### The Census Multidimensional Deprivation Index: Revised and Updated

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#### Abstract

The Census Bureau released a report on Multidimensional Deprivation in the spring of 2019 for the years 2009 through 2017. The Multidimensional Deprivation Index (MDI) consisted of six dimensions: standard of living, health, education, economic security, housing quality, and neighborhood quality. The purpose of this paper is to revise the health, economic security, and housing quality dimensions and redefine the neighborhood quality dimension. Two sets of results are examined. The first set are comparisons at the national level, at the state level, and by demographic groups between the Census Report MDI and the revised MDI from this paper using 2017 data. The second set are MDI estimates using the new MDI methodology. These MDI estimates are compared to official poverty rates and examined over time, by state, and by demographic groups. Furthermore, the MDI is decomposed into contributions made by each dimension of the MDI and decomposed into contributions made by population subgroups.

<sup>&</sup>lt;sup>1</sup> This paper is released to inform interested parties of ongoing research and to encourage discussion of work in progress. Any views expressed are those of the author and not necessarily of the U.S. Census Bureau. The Census Bureau reviewed this data product for unauthorized disclosure of confidential information and has approved the disclosure avoidance practices applied to this release. CDDRB-FY21-POP001-0034.

#### Introduction

As of 2020, 26 countries used national or local multidimensional deprivation indexes (MDI) as their official measure of poverty.<sup>2</sup> While nations adopting multidimensional measures as their official poverty measure tend to be in the developing world, there has been significant use and study of multidimensional deprivation measures in the United States and Europe. Furthermore, one of the United Nation's 2030 Sustainable Development Goals is to reduce the percentage of people living in poverty in all its dimensions.<sup>3</sup>

Multidimensional deprivation measurement is based on the idea that there are income and nonincome based indicators that may identify people as deprived. Multidimensional deprivation provides a more expansive view of well-being than income-based poverty measures. Multidimensional deprivation estimates may include people who are income poor and would be considered in poverty by traditional unidimensional income measures. However, these estimates also include people who may not be income poor, but face hardships or deprivations in other areas of their lives. Multidimensional deprivation estimates also exclude people who are only income poor but are not deprived in other areas.

There has been increased interest in multidimensional poverty since Alkire and Foster published their dual-cutoff approach in 2011. This approach involves setting one cutoff to determine deprivation in a particular dimension and a second cutoff to determine in how many dimensions a person must be deprived in order to be considered poor.

The Census Bureau released its first report on Multidimensional Deprivation in 2019. <sup>4</sup> The report included MDI rates for the years 2009 through 2017 calculated from the American Community Survey. The U.S. Census Bureau also produces official<sup>5</sup> as well as alternate measures of poverty from several household surveys and programs. The Census Bureau releases poverty statistics from the Current Population Survey Annual Social and Economic Supplement (CPS ASEC), the American Community Survey (ACS) and the Survey of Income and Program Participation (SIPP). The CPS ASEC is the source for both official poverty estimates and estimates using an alternative methodology, the supplemental poverty measure (SPM). The official poverty measure (OPM) and the supplemental poverty measure (SPM) are unidimensional measures of poverty that compare resources to a poverty threshold to determine poverty status.<sup>7</sup>

The MDI should be viewed as a separate measure from the OPM or SPM. The OPM and SPM measure income available to meet some minimum threshold of consumption needs, while the MDI evaluates deprivations in a number of different areas in addition to income poverty. However, the overlap across the two types of measures is valuable because it shows how much of the population with multiple deprivations is captured by the unidimensional poverty measures.

<sup>&</sup>lt;sup>2</sup> A full list of countries using a multidimensional approach is available at <u>https://mppn.org/multidimensional-poverty/who-uses/</u>.

<sup>&</sup>lt;sup>3</sup> See <u>https://sustainabledevelopment.un.org/topics/povertyeradication</u>.

<sup>&</sup>lt;sup>4</sup> See <u>https://www.census.gov/content/dam/Census/library/publications/2019/demo/acs-40.pdf</u>.

<sup>&</sup>lt;sup>5</sup> Following the standard specified by the Office of Management and Budget (OMB) in Statistical Policy Directive 14, data from the Current Population Survey Annual and Social Economic Supplement are used to estimate the official national poverty rate, which can be found in the report <u>Income and Poverty in the United States: 2019</u>.

<sup>&</sup>lt;sup>6</sup> See Income and Poverty in the United States: 2019; Supplemental Poverty Measure: 2019; Monthly and Average Monthly Poverty Rates by Selected Demographic Characteristics: 2013.

<sup>&</sup>lt;sup>7</sup> In this report, we use OPM to refer to estimates from the ACS that use the official poverty methodology.

The purpose of this paper is twofold: first, to improve the measurement and definition of several dimensional definitions in order to provide revised estimates for the years 2010 through 2017, and second, to add two new years of data, 2018 and 2019, to the MDI. There are six dimensions in the MDI in this paper. Two dimensions, standard of living and education, are defined just as they were in the 2019 Census Report. The other four dimensions, health, economic security, housing quality, and neighborhood quality, are changed in significant ways detailed in the methods section.

The paper is organized as follows. Section 2 of the paper presents a short literature review. In section 3, the data and methodology for the MDI are discussed. Section 4 lays out the main results of the paper. In this section, two things are done. First, MDI results using the revised methodology are explored by demographic group, by state, and over time. Second, decompositions of the revised MDI are performed, which allow for the analysis of subgroup contributions to the MDI rate as well as each dimension's contribution to the MDI rate. Section 5 discusses the main findings and concludes. In the appendix, the MDI results using the revised methods in this paper are compared to the 2017 MDI from the 2019 Census report.

# Literature review

In 2008, the President of France created the Commission on the Measurement of Economic Performance and Social Progress in order to find more relevant measures of social progress. While the Commission did not focus on deprivation, it did recommend eight dimensions for the measurement of quality of life in a 2009 report which have been used by many people to create multidimensional deprivation measures.<sup>8</sup> These include material well-being (income, consumption, and wealth); health; education; personal activities, including work; political voice and governance; social connections and relationships; environment; and insecurity of an economic and physical nature. Some variant of these dimensions have been used in all multidimensional deprivation measures created in developed countries.

In the U.S., researchers have used the National Health Interview Survey (Alkire and Foster 2011), the CPS ASEC (Mitra and Brucker 2016, 2019), the ACS (Dhongde et al. 2019; Glassman 2017, 2019; Dhongde and Haveman 2016; Reeves et al. 2016), the SIPP (Short 2005), the Panel Study of Income Dynamics (Ciula and Skinner 2015), and the General Social Survey (Wagle 2014) to measure multidimensional deprivation.

Studies of multidimensional deprivation in Europe have mostly used the European Union Statistics on Income and Living Conditions (Alkire and Apablaza 2017; Garcia-Perez et al 2016; Betti et al. 2015; Whelan et al. 2014; Coromaldi and Zoli 2011; Ayala et al. 2011). Several studies used a related panel survey, the European Community Household Panel (D'Ambrosio et al. 2011; Dewilde 2008). In Australia a study used the Household Income and Labor Dynamics in Australia Survey (Martinez Jr. and Perales 2015).

The number of dimensions used in these multidimensional measures ranged from three (Dewilde 2008) to seventeen (Ciula and Skinner 2015). On average, seven dimensions were used. The determination of how many dimensions to use seems to be based largely on the availability of measures in the data source and the author's preferences. While there has been a significant amount of overlap in the use of indicators

<sup>&</sup>lt;sup>8</sup> See Stiglitz et al., 2009.

(education, health, employment, poverty status), unique combinations of indicators also appear, even from researchers using the same data source.<sup>9</sup>

## **Data and Methods**

The data used to construct the MDI comes from the ACS 1-year sample. The ACS is a nationwide survey designed to provide communities with reliable and timely demographic, social, economic, and housing data for the nation, states, congressional districts, counties, places, and other localities every year. It has an annual sample size of about 3.5 million addresses across the United States and Puerto Rico and includes both housing units and group quarters (e.g., nursing facilities and prisons).<sup>10</sup> The ACS is the best source of sub-national economic, social, and employment characteristics and its large sample size allows for decompositions by demographic characteristics and small geographical areas.

The ACS data is supplemented with data at the block group level from the Area Deprivation Index (ADI) created by the University of Wisconsin-Madison.<sup>11</sup> The ADI is an index of seventeen socioeconomic indicators from the American Community Survey 5-year sample.

The MDI is constructed using the Alkire-Foster method, a widely-used flexible methodology (Alkire 2011a) in which individual-level indicators of deprivation in multiple dimensions are used to identify who is deprived and to assess the intensity of their deprivation. Similar to the poverty estimates using official thresholds from the CPS ASEC, SIPP and ACS, the MDI is limited to the poverty universe - all persons except unrelated individuals under age 15 and individuals residing in institutional group quarters. A person is defined as deprived according to the MDI if they are deprived in at least two dimensions.<sup>12</sup>

The MDI produced in this report uses six dimensions, summarized in the table "Changes to the Multidimensional Deprivation Index" and discussed in detail below, to determine if someone is categorized as deprived. Table 1 also includes how dimension definitions changed from the 2019 Census report to this paper. The standard of living dimension, which uses the same definition as the 2019 Census report, is a traditional unidimensional poverty measure. Many studies have used a country's income-based poverty measure to determine standard of living, as is done in this paper.

Education, which also uses the same definition as the 2019 Census report, is included in the MDI because limited educational attainment may limit opportunities, decrease attachment to the labor force, or make it significantly more difficult to increase one's social or economic standing. A person is considered deprived in education if he or she is over 18 years of age and is without a high school degree or GED. Since people under age 19 are likely to still be in school, for this group the educational attainment of the householder is substituted for their own educational attainment. Therefore, a child under age 19 is deprived in this dimension if the householder lacks a high school degree or GED.

<sup>&</sup>lt;sup>9</sup> For a more detailed review of the literature, see

https://www.census.gov/content/dam/Census/library/publications/2019/demo/acs-40.pdf.

<sup>&</sup>lt;sup>10</sup> While people living in group quarters are sampled in the ACS, those living in institutional group quarters (e.g., nursing homes or correctional facilities) are not included in the poverty universe. Homeless populations are not included in the sample universe unless they are living in shelters at the time of the survey.

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<sup>&</sup>lt;sup>12</sup> A cut-off of two dimensions is used in much of the literature to define multidimensional deprivation.

| Dimensions                            | 2019 Census Report  | Current paper  |
|---------------------------------------|---|--|
| Standard of<br>living                 | In poverty according to the official poverty measure  | No change  |
| Education                             | Aged 19 or older and without a high school diploma or GED <sup>a</sup>  | No change  |
| Health                                | Predicted health status <sup>b</sup> is poor. Based on<br>cutoff value of 3 for people under age 65<br>and 3.5 for people age 65 and over.  | For people under age 65: Lacked health insurance.<br>For people age 65 and over: Lacked health insurance o<br>reported at least two disabilities   |
| Economic<br>security                  | <ul> <li>At least two of the following conditions<sup>c</sup>:</li> <li>Lacked health insurance</li> <li>Unemployed at the time of the survey AND did not work the prior 12 months<sup>a</sup></li> <li>Average hours worked in a normal week per adult in the household was less than 20 hours and there was no retirement income in the household.</li> </ul> | <ul> <li>For people under age 65:</li> <li>Aged 18 and older and unemployed at the time of the survey OR</li> <li>Lived in a household in which average household hours worked OR average household weeks worked for working-age adults (age 18 to 64, not currently enrolled in school) was less than 20 hours a week or less than 26 weeks a year, respectively<sup>13</sup></li> <li>For people age 65 and over: <ul> <li>Unemployed at the time of the survey OR</li> <li>Worked less than 20 hours a week OR less than 26 weeks a year AND had minimal retirement income</li> </ul> </li> </ul> |
| Housing quality                       | At least two of the following conditions:<br>• Lacked complete kitchen<br>• Lacked complete plumbing<br>• Overcrowded housing unit<br>• High cost burden.   | Lived in a housing unit with more than two people per<br>bedroom or lived in a shelter.  |
| Neighborhood<br>quality <sup>14</sup> | Lived in a county with at least two of the<br>following:<br>• High crime<br>• Poor air quality<br>• Poor food environment   | Lived in a deprived block group as measured by the<br>Area Deprivation Index: all block groups with an ADI<br>score greater than 90.   |

<sup>c</sup> For people 65 and over, only one of these conditions is necessary.

The health dimension of the MDI accounts for the fact that poor health can make working or enjoying life more difficult. Ideally, a measure of health status would be used. This is not available in the ACS. However, two variables can be used as a reasonable approximation of health. The first variable is health insurance coverage. Studies have found a consistent positive relationship between health insurance coverage and health-related outcomes. The evidence suggests that health insurance is associated with more appropriate use of health care services and better health outcomes (Institute of Medicine Committee on the Consequences of Uninsurance 2002; Sommers et al. 2017).

 <sup>&</sup>lt;sup>13</sup> Those with zero weeks/hours worked were included in the hours and weeks calculations.
 <sup>14</sup> For more information on the change in the neighborhood quality dimension, see

https://www.census.gov/content/dam/Census/library/working-papers/2020/demo/SEHSD-WP2020-08.pdf.

A second variable, number of disabilities, is used for people age 65 and over since nearly all people in this age group have health insurance coverage. People can report up to six disabilities in the ACS.<sup>15</sup> For this dimension, a person is health deprived if they lack health insurance coverage or if they are 65 years of age or over and report at least two disabilities.

In the 2019 Census report, predicted health status was used for people of all ages and health insurance coverage was included in the economic security dimension. This change was made for two reasons. First, predicted health status was dependent on number of disabilities and is not a good measure for people under 65 since they are less likely to have disabilities, which makes it harder to predict their health status from the CPS ASEC. Second, a person without health insurance may skip routine doctor visits and not seek help for minor issues which means their health, rather than their economic security, is affected.

Economic security is included in the MDI because it is possible to be above the standard of living threshold but still face economic insecurity. An economically insecure person is one with a tenuous connection to the labor market. A person can meet this deprivation requirement in a number of ways. A person is considered economically insecure if they are:

- 1) Under age 65:
  - i. Aged 18 and older and unemployed at the time of the survey OR
  - ii. Live in a household in which average household hours worked OR average household weeks worked for working-age adults (age 18 to 64, not currently enrolled in school) is less than 20 hours a week or less than 26 weeks a year, respectively<sup>16</sup>
- 2) Age 65 and over:
  - i. Unemployed at the time of the survey OR
  - ii. Work less than 20 hours a week OR less than 26 weeks a year AND retirement plus Social Security plus Supplemental Security Income for the household is less than the minimum Social Security benefit assuming 30 years of work experience. <sup>17</sup>

Requirement 1.ii is designed to capture people who live in households that are marginally connected to the labor market: those working full-time part of the year or working part-time for the full year. Requirement 2.ii is included because a report from the National Institute of Retirement Security found that non-working older households without retirement income were significantly more likely to be food insecure, face housing hardship, be in poverty, and be on public assistance (Bond and Porell 2020).

In the 2019 Census report, an average hours condition was used along with health insurance and employment status. A change was made because this dimensional definition was overly complicated. For a person under age 65 to be deprived, two of the conditions had to be met while only one condition had to

<sup>&</sup>lt;sup>15</sup> There are six disabilities a person can report in the ACS: Hearing difficulty, vision difficulty, difficulty going out, difficulty dressing, physical difficulty, and difficulty remembering.

<sup>&</sup>lt;sup>16</sup> Those with zero weeks/hours worked were included in the hours and weeks calculations.

<sup>&</sup>lt;sup>17</sup> The minimum social security benefit was calculated using tables available at <u>https://www.ssa.gov/cgi-bin/smt.cgi</u>. To calculate the minimum benefit, it was assumed that the person worked the maximum number of years, 30. For the year 2019, the minimum benefit was \$872.50 per month or \$10,470 annually.

be met for people age 65 and over. Health insurance was moved to the health dimension and the format of the dimension was changed in order to make the dimension definition more straightforward.

The housing quality dimension accounts for the need for physical space and security within one's home. A household has poor housing quality if it is overcrowded. An overcrowded household is defined as having more than two people per bedroom. Furthermore, people living in emergency or transitional shelters are considered deprived in housing quality.

In the 2019 Census report, these conditions along with complete kitchen, complete plumbing, and high cost burden were used against a benchmark of two of the conditions having to be met for a deprived dimension. Kitchen and plumbing are removed from the current definition because there is no good way to differentiate poor housing without complete kitchens from expensive retirement communities. High cost burden is removed because, though it does take housing costs into account, it is largely income based and more indicative of housing affordability than housing quality. The other housing conditions may be the result of household income, but they don't explicitly include income in their calculation. Furthermore, similar to the economic security dimension, there no longer is a requirement that multiple conditions have to be met.

Neighborhood quality is an important dimension when measuring well-being for several reasons. First, there is evidence that among people in poverty, there are better outcomes for those living in less deprived areas than in more deprived areas. In a 2012 paper, Ludwig et al. found that moving from a high-poverty to a low-poverty neighborhood led to long-term improvements in adult physical and mental health and subjective well-being. Furthermore, they found that this movement did not change a family's financial situation. In a 2015 paper, Chetty and Hendren found that low-income children were more likely to succeed in in counties with lower poverty, lower income inequality, lower crime, better schools, and a larger share of two-parent families. Neighborhood disadvantage may also influence health independently of a person's socioeconomic status: studies have suggested that, among people in poverty, those who live in extremely disadvantaged neighborhoods may have worse health outcomes than those who live in wealthier neighborhoods (Ludwig et al. 2011, Hu et al. 2018).

Second, there is evidence that there are independent negative effects for people living in deprived areas over and above the effects of living in a poor or deprived household. In Ludwig et al. 2013, the authors stated that "living in a disadvantaged social environment may depress life outcomes by, for example, shaping exposure to peer norms or access to resources such as schools or job referrals." Numerous studies have found that people living in more disadvantaged neighborhoods fare worse with respect to earnings, education, health, crime involvement, and other life outcomes (Jencks and Mayer 1990; Ellen and Turner 1997; Sampson, Raudenbush, and Earls 1997; Kawachi and Berkman 2003; Sampson, Morenoff, and Gannon-Rowley 2002; Sampson 2012).

Third, there were a number of papers coming out of the moving to opportunity (MTO) program that demonstrated the importance of neighborhoods. The MTO was a program for applicants in highpoverty housing projects for which eligibility for a housing voucher was determined by a random lottery. The studies found that moving to a lower poverty neighborhood led to increased college attendance rates and earnings, improved adult physical and mental health and subjective well-being, lower poverty rates, and increased safety (Chetty, Hendren, and Katz 2015; Ludwig et. al 2013; Kling, Liebman, and Katz 2005; Katz, Kling, and Liebman 2000). In the 2019 Census report, neighborhood quality was proxied by crime, pollution, and access to food at the county level. For small rural counties this may be reasonable, but even mid-sized counties have a significant amount of heterogeneity that is not captured by county-level measures.<sup>18</sup> Furthermore, since the cutoff values were based on national numbers, there were a significant number of states which had no deprived counties. To deal with these issues, a different neighborhood quality measure was chosen for the MDI.<sup>19</sup>

The neighborhood quality measure used in this paper is the Area Deprivation Index (ADI) created by the University of Wisconsin-Madison.<sup>20</sup> The ADI score includes block group measures of education (percent with less than 9 years of education; percent with at least a high school diploma), employment (percent employed in a white-collar occupation; unemployment rate), income (median family income; income disparity;<sup>21</sup> percent below poverty level; percent below 150% of poverty level), housing (median home value; median gross rent; median monthly mortgage; home ownership rate), household composition (percent of single parent households), and household resources (percent without a car; percent without a telephone; percent without complete plumbing; percent of housing units with more than one person per room). The ADI measure is constructed by ranking the ADI score from low to high for the nation and grouping the block groups into bins corresponding to each 1 percent range of the ADI score. The ADI ranks block groups from 1, least disadvantaged, to 100, most disadvantaged in the U.S.<sup>22</sup> To be deprived in neighborhood quality, a person must live in a Census block group that is in the top ten percent of deprived areas, an ADI over 90.

#### Results

#### Deprivation Rates: 2018 and 2019

The focus of this section is on MDI rates using the methodology developed in this paper.<sup>23</sup> In Table 2, the percent of the U.S. population deprived in each dimension is shown for 2018 and 2019. The percent of people deprived in health and neighborhood quality increased from 2018 to 2019, while the percent of people deprived in standard of living, education, economic security, and housing quality decreased from 2018 to 2019. In both years, the deprivation rate was highest for the standard of living dimension and lowest for the housing quality and neighborhood quality dimensions.<sup>24</sup>

<sup>&</sup>lt;sup>18</sup> The 2016 Reeves et al. paper used PUMAs which also contain significant heterogeneity.

<sup>&</sup>lt;sup>19</sup> For more information about the selection and evaluation of the ADI and other neighborhood quality measures, see Glassman (2020).

<sup>&</sup>lt;sup>20</sup> For an extensive list of publications using the ADI, see <u>https://www.neighborhoodatlas.medicine.wisc.edu/citations</u>.

<sup>&</sup>lt;sup>21</sup> Defined as the ratio of households with income less than \$10,000 to households with income > \$50,000.

<sup>&</sup>lt;sup>22</sup> For more information on the ADI, see <u>https://www.neighborhoodatlas.medicine.wisc.edu/</u>.

<sup>&</sup>lt;sup>23</sup> For comparisons of the Census report and current paper MDI rates overall, by demographics groups, and by state and region, see Appendix.

<sup>&</sup>lt;sup>24</sup> In 2018, the difference between housing quality and neighborhood quality was not statistically significant.

| Table 2: Percent of People Deprived in Individual Dimension: 2018 and 2019 |         |          |         |          |                        |                |  |  |
|--|---------|----------|---------|----------|------------------------|----------------|--|--|
|  | 201     | .8       | 20      | 19       | Change (2019 less 2018 |                |  |  |
| Dimension  | Percent | Standard | Percent | Standard | Percent                | Standard error |  |  |
|  |         | error    |         | error    |                        |                |  |  |
| Standard of living   | 13.11   | 0.044    | 12.34   | 0.046    | *-0.78                 | 0.064          |  |  |
| Education  | 11.47   | 0.040    | 11.18   | 0.044    | *-0.29                 | 0.060          |  |  |
| Health   | 11.77   | 0.040    | 12.13   | 0.045    | *0.36                  | 0.060          |  |  |
| Economic security  | 11.07   | 0.031    | 10.86   | 0.029    | *-0.21                 | 0.042          |  |  |
| Housing quality  | 6.47    | 0.039    | 6.27    | 0.042    | *-0.20                 | 0.058          |  |  |
| Neighborhood quality   | 6.49    | 0.023    | 6.58    | 0.027    | *0.09                  | 0.035          |  |  |

\* difference is statistically different from zero at the 90 percent confidence level.

<sup>1</sup>Details may not sum to totals due to rounding.

Note: The deprivation universe excludes children under age 15 who are not related to the householder, people living in institutional group quarters (e.g., nursing homes or correctional facilities), and people living in college dormitories or military barracks.

Source: U.S. Census Bureau, 2018 and 2019 American Community Survey.

In Table 3, the percent of people deprived in different numbers of dimensions is shown for 2018 and 2019. Two or more dimensions is bolded because that row represents the MDI rate (15.4 in 2018 and 14.9 percent in 2019). The percent of people deprived decreased from 2018 to 2019 for all categories except for one or more dimensions. In 2019, approximately 38.2 percent of the population was deprived in at least one of the six dimensions that define the MDI, while about 0.2 percent were deprived in five out of the six dimensions.

|                          | 20      | 18       | 20      | 19       | Change (2019 less<br>2018) <sup>1</sup> |          |
|--------------------------|---------|----------|---------|----------|---|----------|
| Dimension                | Percent | Standard | Percent | Standard | Percent                                 | Standard |
|                          |         | error    |         | error    |   | error    |
| One or more dimensions   | 38.32   | 0.079    | 38.15   | 0.084    | -0.17                                   | 0.116    |
| Two or more dimensions   | 15.36   | 0.056    | 14.95   | 0.059    | *-0.42                                  | 0.081    |
| Three or more dimensions | 5.17    | 0.030    | 4.87    | 0.029    | *-0.30                                  | 0.041    |
| Four or more dimensions  | 1.30    | 0.013    | 1.19    | 0.013    | *-0.11                                  | 0.018    |
| Five or more dimensions  | 0.20    | 0.005    | 0.18    | 0.006    | *-0.02                                  | 0.007    |

 $^{\ast}$  change is statistically different from zero at the 90 percent confidence level.

<sup>1</sup> Details may not sum to totals due to rounding.

Note: The deprivation universe excludes children under age 15 who are not related to the householder, people living in institutional group quarters (e.g., nursing homes or correctional facilities), and people living in college dormitories or military barracks.

Source: U.S. Census Bureau, 2018 and 2019 American Community Survey.

#### **MDI and OPM**

In Figure 1, the MDI is compared to the OPM, which is a traditional unidimensional measure of deprivation, for the years 2018 and 2019. Although the OPM is a dimension (standard of living) in the MDI, in 2019 there was a large amount of the population that was either deprived in at least two dimensions other than standard of living (6.8 percent) or deprived in standard of living but not deprived in any other dimensions (4.2 percent). There was also a large segment of the population (8.2 percent) that was deprived in standard of living and deprived in at least one other dimension. From 2018 to 2019, the

percentage of people deprived in both measures and the percentage of people in poverty but not MDI deprived decreased, while the percentage of people MDI deprived but not in poverty increased.



In Figure 2, the OPM is compared to the MDI, using the current paper methodology, over time.<sup>25</sup> Three conclusions are readily apparent. The first is that the MDI was higher than the OPM in each year. The second is that the MDI and OPM have merged close together over time. In 2010, the MDI was 5.62 percentage points higher (37 percent) than the OPM, while in 2019 the MDI was 2.61 percentage points higher (21 percent) than the OPM. The third is that both the MDI and OPM were lower in 2019 than they were in 2010.



<sup>&</sup>lt;sup>25</sup> The ADI index is only available starting in 2010.

In Figure 3, the MDI rate and the OPM rate are compared for different demographic groups for 2019. The MDI rate was higher than the OPM rate for all groups in Figure 3, except for Non-Hispanic Whites and those under age 18. By race and Hispanic origin, the largest difference between the OPM and the MDI was for Hispanics while the smallest differences was for non-Hispanic Whites. By nativity, there were substantial differences. There was an approximately 0.9 percentage point difference between the OPM and MDI for people born in the U.S., while this difference was approximately 13.3 percentage points for people born outside the U.S. The large differences for Hispanics and the foreign-born were due to deprivation rates more than twice as large in the education, health, and housing dimensions for the foreign-born and Hispanics compared to the native-born and non-Hispanics, respectively.

By age category, the largest difference between the OPM and the MDI was for people aged 65 and over, followed by people aged 18 to 64, and then by people under age 18. The OPM was higher than the MDI for people under age 18, while the OPM was lower than the MDI for people in the other two age groups. Furthermore, people age 65 and over had the lowest poverty rates of the age groups, while people age 18 to 64 had the lowest MDI rates of the age groups. Finally, the difference between the OPM and the MDI was larger for males than it was for females.



As shown in Table 4, the MDI rate was higher than the OPM rate in 29 states, lower than the OPM rate in 8 states and the District of Columbia, and not significantly different than the OPM rate in 13 states. The MDI ranges from 7.0 percent in New Hampshire to 23.6 percent in Mississippi.<sup>26</sup>

<sup>&</sup>lt;sup>26</sup> The MDI rate in Vermont is not different from the MDI rate in New Hampshire at the 90 percent confidence level.

|                      | OPN  | Λ    | P    | ИDI  | Difference (MDI | less OPM) |  |
|----------------------|------|------|------|------|-----------------|-----------|--|
|                      | Est. | S.E. | Est  | S.E. | Est             | S.E.      |  |
| United States        | 12.3 | 0.05 | 14.9 | 0.06 | *2.6            | 0.0       |  |
| Alabama              | 15.5 | 0.32 | 17.2 | 0.29 | *1.8            | 0.3       |  |
| Alaska               | 10.1 | 0.67 | 12.8 | 0.67 | *2.7            | 0.6       |  |
| Arizona              | 13.5 | 0.29 | 17.4 | 0.28 | *4.0            | 0.2       |  |
| Arkansas             | 16.2 | 0.35 | 17.1 | 0.36 | *0.9            | 0.3       |  |
| California           | 11.8 | 0.11 | 17.7 | 0.12 | *5.9            | 0.1       |  |
| Colorado             | 9.3  | 0.22 | 9.5  | 0.24 | 0.2             | 0.2       |  |
| Connecticut          | 10.0 | 0.24 | 10.5 | 0.23 | *0.5            | 0.2       |  |
| Delaware             | 11.3 | 0.71 | 11.6 | 0.64 | 0.3             | 0.6       |  |
| District of Columbia | 13.5 | 0.77 | 12.1 | 0.73 | *-1.4           | 0.8       |  |
| Florida              | 12.7 | 0.16 | 15.9 | 0.15 | *3.3            | 0.1       |  |
| Georgia              | 13.3 | 0.21 | 16.4 | 0.24 | *3.1            | 0.2       |  |
| Hawaii               | 9.3  | 0.51 | 10.6 | 0.43 | *1.2            | 0.4       |  |
| Idaho                | 11.2 | 0.48 | 11.6 | 0.41 | 0.4             | 0.3       |  |
| Illinois             | 11.5 | 0.19 | 12.9 | 0.19 | *1.4            | 0.1       |  |
| Indiana              | 11.9 | 0.13 | 13.9 | 0.25 | *2.0            | 0.2       |  |
| lowa                 | 11.5 | 0.23 | 9.6  | 0.32 | *-1.6           | 0.2       |  |
| Kansas               | 11.4 | 0.30 | 12.6 | 0.37 | *1.1            | 0.1       |  |
| Kentucky             | 16.3 | 0.32 | 16.7 | 0.31 | 0.4             | 0.3       |  |
| Louisiana            | 19.0 | 0.39 | 19.2 | 0.30 | 0.2             | 0.2       |  |
| Maine                | 10.9 | 0.35 | 9.6  | 0.35 | *-1.2           | 0.3       |  |
| Maryland             | 9.0  | 0.44 | 10.4 | 0.35 | *1.4            | 0.1       |  |
| Massachusetts        | 9.4  | 0.21 | 8.8  | 0.20 | *-0.6           | 0.:       |  |
|                      |      |      |      | 0.17 | *0.9            | 0.:       |  |
| Michigan             | 13.0 | 0.19 | 13.9 |      | *-0.8           |           |  |
| Minnesota            | 9.0  | 0.20 | 8.1  | 0.22 |                 | 0.:       |  |
| Mississippi          | 19.6 | 0.50 | 23.6 | 0.53 | *4.0<br>*1.0    | 0.4       |  |
| Missouri             | 12.9 | 0.24 | 13.9 | 0.22 |                 | 0.3       |  |
| Montana              | 12.6 | 0.46 | 10.8 | 0.41 | *-1.9           | 0.4       |  |
| Nebraska             | 9.9  | 0.31 | 9.9  | 0.30 | 0.0             | 0.2       |  |
| Nevada               | 12.5 | 0.38 | 16.3 | 0.41 | *3.8            | 0.3       |  |
| New Hampshire        | 7.3  | 0.34 | 7.0  | 0.32 | -0.3            | 0.3       |  |
| New Jersey           | 9.2  | 0.18 | 11.9 | 0.20 | *2.7            | 0.:       |  |
| New Mexico           | 18.2 | 0.45 | 21.8 | 0.52 | *3.6            | 0.4       |  |
| New York             | 13.0 | 0.15 | 17.2 | 0.18 | *4.1            | 0.:       |  |
| North Carolina       | 13.6 | 0.21 | 15.1 | 0.21 | *1.5            | 0.        |  |
| North Dakota         | 10.6 | 0.50 | 9.5  | 0.56 | *-1.0           | 0.4       |  |
| Ohio                 | 13.1 | 0.17 | 14.1 | 0.18 | *1.1            | 0.:       |  |
| Oklahoma             | 15.2 | 0.24 | 17.5 | 0.27 | *2.4            | 0.2       |  |
| Oregon               | 11.4 | 0.25 | 11.7 | 0.30 | 0.4             | 0.2       |  |
| Pennsylvania         | 12.0 | 0.19 | 12.4 | 0.15 | *0.4            | 0.:       |  |
| Rhode Island         | 10.8 | 0.58 | 10.2 | 0.56 | -0.6            | 0.        |  |
| South Carolina       | 13.8 | 0.33 | 15.6 | 0.32 | *1.7            | 0.2       |  |
| South Dakota         | 11.9 | 0.57 | 12.1 | 0.51 | 0.1             | 0.3       |  |
| Tennessee            | 13.9 | 0.24 | 15.6 | 0.24 | *1.7            | 0.2       |  |
| Texas                | 13.6 | 0.15 | 21.2 | 0.19 | *7.6            | 0.1       |  |
| Utah                 | 8.9  | 0.30 | 9.3  | 0.24 | 0.4             | 0.3       |  |
| Vermont              | 10.2 | 0.46 | 7.8  | 0.45 | *-2.4           | 0.4       |  |
| Virginia             | 9.9  | 0.18 | 10.7 | 0.19 | *0.8            | 0.:       |  |
| Washington           | 9.8  | 0.21 | 10.8 | 0.24 | *1.0            | 0.        |  |
| West Virginia        | 16.0 | 0.49 | 16.0 | 0.55 | 0.0             | 0.4       |  |
| Wisconsin            | 10.4 | 0.20 | 9.5  | 0.18 | *-0.9           | 0.2       |  |
| Wyoming              | 10.1 | 0.61 | 9.1  | 0.62 | -1.0            | 0.0       |  |

## Decompositions

One of the advantages of the MDI is that it can be decomposed into the contributions that subgroups of the population and individual dimensions make to the MDI. The MDI is a headcount ratio: the count of people who are deprived divided by the total population. In order to perform a decomposition, the MDI must be converted to an adjusted headcount ratio. In 2019, the adjusted headcount ratio (6.0 percent) is defined as the headcount ratio (14.9 percent) multiplied by the intensity of deprivation (0.4). The intensity measure is derived by first calculating the average number of deprivations for people who were multi-dimensionally deprived according to the MDI (2.4). This number is then divided by the total possible number of deprivations, which was six in this case. These decompositions allow us to understand the impact that each dimension had on the overall MDI rate and facilitate comparisons of population shares. The MDI can be decomposed in two main ways: into contributions made by each of the dimensions and into contributions made by population subgroups.

Dimension decomposition provides the contributions that each dimension made to the MDI rate. In order to decompose the MDI by its dimensions, the proportion of people who are both deprived in the dimension and multidimensionally deprived was calculated. Then, this value was divided by the number of dimensions, six, and then by the overall adjusted headcount ratio. As shown in Figure 4, in both years, 2018 and 2019, standard of living was the largest contributor to the MDI rate, while housing quality and neighborhood quality were among the smallest contributors. However, health became a larger contributor from 2018 to 2019 while standard of living became a smaller contributor. Changes in the contributions to the MDI rate made by the education, economic security, housing quality, and neighborhood quality dimensions from 2018 to 2019 were not statistically significant.



In addition to looking at dimensional decompositions over time, selected demographic decompositions are shown in Figures 5 and 6. Deprivation in standard of living accounted for 27.0 percent of the MDI rate for people under age 18, but accounted for about 21 percent of the MDI rate for both

people aged 18 to 64 and people aged 65 and over. Similarly, deprivation in economic security accounted for 22.8 percent of the MDI rate for people age 65 and over, but accounted for 13.6 percent of the overall MDI rate for people under age 18. One of the largest discrepancies across age classes was in the health dimension. Health deprivation accounted for 22.0 percent of the MDI rate for people aged 65 and over, while it accounted for 7.4 percent of the MDI for people under age 18. Finally, housing quality accounted for 18.5 percent of the MDI rate for people under age 18, but only 3.1 percent of the MDI rate for people age 65 and over.



The largest contributor to multidimensional deprivation for Non-Hispanic Whites, Blacks, and American Indian and Alaska Natives in Figure 6 was standard of living, while economic security was the largest contributor for Asians, and education was the largest contributor to the MDI rate for Hispanics. Standard of living was a larger contributor to multidimensional deprivation for Blacks than for other groups, health was a larger contributor to multidimensional deprivation for Whites than for the other groups, economic security was a larger contributor for Whites and Asians than for other groups, education was a larger contributor to multidimensional deprivation for Hispanics than for the other groups, housing quality was a larger contributor for Asians and Hispanics than for other groups, and neighborhood quality was a larger contributor to multidimensional deprivation for Blacks than for other groups.



Decomposing the MDI by population subgroups gives the percentage of the national MDI rate contributed by a particular subgroup. In order to decompose the MDI by subgroups, the headcount ratio for a subgroup was divided by the overall adjusted headcount ratio. This number was then multiplied by the subgroup's share of the total population. As seen in Table 5, in 2019, Blacks, American Indian and Alaska Natives, Hispanics, people under age 18, and people aged 65 and over represented larger shares of the multi-dimensionally deprived population than the overall population. Alternatively, Whites, Asians, other races, and those aged 18 to 64 were underrepresented in the multidimensional deprivation population relative to their overall population.

| Table 5: Multidimensional Deprivation Index Shares and Population Shares: 2019                                      |                      |           |             |             |            |           |  |  |  |
|---|----------------------|-----------|-------------|-------------|------------|-----------|--|--|--|
|   | MDI Population Share |           | Total Popul | ation Share | Difference |           |  |  |  |
|   | Percent              | Std. err. | Percent     | Std. err.   | Percent    | Std. err. |  |  |  |
| Race and Hispanic Origin  |                      |           |             |             |            |           |  |  |  |
| White, NH   | 34.35                | 0.24      | 60.07       | 0.01        | *-25.72    | 0.24      |  |  |  |
| Black, NH   | 18.73                | 0.14      | 12.17       | 0.01        | *6.56      | 0.14      |  |  |  |
| Asian, NH   | 4.82                 | 0.06      | 5.65        | 0.01        | *-0.83     | 0.06      |  |  |  |
| AIAN, NH  | 1.44                 | 0.22      | 0.67        | Z           | *0.77      | 0.22      |  |  |  |
| Other, NH   | 2.76                 | 0.05      | 2.94        | 0.02        | *-0.19     | 0.05      |  |  |  |
| Hispanic  | 37.90                | 0.25      | 18.50       | Z           | *19.40     | 0.25      |  |  |  |
| Age   |                      |           |             |             |            |           |  |  |  |
| Under age 18  | 24.10                | 0.20      | 22.38       | 0.01        | *1.72      | 0.20      |  |  |  |
| Age 18 to 64  | 58.93                | 0.33      | 61.13       | 0.01        | *-2.20     | 0.33      |  |  |  |
| Age 65 and over   | 16.97                | 0.10      | 16.49       | 0.01        | *0.48      | 0.10      |  |  |  |
| * difference is statistically different f<br>Z Represents or rounds to zero.<br>Source: U.S. Census Bureau, 2019 An |                      |           |             |             |            |           |  |  |  |

### Conclusion

The purpose of this paper was twofold. The first was to revise the definitions of four out of the six dimensions of the MDI. The second was to provide updated MDI rates for 2010 through 2017 and to provide new rates for 2018 and 2019.

Two sets of comparisons were done. First, the deprivation rates for 2019 were compared to the deprivation rates for 2018. The percent of people deprived in two or more dimensions decreased from 15.4 in 2018 to 14.9 percent in 2019. The percent of people deprived in health and neighborhood quality increased from 2018 to 2019, while the percent of people deprived in standard of living, education, economic security, and housing quality

Second, comparisons were made between the MDI rates using the new methodology and OPM rates using 2019 data. In general, the MDI rate was higher than the OPM rate. This held true over time and when the population was stratified by demographic groups, except for non-Hispanic Whites and people under age 18. When stratified by state, the MDI rate was higher than the OPM rate in 29 states, lower than the OPM rate in 8 states and the District of Columbia, and not significantly different than the OPM rate in 13 states.

The final part of the paper set forth decompositions by dimension and by population subgroup. The contribution that each dimension made to the MDI rate was shown over time, by age group, and by race and Hispanic origin. Population subgroup decomposition showed the contribution to the MDI rate made by each population subgroup. Blacks, American Indian and Alaska Natives, Hispanics, people under age 18, and people aged 65 and over represented larger shares of the multi-dimensionally deprived population than the overall population.

The appendix of the paper compared 2017 MDI results between the methodology used in the Census report and the new methodology created in this paper. The current MDI was higher than the Census report MDI in 2017. This result was consistent for non-Hispanic Asians and American Indian and Alaska Natives, Hispanics of any race, the foreign born, people aged 18 to 64, and males. The current MDI rate was lower than the Census report MDI for non-Hispanic Blacks and Whites, the native born, people under age 18, and females. The current MDI was higher than the Census report MDI in 21 states, lower than the Census report MDI in 19 states and the District of Columbia, and not significantly different from the Census report MDI in 9 states.

Going forward, the plan is to continue to produce MDI rates on an annual basis. The next step is to examine the relationships between the MDI and different types of outcomes such as: volunteerism rates, health outcomes, and voting.

### References

- Alkire, Sabina and James Foster, "Counting and Multidimensional Poverty Measurement," *Journal of Public Economics*, 95(7-8): 476-487, 2011a.
- Alkire, Sabina and James Foster, "Understandings and Misunderstandings of Multidimensional Poverty Measurement," *Journal of Economic Inequality*, 9: 289-314, 2011b.
- Atkinson, Anthony B, "Multidimensional Deprivation: Contrasting Social Welfare and Counting Approaches," *Journal of Economic Inequality*, 1: 51-65, 2003.
- Ayala, Luis, Antonio Jurado, and Jesus Perez-Mayo, "Income Poverty and Multidimensional Deprivation: Lessons from Cross-regional Analysis," *The Review of Income and Wealth* 57(1): 40-60, 2011.
- Betti, Gianni, Francesca Gagliardi, Achille Lemmi, and Vijay Verma, "Comparative Measures of Multidimensional Deprivation in the European Union," *Empirical Economics*, 49: 1071-1100, 2015.
- Bond, Tyler and Frank Porell, "Examining the Nest Egg: The Sources of Retirement Income for Older Americans", National Institute on Retirement Security, January 2020.
- Bourguignon, Francois and Satya R. Chakravarty, "The Measurement of Multidimensional Poverty," Journal of Economic Inequality, 1: 25-29, 2003.
- Chetty, Raj and Nathaniel Hendren. 2015. "The Impacts of Neighborhoods on Intergenerational Mobility: Childhood Exposure Effects and County-Level Estimates." Harvard University Working Paper.
- Chetty, Raj, Nathaniel Hendren, and Lawrence Katz, "The Effects of Exposure to Better Neighborhoods on Children: New Evidence from the Moving to Opportunity Experiment," NBER Working Paper number 21156, 2015.
- Coromaldi, Manuela and Mariangela Zoli, "Deriving Multidimensional Poverty Indicators: Methodological Issues and an Empirical Analysis for Italy," *Social Indicators Research*, 107: 37-54, 2011.
- D'Ambrosio, Conchita, Joseph Deutsch, and Jacques Silber, "Multidimensional Approaches to Poverty Measurement: An Empirical Analysis of Poverty in Belgium, France, Germany, Italy and Spain, based on the European panel," *Applied Economics*, 43: 951-961, 2011.
- Decancq, Koen and Maria Ana Lugo, "Weights in Multidimensional Indices of Well-Being: An Overview," *Econometric Reviews*, 32: 7-34, 2013.
- Dewilde, Caroline, "Individual and Institutional Determinants of Multidimensional Poverty: A European Comparison," *Social Indicators Research*, 86: 233-256, 2008.

- Dhongde, Shatakshee, Prasanta K. Pattanaik, and Yongsheng Xu, "Well-being, Deprivation, and the Great Recession in the U.S.: A Study in a Multidimensional Framework," *The Review of Income and Wealth*, Series 0, Number 0, 2019.
- Dhongde, Shatakshee and Robert Haveman, "Multidimensional Deprivation in the U.S.," *Social Indicators Research*, 127(3): 1-24, 2016.
- Ellen, Ingrid G., and Margery A. Turner. 1997. "Does Neighborhood Matter?" *Housing Policy* Debate 8 (4): 833–66.
- Fox, Liana, "The Supplemental Poverty Measure: 2017," Current Population Reports: P60-265, U.S. Census Bureau, September 2018.
- Garcia-Perez, Carmelo, Yolanda Gonzalez-Gonzalez, and Mercedes Prieto-Alaiz, "Identifying the Multidimensional Poor in Developed Counties Using Relative Thresholds: An Application to Spanish Data," *Social Indicators Research* 131: 291-303, 2017.
- Glassman, Brian, "A Multidimensional Poverty Measure using the American Community Survey," SEHSD Working Paper Number 2017-47, U.S. Census Bureau, 2017.
- Glassman, Brian. 2019. "Multidimensional Deprivation in the United States: 2017." *American Community Survey Reports*, ACS-40, U.S. Census Bureau, Washington, DC.
- Glassman, Brian, "The Multidimensional Deprivation Index Using Different Neighborhood Quality Definitions." SEHSD Working Paper Number 2020 -08. U.S. Census Bureau, July, 2020.
- Institute of Medicine (US) Committee on the Consequences of Uninsurance. Care Without Coverage: Too Little, Too Late. Washington (DC): National Academies Press (US); 2002. 3, Effects of Health Insurance on Health.
- Jencks, Christopher, and Susan E. Mayer. 1990. "The Social Consequences of Growing up in a Poor Neighborhood." In *Inner-City Poverty in the United States*, ed. Laurence Lynn and Michael McGeary, 111–186. Washington, DC: National Academy Press.
- Katz, Lawrence, Jeffrey Kling, and Jeffrey Liebman, "Moving to Opportunity in Boston: Early Results of a Randomized Mobility Experiment," NBER Working Paper 7973, October 2000.
- Kawachi, Ichiro, and Lisa F. Berkman, eds. 2003. *Neighborhoods and Health*. New York: Oxford University Press.
- Kling, Jeffrey, Jeffrey Liebman, and Lawrence Katz, "Experimental Analysis of Neighborhood Effects," NBER Working Paper 11577, August 2005.
- Ludwig J, Sanbonmatsu L, Gennetian L, et al. Neighborhoods, obesity, and diabetes a randomized social experiment. N Engl J Med. 2011; 365:1509–19. [PubMed: 22010917]

- Ludwig, Jens, Greg J. Duncan, Lisa A. Gennetian, Lawrence F. Katz, Ronald C. Kessler, Jeffrey R. Kling, and Lisa Sanbonmatsu. 2012. "Neighborhood Effects on the Long-term Well-being of Low-income Adults". Science 337(6101): 1505-1510.
- Ludwig, Jens, Greg J. Duncan, Lisa A. Gennetian, Lawrence F. Katz, Ronald C. Kessler, Jeffrey R. Kling, and Lisa Sanbonmatsu. 2013. "Long-Term Neighborhood Effects on Low-Income Families: Evidence from Moving to Opportunity." American Economic Review P&P 103(3): 226-31.
- Lusting, Nora, "Multidimensional Indices of Achievements and Poverty: What do we Gain and What do we Lose? An introduction to JOEI Forum on Multidimensional Poverty," *Journal of Economic Inequality*, 9: 227-234, 2011.
- Martinez Jr., Arturo, and Francisco Perales, "The Dynamics of Multidimensional Poverty in Contemporary Australia," *Social Indicators Research*, 130: 479-496, 2015.
- Mitra, Sophie, and Debra L. Brucker, "Income Poverty and Multiple Deprivations in a High-Income Country: The Case of the United States," *Social Science Quarterly*, 2016.
- Reeves, Richard, Edward Rodrigue, and Elizabeth Kneebone, "Five Evils: Multidimensional Poverty and Race in America," The Brookings Institution, 2016.
- Sampson, Robert J., Stephen W. Raudenbush, and Felton Earls. 1997. "Neighborhoods and Violent Crime: a Multilevel Study of Collective Efficacy." *Sciene* 277 (5328): 918–924.
- Sampson, Robert J. 2012. *Great American City: Chicago and the Enduring Neighborhood Effect*. Chicago: University of Chicago Press.
- Sampson, Robert J., Jeffrey D. Morenoff, and Thomas Gannon-Rowley. 2002. "Assessing Neighborhood Effects': Social Processes and New Directions in Research." *Annual Review* of Sociology 28 (1): 443–478.
- Short, Kathleen S. "Material and Financial Hardship and Income-Based Poverty Measures in the USA," *Journal of Social Policy*, 34(1): 21-38, 2005.
- Sommers, Benjamin, Gawande, Atul, and Katherine Baicker, "Health Insurance Coverage and Health What the Recent Evidence Tells Us," New England Journal of Medicine, August, 2017.
- Stiglitz, Joseph E., Amartya Sen, and Jean-Paul Fitoussi, "The Measurement of Economic Performance and Social Progress Revisited," Columbia University, IEP, OFCE Working Paper, 2009.
- U.S. Department of Housing and Urban Development, "Measuring Overcrowding in Housing", Office of Policy Development and Research Publication, 2007.
- University of Wisconsin School of Medicine Public Health. 2015 Area Deprivation Index v2.0. Downloaded from <u>https://www.neighborhoodatlas.medicine.wisc.edu/</u>.

- Wagle, Udaya R, "The Counting-Based Measurement of Multidimensional Poverty: The Focus on Economic Resources, Inner Capabilities, and Relational Resources in the United States," Social Indicators Research, 115: 223-240, 2014.
- Weziak-Bialowolskia, and Lewis Dijkstra, "Regional Human Poverty Index Poverty in the regions of the European Union," JRC Science and Policy Reports, 2014.
- Whelan, Christopher T., Brian Nolan, and Bertrand Maitre, "Multidimensional Poverty Measurement in Europe: An Application of the Adjusted Headcount Approach," Journal of European Social Policy, 24(2): 183-197, 2014.

# Appendix: Comparisons to the Census Report: 2017 MDI<sup>27</sup>

As discussed in detail in the data and methods section, the definitions of the health, economic security, housing quality, and neighborhood quality dimensions are updated for the current MDI, while the definitions of the standard of living and education dimensions remain the same. In Table A.1, the percent of people deprived in each of the dimensions using both sets of definitions are presented for 2017. The new definitions cause deprivation in health and economic security to be higher and deprivations in housing quality and neighborhood quality to be lower.

|                      | Census Rej | port MDI | Currer  | nt MDI   | Difference (Current<br>less Report) <sup>1</sup> |          |
|----------------------|------------|----------|---------|----------|--|----------|
| Dimension            | Percent    | Standard | Percent | Standard | Percent  | Standard |
|                      |            | error    |         | error    |  | error    |
| Standard of living   | 13.40      | 0.046    | 13.40   | 0.046    | N/A  |          |
| Education            | 11.82      | 0.040    | 11.82   | 0.040    | N/A  |          |
| Health               | 5.63       | 0.015    | 11.63   | 0.040    | *6.00  | 0.043    |
| Economic security    | 9.20       | 0.028    | 11.41   | 0.030    | *2.21  | 0.042    |
| Housing quality      | 11.25      | 0.042    | 6.45    | 0.039    | *-4.80   | 0.058    |
| Neighborhood quality | 9.66       | 0.004    | 6.80    | 0.022    | *-2.86   | 0.022    |

<sup>1</sup> Details may not sum to totals due to rounding.

Note: The deprivation universe excludes children under age 15 who are not related to the householder, people living in institutional group quarters (e.g., nursing homes or correctional facilities), and people living in college dormitories or military barracks.

Source: U.S. Census Bureau, 2017 American Community Survey and 2019 Census MDI Report.

In Table A.2, the percent of people deprived in different numbers of dimensions are presented for both the Census Report MDI and the current MDI for 2017. There are more people deprived using the current MDI in one or more and two or more dimensions, while there are more people deprived using the Census Report MDI using three or more, four or more, and five or more dimensions. Similar to the Census

<sup>&</sup>lt;sup>27</sup> 2017 ACS data is used in order to make comparisons between results using the current methods (Current MDI) and published results in the 2019 Census MDI report (Census Report MDI).

MDI report, individuals are considered MDI deprived if they are deprived in two or more dimensions, which is why this line is bolded in Table A.2.

|                          | Census Re | eport MDI | Current MDI |          | Difference (Current<br>less Report) <sup>1</sup> |          |  |
|--------------------------|-----------|-----------|-------------|----------|--|----------|--|
| Dimension                | Percent   | Standard  | Percent     | Standard | Percent  | Standard |  |
|                          |           | error     |             | error    |  | error    |  |
| One or more dimensions   | 37.08     | 0.065     | 38.77       | 0.077    | *1.69  | 0.101    |  |
| Two or more dimensions   | 15.37     | 0.047     | 15.75       | 0.054    | *0.38  | 0.072    |  |
| Three or more dimensions | 6.40      | 0.038     | 5.35        | 0.028    | *-1.05   | 0.047    |  |
| Four or more dimensions  | 1.78      | 0.013     | 1.38        | 0.012    | *-0.39   | 0.018    |  |
| Five or more dimensions  | 0.28      | 0.004     | 0.23        | 0.005    | *-0.04   | 0.007    |  |

<sup>1</sup>Details may not sum to totals due to rounding.

Note: The deprivation universe excludes children under age 15 who are not related to the householder, people living in institutional group quarters (e.g., nursing homes or correctional facilities), and people living in college dormitories or military barracks.

Source: U.S. Census Bureau, 2017 American Community Survey and 2019 Census MDI Report.

A graph of the overlap between the Census Report MDI and the current MDI is shown in Figure A.1. Approximately 10 percent of the U.S. population is considered deprived according to both measures. This accounts for 64 percent of the Census Report MDI population and 62 percent of the current MDI population. The remainder of the MDI populations are made up of people deprived according to the Census Report MDI but not the current MDI (5.55 percent of the U.S. population) and people deprived according to the current MDI but not the Census Report MDI (5.93 percent of the U.S. population).



In Figure A.2, Census Report and current MDI results are compared by race and Hispanic origin,<sup>28</sup> nativity, age, and sex. The current MDI is lower than the report MDI for Blacks and Whites, while the current MDI is higher than the report MDI for Asians, American Indian and Alaska Natives, and Hispanics of any race. For the native-born, the current MDI is lower than the report MDI and for the foreign-born, the current MDI is higher than the report MDI. The current MDI is lower than the report MDI for people under age 18, higher than the report MDI for people aged 18 to 64, and not significantly different from the report MDI for people aged 65 and over. Lastly, the current MDI is higher than the report MDI for females.

<sup>&</sup>lt;sup>28</sup> Race and Hispanic origin categories differ from Census MDI Report. In that report, Hispanics were included in each race category. In the current paper, each race category includes the non-Hispanic portion of that category. Therefore, the race and Hispanic categories are mutually exclusive in this paper. This means the race and Hispanic origin estimates for the Report MDI differ from previously published estimates.



Figure A.2: Differences Between Census Report MDI and Current

There were large differences between the Census report MDI and current MDI for non-Hispanic American Indian and Alaska Natives, Hispanics, and the foreign-born. This came down to large differences in the health dimension. As shown in Figure A.3, each of these groups was more than twice as likely to be deprived in the new health dimension than in the old health dimension. This deprivation was due to significantly lower likelihood of having health insurance for these groups.



Table A.4 compares the current MDI to the report MDI in each state and the District of Columbia.<sup>29</sup> The current MDI was higher than the Census report MDI in 21 states, lower than the Census report MDI in 19 states and the District of Columbia, and not significantly different from the Census report MDI in 9 states.

<sup>&</sup>lt;sup>29</sup> After the release of the 2017 data products, the U.S. Census Bureau identified issues with data collection in Delaware. As a result, 2017 estimates for Delaware are omitted. For more information, see <www.census.gov/programs-surveys/acs/technical-documentation/errata/120.html>.

|                          |             |      | -    |         | Difference (Current MDI less |      |  |
|--------------------------|-------------|------|------|---------|------------------------------|------|--|
|                          | Report      |      |      | ent MDI | Report N                     | ,    |  |
|                          | Est.        | S.E. | Est  | S.E.    | Est                          | S.E. |  |
| United States            | 15.4        | 0.05 | 15.7 | 0.05    | *0.4                         | 0.07 |  |
| Alabama                  | 21.3        | 0.32 | 17.7 | 0.32    | *-3.6                        | 0.29 |  |
| Alaska                   | 11.9        | 0.64 | 15.9 | 0.74    | *4.0                         | 0.64 |  |
| Arizona                  | 14.2        | 0.26 | 18.6 | 0.23    | *4.4                         | 0.22 |  |
| Arkansas                 | 19.4        | 0.41 | 17.1 | 0.37    | *-2.2                        | 0.37 |  |
| California               | 18.6        | 0.12 | 18.9 | 0.12    | *0.3                         | 0.10 |  |
| Colorado                 | 9.9         | 0.19 | 10.8 | 0.23    | *1.0                         | 0.2  |  |
| Connecticut              | 11.1        | 0.31 | 10.6 | 0.32    | *-0.5                        | 0.29 |  |
| Delaware                 | N           | N    | N    | N       | N                            | 1    |  |
| District of Columbia     | 21.8        | 0.67 | 16.3 | 0.74    | *-5.5                        | 0.73 |  |
| Florida                  | 14.3        | 0.17 | 16.9 | 0.15    | *2.6                         | 0.14 |  |
| Georgia                  | 16.0        | 0.27 | 17.6 | 0.25    | *1.6                         | 0.22 |  |
| Hawaii                   | 10.1        | 0.40 | 10.3 | 0.43    | 0.2                          | 0.43 |  |
| Idaho                    | 11.2        | 0.46 | 11.6 | 0.40    | 0.4                          | 0.3  |  |
| Illinois                 | 20.5        | 0.18 | 14.0 | 0.18    | *-6.5                        | 0.1  |  |
| Indiana                  | 15.4        | 0.27 | 14.7 | 0.29    | *-0.7                        | 0.20 |  |
| lowa                     | 9.3         | 0.22 | 9.3  | 0.23    | 0.0                          | 0.2  |  |
| Kansas                   | 10.6        | 0.29 | 12.6 | 0.26    | *2.0                         | 0.2  |  |
| Kentucky                 | 18.7        | 0.28 | 16.8 | 0.31    | *-2.0                        | 0.22 |  |
| Louisiana                | 21.6        | 0.35 | 19.9 | 0.33    | *-1.7                        | 0.28 |  |
| Maine                    | 10.7        | 0.34 | 9.5  | 0.35    | *-1.2                        | 0.30 |  |
| Maryland                 | 14.2        | 0.23 | 11.2 | 0.24    | *-3.0                        | 0.1  |  |
| Massachusetts            | 11.6        | 0.20 | 9.5  | 0.17    | *-2.1                        | 0.10 |  |
| Michigan                 | 16.3        | 0.17 | 15.0 | 0.18    | *-1.3                        | 0.1  |  |
| Minnesota                | 9.0         | 0.17 | 8.6  | 0.18    | *-0.4                        | 0.1  |  |
| Mississippi              | 19.8        | 0.10 | 22.5 | 0.18    | *2.7                         | 0.3  |  |
| Missouri                 | 13.4        | 0.37 | 14.4 | 0.37    | *1.0                         | 0.3  |  |
| Montana                  | 10.8        | 0.19 | 14.4 | 0.43    | -0.2                         | 0.2  |  |
| Nebraska                 | 9.4         | 0.44 | 10.6 | 0.43    | *2.1                         | 0.4  |  |
| Nevada                   | 13.0        | 0.31 | 11.5 | 0.32    | *4.3                         | 0.3  |  |
|                          | 8.6         |      | 7.4  | 0.48    | *-1.2                        | 0.3  |  |
| New Hampshire            | 8.0<br>11.9 | 0.36 | 12.6 | 0.33    | *0.6                         | 0.3  |  |
| New Jersey<br>New Mexico | 20.5        | 0.18 | 20.4 | 0.18    | -0.1                         | 0.10 |  |
|                          |             |      |      |         |                              |      |  |
| New York                 | 17.6        | 0.14 | 18.8 | 0.14    | *1.2                         | 0.12 |  |
| North Carolina           | 13.9        | 0.22 | 15.6 | 0.21    | *1.7                         | 0.15 |  |
| North Dakota             | 9.0         | 0.44 | 9.0  | 0.45    | 0.1                          | 0.4  |  |
| Ohio                     | 15.2        | 0.16 | 14.5 | 0.17    | *-0.7                        | 0.1  |  |
| Oklahoma                 | 14.2        | 0.25 | 18.0 | 0.25    | *3.7                         | 0.20 |  |
| Oregon                   | 13.0        | 0.28 | 12.7 | 0.29    | -0.3                         | 0.23 |  |
| Pennsylvania             | 14.8        | 0.16 | 12.5 | 0.17    | *-2.2                        | 0.1  |  |
| Rhode Island             | 13.0        | 0.58 | 10.9 | 0.46    | *-2.1                        | 0.49 |  |
| South Carolina           | 14.6        | 0.28 | 16.5 | 0.28    | *1.9                         | 0.30 |  |
| South Dakota             | 10.8        | 0.44 | 12.4 | 0.43    | *1.6                         | 0.4  |  |
| Tennessee                | 16.4        | 0.20 | 15.5 | 0.26    | *-0.9                        | 0.23 |  |
| Texas                    | 18.2        | 0.14 | 22.3 | 0.14    | *4.1                         | 0.12 |  |
| Utah                     | 8.3         | 0.34 | 10.1 | 0.31    | *1.8                         | 0.2  |  |
| Vermont                  | 10.9        | 0.58 | 8.0  | 0.44    | *-3.0                        | 0.5  |  |
| Virginia                 | 11.0        | 0.20 | 11.6 | 0.21    | *0.6                         | 0.1  |  |
| Washington               | 11.1        | 0.20 | 11.4 | 0.19    | 0.2                          | 0.1  |  |
| West Virginia            | 17.4        | 0.44 | 17.9 | 0.43    | 0.5                          | 0.3  |  |
| Wisconsin                | 10.4        | 0.18 | 9.8  | 0.18    | *-0.6                        | 0.1  |  |
| Wyoming                  | 8.9         | 0.58 | 10.0 | 0.66    | *1.1                         | 0.6  |  |

\* difference is statistically different from zero at the 90% confidence level.

N Not available or not comparable. After the release of the 2017 data products, the U.S. Census Bureau identified issues with data collection in Delaware. As a result, 2017 estimates for Delaware are omitted from this table. For more information, see <www.census.gov/programs-surveys/acs/technical-documentation/errata/120.html>.

Source: U.S. Census Bureau, 2019 American Community Survey.