

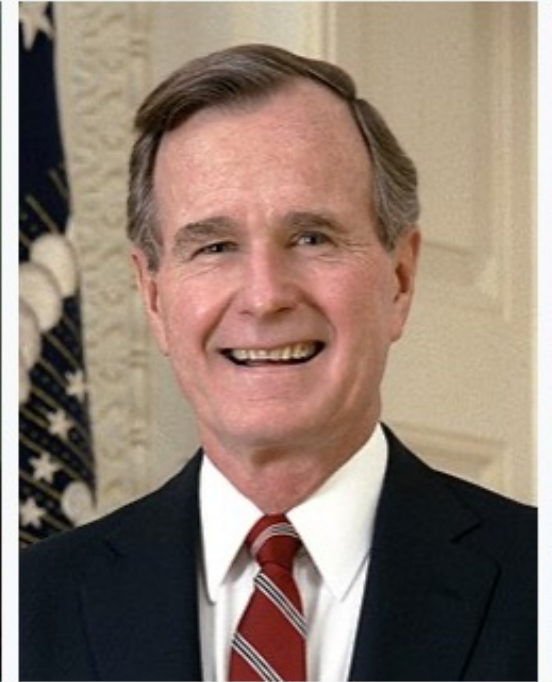
A Multivariate Analysis on U.S Presidential Election Results From 1992

Jared Thacker

Objective

1. Is there a difference in census information between counties that Bill Clinton lost and won?
2. Can we predict the results of an election using *only* census information ignoring the temporal structure? Baseline model?
3. Which variables are the most important?

Democratic Candidate: Bill Clinton



Republican Candidate: George H. W. Bush

Data-Sourcing

- ▶ Two Sources
 - ▶ Ufl.edu - census variables by county
 - ▶ Wikipedia - election results by county

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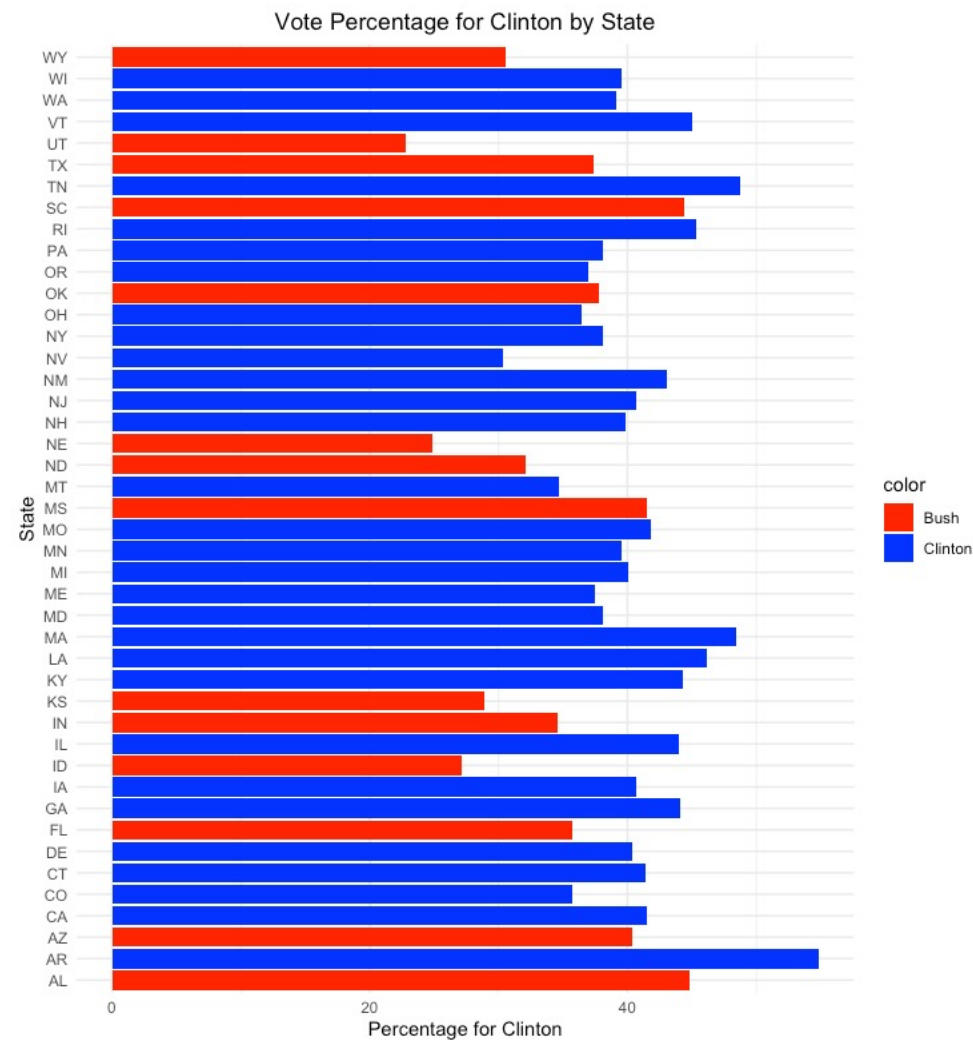
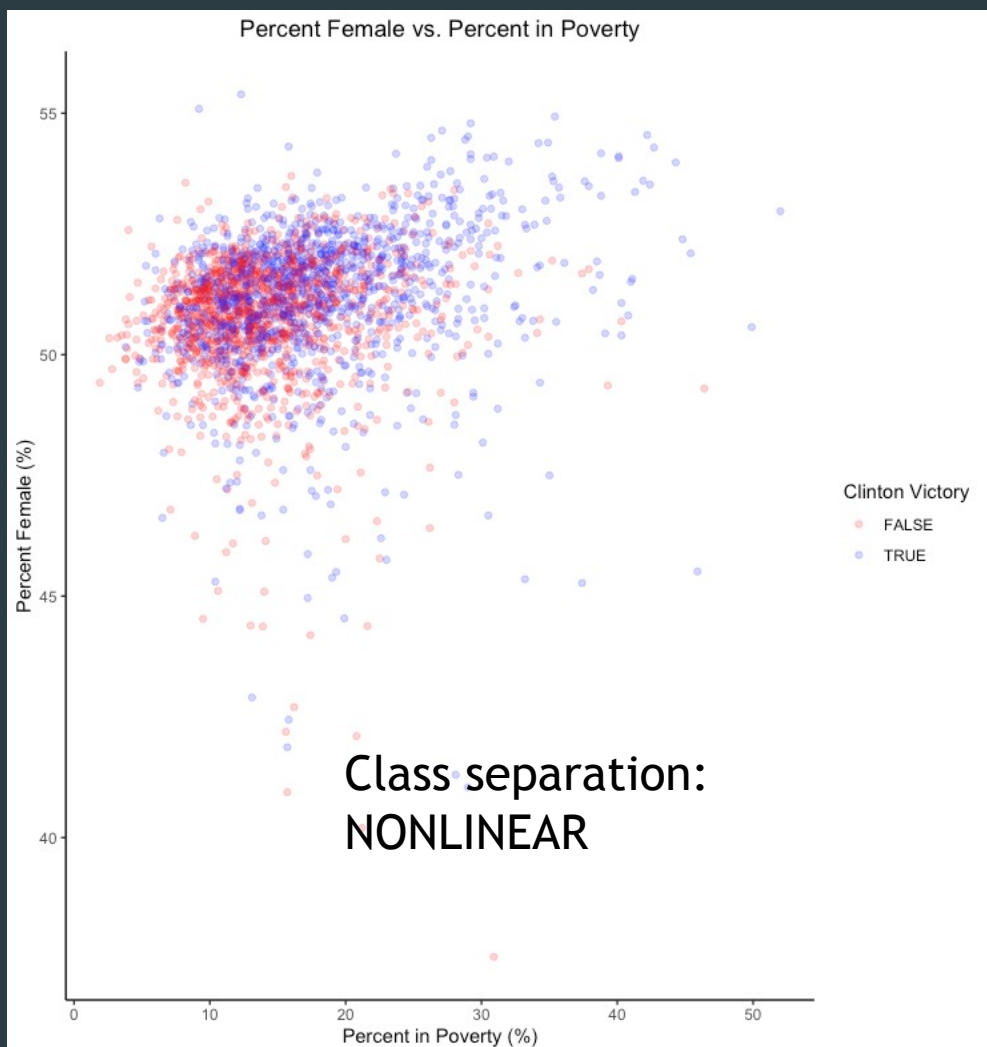
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Language

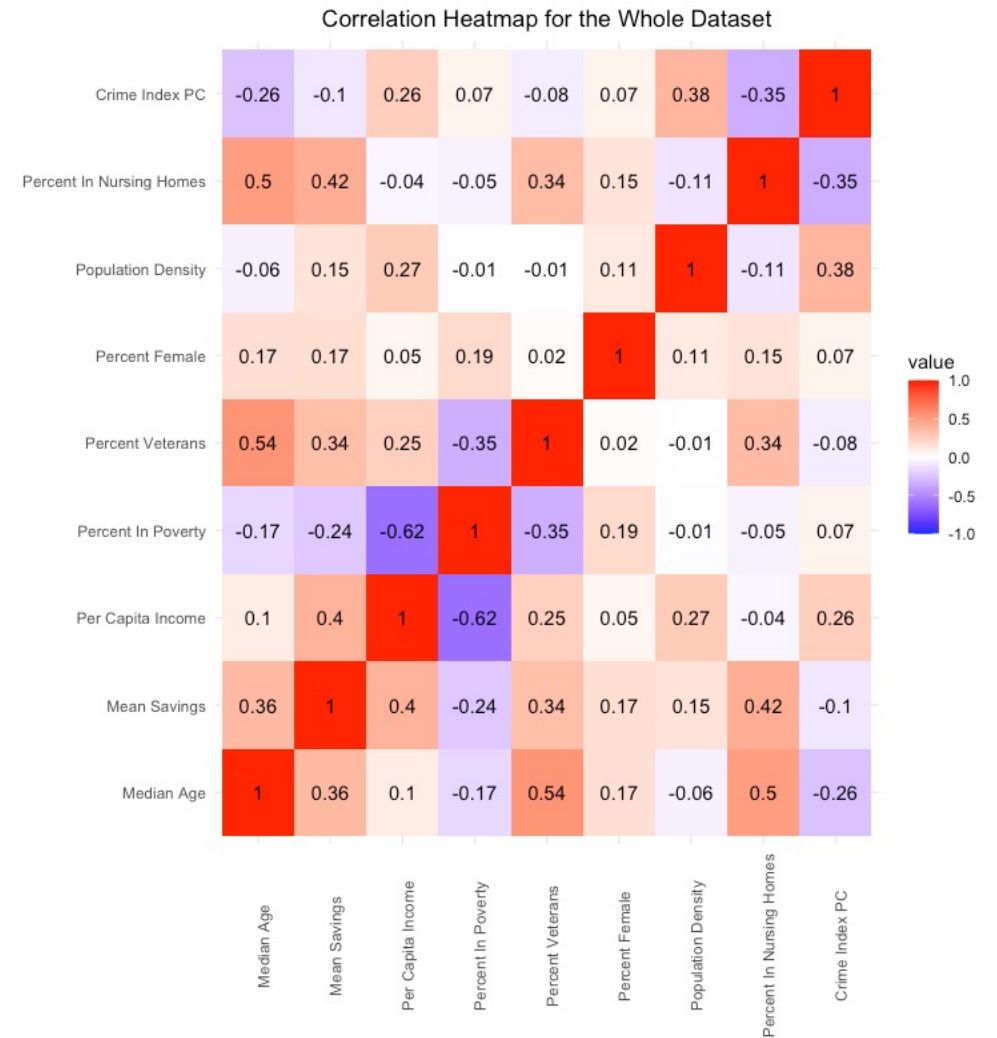
An example of a Wikipedia table that was scraped

Exploratory Data Analysis (EDA)



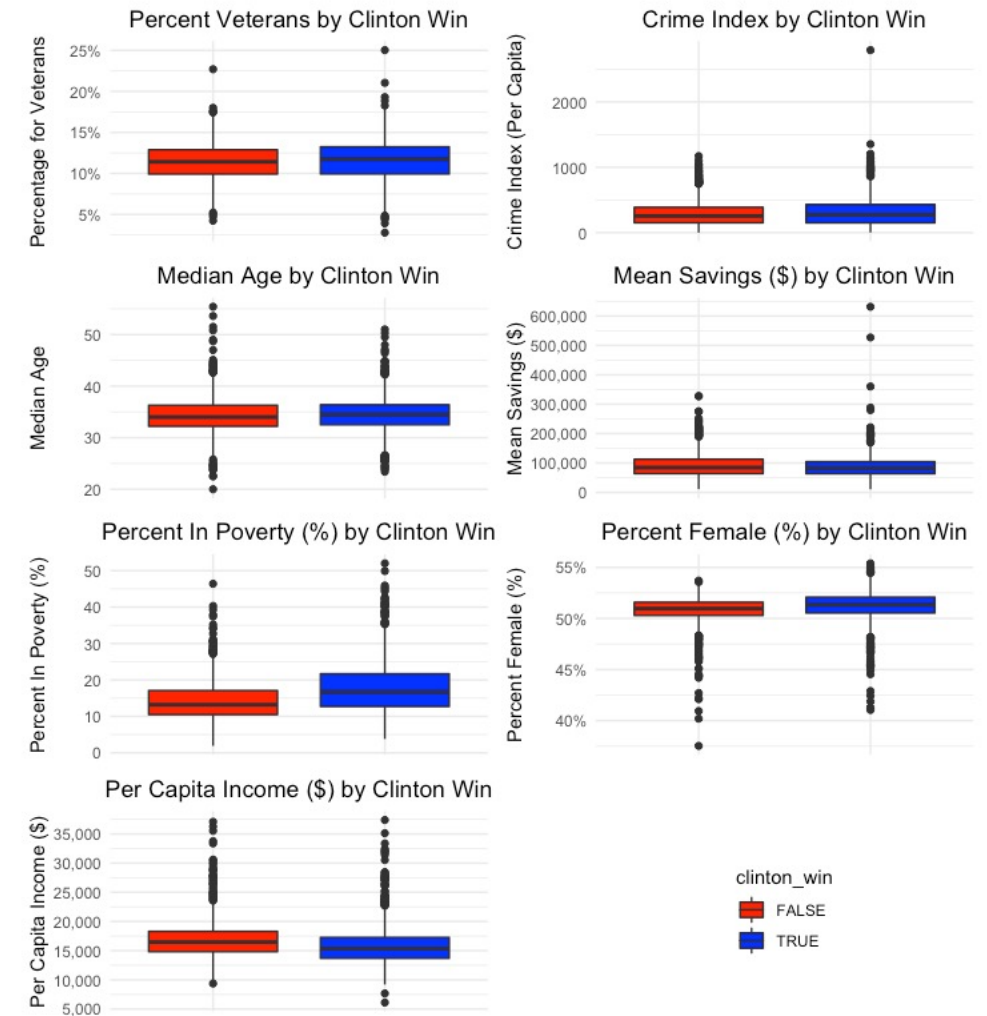
More EDA

- Moderately strong correlation between variables
- PCA might be appropriate



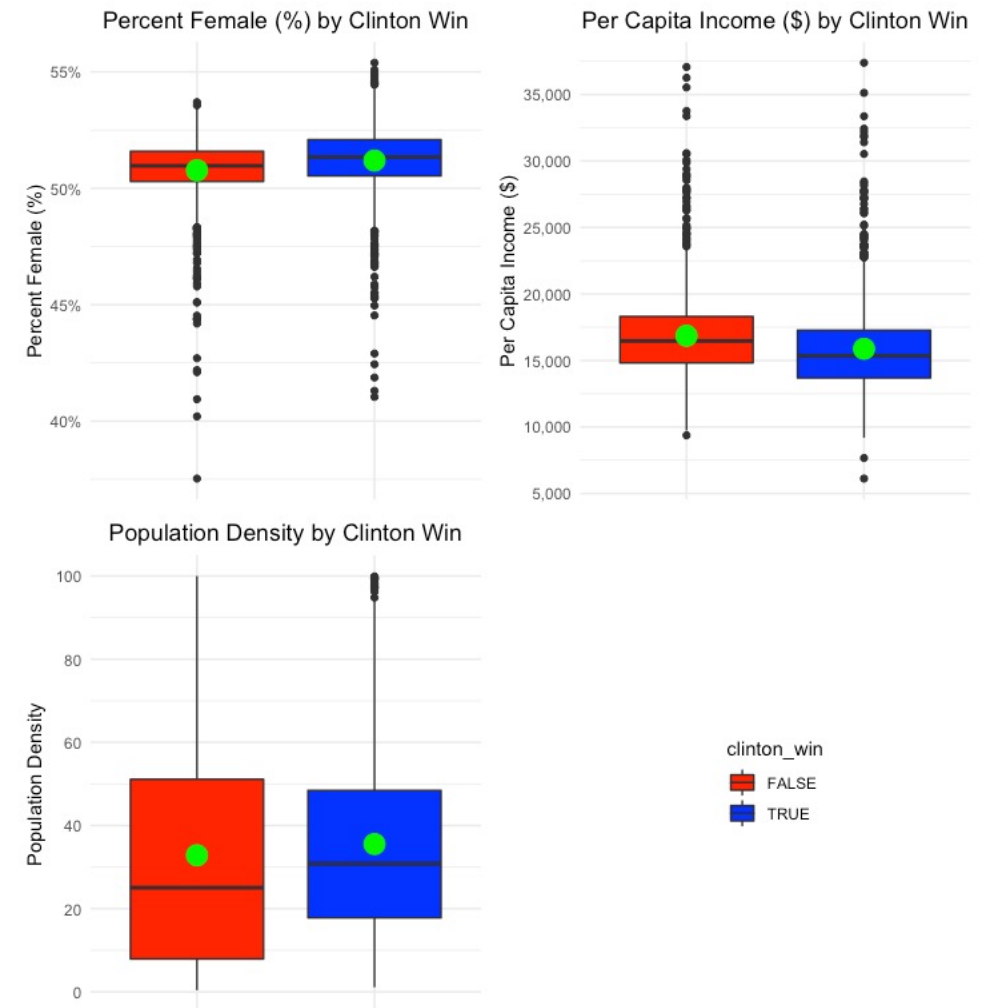
More EDA

- Appearance: small difference between different census measure
- Large sample size -> more power



Question 1: MANOVA

- ▶ Use Wilk's test
- ▶ F test statistic: 11.493
- ▶ $P\text{-value} < 0.00001$
- ▶ Important variables (ANOVA)
 - ▶ Mean Savings: $p < 0.001$
 - ▶ PC Income: $p < 0.0001$
 - ▶ % Female: $p < 0.0001$
 - ▶ Population Dens.: $p < 0.005$
 - ▶ % in poverty: $p < 0.0001$



Question 2:

Predictive Modeling

- ▶ Three Models

- ▶ KNN, Random Forest, Dense Deep-Learning Neural Network (DLNN)

- ▶ Train test split: 80%/20%

- ▶ KNN

- ▶ K=5

- ▶ Random Forest

- ▶ # of Trees: 150
 - ▶ variables at each split : 1

- ▶ DLNN (All were similarly bad)

- ▶ # of hidden layers: 5

- ▶ # of hidden units:

- ▶ 32

- ▶ 64

- ▶ 128

- ▶ 64

- ▶ 32

- ▶ Dropout rate: 10%

- ▶ Activation function: Sigmoid

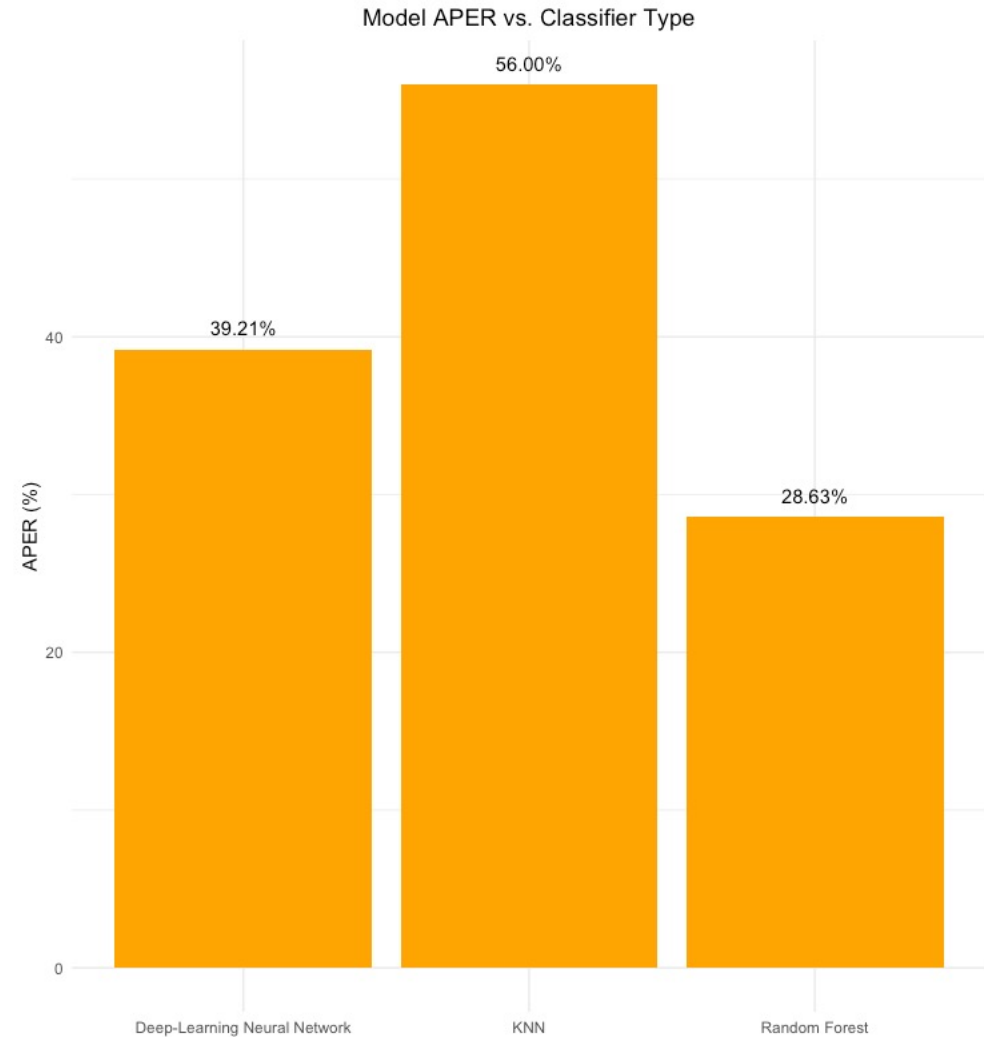
- ▶ Loss function = “binary cross entropy”

- ▶ Optimizer = “RMSprop”

Question 2:

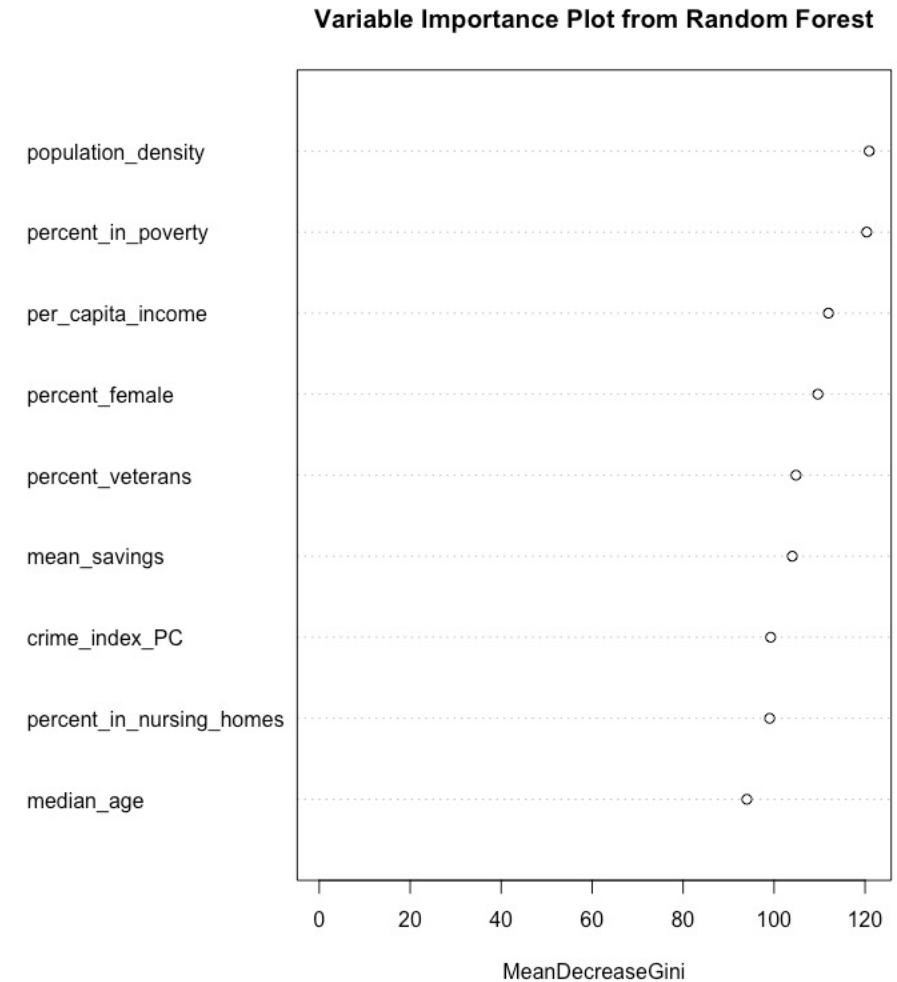
Predictive Modeling

- ▶ Random forest - highest performer
- ▶ Neural Network
 - ▶ Not enough data (inconclusive)
- ▶ There are more ML models
 - ▶ I chose just three
- ▶ I should've considered statistical models
 - ▶ ML offers no advantage sometimes
- ▶ We're ignoring the temporal and cyclical nature of election cycles - this is the future of this study (Time series models, RNNs)



Question 3: Variable Importance

- ▶ Random forest - highest performer: Population Density
- ▶ Random forest importance is *the same as* ANOVA results



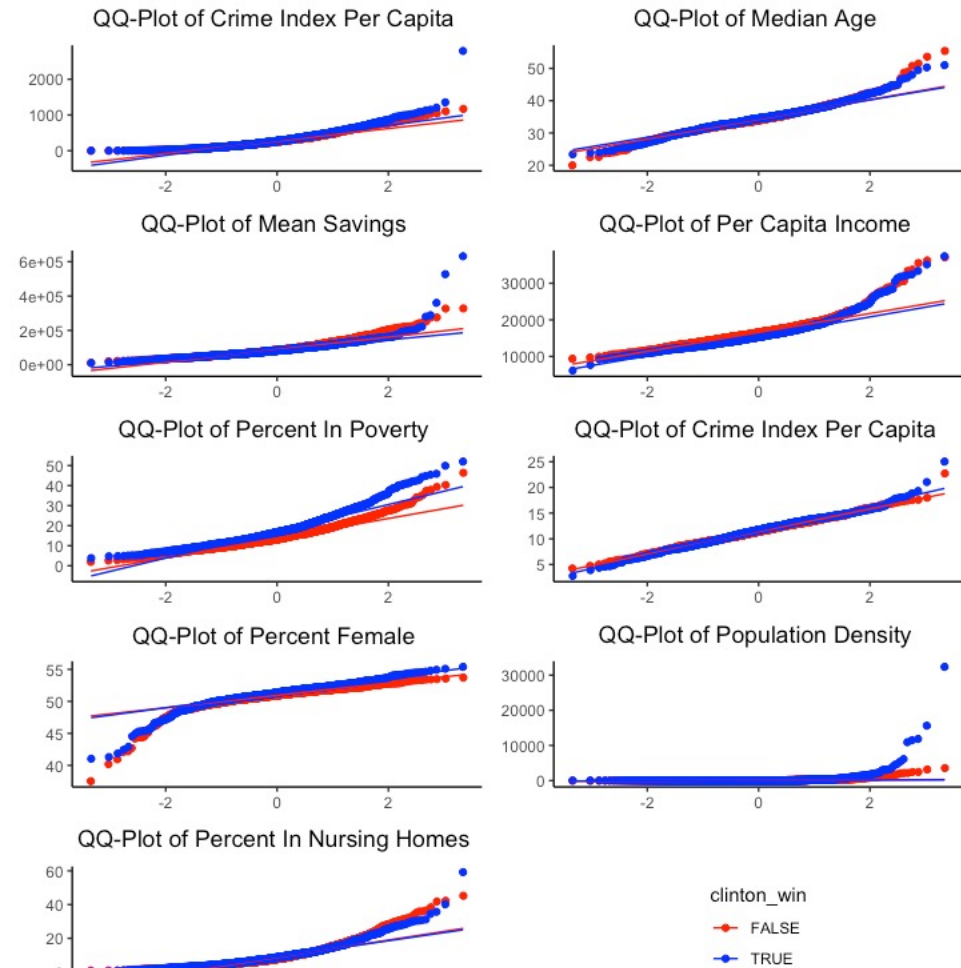
Conclusion

- ▶ There are differences in census measurement that voted for democratic vs. republican
- ▶ Modeling elections is difficult, but possible
 - ▶ Current baseline: random forest
 - ▶ Future: Time-series model, RNN
- ▶ Population density, % female, PC income, % in poverty - same as individual ANOVA results

- ▶ Future Work:
 - ▶ Add interaction effects between important variables
 - ▶ Time-series models
 - ▶ Optimize Parameters (grid search)
 - ▶ Use cross-validation

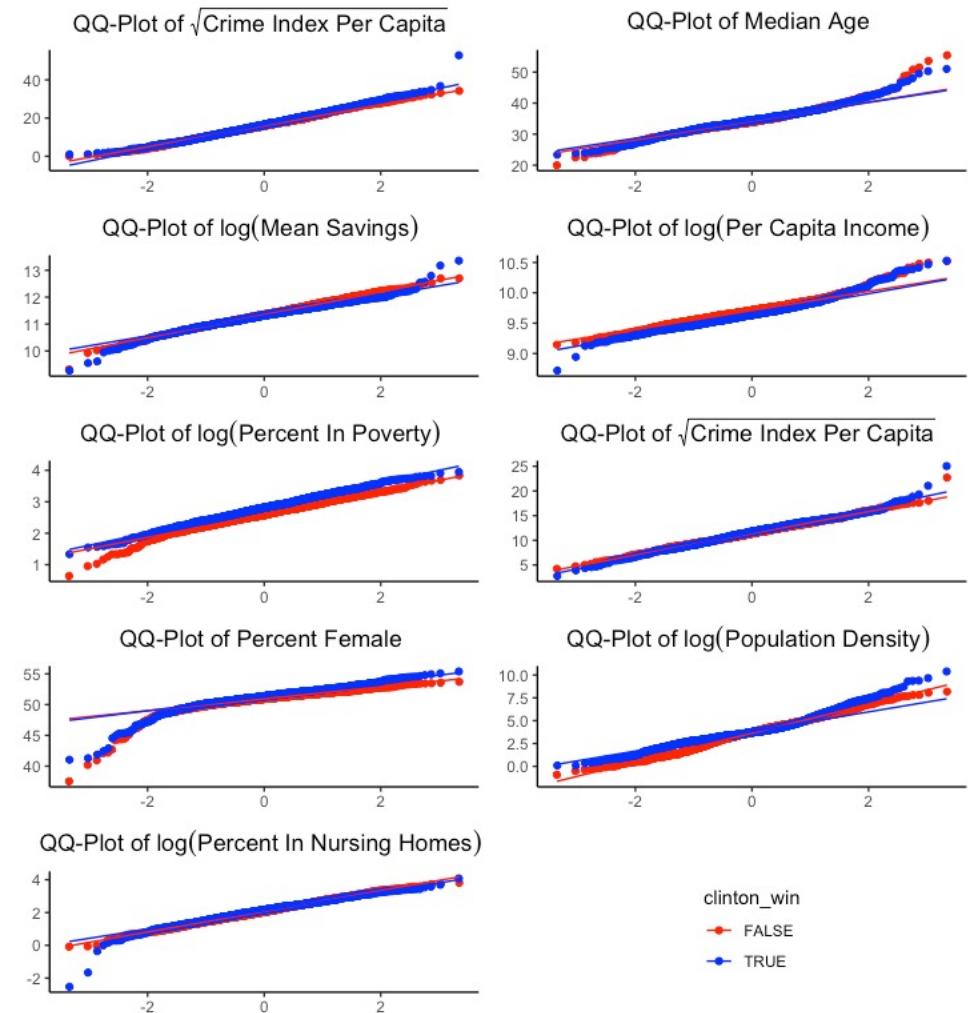
Additional Graphs

► Grouped raw QQ - plots



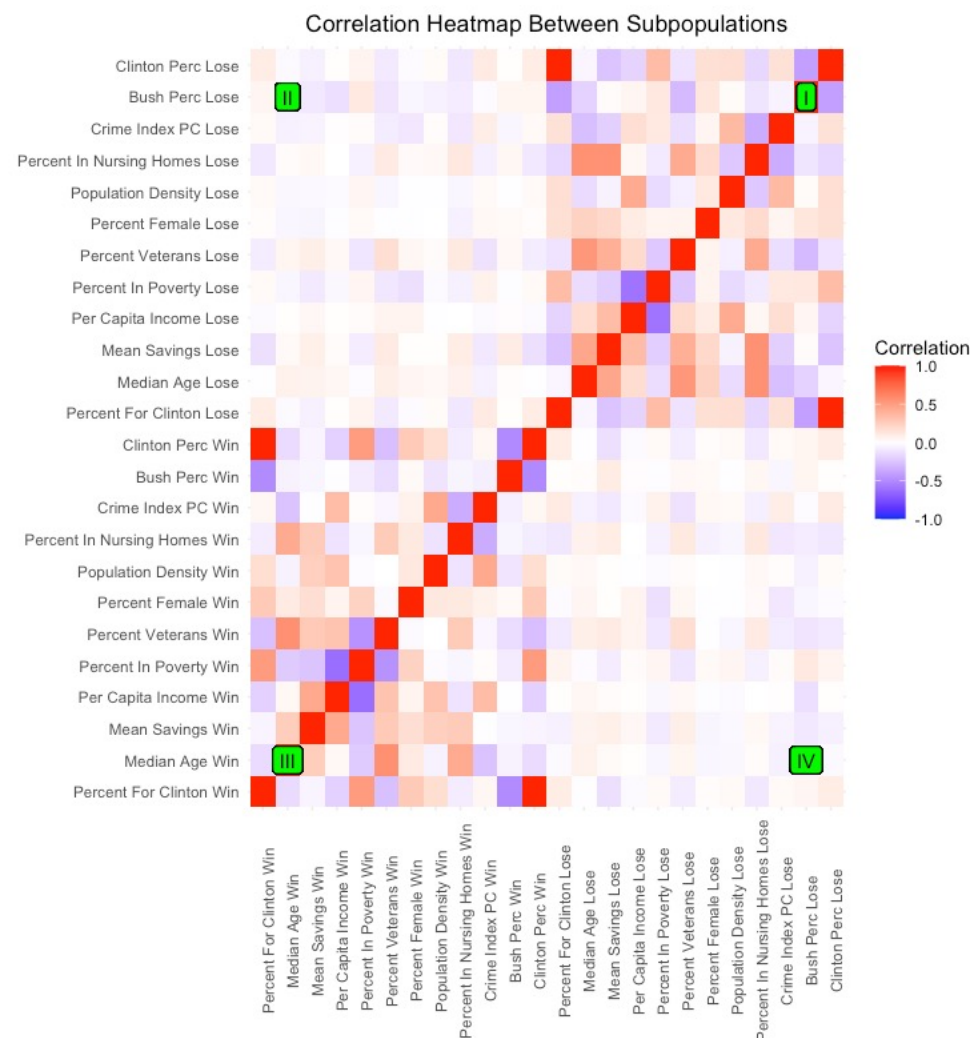
Additional Graphs

- Grouped transformed QQ - plots



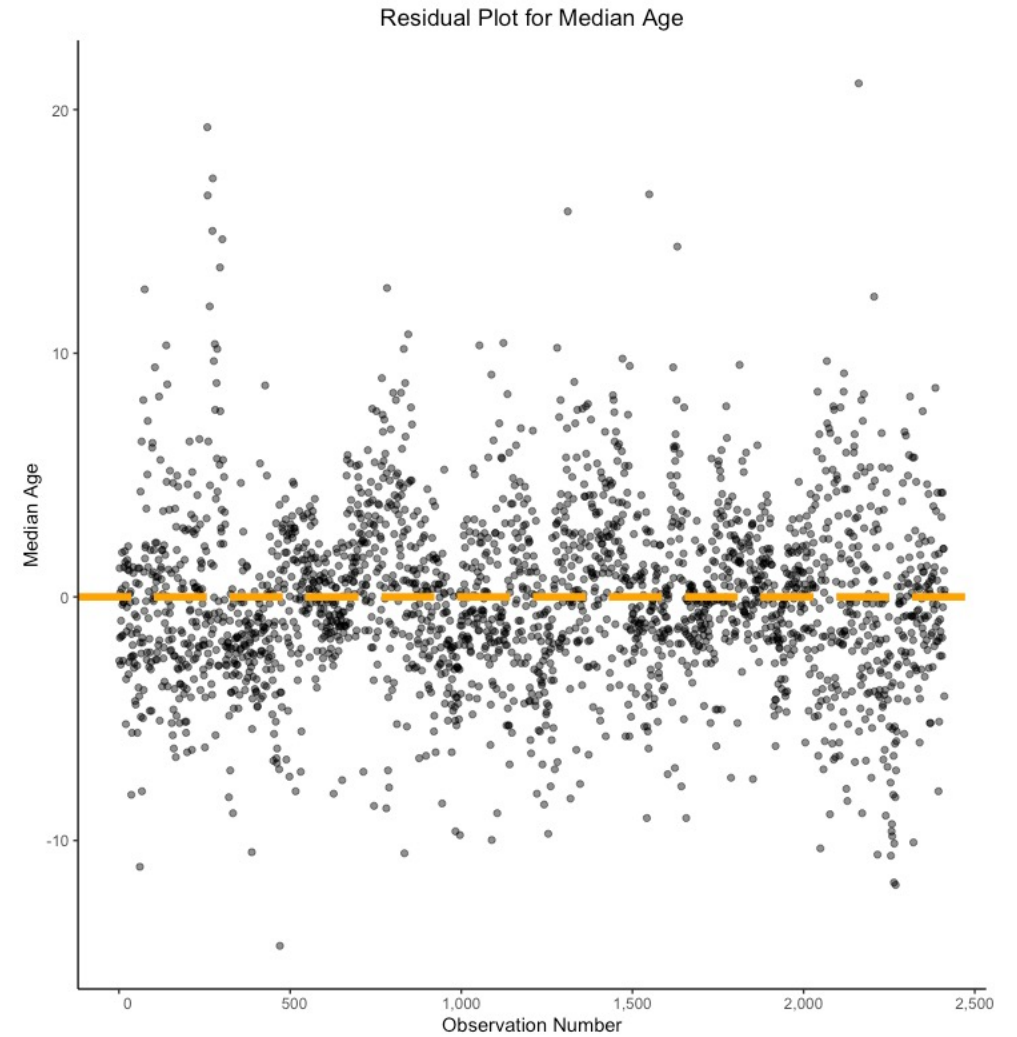
Additional Graphs

► Subpopulation heatmap



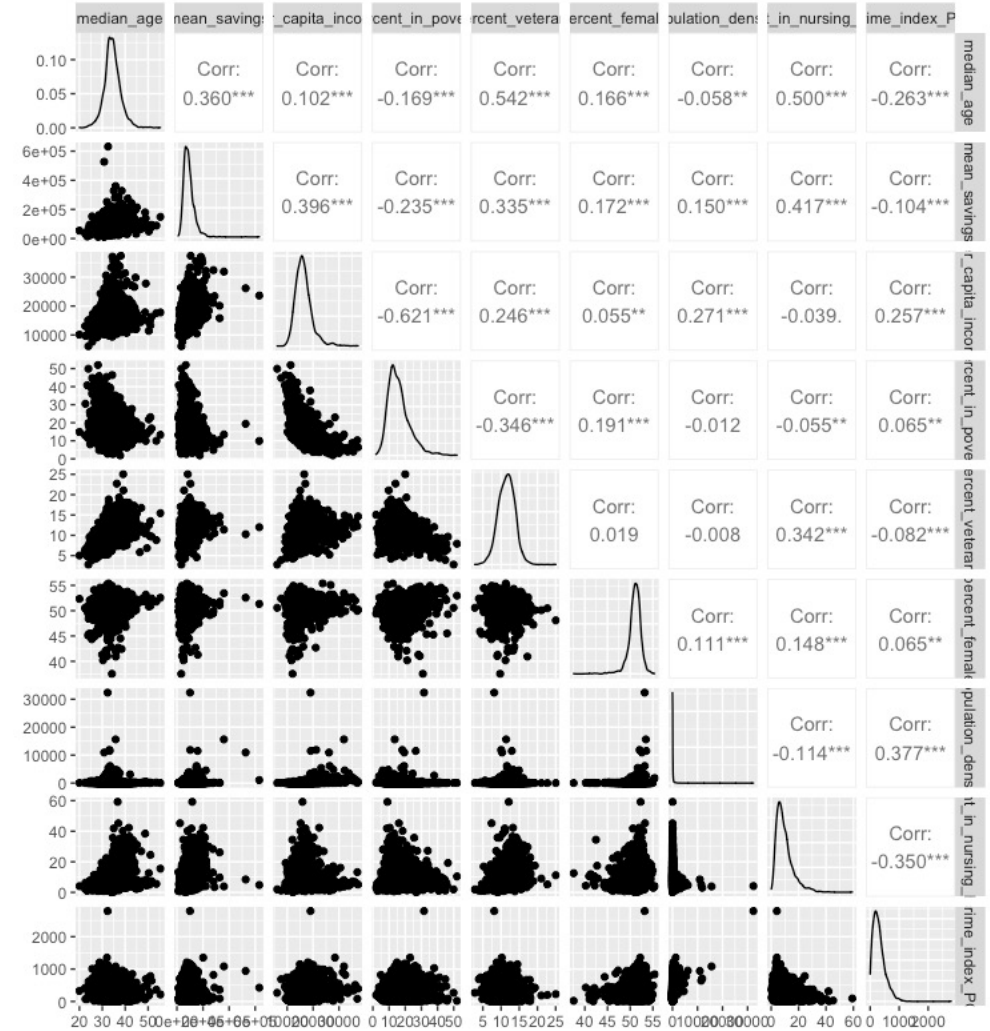
Additional Graphs

- Residual Plot - MANOVA



Additional Graphs

► Scatterplot matrix



My R Package VIP List

- ▶ Rvest
- ▶ Dplyr
- ▶ Stringr
- ▶ ggplot2
- ▶ Keras

