Where and When: Sharpening the lens on geographic disparities in mortality

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ABSTRACT

Life course theories suggest that geographic disparities in mortality may reflect a history of place-based exposures rather than (or in addition to) contemporaneous exposures; yet, few studies examined early life place exposures and later life mortality in the US due to data limitations. The aim of this study is to assess and compare the importance of state of birth and state of residence in predicting mortality for adults over age 50 in the US. Using nationally representative data of nearly 100,000 adults over age 50 from the National Longitudinal Mortality Study, we estimated individual mortality risk using multi-level logistic regression with state of birth and state of residence as second-level random effects. We assessed whether state of residence and state of birth contributed to the variation in adult mortality. We also decomposed state-of-residence random effects to compare “movers” and “stayers.” Our results indicate that state of birth is a stronger predictor of age-, race/ethnicity- and sex-adjusted mortality in the US than state of residence at the time of death. The adult mortality profiles of many states are substantially impacted by the composition of “movers.” Failing to account for residential mobility has clouded our understanding of the patterns and causes of geographic differences in adult mortality. Measures of geographic residence across the life course can improve models of adult mortality in the US and inform interventions to address geographic disparities in longevity.

1. Introduction

Geographic differences in mortality and health in later life are large and well-documented. The gap in life expectancy across US states is approximately 7.5 years (Wilmoth, Boe, & Barbieri, 2010). Contextual factors are increasingly recognized as key determinants of population health, but much remains to be understood about which contexts matter, when, and how.

A central issue in understanding the large and important place-based differences in old age health and mortality is unpacking the forces reflected in the estimates. Life course and Developmental Origins of Adult Health and Disease (DOHaD) theories suggest that some differences in health may reflect a history of place-based exposures rather than (or in addition to) contemporaneous exposures (Ben-Shlomo & Kuh, 2002; Kuh & Ben-Shlomo, 2004). The effects of this history can both accumulate into old age and shape later exposures through various mechanisms. (Feijten, Hooimeijer, & Mulder, 2008; Gustafsson, Hammarström, & San Sebastian, 2015; Montez & Hayward, 2011).

Migration is one key mechanism differentiating past and present place-based exposures. 30–40% of the US population reside in a state they were not born in (Molloy, Smith, & Wozniak, 2011; US Census Bureau, 2011), and recent annual inter-state mobility rate is estimated to range from 1% to 3% (Hyatt, McEntarfer, Ueda, & Zhang, 2018; Kaplan & Schulhofer-Wohl, 2017; Molloy et al., 2011). Thus, a large component of place-based disparities may be attributable to early exposures that are distinct from exposures later in life. However, standard mortality estimates are based on place of death or late-life residence, and rarely draws attention to geographic exposures in early life.

Previous studies have documented the effects of state of residence contexts on adult health by examining measures of socioeconomic status (Montez, Hayward, & Wolf, 2017; Montez, Zajacova, & Hayward, 2016; Subramanian, Kawachi, & Kennedy, 2001), tax policies (Montez et al., 2017; Montez, Hayward, & Zajacova, 2019), social capital and cohesion (Montez et al., 2016; Subramanian et al., 2001) and income inequality (Backlund et al., 2007; Montez et al., 2017; Subramanian et al., 2001). Recent research has pointed to the effects of state of birth on early life health outcomes. For example, empirical studies have shown that infant birth outcomes (e.g. low birth weight) vary by state-level factors
including poverty reduction policies (e.g. Earned Income Tax Credit, minimum wage) (Komro, Livingston, Markowitz, & Wagenaar, 2016; Komro, Markowitz, Livingston, & Wagenaar, 2019; Strully, Rehkopf, & Xuan, 2010), health insurance policies (e.g. Medicaid expansion) (Brown et al., 2019), and access to health care resources (Shi et al., 2004). Other studies also find that early life exposure to state policies and resources is associated with children’s health care coverage and health status (Baughman & Duchovny, 2016) and school achievement (Bastian & Michelmore, 2018; Dahl & Lochner, 2012) as well as adults’ work efforts and earnings (Bastian & Michelmore, 2018; Duncan, Ziol-Guest, & Kalil, 2010), all of which have important implications for subsequent health and mortality.

However, few studies have directly linked state of birth and adult mortality, partially due to lack of suitable data. Indeed, many large studies of mortality in the US lack the capacity to consider geographic exposures at multiple points in the life course. Surveys that ask about state of birth (e.g. Health and Retirement Study) often lack a sufficient number of observations for exploring state-level variation in mortality, and larger datasets (e.g. National Vital Statistics System) do not tabulate the population at risk for mortality by early life geographic details (e.g. state of birth).

Using a unique data source that combines information on place of birth and place of residence for a large representative sample of Americans, our study addresses the following 3 questions: (1) how much does US adult mortality vary across states of residence? (2) how much does US adult mortality vary across states of birth? and (3) how much of the variation in US adult mortality across states of residence is due to “stayers” (whose state of birth and state of residence were the same) and “movers” (whose state of birth and state of residence were different)? While we are not able to examine specific mechanisms through which state of birth and/or state of residence affect mortality in this Short Communication, our aim is to draw attention to the contribution of early life places (i.e. states of birth) to the effects usually attributed to states of residence in comparisons of mortality across the US.

2. Methods

The data used in this study were derived from the National Longitudinal Mortality Study (NLMS). NLMS is a nationally-representative, random sample of non-institutionalized Americans developed for studying demographic, socioeconomic, and occupational disparities in mortality (Makuc et al., 1984). The public-use file consists of a subset of 11 of the 26 Current Population Survey (CPS) cohorts in the full NLMS. The 11 surveys, collected throughout the early 1980s, were combined and re-weighted so they are considered equivalent to a large sample representative of the US population on April 1, 1983. For study members who died, records were linked to the National Death Index (NDI), a random sample of non-institutionalized Americans developed for longitudinal Mortality Study (NLMS). NLMS is a nationally-representative, cross-sectional, multi-level mortality study that tracks all deaths from 1983 onwards. Using a unique data source that combines information on place of birth and place of residence for a large representative sample of Americans, our study addresses the following 3 questions: (1) how much does US adult mortality vary across states of residence? (2) how much does US adult mortality vary across states of birth? and (3) how much of the variation in US adult mortality across states of residence is due to “stayers” (whose state of birth and state of residence were the same) and “movers” (whose state of birth and state of residence were different)?

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2.2. Analytic strategy

We first summarized the demographic distribution of our study sample. Next, we estimated a series of multi-level logistic regression models with state of residence and/or state of birth random effects. The first model estimates the log-odds of mortality for individual i from state of residence j. The second model estimates the log-odds of mortality for individual i from state of birth k. The third/full model estimates the log-odds of mortality from both state of residence and state of birth. All models were adjusted for age (in single years), sex and race/ethnicity. The full model is specified as Equation (1):

\[
\ln\left(\frac{p_{ik}}{1-p_{ik}}\right) = b_0 + b_1 \text{sex}_i + b_2 \text{age}_i + b_3 \text{race}_i + e_j + e_k + e_{ijk}
\]  

(1)

where \(e_j \sim N(0, \sigma_j^2)\) and \(e_k \sim N(0, \sigma_k^2)\). In the model, \(b_0\) is the average log-odds of mortality among individuals in the sample, \(e_j\) is the effect of state of residence and \(e_k\) is the effect of state of birth. Both are assumed to be normally distributed. \(e_{ijk}\) is the error term. All regression models are weighted to account for the study design. Last, using the 2000 US population as the standard population, we calculated age-standardized mortality rates by state of residence as well as by state of residence and state of birth interaction. To illustrate the heterogeneity in mortality across states of birth and residence, we created figures showing the differences in mortality rate between “stayers” and “movers” within states of residence. All statistical analyses were carried out in R, version 3.6.3 (R Core Team, 2020).

3. Results

Summary statistics of the study sample are presented in Table 1. Among the 94,458 individuals in our sample, 33,612 (35.6%) died during the 11-year follow-up period. The mean age at time of interview of those who subsequently died was 69.62 (standard deviation (SD) = 9.96); while the mean age at interview for those who lived throughout the follow-up period was 59.31 (SD = 7.33). Among those died, 16,036 (47.7%) were female, compared to 36,274 (59.6%) among those who survived.

Next, we used Equation (1) to estimate the random effects of state of residence and state of birth on old age mortality, adjusted for sex, race/ethnicity and age. The results of the multi-level logistic regression models are shown in Table 2. Diagnostic statistics suggest that model 3 (which includes both state of residence and state of birth random effects) performs best. The variance of state of birth (0.03) was slightly larger that of state of residence (0.02), meaning that a larger proportion of the
variance in old age mortality risk can be explained by state of birth random effects compared to state of residence random effects.

Fig. 1 shows three examples of our decomposition of the contribution of “movers” and “stayers” to variation in state of residence-based mortality rate estimates. The remaining figures are shown in Appendix A. These figures demonstrate the extent to which typically calculated measures of geographic disparities in mortality are actually complex groupings of mortality rates of “stayers” and mortality rates of a diverse set of “movers”. In addition, we created a figure (see Appendix B) showing similar decompositions for state of birth-based mortality rates. The latter figure highlights variation in mortality experiences among those who emigrate from each state, while the former figure displays the varied mortality experiences of migrants from different origins in each destination.

In the case of Massachusetts (Fig. 1a), standard measures of mortality by place of residence appear to be driven upwards by the higher mortality risk of those who moved to Massachusetts from other East Coast states. Massachusetts residents who were born in the state enjoy a lower mortality risk than those who emigrated to it, suggesting that movers were either less healthy on average than those born in Massachusetts, or that the experience of moving to Massachusetts was somehow deleterious for their longevity. In contrast, the standard death rates for those residing in Alaska (Fig. 1b) and Kentucky (Fig. 1c) are driven down by the lower mortality of several groups of movers. The movers’ longevity displays considerable heterogeneity. For example, relative to those native to Kentucky, those who came to Kentucky from Ohio or Indiana experienced lower mortality while those who moved to Kentucky from Illinois or Tennessee saw considerably higher mortality risks. As shown in Appendix A for the 50 states and the District of Columbia, all but Louisiana have state of birth death rates higher than their state of residence death rates. 37 states and the District of Columbia have state of birth death rates lower than their state of residence death rates; for each of the other 12 states, the state of birth death rates are all higher than their state of residence death rates. Appendix B reveals the heterogeneity in death rates among those born in each state depending on their residence at the time of death. For some states (including Arizona, Hawaii, Georgia, Montana, New Hampshire, Rhode Island, Vermont, and Wyoming), people who were born in those states but migrated to a different state all have higher death rates than those who stayed.

4. Discussion

Recent research on contextual factors (i.e. social and policy environment) has made important contributions towards explaining geographic disparities in adult mortality. However, contemporaneously measured place-based exposures do not accurately capture the far-reaching effects of early life place exposures on later life mortality. Our findings in this Short Communication study are noteworthy in several ways. First, including state of birth measures is consequential for our understanding of geographic disparities in adult mortality. The regression diagnostics show that the model incorporating the random effects of both state of birth and state of residence better predicts mortality risk than does the model with the random effects of state of residence only. Analysis of variance (ANOVA) testing results also reveal that improvement in model fit is significant when state of birth measures are included.

Second, we compare the relative significance of state of birth and state of residence in predicting individual mortality risk. The intra-class correlation coefficient (ICC), which is the fraction of the total variation in the data that is accounted for by between-group (in our case, between-state of birth and between-state of residence) variation (Gelman & Hill, 2007), is used as the measure. The ICC, after accounting for age, sex and race/ethnicity, is 0.9% for state of birth level and 0.6% for state of residence level, albeit both effects are small. ICC can also be interpreted as the correlation among observations within the same group. The mortality risk of individuals within the same state of birth, no matter what their states of residence are, is more similar than individuals within the same state of residence. Although the difference between state of birth and state of residence random effects is small, our results point to the fact that state of birth is as a meaningful predictor of adult mortality risk as state of residence.

Third, we display decompositions of state of residence-based measures of geographic disparities in adult mortality based on “mover” and “stayer” status of the populations. One of the challenges in demographic research is knowing the composition and vital statistics of various strands within mobile populations and weighing their importance in place-based measures of mortality (Kasakoff & Adams, 2000). Here, we show that standard estimates of each state’s mortality rate are influenced to varying extents by individuals who moved between states.
whose populations experience diverse mortality conditions (see Appendix A). Our findings also highlight heterogeneity across migration paths, with some migrants moving to relatively better health environments and others experiencing higher mortality risks in their destinations. While emigrants from certain states enjoy a mortality advantage consistent with ideas about migrant selection or moving to opportunity, those born in states such as Connecticut, Georgia, Vermont, and Wyoming who later moved to another state experienced higher mortality than those who chose to stay put (see Appendix B). The decomposition of state of birth- and state of residence-based mortality rates points to the complexity in the lives of migrants and underscores the need to understand adult mortality from life course perspectives.

Our study has some limitations. First, our data lack the information on the timing of inter-state migration among “movers.” The effects of state of birth on subsequent mortality may be more or less pronounced depending on the duration of the initial exposure and the age at migration. Similarly, the effects of state of residence on adult mortality may be more pronounced for those “movers” who migrated earlier in life and therefore spent more time in their final destination. There is evidence that people who moved across states are more likely to have made such location decision earlier in their lives (Molloy et al., 2011), but more remains to be learned. A related issue is that although we know about our study participants’ location at birth and at the time of interview, we do not know about the number, timing, or destination of other moves that might have taken place in the interim. The lack of a complete migration history between birth and time of interview inhibits our understanding of how migration processes may determine the duration of place-based exposures and consequently affect mortality risk. Furthermore, our geographic unit of analysis is state, which is the only geography at which places of birth and residence are measured in our data. Within-state heterogeneity in early life social and policy environments relevant to older age mortality may be equally important in explaining disparities in state of residence-based mortality rates.

Despite these limitations, our study is one of the first to directly link both state of birth and state of residence to adult mortality. Our results point to the importance of early life place-based exposures, in addition to contemporaneous exposures, in explaining geographic disparities in later life mortality. Future work, with larger sample sizes, should continue to decompose geographic disparities in mortality rates by sex, race/ethnicity, and cohort as well as uncover mechanisms linking state of birth to later life mortality outcomes.

**Author Statement**

Wei Xu: Conceptualization, Methodology, Software, Investigation, Writing- Original draft preparation. Michal Engelman: Conceptualization, Writing- Original draft preparation, Writing- Reviewing and Editing, Funding acquisition. Alberto Palloni: Writing- Reviewing and Editing, Funding acquisition. Jason Fletcher: Conceptualization, Writing- Reviewing and Editing, Funding acquisition.

**Declaration of competing interest**

None.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1177/0042098020100680.

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