# Distributional Changes in U.S. Sugar-Sweetened Beverage Purchases, 2002–2014

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**Introduction:** U.S. policy actions focus on reducing sugar-sweetened beverage purchases. Yet, there are no studies on trends in overall purchase distribution and how it has changed by key subpopulations. This study examined changes in distributions of total sugar-sweetened beverage purchases and its major subtypes (regular carbonated soft drinks and fruit/sports/energy drinks) in 2002–2014 and distinguished among low, moderate, and high purchasers.

**Methods:** Longitudinal data on sugar-sweetened beverage purchases of U.S. households from the 2002–2014 Nielsen Homescan Panel were used. Sugar-sweetened beverages were defined as all caloric non-alcoholic beverages containing added sugars. Longitudinal quantile regression model examined trends across distributions (from quantile 25 to 95) of purchases (measured in kcal/day/ capita), while accounting for households' unobserved differences. All statistical analyses were conducted in 2019.

**Results:** All households across the total purchase distribution significantly reduced their purchases. High purchasers made less proportional reductions than low purchasers (e.g., 35% at 95th quantile vs 62% at 25th quantile). However, the smaller relative reductions among higher purchasers translated into larger absolute decreases (e.g., 134 kcal/day/capita at 95th quantile vs 23 kcal/day/capita at 25th quantile). Similar patterns in heterogeneity were observed across sugar-sweetened beverage subtype distributions and among racial/ethnic and income groups. In addition, there were significant racial/ethnic and income disparities in total sugar-sweetened beverage purchases in 2002–2003. Although racial/ethnic disparities among higher purchasers improved, income disparity patterns at all purchase levels persisted into 2013–2014.

**Conclusions:** From 2002–2003 to 2013–2014, U.S. households at all purchase levels made meaningful reductions in sugar-sweetened beverage purchases in both absolute and relative terms. Furthermore, racial/ethnic disparities in total sugar-sweetened beverage purchases narrowed, but income disparity patterns persisted.

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## INTRODUCTION

**B** accessive consumption of sugar-sweetened beverages (SSBs) has been linked to increased risk of obesity and diet-related noncommunicable diseases.<sup>1-7</sup> This association is not surprising as SSBs are the single largest source of added sugar in the U.S. diet.<sup>8-10</sup> In addition, studies have documented disproportionate effects of obesity and related noncommunicable diseases on racial/ethnic minorities and low-SES groups, along with persistently higher SSB intake among non-Hispanic black (NHB) and low-income subpopulations.<sup>11-14</sup> Strategies aimed at discouraging SSB consumption in the U.S. have been gaining momentum,  $^{15-18}$  making surveillance on

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trends in SSB consumption an integral part of public health efforts.

Several studies have focused on examining trends in the mean SSB consumption and purchases.<sup>19–23</sup> These studies revealed that mean SSB consumption and purchases have fallen since 2002–2003, but it is critical to determine the extent to which observed reductions are from different types of consumers. Higher SSB consumers who are at elevated risk of cardiometabolic consequences of excessive sugar or energy intake are of key concern. Indeed, reductions in consumption among high-SSB consumers could have the most meaningful impact on curbing the obesity epidemic. Yet, studies investigating trends across the SSB consumption distribution are rare,<sup>11,13</sup> and studies exploring trends along the SSB purchase distribution are nonexistent.

The primary purpose of this study was to examine trends at different points across distributions of total SSB purchases and its key subtypes (regular carbonated soft drinks [RCSDs] and fruit/sports/energy drinks) in the U.S. from 2002-2003 to 2013-2014 overall and across racial/ethnic and income subpopulations. Put differently, this study explored how SSB purchases of low, moderate, and high purchasers have changed over time. Drawing on longitudinal data on households' SSB purchases, this study improves on earlier cross-sectional analyses of trends in SSB consumption<sup>11,13,19-23</sup> by accounting for both observable and unobservable differences among households through a longitudinal quantile regression model.<sup>24,25</sup> To further inform public health policy efforts, this study also investigated how and whether racial/ethnic and income disparity patterns in SSB purchases have changed over time.

## METHODS

This study used data from the 2002-2014 Nielsen Homescan Panel (Homescan), a nationwide consumer panel maintained by the Nielsen Company.<sup>26</sup> Homescan is a longitudinal householdlevel data set containing product-level information on all packaged food/beverage purchases for at-home consumption. Households are recruited from 52 metropolitan and 24 nonmetropolitan areas and instructed to scan the Universal Product Codes of all packaged foods/beverages using scanners/smartphone applications immediately upon returning home from a grocery shopping trip. This information is uploaded to Nielsen through Internet/landline phone weekly. Each year, Nielsen prepares a static panel, including households that consistently reported purchases during  $\geq 10$  months of the previous calendar year. These static panel data are used in academic studies (e.g., to analyze food demand/consumption), including this study.<sup>27-32</sup> Some studies investigating the representativeness of Homescan have reported some sample-selection or sample-participation biases,<sup>33</sup> which can be adjusted for using household demographics.<sup>24</sup>

In the static panel, each transaction record contains data on quantity purchased, dollars paid, product attributes, Universal Product Code, and Homescan product module code. To obtain calorie/ingredient information needed in the construction of outcomes of interest in this study, Homescan purchase data were merged (by Universal Product Codes and year) to Nutrition Facts Panel and ingredient data from a variety of sources, including Mintel Global New Product Database.<sup>34</sup>

#### Study Sample

Homescan annually collects sociodemographic information including income, educational attainment, race/ethnicity, age and gender of all household members, and household sampling weights. This study sample was restricted to non-Hispanic white (NHW), NHB, and Hispanic households with  $\geq 2$  years of data. Moreover, households were defined as low income if income was  $\leq 185\%$  of the federal poverty line, middle income if income was >185% and  $\leq 400\%$  of the federal poverty line, and high income if income was >400% of the federal poverty line, as done elsewhere.<sup>13,35</sup>

The analysis sample included 111,397 households. For these households, weekly food/beverage purchases were aggregated to a household-year level (n=634,783). Table 1 shows sample descriptive statistics, overall and across 5 periods from 2002 to 2014. Although there were some minor differences in household characteristics across time, such differences were not problematic as the empirical model accounted for households-observed and -unobserved differences.

#### Measures

Using Homescan product module codes and nutrient information, the total SSB category was defined to include all caloric non-alcoholic beverages containing added sugars, namely RCSDs, non-100% fruit/vegetable drinks/juices, sports/energy drinks, sweetened tea/ coffee/dairy drinks, and beverage powder/concentrates. In addition, RCSDs and fruit/sports/energy drinks were considered 2 key SSB subcategories. Using calorie information and total yearly SSB purchases of households, daily per capita calorie (kcal/day/capita) purchases from these SSB categories were calculated and used as outcomes of interest. In this study's data, RCSDs and fruit/sports/ energy drinks on average accounted for approximately 70% of total SSB calories (47% and 23%, respectively). All other SSBs combined accounted for the remaining 30%.

#### **Statistical Analysis**

In this analysis, different types of SSB-purchasing households were defined by quantiles of SSB purchase distributions; low purchasers were defined by low quantiles and high purchasers by high quantiles. For instance, one may think of a household at 25th quantile of the total SSB purchase distribution as a low purchaser, whereas a household at 95th quantile could be considered a high purchaser. Thus, a specific quantile is not strictly assigned to a specific type of consumer, and it is the relative position of households along the distribution that matters.

In this context, quantile regression<sup>36–38</sup> was used to analyze trends at quantiles 25–95 (in 10-unit increments) of total SSB, RCSD, and fruit/sports/energy drink distributions. Detailed descriptions of empirical models and estimation approaches are provided in the Appendix (available online). Briefly, main variables in the

Table 1. Household Summary Statistics, Overall and for 5 Periods Over 2002–2014

	Full sample	By period				
Variable	2002-2014	2002–2003	2004–2006	2007–2009	2010-2012	2013-2014
Household size	2.49 (1.42)	2.48 (1.41)	2.50 (1.42)	2.49 (1.43)	2.50 (1.43)	2.46 (1.42)
Household with children, %	33.03 (47.03)	32.79 (46.95)	34.31 (47.47)	34.42 (47.51)	32.58 (46.87)	29.83 (45.75)
Household head's age, year	53.42 (14.50)	53.33 (14.67)	52.91 (14.77)	52.77 (14.63)	53.60 (14.30)	55.03 (13.91)
Married household head, $\%$	47.85 (49.95)	49.11 (49.99)	47.60 (49.94)	45.61 (49.81)	47.42 (49.93)	51.30 (49.98)
Household head's race, %						
NHW	76.97 (42.10)	79.64 (40.27)	77.82 (41.55)	76.76 (42.24)	75.85 (42.80)	75.21 (43.18)
NHB	11.83 (32.30)	11.29 (31.64)	11.71 (32.15)	11.77 (32.22)	12.04 (32.54)	12.30 (32.84)
Hispanic	11.20 (31.54)	9.07 (28.72)	10.47 (30.62)	11.47 (31.87)	12.11 (32.62)	12.50 (33.07)
Household's income level, %						
Low income	25.75 (43.73)	21.16 (40.85)	24.83 (43.20)	26.02 (43.87)	26.75 (44.27)	29.53 (45.62)
Middle income	36.92 (48.26)	41.10 (49.20)	34.30 (47.47)	36.84 (48.24)	38.16 (48.58)	35.10 (47.73)
High income	37.33 (48.37)	37.74 (48.47)	40.87 (49.16)	37.15 (48.32)	35.09 (47.72)	35.37 (47.81)
Household head's education, %						
Less than high school	35.36 (47.81)	34.76 (47.62)	35.44 (47.83)	35.89 (47.97)	35.31 (47.79)	35.06 (47.71)
High school	23.76 (42.56)	22.76 (41.93)	24.24 (42.85)	23.77 (42.57)	24.13 (42.79)	23.37 (42.32)
Some college	20.00 (40.00)	21.92 (41.37)	20.13 (40.10)	19.54 (39.65)	19.43 (39.57)	19.61 (39.70)
College degree or more	20.88 (40.65)	20.56 (40.42)	20.19 (40.14)	20.80 (40.58)	21.14 (40.83)	21.97 (41.41)
Observations	634,783	68,154	134,814	164,847	163,534	103,434

Source: Authors' calculations were based, in part, on data reported by Nielsen through its Homescan Services for all food categories, including beverages and alcohol for the 2002–2014 periods across the U.S. market.<sup>26</sup> The conclusions drawn from the Nielsen data are those of the authors and do not reflect the views of Nielsen. Nielsen is not responsible for, had no role in, and was not involved in analyzing and preparing the results reported herein.

Note: SDs are in parentheses. Low-income households are defined as those with annual income  $\leq 185\%$  of the FPL, middle-income households as those with income between 185% and 400% of the FPL, and high-income households as those with income >400% of the FPL. Survey weights were applied.

NHB, non-Hispanic black; FPL, federal poverty line; NHW, non-Hispanic white.

model were 4 indicator variables for 5 periods from 2002 to 2014: 2002–2003, 2004–2006, 2007–2009, 2010–2012, and 2013–2014, with 2002–2003 set as reference. Other (time-variant) model covariates were variables for proportions of household members within 10 gender-specific age groups to account for household composition, indicator variables for household income, and indicator variables for household head's marital status and educational attainment.

To account for time-invariant unobserved household characteristics, a correlated random effects quantile regression estimator was used.<sup>24,25,39</sup> Coefficient estimates for period indicators captured the magnitudes of absolute changes (kcal/day/capita) in SSB purchases from 2002–2003 to the period they represented. For instance, the 2013–2014 coefficient was interpreted as the absolute change in SSB purchases from 2002–2003 (baseline) to 2013–2014. Therefore, comparing the magnitudes of coefficient estimates of the 2013 –2014 indicator at different quantiles of (each) SSB purchase distribution would reveal whether low-, moderate-, and high-SSB purchasers reduced their purchases differently from 2002–2003 to 2013 –2014. Using absolute changes and adjusted baseline SSB purchases, relative (percentage) changes were calculated.

To investigate differential trends by race/ethnicity, the analysis of the U.S. population was extended by including 2-way interaction terms between race/ethnicity indicators and all model covariates (Appendix, available online). A similar approach was used to explore differential trends among income groups. Finally, to examine whether racial/ethnic and income disparity patterns in SSB purchases (i.e., relative differences between subpopulations) at baseline persisted over time, the existence of such disparities was first explored by testing the equality of purchase distributions between racial/ethnic groups and similarly, between income groups in 2002–2003. Then, tests of statistical differences between the magnitudes of relative changes in purchases of racial/ethnic groups and of income groups were conducted. As relative changes accounted for differences in baseline purchases across subpopulations (if any), rejecting the null hypothesis of equality of relative changes (across subpopulations) indicated that disparity patterns in 2013–2014 were different from those in 2002–2003. Statistical analyses were done in 2019 using Stata, version 15.1. SEs were clustered at the household-level.

## RESULTS

Trends representative of the U.S. for total SSB purchase distribution are shown in Figure 1. Top panel shows the adjusted number of SSB calories purchased (kcal/day/capita) at different quantiles/periods. Middle and bottom panels display the estimated reductions in purchases (accompanied by 95% CIs) at different quantiles from 2002–2003 to 2013–2014 in absolute and relative terms (solid lines), respectively. For comparison, mean absolute and relative declines are also displayed (dashed lines).



#### Total Sugar-Sweetened Beverages

**Figure 1.** Trends across the adjusted distribution of total SSB purchases across all households from 2002–2003 to 2013–2014. *Source*: Authors' calculations were based, in part, on data reported by Nielsen through its Homescan Services for all food categories, including beverages and alcohol for the 2002–2014 periods across the U.S. market.<sup>26</sup> The conclusions drawn from the Nielsen data are those of the authors and do not reflect the views of Nielsen. Nielsen is not responsible for, had no role in, and was not involved in analyzing and preparing the results reported herein. *Note*: The top panel displays households' total SSB purchases (kcal/day/capita) across the purchase distribution from quantiles 25th to 95th in 10-unit increments for 5 periods from 2002–2003 to 2013–2014. The middle panel shows the absolute quantile reductions (solid line) and mean reduction (dashed line) in total SSB purchases (kcal/day/capita) from 2002–2003 to 2013–2014. The bottom panel shows reductions in relative (percentage) terms. Survey weights were applied. All estimates are accompanied by 95% Cls calculated using SEs clustered at the household-level. SSB, sugar-sweetened beverage.

First, there was important heterogeneity in terms of total SSB purchase level across the distribution (Figure 1, top panel). In 2002–2003, households at 95th quantile purchased about 10 times as many SSB calories as those

at 25th quantile (386 vs 37 kcal/day/capita; p<0.05). Second, although households at all quantiles continually and gradually reduced their purchases from 2002–2003 to 2013–2014 (top panel), absolute reductions at higher

quantiles were larger than at lower quantiles (middle panel). Thus, absolute reductions in purchases were not uniformly distributed between low and high purchasers as implied by the mean estimate; low purchasers reduced their SSB purchases less than the average consumer, whereas high purchasers reduced more. For instance, households at 25th and 95th quantiles decreased their purchases by 23 and 134 kcal/day/capita (p<0.05), respectively, whereas the average household made a 53 kcal/day/capita reduction (p<0.05).

As shown at the bottom panel of Figure 1, the relative changes in total SSB purchases revealed a different heterogeneity pattern. Unlike the size of absolute reductions, which increased with quantile, relative reductions in SSB purchases were larger at lower quantiles and became smaller toward higher quantiles (e.g., 62% at 25th quantile vs 35% at 95th quantile; p<0.05). This pattern indicated that increases in magnitudes of absolute reductions toward higher quantiles (23 to 134 kcal/day/capita) were less proportional than increases in baseline SSB purchases (37 to 386 kcal/day/capita), leading to smaller relative reductions toward the distribution's right tail.

Similar heterogeneity patterns were observed across RCSD and fruit/sports/energy drink distributions (Appendix Figure 1, available online). In particular, the highest RCSD purchasers reduced purchases by 87 kcal/ day/capita (225 to 138 kcal/day/capita, p<0.05), and the highest fruit/sports/energy drink purchasers made a 37 kcal/day/capita reduction (90 to 53 kcal/day/capita, p < 0.05). These results suggested that reductions along both RCSD and fruit/sports/energy drink distributions contributed to total SSB purchase distribution's shift. However, one should be cautious when drawing conclusions about the relative contribution of SSB subtypes to observed reductions in total SSB purchases because households at a certain quantile of the total SSB distribution may not necessarily be at the same quantile of its subtype distributions. For example, a household at 95th quantile of the total SSB distribution might be at 90th quantile of RCSD distribution and at 85th quantile of fruit/sports/energy drink distribution. However, the mean reduction of 53 kcal/day/capita in total SSB purchases can be explained by a 30 kcal/day/capita decrease in RCSDs, 12 kcal/day/capita in fruit/sports/energy drinks, and 11 kcal/day/capita in other SSBs.

Trends across the distribution of total SSBs by race/ ethnicity are shown in Figure 2. For simplicity, only adjusted purchases in 2002–2003 and 2013–2014 (top panels) and absolute reductions (bottom panels) are reported. First, there are significant racial/ethnic disparities in total SSB purchases at baseline. Importantly, NHB households purchased more SSB calories than NHWs and Hispanics at all points across the distribution (e.g., 450 vs 364 kcal/day/capita at 95th quantile; p<0.05). In addition, although heterogenity patterns in absolute reductions for all racial/ethnic groups mimicked that of the general U.S. population, NHB households made larger reductions than NHW households at all quantiles, with larger differences toward higher quantiles (e.g., 195 vs 125 kcal/day/capita at 95th quantile; p<0.05) (Appendix Figure 2A, available online).

Comparing the magnitudes of relative reductions between NHB and NHW households along the distribution indicated that NHB households made larger relative reductions as well (p<0.05) (Appendix Figure 2C, available online), leading to smaller disparities in total SSB purchases of NHB and NHW households within the top quartile of the distribution. For instance, in 2002-2003, NHB households at 95th quantile purchased around 1.24 times as many SSB calories as compared with NHW households (450 vs 364 kcal/day/capita). In 2013-2014, this ratio was approximately 1.07 (256 vs 239 kcal/day/ capita). However, differences between total SSB reductions of Hispanic and NHW households in both absolute and relative terms were statistically indistinguishable (Appendix Figure 2B and D, available online). This pattern was not unexpected given that these subpopulations purchased similar amounts of SSBs at baseline (e.g., 352 vs 364 kcal/day/capita at 95th quantile) (Figure 2).

With respect to baseline disparities in SSB subtype purchases, NHBs purchased a similar number of RCSD calories to NHW households (e.g., 218 vs 222 kcal/day/capita at 95th quantile) (Appendix Figure 3, available online) but more than Hispanic households (e.g., 218 vs 175 kcal/day/ capita at 95th quantile; p<0.05). They also purchased (slightly) more fruit/sports/energy drink calories than NHW and Hispanic households across the distribution (p<0.05) (Appendix Figure 4, available online). Results further indicated that all racial/ethnic groups significantly reduced their purchases of RCSD and fruit/sports/energy drinks at all quantiles, with NHB making larger absolute reductions than NHW households in both RCSD and fruit/sports/energy drink purchases (p<0.05) (Appendix Figures 5A and 6A, available online). In relative terms, NHB households' reductions in RCSDs were also larger than NHW households within the top quartile (p < 0.05) (Appendix Figure 5C, available online). This suggests that improvements in racial/ethnic disparities within the top quartile of total SSB distribution were likely driven by NHBs' large reductions in RCSD purchases.

Trends across the total SSB purchase distribution by household income are shown in Figure 3. First, low-income households purchased more SSBs than high-income households in 2002-2003 (p<0.05), with larger differences among high purchasers (top panels).



**Figure 2.** Trends across the adjusted distribution of total SSB purchases by race or ethnicity from 2002–2003 to 2013–2014. Source: Authors' calculations were based, in part, on data reported by Nielsen through its Homescan Services for all food categories, including beverages and alcohol for the 2002–2014 periods across the U.S. market.<sup>26</sup> The conclusions drawn from the Nielsen data are those of the authors and do not reflect the views of Nielsen. Nielsen is not responsible for, had no role in, and was not involved in analyzing and preparing the results reported herein.

Note: Top panels display households' total SSB purchases (kcal/day/capita) across the purchase distribution from quantiles 25th to 95th in 10-unit increments in 2002–2003 and 2013–2014. Bottom panels show the absolute quantile reductions (solid lines) and mean reduction (dashed lines) in total SSB purchases (kcal/day/capita) from 2002–2003 to 2013–2014. Survey weights were applied. All estimates are accompanied by 95% Cls calculated using SEs clustered at the household-level.

SSB, sugar-sweetened beverage.

Furthermore, results in bottom panels indicated that lowincome households made larger absolute reductions in purchases across the distribution than high-income households (p<0.05) (Appendix Figure 7A, available online). However, low-income households' relative reductions were not statistically different from high-income households' relative decreases (Appendix Figure 7C, available online), implying that income disparity patterns did not improve from 2002–2003 to 2013–2014. For example, in 2002–2003, low-income households at 95th quantile purchased around 1.38 times as many SSB calories as compared with high-income households (458 vs 333 kcal/ day/capita). In 2013–2014, this ratio was still approximately 1.38 (287 vs 208 kcal/day/capita).

Regarding income disparities in RCSD purchases at baseline, low-income households purchased more RCSDs than their high-income counterparts at all quantiles (p<0.05) (Appendix Figure 8, available online). The magnitudes of relative reductions in RCSD purchases were not statistically different between low- and high-income

households (Appendix Figure 9C, available online), suggesting that baseline disparity patterns in RCSD purchases persisted to 2013–2014. Lastly, all income groups purchased a similar number of fruit/sports/energy drink calories at baseline (Appendix Figure 10, available online) and made similar reductions in purchases in both absolute and relative terms from 2002–2003 to 2013–2014 (Appendix Figure 11, available online).

## DISCUSSION

This study explored trends in SSB purchases of low- to high-SSB purchasing households across distributions of total SSB purchases and 2 key SSB subtypes (RCSDs and fruit/sports/energy drinks) in the U.S. during 2002 -2014. Within the general U.S. population, meaningful reductions occurred in total SSB purchases at all purchase levels in both absolute and relative terms. However, magnitudes of reductions varied by purchase level, consistent with a recent study.<sup>13</sup> In relative terms, high



**Figure 3.** Trends across the adjusted distribution of total SSB purchases by income from 2002–2003 to 2013–2014. Source: Authors' calculations were based, in part, on data reported by Nielsen through its Homescan Services for all food categories, including beverages and alcohol for the 2002–2014 periods across the U.S. market.<sup>26</sup> The conclusions drawn from the Nielsen data are those of the authors and do not reflect the views of Nielsen. Nielsen is not responsible for, had no role in, and was not involved in analyzing and preparing the results reported herein.

Note: Top panels display households' total SSB purchases (kcal/day/capita) across the purchase distribution from quantiles 25th to 95th in 10-unit increments in 2002–2003 and 2013–2014. Bottom panels show the absolute quantile reductions (solid lines) and mean reduction (dashed lines) in total SSB purchases (kcal/day/capita) from 2002–2003 to 2013–2014. Survey weights were applied. All estimates are accompanied by 95% Cls calculated using SEs clustered at the household-level.

SSB, sugar-sweetened beverage.

purchasers reduced their total SSB purchases less than low purchasers. In absolute terms, they made larger reductions. Similar patterns in heterogeneity were observed along SSB subtype distributions and across racial/ethnic and income subpopulations, suggesting that reductions in total SSB purchases were driven by both of its key subcategories and by all racial/ethnic and income groups.

From a public health perspective, decreases along SSB purchase distributions, particularly larger absolute reductions among high purchasers, are encouraging as excessive SSB consumption is associated with increased risks of obesity and diet-related noncommunicable diseases.<sup>1–7</sup> SSBs are simple carbohydrates that are metabolized quickly but do not invoke a feeling of satiety, likely leading to higher overall calorie intake and thus weight gain.<sup>1,2,40,41</sup> U.S. obesity trend studies found that after a rapid growth from the early 1980s to early 2000s, the rate of increase in obesity prevalence has slowed down recently,<sup>14,42–44</sup> which might be partially due to overall

reductions in SSB calorie purchases, particularly among higher consumers.

The second component of this study was around racial/ ethnic and income disparities in SSB purchases. The subpopulation analyses, consistent with SSB consumption literature,<sup>13,20</sup> revealed significant racial/ethnic and income disparities in total SSB purchases in 2002-2003. In particular, NHB and low-income households purchased more SSB calories than NHW and high-income households, respectively, at all points across the total SSB purchase distribution. Furthermore, results suggested that although disparity patterns between NHB and NHW households improved among high-SSB purchasers over time (likely driven by NHBs' large reductions in RCSD purchases), income disparity patterns persisted from 2002-2003 to 2013–2014. These results echo the research on U.S. obesity trends, indicating that SES disparities have not improved in the past decade.45,46

Given that SSB prices have been declining over time,<sup>47</sup> reductions in SSB purchases are likely due to agentic

interventions (e.g., educational healthy eating and behavior campaigns implemented at schools/workplaces or through the mass media) intended at increasing individuals' nutritional knowledge/skills to make healthier food choices and engage in healthier behaviors. Though such interventions can be effective in obesity prevention, they are also likely to inadvertently exacerbate socioeconomic inequalities in obesity because low-SES communities have fewer economic and social resources to maximize their uptake of them.<sup>48-50</sup> In addition, marketing strategies promoting higher intakes of caloriedense, low-nutrient foods/beverages such as fast foods and SSBs, are disproportionately targeting low-income racial/ethnic minorities and thus, directly contributing to obesity disparities affecting these subpopulations.<sup>5</sup> <sup>-53</sup> Extensive efforts restricting targeted unhealthy food/ beverage marketing strategies could help reduce dietrelated health disparities, including obesity, among disadvantaged communities.

Moreover, agento-structural interventions (e.g., fiscal policies) implemented at the local, state, and national level are projected to have equal or even greater benefits among low-SES groups given their wider reach and more sustained benefits,<sup>48–50</sup> suggesting the potential for SSB taxation to reduce disparities and purchase/con-sumption among high purchasers/consumers. Results from Mexico's volume-based SSB tax showed much larger SSB reductions among high-SSB purchasers.<sup>54,55</sup> Similarly, a U.S.-based study (policy simulation) also found that specific excise SSB taxes could lead to larger absolute reductions in SSB purchases of high-SSB purchasers (PV and SWN, unpublished data, 2019).

## Limitations

One limitation of this study is that Homescan data reflect household-level SSB purchases and not individual-level consumption. SSB purchases could differ from SSB consumption as households might throw or give away SSBs. More importantly, Homescan only tracks packaged/pre-made SSBs purchased by households for at-home consumption and does not cover the on-the-go segment of the market, including SSBs purchased at restaurants, fast food eateries, or vending machines. One study using dietary intake data revealed that, on average, individuals (regardless of income, race, or ethnicity) acquire approximately 25% of their total beverage calories from nonstore sources.<sup>35</sup> However, these are likely offset by this study's ability to conduct analyses over an entire year of purchases rather than 1 or 2 days of dietary recall. Moreover, relying on SSB purchases over a longer period likely helps avoid potential issues associated with using short-term self-reported intake data, such as episodic SSB consumption and under-reporting.<sup>56–60</sup>

## CONCLUSIONS

Overall, though results from this study indicate that there are declining trends in SSB purchases at all purchase levels, they highlight the need for public health efforts and interventions (e.g., SSB taxation) to further reduce SSB purchases, particularly among high consumers. Furthermore, comprehensive healthy eating/behavior mass media campaigns, augmented by targeted policies focusing on reducing racial/ethnic and income disparities in SSB consumption, continue to be an important strategy to address high rates of obesity in an equitable manner.

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# SUPPLEMENTAL MATERIAL

Supplemental materials associated with this article can be found in the online version at <a href="https://doi.org/10.1016/j">https://doi.org/10.1016/j</a>. amepre.2020.02.002.

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