# **Explaining nationalist political views: The case of Donald Trump**

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#### **Abstract**

The 2016 US presidential nominee Donald Trump has broken with the policies of previous Republican Party presidents on trade, immigration, and war, in favor of a more nationalist and populist platform. Using detailed Gallup survey data for a large number of American adults, I analyze the individual and geographic factors that predict a higher probability of viewing Trump favorably and contrast the results with those found for other candidates. The results show mixed evidence that economic distress has motivated Trump support. His supporters are less educated and more likely to work in blue collar occupations, but they earn relative high household incomes, and living in areas more exposed to trade or immigration does not increase Trump support. There is stronger evidence that racial isolation and less strictly economic measures of social status, namely health and intergenerational mobility, are robustly predictive of more favorable views toward Trump, and these factors predict support for him but not other Republican presidential candidates.

## Introduction

The 2016 Republican Party presidential nominee in the United States is Donald Trump, a man who has based his campaign largely on restricting immigration, in part by building a large wall along the border with Mexico and barring Muslims from entering the country, and restricting trade, by re-negotiating trade agreements and imposing tariffs on China and possibly other countries. His first foray into national polictics created headlines by accusing President Barak Obama of having conspired to forge his US-based birth certificate, despite the insistence of state officials from Hawaii that he was born there and they still have his birth certificate on record. With these positions and others, including his criticism of former president George W. Bush and the Iraq War, Trump's candidacy has attracted the support of right-wing nationalists, and provoked criticism from Republican party media and political leaders.

This article examines the characterisics of Trump's supporters with a view to establishing broader insight into what factors motivate nationalist political identification. Trump's nationalist appeals were evident in his acceptance speech of the Republican Party's nomination:

"The most important difference between our plan and that of our opponents, is that our plan will put America First. Americanism, not globalism, will be our credo. As long as we are led by politicians who will not put America First, then we can be assured that other nations will not treat America with respect. This will all change in 2017. The American People will come first once again."

There is a large literature on historic and contemporary nationalist or nativist parities in Europe (Muddle 2007). In a study of perhaps the most infamous party, the geography of voting patters reveal that the political supporters of Hitler's National Socialist party were largely comprised of rural Protestants and of the non-farm population those in lower-middle class administrive occupations or working class occupations, likely with much education than their counterparts (Hamilton 2014).

In work closely related to this project, Mansfield and Mutz (2009) find that ethnocentrist and islationist world-views predict opposition to free trade, and after accounting for these factors, invididual economic characteristics such as education are not signfiicant. In a similar analysis, but of support for outsourcing, Mansfield and Mutz (2013) find that nationalism, ethnocentristm, and isolationism predict opposition to outsourcing, but objective econmic threat—in terms of occupational or industrial employment—does not. The implication of these studies that is that rational self-interest is less relevant to political preferences than nationalist and related attitudes.

Quite recently, the 2016 "Brexit" referendum, in which a majority of UK voters decided to leave the European Union, revealed stark divisions at small geographic units. Local authority areas

<sup>&</sup>lt;sup>1</sup> See campaign website, <a href="https://www.donaldjtrump.com/positions">https://www.donaldjtrump.com/positions</a>; Reinhard, B and Paletta, D. "Donald Trump Back-Pedals on Banning Muslims From U.S." Wall Street Journal June 28, 2016.

<sup>&</sup>lt;sup>2</sup> Garret Epps, Trump's Birther Libel, The Atlantic, February 26, 2016.

<sup>&</sup>lt;sup>3</sup> Taub, A. The rise of American authoritarianism, Vox March 1, 2016, available at http://www.vox.com/2016/3/1/11127424/trump-authoritarianism#fear

<sup>&</sup>lt;sup>4</sup> Donald J Trump, Republican National Convention speech, Jul 21, 2016, available at, <a href="http://www.politico.com/story/2016/07/full-transcript-donald-trump-nomination-acceptance-speech-at-rnc-225974#ixzz4FiNnOL3l">http://www.politico.com/story/2016/07/full-transcript-donald-trump-nomination-acceptance-speech-at-rnc-225974#ixzz4FiNnOL3l</a>

with the following characteristics tended to vote to leave: less post-secondary educational attainment, lower test scores, older residents, with fewer immigrants and lower incomes.<sup>5</sup>

Yet, there is scant empirical literature explaining why people support extreme political views generally and right-wing nationalism in particular. A small body of research likens the rise of more extreme politics in the United States "(political polarization") to shocks from import competition (Autor, Dorn, Hanson, and Majlesi 2016) or income inequality (McCarth, Rosenthal, and Poole 2006), though neither study considers nationalist political views akin to Trump's "America first" rhetoric and proposals.

Even if income or other standard economic measures are not especially helpful in explaining nationalism, ill-health and cultural behaviors and attitudes may be more revealing. Beyond standard economic measures, there is evidence that whites are unusually pessimistic about their well-being, after adjusting for other factors (Graham forthcoming). Specifically, lower-income whites and older whites exhibit this pessimism compared to other groups (ibid).<sup>6</sup> Along these lines, middle-aged whites have experienced a rise in mortality rates in the last decade and a half (Case and Deaton 2015).

Additionally, there is a large body of theoretical and empirical literature explaining the conditions of inter-group conflict. In the early 20<sup>th</sup> century, research on the military, policing, and public housing found that inter-group conflict reduced prejudice toward African-Americans (Pettigrew and Tropp 2006; 2011). The American pyshcologist Gordon Allport (1954) is credited with establishing this theory in the social science literature, and he further stipulated that contact reduces prejudice when certain conditions are met: equal status between groups; cooperatively working toward common goals, and under the support of an external authority (Pettigrew and Tropp 2006; 2011).

Since, then a large literature has confirmed Allport's theory, and even found that the conditions do not necessarily need to be present, at least in modern settings, in which formal civil right laws have already been established (Pettigrew and Tropp 2006). At the personal level, one recent study finds that friendly contact with other groups reduces anxiety around the threat of rejection and eases comfort with physical and conversational engagement (Barlow et al 2009). At the scale of metropolitan areas, Rothwell (2012) finds that racial segregation but not diversity predicts lower levels of social capital, measured by trust and volunteering, in the United States.

In so far as nationalist political attitudes are characterized by suspicion of ethnic outsiders, contact theory would predict less support for nationalist political parties. In a direct test of that hypothesis, Biggs and Knauss (2012) find that neighborhood level exposure to minorities predicts lower membership rates in British nationalist parities. These neighborhood level correlations would be biased if people sort into neighborhoods based on political preferences, but Kaufmann and Harris (2015) finds no evidence of geographic sorting based on nationalist political views. In related work, Jorgen Soreson (2014) finds that an initial wave of immigration

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and positive when interacted with low income status or age for blacks and Asians.

<sup>&</sup>lt;sup>5</sup> The Guardian, "EU Referendum Results and Full Analysis," accessed July 29, 2016, available at <a href="http://www.theguardian.com/politics/ng-interactive/2016/jun/23/eu-referendum-live-results-and-analysis">http://www.theguardian.com/politics/ng-interactive/2016/jun/23/eu-referendum-live-results-and-analysis</a>
<sup>6</sup> See Chapter 4 of Graham (forthcoming), which shows regressions of anticipated life satisfaction in five-years on dummy variables for race interacted with income (Table 4.2a) and age (Table 4.2b). The black and Hispanic coefficients are significant and positive by themselves (relative to whites) and significant

at the local level increased support for a right-wing party in Norway, but the effect quickly faded out, which the author suggests is the result of direct contact with immigrants.

This analysis attempts to explain the characteristics of Trump supporters and test two hypotheses:

- 1. Social hardship increases the likelihood of Trump support
- 2. Contact with immigrants or racial minorities reduces the likelihood of Trump support
- 3. Exposure to trade competition increases support for Trump

For the first, I distinguish between traditional measures of economic hardship like income and employment status in favor of measures of health and intergenerational mobility. The former is a core component of well-being, and the latter may be related to one's hope for the furture well-being of offspring, which may, in turn, directly affect personal well-being and level of satisfaction with the political status quo.

To test the second hypothesis, I analyze the degree of neighborhood segregation and distance to the Mexican border, and for the third, I predict how support for Trump varies by the share of employment in the manufacturing sector, as well as various other measures as robustness checks.

The paper proceeds with a description of the data and methods, a summary of the ideological differences between Trump supporters and other groups, particularly other Republicans, and a broader summary of the microdata used. The empircal section highlights the individual and geographic correlaries of Trump support, in light of the hypothesis desribed above. The discussion concludes with an effort to situate these findings in a larger theoretical context.

## Data and analysis

The main data are Gallup Daily Tracking survey microdata, collected from July 8, 2015 through July 25, 2016. 93,207 American adults were asked if they hold a favorable view of Donald Trump over this period. Of these, 87,428 responsed either yes or no (with 65% reporting an unfavorable view). 4% reported no opinion, 1% percent said they hadn't heard of him, and less than one percent refused to answer. The analysis discards observations from those who did not answer yes or no. Survey weights developed by Gallup methodologists were applied to make the sample size nationally representative. This is a very large sample size relative to the two thousand or less used in comparable studies (eg Mansield and Matz 2009, 2013).

The principal method used is multi-variable probit regression, designed to estimate how various factors are associated with the binary probability of holding a favorable view of Trump in Gallup's Daily Tracking surveys. The data were collected from July 8, 2015 to July 25, 2016 and Trump favorability could be analyzed for 87,428 observations, in which a respondent answered either favorable or unfavorable. Those who did not know or refused were excluded from this analysis.

A county level indicator from the Gallup surveys was linked to CZs using a county-CZ crosswalk developed by David Dorn and made available on his personal website. Zip-code level data from the US Census was linked to Gallup survey data, which contains zip codes, by converting zip

code tabulation areas (ZCTAs) to traditional zip codes using a crosswalk funded by the US Health Resources and Service Administration.<sup>7</sup>

Equation one shows the basic model.

$$1. P \left[ T_{i,c} \right] = I_{i,c} + C_c + \varepsilon_{i,c}$$

The probability of individial *i* residing in commuting zone *c* of holding a favorable view of Trump is modelled as a funciton of a vector of individual characteristics (*I*) and commuting zone characteristics (*C*). The residual is assumed to have both an individual and commuting zone component, and errors are clustered at the commuting zone level to account for within CZ correlations. Sample weights are also applied to make the analysis representative at the national level. The analysis also includes the date of the interview to account for the fact that voters may have changed their views based on the candidates performance during the primary elections and campaign. This basic set up will also be repeated to mesaure favorability toward other candidates to compare the results against Trump.

The *I* term contains various demogrpahic measures, shown below, and the C term examines:

- distance to the Mexican border;
- the manufacturing share of employment;
- intergeneratinal mobility
- racial segregation;
- mortality rates
- educational attainment
- population

Distance to Mexico was calculated by first allocating the centroid longitude and latitude coordinates for the largest county by 2010 population to each commuting zone, using data from American Fact Finder and the 2010 Decennial Census. Second, distance between these CZs and the Mexican border was approximated by grouping CZs into longitudinal regions and calculating their distance to one of five border MSAs using the "vincenty" command in STATA, based on their longitude: San Diego, for the westernmost CZs with longitudinal coordinates less than -115.345; Yuma (-115.3 to -112.8); Tucson (-112.8 to -109.0); El Paso (-109.0 to -102.2); McAllen (>-102.2).

The manufacturing share of employment is calculated using data from the QCEW. Since data suppressions are present in even the high level data file, the analysis is supplemented using manufacturing and other employment level estimates from Acemoglu et al (2016). They developed a method to impute over County Business Patterns data suppressions and have made their data available. The analysis also uses an index of Chinese import exposure from Autor, Dorn, and Hanson (2013).

To measure potential political preferences stemming from a lack of inter-generational mobility, the analysis uses a measure of intergenerational mobility at the CZ level from Chetty et al (2014), which they constructed using an Internal Revenue Service database of all federal tax records for individuals born between 1980 and 1982, which they linked to the tax records of their parents. Intergenerational mobility is caluclated as the average CZ national income rank at age

<sup>&</sup>lt;sup>7</sup> UDS Mapper, Zip Code to ZCTA Crosswalk, available at http://udsmapper.org/zcta-crosswalk.cfm

30, for individuals raised at the 25<sup>th</sup> percentile of the national income distribution, using family income between ages 15 and 20. Chetty and Hendren (2015) subsequently developed a method to estimate the causal effect of a commuting zone on intergenerational mobility, to eliminate effects from migration. This causal effect on intergenerational mobility is the preferred variable for this analysis, because it filters out local migratory effects.

Racial segregation in this anlaysis is measured by matching survey respondent zip codes to census population data (originally from ZCTAs) from the 2010-2014 5-year Ameican Community Survey. Segregation is measured in two ways. The first uses the difference in the white share of population at the zip code and CZ levels. The second uses the ratio of CZ diversity to zip code diversity, using standard diversity index measures.

- 1. Racial isoaltion of whites = zip code share white CZ share white
- 2.  $Racial\ isolation = \frac{Diversity\ index\ CZ}{Diversity\ index\ zip}$

whereby Diversity index = 
$$1 - \sum (p_g^2)$$

For both, higher values indicate greater segregation. The overall white share of the CZ population is included as a control variable in the first and overal CZ diversity is included as a control in the second.

Health status for likely Trump supporters is measured using the 2014 mortality rate for white non-hispanics aged 45 to 54. These data are from the US Centers for Disease Control (CDC Wonder). County level total deaths and population were aggregated to the CZ level. All causes of death were included. To supplement the analysis, data from Chetty et al (2016) are included to measure life expectancy at birth at various income levels for the entire CZ population.

CZ level population and educational attianment data are calcualted from county data available from the 2010-2014 American Community Survey.

Any analysis looking at support for a particular politician raises the issue of whether the results are attributable to the party or the specific characteristics of the politician and his or her positions. There are also possible interaction effects between the various independent variables and race and party affiliation. To account for this, the regression models are estimated against three samples: the entire sample, a sample of all white non-Hispanics, and a sample of white non-Hispanic Republican party members. To identify the latter, a Gallup survey question ("As of today, do you lean more . . .") is used, whereby those who lean Republican or simply choose Republican are coded as Republican-party affiliated.

# **Evidence that Trump supporters differ from other Republicans**

To start, it is worth noting where Donald Trump's supporters identify themselves on the ideological spectrum. The evidence suggest Trump's supporters are significantly further to the right than even other Republicans. The Gallup Daily Tracker asks respondents to "desribe your political views" and provides options of very conservative, conservative, moderate, liberal, or very liberal. As shown in Table 1, those who view Trump favorbably are significantly more likely to identify as conversative or very conservative compared to those who do not. Of greater

interest, is the comparison between columns 3 and 4, which compare those who view Trump favorably to those who do not among only Republicans. The differences on very conservative (4 percentage points) are highly significant, with Trump supporters being further right. The total conservate share difference (12 percentage points) is also highly significant.

In addition to broad ideological orientation, Republicans who favor Trump are also significantly more likely than other Republicans to oppose trade and immigration. The Gallup Daily Tracker reserves some space for topical questions asked for bried periods of time. One question asks whether or not the respondent agrees or disagrees with the statement "End U.S. participation in free trade deals, such as NAFTA" and another states "Reform immigration laws to provide automatic green cards for high skilled workers" Among Republicans who favor, 58 percent oppose trade deals and 57 percent oppose reforming immigration. By contrast, among Republicans who do not support Trump, 42 percent oppose trade deals and 28 percent oppose reforming immigration laws.

# **Summary data**

The means and standard deviations of the full database used here, including the CZ level variables, is provided in Table 2. Trump's supporters are older, with higher household incomes, are more likely to be male, white non-Hispanic, less likely to identify as LGBTQ, less likely to hold a bachelor's degree or higher education, more liekly to be a verteran or family member of a veteran, more likely to work in a blue-collar occupation, and are more likely to be Christian and report that religion is important to them. Those who view Trump favorbaly are slightly less likely to be unemployed and more likely to be self-employed. Labor force participation is lower among Trump supporters, but not after adjusting for age. Trump supporters are much more likely to be retired. Trump supporters live in smaller commuting zones with lower college attainment rates, a somewhat higher share of jobs in manufacturing, higher mortality rates for middle-aged whites, and a higher segregation. There is no statistically significant difference between Trump supporters and non-supporters with respect to the median household income of their zip-code, a proxy for neighborhood conditions.

The next section will examine the marginal contributions of individual level variables in predicting Trump support, while holding other factors constant, and then turn to variables measured at higher levels of geograph to observe how zip code and CZ level variables affect the probability of supporting Trump, conditional on those individual factors.

### Results for individual correlates

The main results from the probit regressions are reported below in Table 1. Columns one and two use the entire survey sample but differ in their measures of segregation. Column one uses the difference in the white share of population at the zip code and CZ levels, whereas column two uses CZ diversity relative to zip code diversity. Columns three and four limit the sample to non-Hispanic whites, wherea columns 5-6 limit the respondents to Republican-Party affiliated non-Hispanic whites. This is done to distinguish between Trump support and Republican support more generally.

The individual data do not suggest that those who view Trump favorable are confronting abnormally high economic distress, by conventional measures of employment and income.

Controlling for a variety of demographic and geographic characteristics, Trump supporters are more likely to be self-employed, overall and among other whites, and other white Republicans, somewhat more likely to be unemployed overall but not among other whites or white Republicans, and no more likely to be out of the labor force compared to any group.

Higher household income predicts a greater likelihood of Trump support overall and among whites, though not among white non-Hispanic Republicans. In other words, compared to all non-supporters or even other whites, Trump supporters earn more than non-supporters, conditional on these factors, but this is partly because Republicans, in general, earn higher incomes, and the difference is no-longer significant when restricted to this group. The measure of household income reported imputes the mid-point of income brackets that respondents identifed themselves as being in.

Using an alternative mesaure of income, suggests Trump supporters earn more than even other white non-Hispanic Republicans, conditional on education and other factors. The alternative income measures imputes within self-reported brackets using the median incomes of people in the same state, income bracket, and age group, based on data from the IPUMS-CPS 2015 Annual Social and Economic Supplement. Trump supporters earn significantly higher household incomes in all segments using the CPS-imputed data.

On the other hand, workers in blue collar occupations (defined as production, construction, installation, maintenance, and repair, or transporation) are far more likely to support Trump, as are those with less education. People with graduate degrees are particularly unlikely to view Trump favorably. Since blue collar and less educated workers have faced greater economic distress in recent years, this provides some evidence that economic hardship and lower-socio-economic status boost Trump's popularity.

Still, Hispanics and blacks are roughly 20 percentage points less likely to view Trump favorably than non-Hispanic, even controlling for income, education, and many other variables. This is strong evidence that economic factors alone cannot account for his support. 14 percent of blacks and Hispanic adults view Trump favorably, and this rises to just 16 percent among black and Hispanics working in blue collar occupations, a statistically significant but very small difference.

## Results for higher geographic correlates

Segregation, mortality, distance to Mexico, and lower college education shares are all robustly predictive of Trump support across these samples. Exposure to manufacturing tends to predict significantly lower Trump support. (All CZ level variables are standardized to faciliate comparisions of effect sizes, and the results are reported at the bottom of Table 1).

People living in zip codes with disproportionately high shares of white residents are significantly and robustly more likely to view Trump favorably. A one standard deviation in the racial isoaltion index predicts a 2.9 percentage point increase in Trump's popularity. This holds among white non-Hispanics and white-non Hispanic Republicans, though the strength of the relationship falls to 1.8 percentage points.

Those living in zip codes with overall diversity that is low relative to their commuting zone are also far more likely to view Trump favorably. This holds across samples, though unlike white racial isoaltion, it is not significant among white non-Hispanic republicans. However, a simple

mesaure of racial diversity at the zip code level predicts lower support for Trump even among this group and in the larger samples as well.

These results provide strong support for contact theory, and they are bolstered further by the strong relationship between distance to Mexico and support for Trump. A standard deviation in distance to the Mexican border predicts a significant 1.1 percent percentage point increase in the likelihood of viewing Trump favorably in the full sample. This relationship is not significant among only white non-Hispanics, but interestingly, it becomes significant again for white non-Hispanic Republicans.

Using distance to Mexico rather than the Hispanic population share has the advantage of removing any endogenous component associated with the economic attraction of Hispanics to a commuting zone. Still, the results are similar using either measure.

Replacing the distance measure with the share Hispanic in column one, also predicts significantly lower support for Trump, though not among white non-Hispanic Republicans. The two measures (distance to Mexico and the Hispanic share of the CZ population) are highly correlated (-0.59), and the correlation is even stronger between the Mexican-born population share and distance to Mexico (-.73). Using distance to Mexico as an instrumental variable for the Hispanic population share also yields significant effects for the entire sample and the white non-Hispanic Republican sample.<sup>8</sup>

At the individual level, there was little clear evidence that economic hardship predicts support for Trump, in that higher household incomes tend to predict higher Trump support. Yet, at the CZ level, two alternative measures of living standards—health and intergenerational mobility—provide support for the idea that Trump supporters are less prosperous than others.

People living in commuting zones with higher white middle-aged mortality rates are much more likely to view Trump favorably. A one standard deviation in mortality predicts a roughly 2 percentage point increase in favorable views toward Trump. Other mesures of health were considered, including overall race-adjusted life expectancy, overall mortality rates, and white age-adjusted mortality rates. Race-adjusted life expectancy was not significant, but the overall 2014 mortality rate was significantly positive in favor of Trump. White mortality was far more predictive, however, and middle-aged white mortality had the strongest relationship to Trump support.

In results not shown, I find that people living in CZs with higher obesity rates and higher shares of people reporting poor or fair overall health status are significantly more likely to favor Trump, when they replace the mortality rate. These variables become insignificant when the white middle-aged mortality rate is included in the model, suggesting the latter is a stronger overall indicator of poor health. The fact that the obesity rate and self-reported health status were not available for whites only may also explain why they have less explanatory power.

Somewhat related to health and general social well-being, a one standard deviation in the causal effect of a cz on intergenerational mobility predicts a 0.6 to 0.7 percentage point increase in favorable views toward Trump. This is a small effect relative to the others, but it is robust

<sup>&</sup>lt;sup>8</sup> These results were not published in tables to conserve space but are available upon request.

<sup>&</sup>lt;sup>9</sup> These data are from the Robert Wood Johnson county health rankings database, available at <a href="http://www.countyhealthrankings.org/">http://www.countyhealthrankings.org/</a>

overall and among non-Hispanic whites. To be clear, this is not meant to suggest that with undue certaintly that growing up in a place that causes lower social mobilty causes Trump support. This analysis only identifies the correlation. In any case, it does not provide any explanatory power among non-Hispanic white Republicans.

The size of the CZ has no significant correlation with Trump views, but the bachelor's degree share of the population had a very large and robust correlation. A one standard deviation increase in the share of people above age 25 with a bachelor's degree, predicts a 3 to 5 percentage point decrease in support for Trump, depending on which sample is considered. This suggests that cultural islotion from the college educated may increase sympathy for nationalist politics.

Turning to trade competition, the 2015 share of CZ employment in manufacturing is negative and significant across the three samples (ie the full sample, white non-Hispanics, and white non-Hispanic Republicans) and in five of the six models reported below. This is a suprising result given the relationship between blue collar employment and Trump support and Trump's protectionist campaign platform.

To test the robustness of this relationship to various measures of trade exposure, the analysis varies the date the manufacturing employment shares are measured, to account for the fact that many places saw large losses in recent years. Other adjustments to the model include using changes in the share of jobs in manufacutring, reflecting replacement of manufacturing jobs with those in other sectors, growth (or loss) rates in the number of manufacturing jobs, and total employment growth. The results are summarized in Table 2, which re-estimates the main full-sample models using these alterations.

The main model used 2015 employment shares, but 2000 manufacturing employment shares also predict significantly lower support for Trump, whether measured by the QCEW or Acemoglu et al (2015)'s imputation of suppressions in County Business Patterns data. Likewise, an increase in the share of manufacturing employment from 2000 to 2007 (using data from Autor, Dorn and Hanson 2013) predicts higher levels of Trump support, which is the opposite of the hypothesized relationship. Overall manufacturing employment growth from 2000 to 2015 has no effect, controlling for 2015 shares, nor does the change from 1990 to 2007. Total employment growth predicts greater Trump support, suggesting that people in more economically properous metropolitan areas are marginally more likely to view him favorably. Finally, a measure of Chinese import exposure predicts less Trump support, but the relatsionship is not statistically significant.

To summarize, the evidence is mixed as to how economic hardship affects Trump's popularity. It seems that lower social status and material hardship play a role in support for Trump, but not through the most obvious economic channles of income and employment. The evidence is in favor of contact theory is quite clear. Racial isoaltion and lack of exposure to Hispanic immigrants raise the likelihood of Trump support. Meanwhile, Trump support falls as exposure to trade and immigration incresaes, which is the opposite of the predicted relationship.

## Comparing results across politicians

The analysis shows that Trump supporters standout statistically on a number of dimentions, even when compared to non-Hispanic white Republicans. In these regresions, the comparison group consist of white Republicans who do not support Trump, but this does not necessarily

imply they support other more moderate Republican candidates or Democrats. This section compares the results from Table 3 column one to other politicians running for the 2016 presidential nomintion in both parties using an otherwise identical model.

Going through the CZ-level resutls, population size had no predictive power for Trump support, but does predict greater support for Hillary Cliton, John Kasich, and Jeb Bush, who are among the more moderate candidates. The college attainment rate predicted lower support for Trump, and this applies more broadly to the other Republican candidates, with the exception of Bush, where there is no significant correlation. By contrast, more educated areas predict greater support for Bernie Sanders and Clinton.

Those living in areas with a greater share of jobs in manufacturing were more likely to support Clinton (the only candidate to hold a positive and significant relationship with this variable). Aside from Trump, manufacturing orientation was negative and significant only for Bush and Cruz.

People living in places that cause greater intergenerational mobility are more likely to support Sanders and Clinton, but there is no effect on other candidates, in contrast to the negative and significant relationship between mobility and Trump support.

As noted above, those living in areas with higher white mortality rates are more likely to support Trump, but are significantly less likely to support Sanders. Interestingly, white mortality had no relation to support for Clinton or the other Repulican candidates.

As for segregation, Trump once again stands out. Segregation decreases support for Sanders and, especially, for Clinton, but has no significant predictive power for the other Republican candidates, though Jeb Bush received significantly lower support in less racially diverse CZs, as did Hillary Clinton. Distance to Mexico predicts greater support for Sanders, Clinton, and Kasich, but less support for Cruz, probably because of high support in his home state of Texas. It has no relation to support for Rubio or Bush.

Some caution is needed in interpreting these results, in that the sample sizes vary across candidates and are smaller for less popular candidates, particualrly if they dropped out of the race early, and this will tend to make it less likely to find significant relationships. These patterns of significance, however, cannot be attrbuted solely to sample size. Some of the other CZ variables—like population and education—are significant predictors of support for even candidates with the smallest sample sizes.

In summary, these results confirm that Trump's supporters differ in important ways from other Republican candidates. He is the only candidate who recieves significantly more favorable rating in racially isolated neighborhood and in areas with high middle-aged white mortality rates, conditional on individual factors. He is also the only candidate for which lower rates of intergenerational mobility predict greater support.

## **Discussion**

These results do not present a clear picture between social and eocnomic hardship and support for Trump. The standard economic measures of income and employment status show that, if anything, more affluent Americans favor Trump, even among white non-Hispanics. Surprisingly, there appears to be no link whatsoever between exposure to trade competition and support for nationalist policies in America, as embodied by the Trump campaign.

Yet, more subtle measures at the commuting zone level provide evidence that social well-being, measured by longevity and intergenerational mobility, is significantly lower among in the communities of Trump supporters. The causal mechanisms linking health and intergeneratinal well-being to political views are not well-understood in the social science literature. It may be the case that material circumstances caused by economic shocks manifest themselves in depression, dissapointment, and ill-health, and those are the true underlying causes. Or, it may be that material well-being and health are undermined by a cutlural or pyschological failure to adjust and adapt to a changing world. With intergenerational mobility, it may be that parents see their children failing to reach milestones predictive of success and blame the political staus quo.

In any case, this analysis provides clear evidence that those who view Trump favorably are disproportionately living in racially and culturally isolated zip codes and commuting zones. Holding other factors, constant support for Trump is highly elevated in areas with few college graduates, far from the Mexican border, and in neighborhoods that standout within the communting zone for being white, segregated enclaves, with little exposure to blacks, asians, and Hispanics.

This is consistent with contact theory, which has already received considerable empircal support in the literature in a variety of analogous contexts. Limited interactions with racial and ethnic minorities, immigrants, and college graduates may contribute to prejudical stereotypes, political and cultural misunderstandings, and a general fear of rejection and not-belonging.

To situate these diverse results more theoretically, I find only limited support that the political views of US nationalists—as manifest in a favorable view towards Donal Trump—are related to economic self-interest. If so, the self-interest calculation must go beyond conventional economic measures to include one's physical health and inter-generational concerns. Standard economic data are likely inadequate to understanding important aspects of well-being that shape political behavior. Second, I find evidence that contact with racial minorities reduces support for nationalist politics.

These findings suggest a need to better understand how even seemingly affluent voters may take extreme political views when their health status and the well-being of their children fail to meet their expectations. The results also suggest that housing and social integration can moderate extreme political beliefs, consistent with contact theory.

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Table 1. Political ideology by Trump support and party affiliation

	Favorable view of Trump	Unfavorable view of Trump	Favorable view of Trump	Unfavorable view of Trump	Unfavorable view of Trump	Unfavorable view of Trump
	Any party affiliation	Any party affiliation	Republican or lean Republican	Republican or lean Republican	Independent	Democrat or lean Democrat
Very conservative	15.0	5.4	18.1	13.9	5.0	2.5
Conservative	42.5	19.1	49.5	40.7	19.2	11.8
Moderate	27.7	36.2	24.6	34.8	39.0	37.6
Liberal	7.5	23.9	4.7	6.7	15.7	32.8
Very liberal	1.7	8.6	0.9	1.5	4.6	12.4
Don't know	2.1	2.6	1.3	1.2	9.7	1.8
Refused to answer	3.6	4.2	0.9	1.1	6.8	1.1

Source: Gallup Daily Tracking data for 87,428 respondents who reported favorable or unfavorable view of Trump.

Table 2. Summary statistics of primary data used in analysis

1000 21 0	rable 2. Gariffiary statistics of printary data does in analysis						rable view of	
		Favorable view of Trump			view of Trump	p Trump		
	Obs	Mean	St. deviation	Mean	St. deviation	Mean	St. deviation	
Percent who view Trump favorably	87,428	0.35	0.48					
self-employed	87,428	0.06	0.24	0.08	0.27	0.05	0.22	
employed part-time	87,428	0.12	0.33	0.11	0.31	0.13	0.34	
unemployed	87,428	0.04	0.19	0.03	0.18	0.04	0.19	
not in labor force	87,428	0.31	0.46	0.33	0.47	0.30	0.46	
Catholic	87,428	0.23	0.42	0.23	0.42	0.23	0.42	
Jewish	87,428	0.02	0.14	0.02	0.12	0.02	0.15	
Muslim	87,428	0.01	0.08	0.00	0.05	0.01	0.10	
Mormon	87,428	0.02	0.14	0.02	0.14	0.02	0.14	
Other non-Christian	87,428	0.02	0.16	0.01	0.12	0.03	0.17	
Atheist	87,428	0.18	0.39	0.11	0.31	0.22	0.41	
Religion is important	87,428	0.64	0.48	0.72	0.45	0.59	0.49	
Veteran or family member of veteran	87,428	0.26	0.44	0.33	0.47	0.22	0.41	
Works for government	87,428	0.10	0.30	0.09	0.29	0.10	0.30	
Gay, lesbian, or trans-sexual	87,428	0.04	0.19	0.02	0.14	0.05	0.22	
Registered to vote	87,428	0.06	0.24	0.06	0.24	0.06	0.24	
Retiree	87,428	0.26	0.44	0.32	0.47	0.23	0.42	
male	87,428	0.49	0.50	0.58	0.49	0.44	0.50	
Married	87,428	0.52	0.50	0.60	0.49	0.47	0.50	
Was married	87,428	0.16	0.37	0.17	0.37	0.15	0.36	
Works in blue collar occupation	87,428	0.11	0.31	0.14	0.35	0.09	0.29	
union member, non-government	87,428	0.04	0.19	0.04	0.19	0.04	0.19	
log of household income	73,850	10.86	1.07	10.95	1.00	10.81	1.11	
Hispanic	87,428	0.14	0.35	0.06	0.24	0.18	0.39	
Less than High School diploma	87,428	0.10	0.30	0.08	0.27	0.11	0.31	
High school diploma	87,428	0.29	0.46	0.33	0.47	0.27	0.45	
Technical degree program	87,428	0.03	0.18	0.04	0.20	0.03	0.17	
Bachelor's degree	87,428	0.18	0.38	0.16	0.37	0.19	0.39	
Post-bachelor's degree	87,428	0.14	0.34	0.10	0.30	0.16	0.37	
age	87,428	48.2	19.0	52.1	18.2	46.1	19.2	
White	87,428	0.77	0.42	0.89	0.31	0.70	0.46	
Black (or White and Black)	87,428	0.13	0.34	0.05	0.22	0.17	0.38	

Asian (or White and Asian)	87,428	0.03	0.18	0.03	0.18	0.03	0.18
In CZ pop, 2014 5-yr	80,734	3,544,243	4,485,722	2,917,937	4,048,059	3,863,761	4,661,035
Share of CZ pop with BA or higher, 2014 5-yr	87,419	0.29	0.08	0.28	0.08	0.30	0.08
Share of jobs in manufacturing sector, 2015	87,420	0.11	0.06	0.11	0.07	0.10	0.06
Causal effect of CZ on intergenerational mobility	86,674	0.00	0.28	0.01	0.31	0.00	0.26
Median household income, zip-code	84,724	\$58,091	\$23,804	\$57,958	\$22,663	\$58,163	\$24,396
(zip code share white) - (CZ share white)	84,769	0.01	0.20	0.05	0.17	-0.01	0.21
CZ share white, 2014 5-yr	87,419	0.64	0.18	0.67	0.18	0.63	0.19
CZ center distance to Mexico in miles	87,428	1014	526	1027	499	1008	540
CZ 2014 white mortality rate per thousand people, 45 to 54	86,386	4.03	1.16	4.26	1.25	3.90	1.09

Table 3. Probit regression of Trump favorability on individual and geographic level characteristics

Table 3. Probit regression of	Trump lavorabil	ity on maividu	ai anu geograf	priic ievei cilai		n-Hispanic	
				an-Party			
		ondents	White non-		affiliates		
	Depe	ndent variable	orable view of Trump				
	1	2	3	4	5	6	
Individual level variables							
self-employed	0.0707***	0.0732***	0.0636***	0.0664***	0.0610***	0.0636***	
	(0.0107)	(0.0111)	(0.0116)	(0.0118)	(0.0139)	(0.0140)	
employed part-time	-0.00642	-0.0131	-0.0266***	-0.0335***	-0.0289**	-0.0421***	
	(0.00840)	(0.00803)	(0.00965)	(0.00942)	(0.0132)	(0.0134)	
unemployed	0.0479***	0.0413***	0.0356*	0.0325*	0.0334	0.0303	
	(0.0159)	(0.0157)	(0.0201)	(0.0196)	(0.0276)	(0.0277)	
not in labor force	0.00289	-0.00329	-0.0106	-0.0179*	-0.0175	-0.0312**	
	(0.00851)	(0.00824)	(0.0101)	(0.00988)	(0.0133)	(0.0134)	
Catholic	-0.00760	-0.00746	0.0145	0.0157*	0.0432***	0.0461***	
	(0.00834)	(0.00853)	(0.00949)	(0.00946)	(0.00925)	(0.00892)	
Jewish	-0.0902***	-0.0893***	-0.115***	-0.112***	0.0288	0.0300	
	(0.0141)	(0.0142)	(0.0133)	(0.0132)	(0.0218)	(0.0213)	
Muslim	-0.150***	-0.156***	-0.240***	-0.243***	-0.0237	-0.0283	
	(0.0263)	(0.0259)	(0.0429)	(0.0426)	(0.140)	(0.143)	
Mormon	-0.0662***	-0.0680***	-0.0978***	-0.102***	-0.161***	-0.169***	
	(0.0144)	(0.0145)	(0.0167)	(0.0170)	(0.0203)	(0.0210)	
Other non christian	-0.125***	-0.124***	-0.202***	-0.199***	0.00973	0.00994	
	(0.0144)	(0.0145)	(0.0148)	(0.0148)	(0.0407)	(0.0398)	
Atheist	-0.115***	-0.115***	-0.148***	-0.148***	-0.0190	-0.0194	
	(0.00676)	(0.00676)	(0.00898)	(0.00897)	(0.0144)	(0.0144)	
Religion is important	0.0915***	0.0908***	0.121***	0.119***	0.0195*	0.0156	
	(0.00618)	(0.00609)	(0.00712)	(0.00705)	(0.00996)	(0.00991)	
Veteran or family member of veteran	0.0649***	0.0616***	0.0626***	0.0588***	0.0363***	0.0308***	
	(0.00490)	(0.00489)	(0.00612)	(0.00606)	(0.00772)	(0.00776)	
Works for government	0.00768	0.00827	0.00265	0.00510	0.00586	0.00733	
	(0.00867)	(0.00870)	(0.00981)	(0.00984)	(0.0119)	(0.0117)	
Gay, lesbian, or trans-sexual	-0.0937***	-0.0935***	-0.168***	-0.167***	-0.0781***	-0.0750**	
	(0.0115)	(0.0114)	(0.0134)	(0.0132)	(0.0302)	(0.0308)	
Registered to vote	0.0166	0.0180*	0.0121	0.0129	-0.00581	-0.00766	

D. II	(0.0103)	(0.0103)	(0.0120)	(0.0120)	(0.0141)	(0.0141)
Retiree	-0.00161	-0.0206**	-0.00342	-0.0254**	0.0485***	0.0205*
	(0.00861)	(0.00857)	(0.0104)	(0.0102)	(0.0127)	(0.0124)
male	0.142***	0.141***	0.152***	0.150***	0.0958***	0.0924***
	(0.00467)	(0.00463)	(0.00571)	(0.00564)	(0.00781)	(0.00781)
Married	0.0311***	0.0518***	0.0443***	0.0668***	-0.000973	0.0344***
	(0.00625)	(0.00651)	(0.00770)	(0.00792)	(0.0101)	(0.0103)
Was married	0.0242***	0.0382***	0.0250***	0.0399***	-0.0111	0.0125
	(0.00770)	(0.00783)	(0.00896)	(0.00922)	(0.0127)	(0.0128)
Works in blue collar occupation	0.0587***	0.0620***	0.0932***	0.0972***	0.0521***	0.0559***
	(0.00873)	(0.00885)	(0.0105)	(0.0107)	(0.0111)	(0.0111)
union member, non-government	-0.0324***	-0.0304**	-0.0555***	-0.0509***	0.0139	0.0171
	(0.0119)	(0.0119)	(0.0152)	(0.0154)	(0.0201)	(0.0201)
log of household income	0.0147***	0.0151***	0.0126***	0.0129***	0.00623	0.00775*
	(0.00316)	(0.00323)	(0.00344)	(0.00348)	(0.00467)	(0.00465)
Hispanic	-0.195***	-0.204***				
	(0.00803)	(0.00773)				
Less than High School diploma	-0.0160	-0.0216	0.0313*	0.0250	0.0538**	0.0415*
	(0.0142)	(0.0140)	(0.0168)	(0.0166)	(0.0212)	(0.0218)
High school diploma	0.0352***	0.0323***	0.0416***	0.0381***	0.0391***	0.0325***
	(0.00632)	(0.00619)	(0.00761)	(0.00760)	(0.00902)	(0.00897)
Technical degree program	0.0282**	0.0312***	0.0448***	0.0481***	0.0505***	0.0543***
	(0.0112)	(0.0109)	(0.0139)	(0.0134)	(0.0173)	(0.0163)
Bachelor's degree	-0.0823***	-0.0800***	-0.109***	-0.105***	-0.0975***	-0.0953***
	(0.00567)	(0.00567)	(0.00732)	(0.00744)	(0.00923)	(0.00932)
Post-bachelor's degree	-0.156***	-0.154***	-0.202***	-0.199***	-0.174***	-0.172***
	(0.00562)	(0.00555)	(0.00792)	(0.00786)	(0.0122)	(0.0121)
age	0.0119***	0.00154***	0.0132***	0.00156***	0.0174***	0.00276***
	(0.00106)	(0.000189)	(0.00140)	(0.000230)	(0.00177)	(0.000301)
	-9.60e-		-		-	
age^2	05***		0.000107***		0.000141***	
	(8.40e-06)		(1.08e-05)		(1.37e-05)	
age^3	-0.0254***		-0.0289***		-0.0172	
	(0.00702)		(0.00946)		(0.0128)	
White	0.0926***	0.102***				
	(0.00862)	(0.00819)				

Black (or White and Black)	-0.179***	-0.186***	-0.218***	-0.227***	-0.200***	-0.210***
	(0.0100)	(0.00965)	(0.0281)	(0.0275)	(0.0621)	(0.0613)
Asian (or White and Asian)	0.0681***	0.0718***	0.0359*	0.0362*	0.0298	0.0315
	(0.0157)	(0.0156)	(0.0208)	(0.0205)	(0.0234)	(0.0236)
	-4.11e-	-4.18e-	-2.99e-	-3.11e-		2.58e-
Time effect (days since start of poll)	06***	06***	06***	06***	2.59e-06***	06***
	(5.30e-07)	(5.22e-07)	(6.48e-07)	(6.47e-07)	(8.22e-07)	(8.28e-07)
CZ or ZIP code LEVEL						
In CZ pop, 2014 5-yr	0.00304	-0.00223	-0.00220	-0.00294	0.0104	0.0129
	(0.00601)	(0.00581)	(0.00737)	(0.00756)	(0.00727)	(0.00844)
Share of CZ pop with BA or higher, 2014 5-yr	-0.0371***	-0.0447***	-0.0431***	-0.0512***	-0.0226***	-0.0297***
	(0.00544)	(0.00512)	(0.00700)	(0.00657)	(0.00760)	(0.00780)
Share of jobs in manufacturing sector, 2015	-0.0147***	-0.0143***	-0.0169***	-0.0189***	-0.00863	-0.0111**
	(0.00414)	(0.00405)	(0.00498)	(0.00498)	(0.00548)	(0.00564)
Causal effect of CZ on intergenerational	-					
mobility	0.00597**	-0.00552*	-0.00724**	-0.00718**	-0.00440	-0.00522
	(0.00276)	(0.00282)	(0.00330)	(0.00342)	(0.00354)	(0.00360)
Median household income, zip-code	0.00110	0.0133***	-0.000544	0.00376	-0.00843*	-0.00700
	(0.00356)	(0.00326)	(0.00408)	(0.00375)	(0.00504)	(0.00468)
(zip code share white) - (CZ share white)	0.0291***		0.0257***		0.0182***	
	(0.00299)		(0.00433)		(0.00506)	
CZ share white, 2014 5-yr	-0.00119		-0.0173**		-0.0191***	
	(0.00541)		(0.00767)		(0.00677)	
CZ center distance to Mexico in miles	0.0111**	0.0123***	0.00900	0.00708	0.0163**	0.0132**
	(0.00467)	(0.00438)	(0.00619)	(0.00597)	(0.00643)	(0.00660)
CZ 2014 white mortality rate, 45 to 54	0.0198***	0.0199***	0.0221***	0.0201***	0.0230***	0.0209***
	(0.00446)	(0.00457)	(0.00526)	(0.00538)	(0.00586)	(0.00604)
CZ diversity index/zip code diversity index		0.00654***		0.00822***		0.00831*
		(0.00205)		(0.00255)		(0.00439)
Racial diversity index for CZ, 2014 5-yr		0.0189***		0.0355***		0.0295***
		(0.00616)		(0.00846)		(0.00847)
Racial diversity index for zip code, 2014 5-yr		-0.00907**		-0.0206***		-0.0171***
•		(0.00400)		(0.00451)		(0.00577)
Observations	71,258	71,383	55,101	55,119	28,716	28,713
Pseduo R-squared	0.1469	0.1436	0.1192	0.1168	0.0615	0.0566

Pseduo R-squared 0.1469 0.1436 0.1192 0.1168 0.0615 0.0566

Robust standard errors in parentheses; errors clustered at CZ level. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1. CZ level variables are standardized to have mean of zero and standard deviation of one. Survey data collected between July 8, 2015 and July 25, 2016.

Table 4. Testing the robustness of trade exposure to favorable rating for Trump

Mfg share of employment, 2000	-0.0134***
	(0.00399)
Mfg share of employment, 2000 (Agemoglu et al)	-0.0174***
	(0.00387)
Mfg share of employment 2007 - Mfg share 2000 (Autor, Dorn, Hanson)	0.00845**
	(0.00341)
Mfg employment 2015/Mfg employment 2000 (1)	0.0232
	(0.0172)
Mfg share of employment 2007 - Mfg share 1990 (Autor, Dorn, Hanson) (1)	-0.00208
	(0.00311)
Total employment 2015/Total employment 2000 (1)	15.79***
	(4.968)
Chinese exposure index 1999-2011 (Acemoglu et al)	-0.00434
	(0.00413)

Notes. Observations equal to 70,839 in smallest case. Each row represents a model identical to that shown in Table 3 column 1, except the manufacturing share variable is replaced or complemented as indicated. Coefficients on additional manufacturing/trade exposure variable are shown with standard errors in parentheses. (1) indicates that control for 2015 manufacturing share was included in the model. It was significant and negative in all three cases. All variables are standardized to mean zero. Data are from QCEW unless other indicated. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1.

Table 5. Probit regression of candidate favorability on individual and geographic level characteristics

	Sanders	Clinton	Kasich	Bush	Rubio	Cruz
	1	2	3	4	5	6
Individual level variables						
self-employed	-0.0359**	-0.0406***	-0.00897	-0.00562	-0.0195	-0.00214
	(0.0155)	(0.00991)	(0.0163)	(0.0160)	(0.0172)	(0.0147)
employed part-time	0.000934	-0.00911	0.0390***	0.0274*	0.0177	-0.0296*
	(0.0101)	(0.00825)	(0.0149)	(0.0158)	(0.0144)	(0.0117)
unemployed	-0.0122	-0.0155	-0.00223	0.0325	0.0385	-0.00620
	(0.0166)	(0.0171)	(0.0279)	(0.0318)	(0.0279)	(0.0270)
not in labor force	-0.0345***	0.0105	0.00124	0.0150	-0.0193	-0.0345**
	(0.0113)	(0.00801)	(0.0130)	(0.0156)	(0.0179)	(0.0123)
Catholic	0.0310***	0.0807***	0.0115	0.0117	-0.0245	-0.0490**
	(0.00976)	(0.00953)	(0.0103)	(0.00983)	(0.0163)	(0.0106)
Jewish	0.122***	0.202***	-0.101***	-0.0814***	-0.170***	-0.170**
	(0.0183)	(0.0137)	(0.0264)	(0.0260)	(0.0237)	(0.0249)
Muslim	0.208***	0.196***	-0.0677	-0.0671	-0.241***	-0.168**
	(0.0285)	(0.0346)	(0.0468)	(0.0557)	(0.0420)	(0.0496
Mormon	-0.0981***	-0.144***	0.0833***	0.0951***	0.139***	0.0522*
	(0.0214)	(0.0154)	(0.0300)	(0.0349)	(0.0354)	(0.0230
Other non christian	0.207***	0.109***	-0.110***	-0.120***	-0.196***	-0.195**
	(0.0172)	(0.0178)	(0.0285)	(0.0274)	(0.0301)	(0.0209
Atheist	0.165***	0.0787***	-0.0863***	-0.168***	-0.201***	-0.188**
	(0.00896)	(0.00830)	(0.0122)	(0.0119)	(0.0157)	(0.0111
Religion is important	-0.149***	-0.118***	0.0460***	0.0795***	0.161***	0.193**
	(0.00631)	(0.00651)	(0.0100)	(0.0108)	(0.0110)	(0.0079)
Veteran or family member of veteran	-0.0372***	-0.0786***	-0.000375	-0.00137	0.0327***	0.0372*
	(0.00641)	(0.00580)	(0.00833)	(0.00936)	(0.00866)	(0.00770
Works for government	0.0126	0.0134	-0.0128	-0.0108	-0.0237	0.0051
	(0.0112)	(0.00908)	(0.0139)	(0.0141)	(0.0162)	(0.0113
Gay, lesbian, or trans-sexual	0.128***	0.139***	-0.0692***	-0.0971***	-0.145***	-0.124*
	(0.0189)	(0.0127)	(0.0205)	(0.0219)	(0.0240)	(0.0191
Registered to vote	-0.000383	-0.0230***	0.0145	-0.0466*	0.0229	-0.013
-	(0.0118)	(0.00882)	(0.0165)	(0.0272)	(0.0369)	(0.0165
Retiree	0.0362***	0.0448***	-0.0327**	-0.0347**	-0.0260	-0.0147
	(0.0106)	(0.00927)	(0.0155)	(0.0147)	(0.0161)	(0.0140

male	-0.0851***	-0.135***	0.0337***	-0.00268	0.0424***	0.0566***
	(0.00541)	(0.00580)	(0.00842)	(0.00905)	(0.00927)	(0.00717)
Married	-0.0636***	-0.0479***	0.0141	0.0381***	0.0665***	0.0739***
	(0.00737)	(0.00688)	(0.0110)	(0.0126)	(0.0123)	(0.0102)
Was married	-0.0417***	-0.0267***	0.00873	0.0114	0.0342**	0.0371***
	(0.0103)	(0.00797)	(0.0128)	(0.0141)	(0.0147)	(0.0121)
Works in blue collar occupation	-0.0377***	-0.0102	-0.0387**	-0.0138	-0.0159	0.0426***
	(0.00998)	(0.00841)	(0.0156)	(0.0161)	(0.0156)	(0.0134)
union member, non-government	0.0593***	0.0676***	-0.0809***	-0.0790***	-0.0500**	-0.0746***
	(0.0140)	(0.0148)	(0.0210)	(0.0195)	(0.0234)	(0.0169)
log of household income	-0.0137***	-0.0264***	0.0319***	0.0159***	0.0154**	-0.00795*
	(0.00378)	(0.00340)	(0.00578)	(0.00564)	(0.00635)	(0.00443)
Hispanic	0.132***	0.224***	-0.0166	0.0860***	0.0299*	-0.00683
	(0.0104)	(0.0126)	(0.0167)	(0.0186)	(0.0161)	(0.0160)
Less than High School diploma	-0.0398**	0.158***	-0.0451*	0.0981***	-0.0193	0.0224
	(0.0166)	(0.0145)	(0.0231)	(0.0224)	(0.0246)	(0.0198)
High school diploma	-0.0295***	0.00826	-0.0149	0.0325***	-0.00336	0.0135
	(0.00826)	(0.00674)	(0.0129)	(0.0122)	(0.0131)	(0.0104)
Technical degree program	-0.0142	0.00143	-0.0175	-0.00309	-0.0631**	0.00381
	(0.0158)	(0.0127)	(0.0248)	(0.0227)	(0.0268)	(0.0199)
Bachelor's degree	0.0191**	0.0635***	0.0602***	0.0404***	-0.00267	-0.0491***
	(0.00779)	(0.00685)	(0.0104)	(0.0119)	(0.0150)	(0.00923)
Post-bachelor's degree	0.105***	0.165***	0.0601***	0.0228*	-0.0656***	-0.150***
	(0.00819)	(0.00679)	(0.0104)	(0.0133)	(0.0130)	(0.0111)
age	-0.0108***	0.0144***	-0.00568***	-0.00721***	-0.00740***	-0.00358**
	(0.00130)	(0.00119)	(0.00184)	(0.00174)	(0.00207)	(0.00179)
age^2	8.08e-05***	-0.000100***	8.54e-05***	8.19e-05***	7.91e-05***	4.08e-05***
	(1.02e-05)	(9.41e-06)	(1.43e-05)	(1.43e-05)	(1.68e-05)	(1.41e-05)
age^3	0.0341***	-0.0180**	0.00150	-0.00372	-0.00350	-0.0160
	(0.00928)	(0.00864)	(0.0144)	(0.0145)	(0.0148)	(0.0126)
White	-0.0783***	-0.176***	0.0294*	0.0365**	0.0186	0.0634***
	(0.0124)	(0.0102)	(0.0172)	(0.0183)	(0.0191)	(0.0137)
Black (or White and Black)	0.162***	0.295***	-0.0517***	-0.0986***	-0.194***	-0.110***
	(0.0159)	(0.0165)	(0.0197)	(0.0196)	(0.0206)	(0.0172)
Asian (or White and Asian)	-0.0237	-0.0955***	-0.0371	-0.0398*	-0.0199	0.00636
	(0.0195)	(0.0130)	(0.0261)	(0.0239)	(0.0272)	(0.0202)

Time effect (days since start of poll)	1.70e-06**	-6.11e-06***	9.15e-06***	-7.53e-07	-6.08e-06***	-7.85e-06***
	(6.67e-07)	(6.13e-07)	(8.80e-07)	(1.12e-06)	(1.02e-06)	(7.73e-07)
CZ or ZIP code LEVEL						
In CZ pop, 2014 5-yr	0.0117	0.0206***	0.0254***	-0.0293***	-0.00349	-0.00808
	(0.00842)	(0.00525)	(0.8800.0)	(0.00939)	(0.0108)	(0.00795)
Share of CZ pop with BA or higher, 2014 5-yr	0.0277***	0.0328***	-0.0264***	-0.0107	-0.0214**	-0.0309***
	(0.00866)	(0.00581)	(0.00949)	(0.00996)	(0.00973)	(0.00800)
Share of jobs in manufacturing sector, 2015	0.00729	0.0140***	-0.00608	-0.0131**	-0.0117*	-0.0136***
	(0.00488)	(0.00478)	(0.00611)	(0.00656)	(0.00628)	(0.00516)
Causal effect of CZ on intergenerational mobility	0.00807**	0.00759**	-0.00303	-0.00287	-0.00484	0.000913
	(0.00412)	(0.00307)	(0.00486)	(0.00462)	(0.00487)	(0.00416)
Median household income, zip-code	-0.0154***	-0.00356	0.0270***	0.00702	0.0124*	-0.000353
	(0.00447)	(0.00450)	(0.00555)	(0.00538)	(0.00640)	(0.00442)
(zip code share white) - (CZ share white)	-0.0153***	-0.0458***	-0.00733	0.000863	0.00334	0.00877
	(0.00417)	(0.00374)	(0.00492)	(0.00538)	(0.00632)	(0.00537)
CZ share white, 2014 5-yr	0.00678	-0.0120**	0.0107	-0.0310***	0.00307	-0.00755
	(0.00689)	(0.00588)	(0.00787)	(0.00758)	(0.00724)	(0.00643)
CZ center distance to Mexico in miles	0.0125**	0.00935***	0.0172***	0.0123*	-0.00821	-0.0138***
	(0.00553)	(0.00362)	(0.00592)	(0.00678)	(0.00646)	(0.00519)
CZ 2014 white mortality rate, 45 to 54	-0.0175***	-0.00511	0.00338	0.00695	0.00238	-0.000100
	(0.00643)	(0.00515)	(0.00726)	(0.00761)	(0.00770)	(0.00675)
Observations	47,924	71,970	23,906	22,722	22,760	32,825
Pseudo R-squared	0.1158	0.1703	0.0434	0.0475	0.087	0.1082

Robust standard errors in parentheses; errors clustered at CZ level. \*\*\* p<0.01, \*\* p<0.05, \* p<0.1. CZ level variables are standardized to have mean of zero and standard deviation of one.