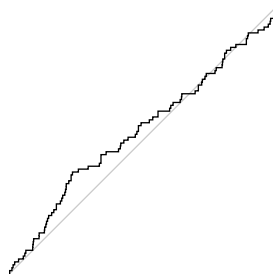


Figure 28: Empirical distribution of fractional part of decimal logarithm of votes for Chatham,Georgia (R) (black line) and uniform distribution (gray line)

### Clarke

The test results for the county-wide election results (per precinct) of Clarke County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.580093
- dcrit: 0.269000
- N: 24

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.383468
- dcrit: 0.269000
- N: 24

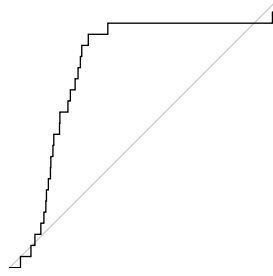


Figure 29: Empirical distribution of fractional part of decimal logarithm of votes for Clarke,Georgia (D) (black line) and uniform distribution (gray line)

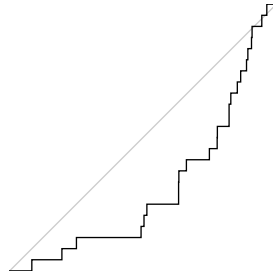


Figure 30: Empirical distribution of fractional part of decimal logarithm of votes for Clarke,Georgia (R) (black line) and uniform distribution (gray line)



## Clayton

The test results for the county-wide election results (per precinct) of Clayton County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.463395
- dcrit: 0.168452
- N: 65

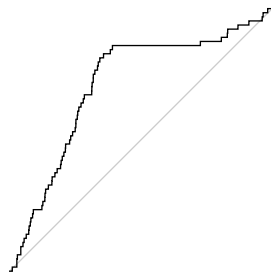


Figure 31: Empirical distribution of fractional part of decimal logarithm of votes for Clayton,Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.237590
- dcrit: 0.168452
- N: 65

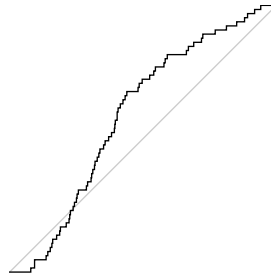


Figure 32: Empirical distribution of fractional part of decimal logarithm of votes for Clayton,Georgia (R) (black line) and uniform distribution (gray line)

## Cobb

The test results for the county-wide election results (per precinct) of Cobb County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.281565
- dcrit: 0.112784
- N: 145



Figure 33: Empirical distribution of fractional part of decimal logarithm of votes for Cobb, Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.253272
- dcrit: 0.112784
- N: 145

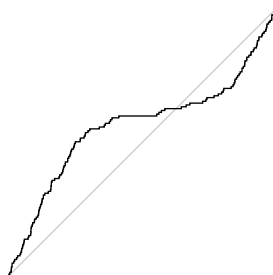


Figure 34: Empirical distribution of fractional part of decimal logarithm of votes for Cobb, Georgia (R) (black line) and uniform distribution (gray line)

## DeKalb

The test results for the county-wide election results (per precinct) of DeKalb County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.409322
- dcrit: 0.098269
- N: 191



Figure 35: Empirical distribution of fractional part of decimal logarithm of votes for DeKalb,Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.141574
- dcrit: 0.098269
- N: 191

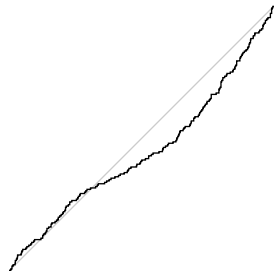


Figure 36: Empirical distribution of fractional part of decimal logarithm of votes for DeKalb,Georgia (R) (black line) and uniform distribution (gray line)

## Douglas

The test results for the county-wide election results (per precinct) of Douglas County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.277425
- dcrit: 0.264000
- N: 25

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.176356
- dcrit: 0.264000

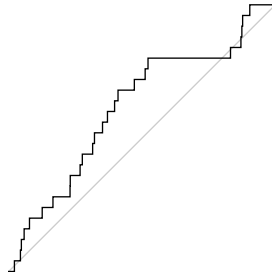


Figure 37: Empirical distribution of fractional part of decimal logarithm of votes for Douglas,Georgia (D) (black line) and uniform distribution (gray line)

- N: 25

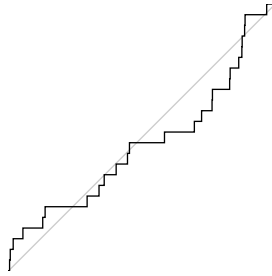


Figure 38: Empirical distribution of fractional part of decimal logarithm of votes for Douglas,Georgia (R) (black line) and uniform distribution (gray line)

### Forsyth

The test results for the county-wide election results (per precinct) of Forsyth County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.383994
- dcrit: 0.294000
- N: 20

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.325526
- dcrit: 0.294000
- N: 20

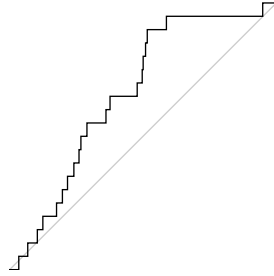


Figure 39: Empirical distribution of fractional part of decimal logarithm of votes for Forsyth, Georgia (D) (black line) and uniform distribution (gray line)

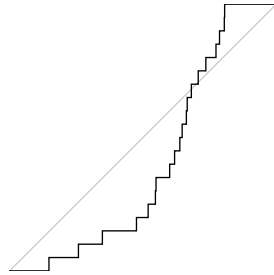


Figure 40: Empirical distribution of fractional part of decimal logarithm of votes for Forsyth, Georgia (R) (black line) and uniform distribution (gray line)

## Fulton

The test results for the county-wide election results (per precinct) of Fulton County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.108344
- dcrit: 0.069669
- N: 380

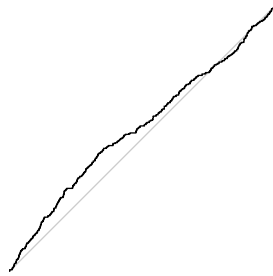


Figure 41: Empirical distribution of fractional part of decimal logarithm of votes for Fulton,Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.043403
- dcrit: 0.069946
- N: 377

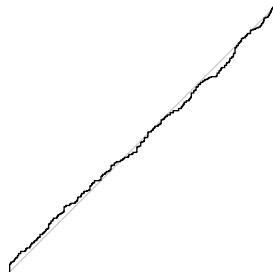


Figure 42: Empirical distribution of fractional part of decimal logarithm of votes for Fulton,Georgia (R) (black line) and uniform distribution (gray line)

## Gwinnett

The test results for the county-wide election results (per precinct) of Gwinnett County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.323849
- dcrit: 0.108735
- N: 156

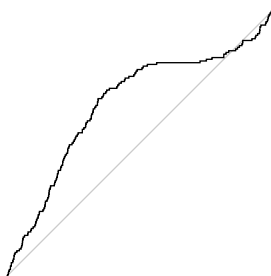


Figure 43: Empirical distribution of fractional part of decimal logarithm of votes for Gwinnett,Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.146186
- dcrit: 0.108735
- N: 156

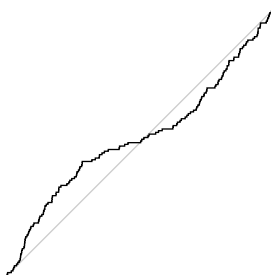


Figure 44: Empirical distribution of fractional part of decimal logarithm of votes for Gwinnett,Georgia (R) (black line) and uniform distribution (gray line)

## Hall

The test results for the county-wide election results (per precinct) of Hall County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.255701
- dcrit: 0.238000
- N: 31

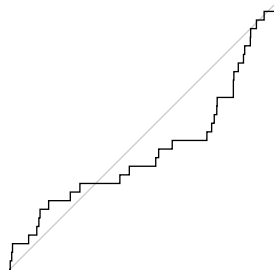


Figure 45: Empirical distribution of fractional part of decimal logarithm of votes for Hall,Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **violate** Benford's law with 99% certainty:

- dmax: 0.311377
- dcrit: 0.238000
- N: 31

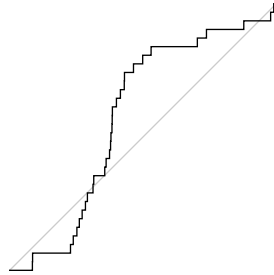


Figure 46: Empirical distribution of fractional part of decimal logarithm of votes for Hall,Georgia (R) (black line) and uniform distribution (gray line)

## Henry

The test results for the county-wide election results (per precinct) of Henry County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.249758
- dcrit: 0.223271
- N: 37

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.167748
- dcrit: 0.223271



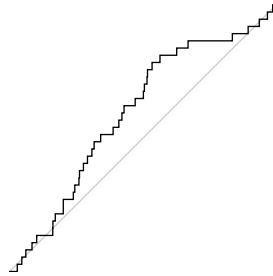


Figure 47: Empirical distribution of fractional part of decimal logarithm of votes for Henry,Georgia (D) (black line) and uniform distribution (gray line)

- N: 37

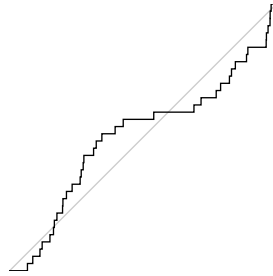


Figure 48: Empirical distribution of fractional part of decimal logarithm of votes for Henry,Georgia (R) (black line) and uniform distribution (gray line)

## Houston

The test results for the county-wide election results (per precinct) of Houston County, Georgia are as follows.

The election results for Biden **violate** Benford's law with 99% certainty:

- dmax: 0.348892
- dcrit: 0.327000
- N: 16

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.213568
- dcrit: 0.327000
- N: 16

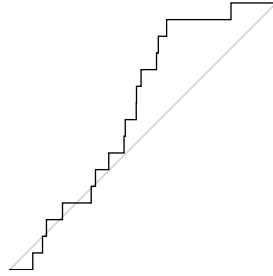


Figure 49: Empirical distribution of fractional part of decimal logarithm of votes for Houston,Georgia (D) (black line) and uniform distribution (gray line)

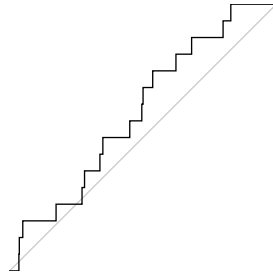


Figure 50: Empirical distribution of fractional part of decimal logarithm of votes for Houston,Georgia (R) (black line) and uniform distribution (gray line)

## Lowndes

The test results for the county-wide election results (per precinct) of Lowndes County, Georgia are as follows.

The election results for Biden **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.148536
- dcrit: 0.361000
- N: 13

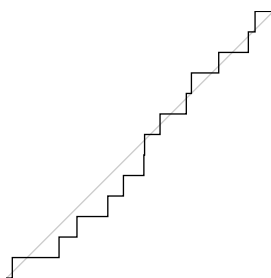


Figure 51: Empirical distribution of fractional part of decimal logarithm of votes for Lowndes, Georgia (D) (black line) and uniform distribution (gray line)

The election results for Trump **seem to satisfy** Benford's law up to an error of 1%:

- dmax: 0.185087
- dcrit: 0.361000
- N: 13

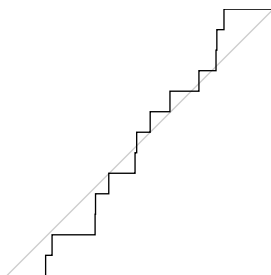


Figure 52: Empirical distribution of fractional part of decimal logarithm of votes for Lowndes, Georgia (R) (black line) and uniform distribution (gray line)