## **Michael Minn**

Department of Geography and Geographic Information Science, College of Liberal Arts and Sciences, University of Illinois

## **LITERATURE REVIEW**

- In the 2016 US presidential election, Hillary Clinton underperfomed compared to Barak Obama in 2012 (Ball 2016).
- Lewis-Black and Quinlin (2019) examine evidence of a broad range of factors that have spatio-demographic components.
- However McCall and Orloff (2017) note the significance of identity politics in the outcome, which may not appear in spatio-demographic patterns.
- Goldman et al. (2019) associate deaths of despair as a proxy for a broader range of social challenges that may have been manifest in the results.

# **RESEARCH QUESTIONS**

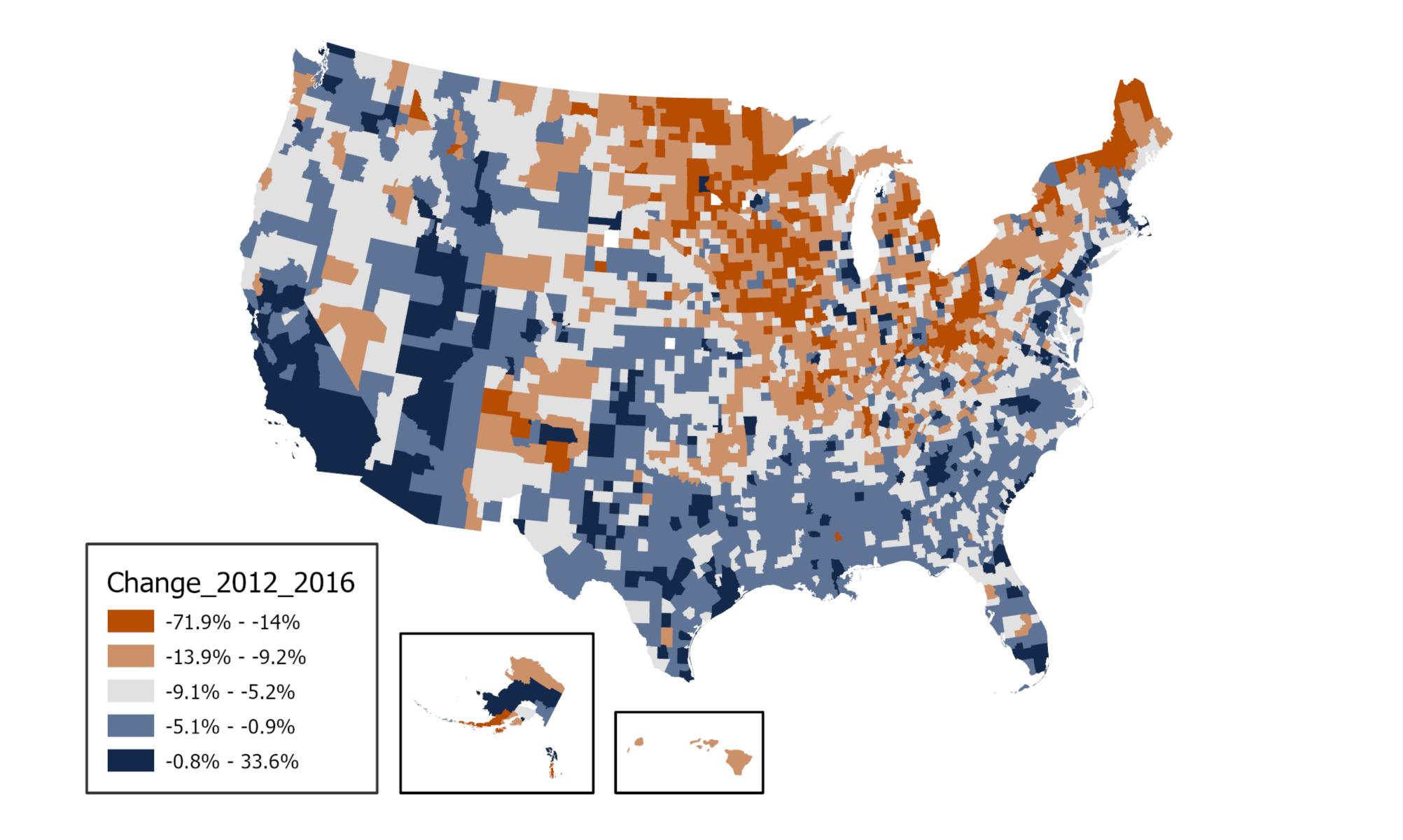
- Where did Hillary Clinton underperform in 2016 compared to Barak Obama in 2012?
- What demographic factors were associated with that underperformance.
- What spatial patterns hint at non-demographic factors associated with that underperformance.

# **METHODS AND DATA SOURCES**

- ArcGIS Pro 3.0.3
- Exploratory Regression
- Ordinary Least Squares Regression
- Global Moran's I
- County level electoral results from state secretaries of state offices
- Demographic data from the US Census Bureau's 2015-2019 American Community Survey five-year estimates



# **DEMOCRATIC UNDERPERFORMANCE IN THE 2016 vs. 2012 ELECTION**





## Input Features

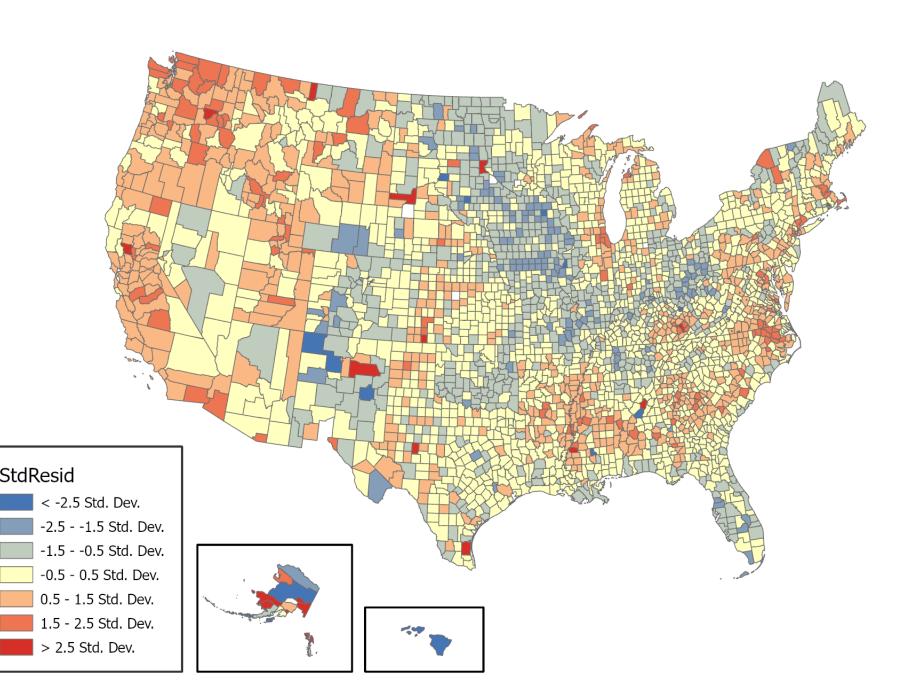
Number of Observations Multiple R-Squared['d'] Joint F-Statistic['e'] Joint Wald Statistic['e'] Koenker (BP) Statistic['f'] [argue-Bera Statistic['g']

## **OLS Diagnostics**

Counties	Dependent Variable	CHANGE_2012_2016
3121	Akaike's Information Criterion (AICc)['d']	17247.061906
0.472931	Adjusted R-Squared['d']	0.472085
559.008755	Prob(>F), (5,3115) degrees of freedom	0.000000*
2131.425036	Prob(>chi-squared), (5) degrees of freedom	0.000000*
79.574383	Prob(>chi-squared), (5) degrees of freedom	0.000000*
87182.933816	Prob(>chi-squared), (2) degrees of freedom	0.000000*

Std	R

Variable	Coef	StdError	t_Stat	Prob	Robust_SE	Robust_t	Robust_Pr	StdCoef
Intercept	15.752436	0.723694	21.76671	0	0.84585	18.623211	0	0
LATITUDE	-0.538228	0.014651	-36.736999	0	0.02146	-25.080133	0	-0.525259
LAND_SQUARE_MILES	0.000267	0.00002	13.222732	0	0.00005	5.383511	0	0.179186
PERCENT_DEM_2012	-0.059848	0.00483	-12.391841	0	0.007677	-7.795454	0	-0.166873
MEDIAN_AGE	-0.164764	0.013264	-12.42146	0	0.014453	-11.40015	0	-0.16859
PERCENT_BACHELORS	0.476536	0.012905	36.926678	0	0.013749	34.660792	0	0.513895



- S56.



## CONCLUSIONS

Exploratory regression finds the best model (adjusted R-squared of 0.472) includes latitude (strong negative), county size (positive), percent 2012 vote (negative), median age (negative), and percent with a bachelor's degree (strong positive).

• Low VIF indicates no meaningful multicollinearity.

However, a Moran's I of 0.19 indicates significant autocorrelation in the residuals, which, along with the strength of latitude, makes the coefficients unreliable.

These results corroborate the importance of missing non-demographic factors, like the effectiveness of the campaigns, the influence of media, structural biases, and the unique strengths and weaknesses of the candidates.

## REFERENCES

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Goldman, Lee, Maribel P. Lim, Qixuan Chen, Peng Jin, Peter Muennig, and Andrew Vagelos. 2019. Independent Relationship of Changes in Death Rates with Changes in US Presidential Voting. Journal of General Internal Medicine 34, 363–371. https://doi.org/10.1007/s11606-018-4568-6

Lewis-Beck, Michael S. and Stephen. Quinlan. 2019. The Hillary Hypotheses: Testing Candidate Views of Loss. Perspectives on Politics 17 (3), 646 - 665. https://doi.org/10.1017/S153759271800347X.

McCall, Leslie and Ann Shola Orloff. 2017. The multidimensional politics of inequality: taking stock of identity politics in the U.S. Presidential election of 2016. The British Journal of Sociology 68 (51), S34 -

# **ILLINOIS**