RESEARCH ARTICLE

Estimating the health impacts of sugar-sweetened beverage tax for informing policy decisions about the obesity burden in Vietnam

Duyen Thuy Nguyen1,2*, Minh Van Hoang1, Son Dao3, Phuong Hong Do4, Quang Dinh Nguyen4, Jo Jewell5, Ben Amies-Cull6, Maharajan Muthu4, Ly-Na Hoang7, Thu Thi Le7, An Thi Nguyen7, Bao Quoc Tran8, Ciaran O'Neill2

1 Center for Population Health Sciences, Hanoi University of Public Health, Hanoi, Vietnam, 2 School of Medicine, Dentistry & Biomedical Sciences, Queen’s University Belfast, Belfast, United Kingdom, 3 Department of Economics, Thuong Mai University, Hanoi, Vietnam, 4 UNICEF Vietnam, Hanoi, Vietnam, 5 UNICEF United States of America, New York, New York, United States of America, 6 Nuffield Department of Population Health, University of Oxford, Oxford, United Kingdom, 7 Health Bridge Foundation of Canada, Hanoi, Vietnam, 8 General Department of Preventive Medicine, Ministry of Health, Hanoi, Vietnam

* ntd@huph.edu.vn

Abstract

Background

Taxation on sugar-sweetened beverages (SSBs) has been adopted in more than 40 countries but remained under discussion in Vietnam. This study aimed to estimate the health impacts of different SSBs tax plans currently under discussion to provide an evidence base to inform decision-making about a SSBs tax policy in Vietnam.

Method & findings

Five tax scenarios were modelled, representing three levels of price increase: 5%, 11% and 19–20%. Scenarios of the highest price increase were assessed across three different tax designs: ad valorem, volume-based specific tax & sugar-based specific tax. We modelled SSBs consumption in each tax scenario; how this reduction in consumption translates to a reduction in total energy intake and how this relationship in turn translates to an average change in body weight and obesity status among adults by applying the calorie-to weight conversion factor. Changes in type 2 diabetes burden were then calculated based on the change in average BMI of the modelled cohort. A Monte Carlo simulation approach was applied on the conversion factor of weight change and diabetes risk reduction for the sensitivity analysis. We found that the taxation that involved a 5% price increase gave relatively small impacts while increasing SSBs’ price up to 20% appeared to impact substantially on overweight and obesity rates (reduction of 12.7% and 12.4% respectively) saving 27 million USD for direct medical cost. The greatest reduction was observed for overweight and obesity class I. The decline in overweight and obesity rates was slightly higher for women than men.
Conclusion

This study supports the SSB tax policy in pursuit of public health benefits, especially where the tax increase involves around a 20% price increase. The health benefit and revenue gains were evident across all three tax designs with the specific tax based on sugar density achieving greatest effects.

Background

In 2016 it was estimated that globally almost half of adults and one fifth of children aged 5–19 were overweight or obese [1, 2]. By 2030, it is estimated that over 1 billion people globally will be overweight or obese [3]. Low and middle-income countries observed the most rapid increase in obesity status in recent years [3]. Therefore, it is critical for everyone, especially children, to access affordable and appealing healthy diets including avoiding or limiting health-harming drinks. There is strong, consistent evidence linking sugar-sweetened beverage (SSBs) consumption to weight gain and increased risk of overweight and obesity in children, adolescents, and adults [2, 4]. There is evidence, too, showing that SSBs are the main source of added sugar in diets [4]. It has been estimated that for every 100 million cases of type 2 diabetes predicted to occur in the US, about 8.7 million cases can be attributed to consumption of SSBs [5]. In the UK, SSB consumption is estimated to be responsible for about 3.6 million cases out of every 100 million cases of type 2 diabetes that occurs [5].

Increasing taxes on SSBs has been strongly encouraged to reduce the SSB consumption as part of a comprehensive, evidence-based approach to improving diets and reducing the burden of diet-related NCDs [4, 6]. So far, over 40 jurisdictions have levied a tax on SSBs in order to increase the price and reduce the consumption of this kind of beverage [4]. According to the World Health Organization (WHO), SSBs are defined as all types of beverages containing free sugars and these include carbonated or non-carbonated soft drinks, fruit/vegetable juices and drinks, liquid and powder concentrates, flavoured water, energy and sports drinks, ready-to-drink (RTD) tea, RTD coffee, and flavoured milk drinks. Free sugars refer to monosaccharides (such as glucose, fructose) and disaccharides (such as sucrose or table sugar) added to foods and drinks by the manufacturer, cook or consumer, and sugars naturally present in honey, syrups, fruit juices and fruit juice concentrates [4, 7].

In Vietnam, while the rising trend of NCD burden has been observed in the last decade, Vietnam has shown limited progress towards achieving the diet-related non-communicable disease (NCD) targets for 2020 [8]. A rapid increase in overweight and obesity status was observed among both children and adults. The prevalence of overweight and obesity almost doubled in adults (from 10.9% in 2002 to 18.3% in 2016) [9] and rose by 7 times in youths aged from 5–19 (from 2.6% in 2002 to 19% in 2020) [10]. Accompanied with the sharp increase in overweight status, the burden of diabetes mellitus type 2 and other diabetes-driven chronic diseases. As of 2015, about 4.1% Vietnamese population aged 18–69 had diabetes. A meta analysis study in 2022 found that the prevalence of diabetes mellitus type 2 in 2016–2020 had tripled the pooled figure of 2000–2004 [11]. Over the same period, the consumption of SSBs has increased considerably. In the period 2002–2016, the consumption of carbonated drinks increased 3 times, juices increased 10 times, sport and energy drink increased 9 times and sweetened ready-to-drink tea increased 6 times [12].

To date, limited efforts have been made to limit trends in overweight and obesity. SSBs were considered for inclusion in the list of goods subjected to a special consumption tax (or
excise tax) under Vietnam’s Law on Excise Tax in 2008 but it was not materialized. In 2017, the Ministry of Finance again proposed an ad-valorem tax at 10% applied on SSBs [13]. In this draft law, a definition of SSB products was proposed to cover carbonated soft drink, non-carbonate soft drink, energy drink, sport drink, ready-to-drink tea/coffee, except 100% juices, milk and milk-based drinks. This time it was again not adopted [13]. To support decision-making about the development of SSBs tax policy, this study aimed to estimate the potential impacts on overweight and obesity and their main health effects of different SSBs tax plans under discussion in Vietnam.

**Methodology**

**Model structure & inputs**

Fig 1 below presents a theoretical framework for modelling the impact of SSBs taxation on the consumption of SSBs and the prevalence of obesity and overweight and type 2 diabetes mellitus. Type 2 diabetes mellitus was selected for modelling the impact of SSB tax because this disease has the strongest relation with weight change with or without adjusted for other NCD risk factors [14] compared to other diabetes-driven chronic diseases. In 2017, the age-standardized fraction of high BMI (BMI ≥ 25 kg/m2) made up to 3.9% of total disease burden and 4.5% of total deaths in Vietnam [15]. In Southeast Asia, fraction of DALYs of diabetes mellitus attributable to high BMI among female were 39.1% (compared to 19.2% of ischemic heart disease and 24.9% of stroke). Male figures were also quite high at 32.7% for diabetes (16.2% for ischemic heart disease and 19.6% for stroke) [15]. The model structure was drawn based on the causal pathway of taxation policies on SSBs articulated in several studies in Thailand, South Africa, US, UK, Ireland, Mexico, Australia, Indonesia, Zambia [16–22].

Fig 1 is accompanied with Table 1 that describes the main model inputs and assumptions with specific clarifications. Data for these inputs and assumption were drawn from the desk review and various available data sources which deemed as the most relevant for Vietnam context.

As the study employed a multiple stage modelling approach, there are two time-horizons applied, starting with the 3-year horizon for weight change projection (short-term impact) and a lifetime horizon for the prediction of diabetes mellitus prevalence (long-term impact). For the first projected outcome regarding weight change and obesity status, the time horizon of our model was set at 3 years from the point of SSBs tax implementation based on the average time to obtain expected weight change [28]. For the change in diabetes prevalence, the model projection was carried out for a lifespan of model cohort since it would take much longer time for the change in obesity status to affect insulin production and later on individual blood glucose control.

**Model scenarios**

In Vietnam, currently the excise tax is imposed on the ex-factory before-tax price (or factory price). The government tax strategy until 2030, No508/QÐ-TTg 2022, indicated that an excise specific tax component (as fixed amount of tax placed on a product quantity such as volume or sugar content) could be considered for some products so as to have a mixed ad valorem/specific tax system. Table 2 below illustrates five SSBs tax scenarios selected for modelling with average increase in retail price. The average price increase was estimated assuming that the amount of tax increase will be 100% passed on to the retail price. The five scenarios were (1) ad valorem tax of 10% on SSBs’ factory price; (2) specific tax at 3,500d (0.15 USD) per litre of SSB; (3) specific tax of 60d per 1 gram of sugar per 100 ml; (4) specific tax at 7,000d (0.30 USD) per litre of SSB and (5) ad valorem tax of 40%. These scenarios were designed to
compare three levels of price increase 5% (scenario 1) vs 11% (scenario 2) vs 19–20% (scenario 3, 4, 5). Also, the three highest scenarios (scenario 3 to 5) allow a comparison of three designs of excise tax: ad valorem tax; volume-based specific tax; and sugar-based specific tax which give the same level of price increase at 19–20%. Specifically, scenario 1 was established based on the nearest proposed tax plan by Vietnam Ministry of Finance. Scenario 2 was designed as an in-between scenario for comparing the impacts of the proposed plan (scenario 1) and the desired plans (scenario 3, 4 and 5). Scenario 3, 4 and 5 was designed to meet the goal of
increasing retail price by an average of 20% for an effective reduction in consumption as suggested by WHO [29].

**Simulation techniques**

**Step 1—Change in SSBs consumption.** This step was designed to cover two transitions: (i) tax to price and (ii) price to consumption. In combination, the impact of tax policy placed on SSBs’ retail price is estimated, giving a prediction of reduction in SSBs consumption after imposing SSBs tax.

---

**Table 1. Model parameters & data sources.**

| Indicators                                    | Description                                                                 | Data sources                                                                 |
|-----------------------------------------------|-----------------------------------------------------------------------------|------------------------------------------------------------------------------|
| **Step 1: Change in SSB consumption**         |                                                                            |                                                                              |
| Price elasticity                              | A parameter for estimating the change of SSB purchasing and consuming of when the price is increased from the taxation. | Linh Luong et al 2020 [23]; literature review                                 |
| Tax increase (%)                              | The relative change of SSB tax rate compared to the baseline rate to set up different tax scenarios | Shared data from Health Bridge Canada (Vietnam office) [24]                   |
| Baseline SSB consumption (litre)               | Amount of SSB consumption in year 2020 separated by 4 categories (carbonates, juices, ready-to-drink tea/ coffee & sport drinks) | Global Data 2021                                                            |
| SSB consumption per capita (100ml/ day/ person)| Amount of SSB consumption per capita in year 2020, separated by 4 categories (carbonates, juices, ready-to-drink tea/ coffee, energy & sport drinks) | Author’s calculation for population age 2+ (Vietnam GSO Census 2019)          |
| Population size                                | Population structure by age and sex, also representing the market size of SSB in Vietnam | Vietnam GSO Census 2019                                                      |
| **Step 2: Change in energy intake**            |                                                                            |                                                                              |
| Sugar content                                 | The average amount of sugar contained in each SSB lines, measured in gram/ 100ml | Paraje G. (WHO’s expert report) [25]                                         |
| Calorie density                               | The average calorie density in each SSB categories, measured in kJ/100ml    | Author’s calculation from sugar content                                       |
| Baseline energy intake                         | The average daily intake of calories at baseline, measured as kJ/day/person | National Nutrition Survey 2019–2020                                          |
| **Step 3: Change in body weight, BMI & obesity status** | The corresponding change of weight due to the decreased intake of calorie consumed for children and adults | Literature review (See more in Step 3a in Method section)                    |
| Baseline weight                                | The baseline weight of population by sex & age                              | STEPS 2015                                                                   |
| Baseline height                                | The baseline height of population by sex & age                              | STEPS 2015                                                                   |
| Baseline BMI                                   | The baseline BMI of population by sex & age                                 | STEP 2015                                                                   |
| BMI change                                     | The absolute change between baseline BMI and the counterfactual BMI         | Cohort simulation using STEPS 2015 cohort                                    |
| **Step 4: Change in burden of obesity-related diseases** | The relative reduction in risk of diabetes mellitus type 2 for each 2 kg/m2 BMI unit decrease | Asia Pacific Cohort Studies Collaboration 2005 [26]                          |
| % of diabetes with complications               | % of diabetes patients with complications                                   | VSS 2017 (Kiet Pham et al 2020 [27])                                        |
| Medical cost for diabetes with complications   | The average treatment cost of diabetes patients with complications, inflation adjusted to 2020 price (USD) | VSS 2017 (Kiet Pham et al 2020 [27])                                        |
| Medical cost for diabetes without complications| The average treatment cost of diabetes patients with complications, inflation adjusted to 2020 price (USD) | VSS 2017 (Kiet Pham et al 2020 [27])                                        |

---

**Table 2. Selected tax scenarios for modelling.**

| No | Tax type      | Tax design          | Interpretation                           | Tax rate | Price increase |
|----|---------------|---------------------|------------------------------------------|----------|----------------|
| 1  | Ad valorem tax| Tax as % of factory price |                                          | 10%      | 5%             |
| 2  | Specific tax  | Volumetric          | Fixed amount of tax imposed on product’s volume | 3,500d/ litre | 11%           |
| 3  | Specific tax  | Sugar content       | Fixed amount of tax imposed on grams of sugar contained | 60d/ gram/ litre | 19%           |
| 4  | Specific tax  | Volumetric          | Fixed amount of tax imposed on product’s volume | 7,000d/ litre | 20%           |
| 5  | Ad valorem tax| Tax as % of factory price |                                          | 40%      | 20%            |

https://doi.org/10.1371/journal.pone.0274928.t001

https://doi.org/10.1371/journal.pone.0274928.t002
Step 1a: The transition from tax to retail price:

This study used the findings from the TaxSim simulation model on sugar-sweetened beverages carried out by Health Bridge Canada in Vietnam [24] to obtain the average price increase in each tax plan. Data on the SSBs consumption and retail price was extracted from the Soft Drinks Volume and Value databases in 2020 from Global Data. This study estimated the SSBs consumption in four groups: (1) carbonates, (2) juice included liquid and solid state of juice, nectars, squash/syrups, still drinks, and fruit powders, (3) RTD tea and coffee, (4) sport and energy drinks. These figures included both regular and low-calorie product lines. The baseline consumption was collected for SSB products in four categories as above, measured in litres per day per person. The average retail price increase was estimated assuming that the pass-on rate from tax increase to factory price is 100% which equivalents to the pass-on rate of about 50% from tax increase to retail price.

Step 1b: The transition from price to consumption

The model employed the own-price elasticity of SSBs from Linh Luong et al 2020 which estimated price elasticities using Vietnam Household Living Standard Survey 2016 [23]. The own-price elasticity of SSBs was estimated at -1.14 indicating that if the price of a SSB increased by 1%, each household would decrease their consumption of SSBs by 1.14% [23]. This value was considered comparable with findings from a meta-analysis in low-and-middle-income countries and previous studies in Thailand or South Africa [18, 20, 30, 31]. It is important to note that the price elasticity estimated for soft drink in Linh Luong et al 2020 [23] included both fresh water and other sugary drinks. The price elasticity was assumed to be the same for the whole population and assumed to be constant throughout the modelled time horizon.

Step 2—Change in energy intake. We used average sugar content in each SSBs category multiplied by the average change in SSB consumption to estimate the change in the amount of sugar consumed from SSBs. The energy content in kilojoules (kJ) was calculated based on grams of sugar content. Then, the changes in caloric intake from SSBs were summed to give the net change in energy intake. To reduce model complexity, we assumed that no significant changes in other sources of energy intake happened. The sugar content in carbonates, juices, RTD coffee and tea, and sports and energy drinks are 11gr, 7gr, 9gr and 16 gr per 100ml respectively. One gram of sugar is equivalent to 4 kcal or 16.7kJ [32].

Step 3—Change in body weight, BMI & obesity status.

Step 3a: Body weight

For children under 6, the change in weight for young children aged between 2 and 5 years was calculated based on the coefficients for change in weight per change in energy intake according to Long et al. [16]. For boys, a change of 216 kJ/day would lead to 1 kilogram body weight change while for girls, one kilogram body weight change requires a change of 204 kJ/day [16]. For children and adolescents aged 6–17 years, the equations from Hall et al. [33] were used. Hall and colleagues developed age- and gender-specific linear equations to predict the weight gain from a given energy imbalance. For children aged 6–17 years, the equations were kcal/day/kg = 68–2.5*age for males and kcal/day/kg = 62–2.2*age for females. For adults aged 18 and above, change in body mass was estimated using equations published by Swinburn et al. [34], which state that a daily increase in energy intake of 94 kJ/day is needed for a change in body weight of 1 kg in equilibrium for adults (93.0 kJ/day for men and 72.3 kJ/day for women). Generally, the above estimated weight change will take a year for a 50% achievement and three years for a 95% of total weight changes [34].
A Monte-Carlo simulation was applied at this stage to simulate the reduction of energy intake from SSBs to the average body weight change. In each simulation, the parameters are drawn from a normal distribution [34] with the final weight change computed by averaging the result from 10,000 iterations. The simulation was carried out separately by gender with the average value used in the following calculation in Step 3b. All the simulations were undertaken with Microsoft Excel macros developed in Visual Basic for Applications (VBA).

**Step 3b: BMI index & obesity status**

At this stage, the dataset of the National Survey on Non-communicable diseases risk factors (STEP) 2015 was used to develop a cohort simulation for further estimation for adult population aged 18 and above. Assuming there is no significant change in the height of all cohort participants, the BMI change was estimated based on the change in body weight after 3 years. The change in average BMI index was estimated for age and sex-specific groups of the STEP 2015 cohort and generalized to Vietnamese population aged 18–69. For children, the model was only able to estimate the projection of average weight change without further estimation to their BMI because children tend to experience rapid growth in their height which limits the validity of a BMI projection.

The prevalence of overweight and obesity was estimated using the threshold of Western Pacific Region of WHO for Asian population in which $23 \leq \text{BMI} < 25$ is classified as overweight; $25 \leq \text{BMI} < 30$ as obesity class I and $\text{BMI} \geq 30$ as obesity class II [35]. While other simulations were performed using Microsoft Excel macros, this step was carried out in STATA version 14.2 with the `svyset` command for complex survey data to extrapolate the estimation of overweight and obesity prevalence for Vietnamese population.

**Step 4—Change in burden of obesity-induced diseases.** The findings in Asia Pacific Cohort Studies Collaboration 2005 [26] showed that for each 2 unit of BMI decrease, the risk of diabetes would reduce by 27% (95% confident interval: 23%-30%). The number of avoided diabetes cases was estimated using the relative reduction in diabetes prevalence. Probability of having diabetes with complications was applied on the model population as whole to estimate number of diabetes cases with and without complication that would be avoided after introduction of the SSBs tax, based on findings from Vietnamese health insurance claim database 2017 by Kiet Pham et al 2020 [27]. The number of avoided cases were then multiplied with treatment cost for those diabetes cases with and without complications, taken from Kiet Pham et al 2020 [27]. This outcome is limited for population aged 18 to 69 as the cohort simulation was conducted using STEPS 2015 cohort of age 18–69. All data inputs & data sources can be found in S1 File.

**Sensitivity analysis**

Probabilistic sensitivity analysis was performed using Monte Carlo simulation. The calorie-to-weight conversion factor was drawn using normal distribution, the relative risk of diabetes from BMI reduction is obtained from beta distribution. All simulations were carried out using the 95% confident interval and averaging from 10,000 iterations. The probabilistic analysis was later branched out into two models in which the Monte Carlo simulation employed two different sets of parameters. Model 1 performed the probabilistic analysis on weight change only while model 2 performed the extended probabilistic analysis on weight change and the risk reduction of diabetes because the risk reduction of diabetes based on BMI changes was highly sensitive to the calculation of diabetes’s burden. Additionally, one-way deterministic sensitivity analysis was carried out on the price elasticity at -1.0 and -0.8 (beside the price elasticity of -1.14 for base analysis). Findings of deterministic sensitivity analysis was included in S2 File for reference.
Ethical statement

The study was approved by the Ethical Review Board for Biomedical Research Hanoi University of Public Health (no. 373/2021/YTCC-HD3 dated October 4th, 2021). This paper uses data from the Vietnam 2015 STEPS survey, implemented by Vietnam Ministry of Health with the support of the World Health Organization. The deposited data covers 3,856 respondents aged 18–69 that was fully anonymized and, hence, the need for consent was waived by the ethics committee.

Main findings

SSBs consumption & energy intake

Table 3 below shows five tax scenarios along with their impact on the SSB consumption. At the price elasticity of -1.14, the SSB consumption per capita per annum was estimated to reduce by 2.6 litres if the price increased by 5%; 5.1 litres if price increases by 11% and between 9.8–10.5 litres if price increase by 19–20%. Interestingly, although scenario 3 offered 19% price increase, the reduction in the amount of sugar consumed in this scenario (3.2 gr/ day/ person) would be higher than scenario 4 of 20% price increase (3.1 gr/ day/ person). This interesting result was mostly contributed from the reduction in high sugar content product lines (carbonates and sport drinks). Following the reduction of sugar consumed, scenario 3 continues to predict larger reduction in energy intake than scenario 4 and is almost of equivalent impact to scenario 5. Clearly, the three scenarios of 19–20% price increase were projected to offer much higher reduction in energy intake compared to scenario 1 (price increase of 5%) and scenario 2 (price increase of 11%). Further findings on price elasticity of -1.0 and -0.8 could be found in S2 File.

Changes in body weight, BMI & obesity status

Table 4 shows the projected body weight reduction, average BMI index and prevalence of overweight and obesity in different SSB tax scenarios. In scenarios of 20% price increase, the biggest predicted change in body weight was expected to reach about 0.57–0.59 kg for males and 0.73–0.76 kg reduced for females after 3 years of tax implementation. Noticeably, females could observe greater reduction of body weight change than males in all five tax scenarios. Corresponding to the change in body weight, the average BMI after SSB tax could vary up to 0.20 BMI unit between 5 scenarios (the variation would be 0.16 among men and 0.24 among women). Table 4 also presents a lower figure of overweight and obesity compared to baseline prevalence. The smallest projected impact on the overweight and obesity prevalence was from scenario 1 at 17.6% (overweight), 13.2% (obesity class I) and 3.4% (obesity class II), respectively. The lowest projected prevalence was from scenario 3 and 5, estimated at 15.7%-15.9% (overweight), 12.4% (obesity class I) and 3.2% (obesity class II). Due to the small baseline

Table 3. Changes in SSBs’ consumption in five SSB tax scenarios.

| Tax designs                        | Scenario 1     | Scenario 2     | Scenario 3     | Scenario 4     | Scenario 5     |
|-----------------------------------|---------------|---------------|---------------|---------------|---------------|
|                                   | 10% ad-valorem| 3,500d/ litre | 60d/gr/100ml  | 7,000d/ litre | 40% ad-valorem|
| Average price increase            | 5%            | 11%           | 19%           | 20%           | 20%           |
| Decrease in total SSB consumption (million litres/year) | 171.3         | 334.0         | 641.0         | 668.0         | 684.9         |
| Decrease in consumption (litre/person/ year) | 2.6           | 5.1           | 9.8           | 10.2          | 10.5          |
| Decrease in sugar consumed (gram/ day/ person) | 0.8           | 1.6           | 3.2           | 3.1           | 3.3           |
| Decrease in calorie intake from SSBs (kJ/ day/ person) | 13.7          | 26.2          | 54.0          | 52.4          | 54.9          |

https://doi.org/10.1371/journal.pone.0274928.t003
Changes in burden of obesity-induced diseases

Table 5 presents results for the uncertainty analysis in which the standard deviation from the Monte Carlo estimation was reported in the parentheses. Overall, the SSB tax would reduce the average BMI of population from between 0.07 to 0.28 BMI units. The reduction of BMI among females was larger than males. This would give rise to a reduction of the diabetes prevalence by 0.03–0.12 percentage points compared to the base prevalence of 4.1%, which is equivalent to between approximately 20,000–80,000 diabetes cases avoided. Females could have a bigger benefit compared to males due to a larger reduction in diabetes prevalence.

In model 1, the reduction in prevalence of diabetes corresponded to about 20,270–80,992 cases of diabetes avoided over the lifespan of modelled cohort. For both sexes, this could further save up to 155.2–620.1 billion VND (6.9–27.2 million USD, 2021’s exchange) for the direct medical cost of diabetes treatment. Model 2 provided a similar estimate to model 1 for
the change in diabetes burden. The number of avoided diabetes cases was slightly higher than
model 1, ranging from 20,386 to 81,455 cases. The saving in health care cost estimated in
model 2 is also greater, ranging from 156.1–623.6 billion VND (7.0–27.9 million USD, 2021’s
exchange).

**Discussion**

Overall, the results indicated that projected SSB consumption levels reduced in relation to the
application of higher tax rates. The Ministry of Finance-proposed option of 10% ad valorem
(equivalent to a 5% price increase) was predicted to bring down the total SSB consumption
by 171.3 million litres, equivalent to the reduction of 2.6 litres per capita per annum. And the
reduction was expected to be four times higher in response to an average price increase of 19–
20% in three highest tax plans (scenario 3 to 5). The reduction in total amount of consumption
would be 9.8, 10.2 and 10.5 litres per capita per year in scenario 3, 4 and 5, respectively.

Although scenario 3 with 19% price increase has less impact on the SSB consumption com-
pared to scenario 4 & 5 of 20% price increase, the reduction in sugar intake from SSBs was
almost equal at 3.1–3.3 gram/day/person in all three tax options. This could be explained by
the effect of tax design on consumption behaviours including an industry response (through
product reformulation) because the sugar-based specific tax has more power to reduce the
consumption of high sugar-content products and promote the switch to lower sugar-content
lines.
Reflecting the similar pattern of reduction in the amount of sugar consumed, the change in diet related NCD burden is predicted to show the most benefits when a sufficient level in price increase is reached. There is a clear difference in the prevalence of overweight and obesity class I when applying a price increase from 5% to 11% and up to 19–20% (see Table 4 above). Although, the change in obesity class II and type 2 diabetes were marginal, a noticeable gap in predicted reductions between different levels of price increase maintained (see Table 4 above). More importantly, at the same level of price increase at 19–20%, scenario 3 of sugar-based specific tax showed a higher benefit compared to the volume-based specific tax design (scenario 4) or almost equal to the ad valorem tax (scenario 5). This pointed to the fact that even at the same level of price increase, tax design targeted on high-sugar content product lines would have more health impacts. The design of specific tax based on sugar content or volume has recently proven successful at reducing consumption of high sugar-content SSB products and further encourage the switch to more healthy products [4]. This finding should be highlighted when considering a new tax design for SSBs in Vietnam as well as other countries considering implementing SSB tax.

In comparison with previous simulation studies on SSB tax, the study results show consistent direction and compared to some countries, are close in magnitude of policy impacts on obesity status. At price increase of 20%, other simulation work on SSB tax reported the reduction in overweight and obesity prevalence varying from around 1% up to 3.8% such as in Thailand [18], Ireland [36], India [37], South African [20], Indonesia [21]. This study estimated that at the same price increase, Vietnam would have about 1.2% drop in overweight and 0.2% reduction in obesity prevalence. The difference can be appreciable due to the different in country context of health trend and economic characteristics. A summary of previous simulation studies estimating SSB tax impacts on obesity prevalence can be found in S3 File.

**Implications**

The study’s findings, consistent with previous work, suggest a tax on SSBs has the potential to reduce rates of over-weight/obesity and attain positive health effects in Vietnam. By taxing SSBs, the benefit could be observed not only in the health of the general population but also in the revenue gain and saving of healthcare cost for the government. The study focused on examining two determinants for developing SSB tax policy which are how and how much SSBs should be taxed.

Firstly, about the tax design, across three tiers of price increase, the impacts on consumption, health and economic outcomes would grow in line with the level of price increase. While 5% price increase would bring some benefits, increasing price up to 20% could bring a sizeable impact on the overweight and obesity rate. WHO recommends at least 20%, which is a good starting point for any country considering a tax [29, 38]. Lawmakers and governmental authority must be aware that SSB tax must reach a sufficient level to obtain the expected benefits. Because the rapid economic growth can rapidly dominate the SSB tax increase, and potentially erase the deterrent effect of the tax on consumer behaviour, when the price increase has been achieved a tax escalator should be incorporated into the tax to maintain its deterrent effect and adjusted regularly to eliminate the inflation impact.

Secondly, at the same price increase, the comparison of three tax designs has also shown some small differences in health benefits which the specific tax based on sugar density was predicted to be most effective on reducing sugar consumption from SSBs. The single tier based specific tax or ad valorem is familiar and straightforward for tax administration agency. The tax design based on sugar content is highly appraised for incentivizing industry to reformulation SSB products and have already been in practice in at least eight countries.
Last but not least, the policy implications should consider the alternatives to sugar-sweetened beverages, especially "diet" drinks—beverages with artificial sweeteners to have less sugar or sugar free—which consumers may substitute for SSBs. The United Kingdom has showcased an example on the surge of diet drinks following the implementation of SSB tax. An obvious shift of the market share for diet drinks from 44% in 2011 to 61% in 2021 was reported [39]. A 2021 study in UK showed that the volume of purchases sugary beverages did not change but the average sugar consumed from these products dropped about 10%, proving that the sugar content in this soft drink category has significantly reduced [40]. This represented a case study for every country that considering developing SSB tax because there are concerns around their long-term adverse health effects of this alternative product and their interference in substituting SSBs with the actual healthy products [41].

**Model limitations**

Model limitations should not be ignored for further interpretation and implications. Firstly, the model outcomes are likely to offer a lower bound estimate of tax effects because only diabetes is modelled as a disease outcome and the body weight change was assumed from reduction in SSB consumption only, not accounting for reformulation of products to contain less sugar. Preliminary findings from Vietnam STEPS 2021 suggests that obesity burden is increasing rapidly compared to the 2015 figure (BMI $\geq$ 25: 19.5% vs. 13.7%; diabetes: 7.5% vs. 4.1%) [42]. Given the alarming trend of overweight and obesity and how long the policy formulation will take, our estimated impacts might only be able to slow down the increase rate of obesity rather than give actual reduction in overweight & obesity prevalence.

Additionally, model projection was also truncated within the cohort aged 18–69 so there may be substantially higher impacts when extended the modelled group to the whole population. Given the concern on childhood obesity in Vietnam during current time, further attempts on estimating SSB tax impact on childhood obesity explicitly is highly recommended. Additionally, one of the key parameters of calorie-to-weight conversion factor which originated from studies among Caucasian ethnicities might not provide a close approximation for Vietnamese population. Further, the assumption on the pass-on rate needs testing in the real world, but any reduction in this would likely have proportional impacts on health and cost consequences of an intervention.

Otherwise, this study presents another drawback that should be addressed in further studies if resources allow. The study did not provide estimates differentiated by potentially correlators such as socio-economic status (SES) or rural/urban residency. This is important not just in terms of estimating potential health effects where gradients related to SES may exist but also in terms of the distribution of the tax. International experiences showed that the acceptability of SSB taxes among both public and policymakers is greatly influenced by evidence related to the perceived equity of the tax burden [43, 44], and how the revenues will be used [43–45].

**Conclusion**

The study findings appear to offer strong support for the implementation of a SSB tax, which will slow the increase rate of obesity burden and further reduce this burden if the policy is taken strongly. This is highly likely to benefit population health improvement through its contribution to a healthy food environment while generating considerable government revenue. The implementation of a SSB tax policy should be facilitated as multisector initiative [46, 47]. There is a need to continue to develop and disseminate messages that promote healthy food choices [46, 47]. Finally, it is important to keep in mind the study limitations, the nature of
simulation work and noted uncertainties when considering the results and implications of the findings.

**Supporting information**

S1 File. Data inputs and assumptions. (DOCX)

S2 File. Sensitivity analysis result. (DOCX)

S3 File. Comparison of current findings with previous works. (DOCX)

**Acknowledgments**

The authors would like to express our thanks to Lam Tuan Nguyen from World Health Organization (Vietnam); Hoa Ngo, Fiona Watson, Courtney Peters & Jade Little from UNICEF; Doan Thu Huyen & Nguyen Van Huan from Global Health Advocacy Incubator for their valuable insights & comments throughout our work. A special thank goes to Professor Michael Donnelly (Queen’s University Belfast) for his time on reviewing and suggestions that has greatly improved this manuscript.

**Author Contributions**

**Conceptualization:** Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Phuong Hong Do, Quang Dinh Nguyen, Jo Jewell, Maharajan Muthu.

**Data curation:** Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Ben Amies-Cull, Bao Quoc Tran, Ciaran O’Neill.

**Formal analysis:** Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Phuong Hong Do, Jo Jewell, Ly-Na Hoang, Thu Thi Le, An Thi Nguyen.

**Funding acquisition:** Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Phuong Hong Do.

**Methodology:** Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Phuong Hong Do, Quang Dinh Nguyen, Jo Jewell, Ben Amies-Cull, Maharajan Muthu, Ly-Na Hoang, Thu Thi Le, An Thi Nguyen, Ciaran O’Neill.

**Project administration:** Duyen Thuy Nguyen, Minh Van Hoang, Phuong Hong Do, Maharajan Muthu.

**Resources:** Duyen Thuy Nguyen, Son Dao, Quang Dinh Nguyen, Ly-Na Hoang, Thu Thi Le, An Thi Nguyen, Bao Quoc Tran.

**Software:** Duyen Thuy Nguyen, Ciaran O’Neill.

**Supervision:** Duyen Thuy Nguyen, Minh Van Hoang, Jo Jewell, Ben Amies-Cull, Ciaran O’Neill.

**Validation:** Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Phuong Hong Do, Jo Jewell, Ben Amies-Cull, Maharajan Muthu, Ly-Na Hoang, Bao Quoc Tran, Ciaran O’Neill.

**Visualization:** Duyen Thuy Nguyen, Ciaran O’Neill.

**Writing – original draft:** Duyen Thuy Nguyen, Ciaran O’Neill.
Writing – review & editing: Duyen Thuy Nguyen, Minh Van Hoang, Son Dao, Phuong Hong Do, Quang Dinh Nguyen, Jo Jewell, Ben Amies-Cull, Maharajan Muthu, Ly-Na Hoang, Thu Thi Le, An Thi Nguyen, Bao Quoc Tran.

References
1. Development Initiatives. 2021 Global Nutrition Report: The state of global nutrition. Bristol, UK: Development Initiatives Poverty Research Ltd.; 2021.
2. World Health Organization. Obesity and Overweight—Key Facts. Geneva; 2018.
3. Tim Lobstein HB, Margot Neveux,. World Obesity Atlas 2022. World Obesity Federation; 2022.
4. World Bank. Taxes on Sugar-Sweetened Beverages: International Evidence and Experiences. World Bank; 2020.
5. Imamura F, O’Connor L, Ye Z, Mursu J, Hayashino Y, Bhupathiraju SN, et al. Consumption of sugar sweetened beverages, artificially sweetened beverages, and fruit juice and incidence of type 2 diabetes: systematic review, meta-analysis, and estimation of population attributable fraction. Bmj. 2015; 351: h3576. https://doi.org/10.1136/bmj.h3576 PMID: 26199070
6. World Health Organization. Fiscal Policies for Diet and Prevention of Noncommunicable Diseases: Technical Meeting Report. Geneva; 2016.
7. World Health Organization. Taxes on Sugary Drinks: Why Do It?; 2017.
8. Report GN. 2020 Country Nutrition Profiles: Vietnam. https://globalnutritionreport.org/resources/nutrition-profiles/asia/south-eastern-asia/viet-nam/; 2020.
9. Ministry of Health. NATIONAL SURVEY ON THE RISK FACTORS OF NON-COMMUNICABLE DISEASES (STEPS) VIET NAM 2015. Hanoi: GENERAL DEPARTMENT OF PREVENTIVE MEDICIN; 2016.
10. Summary findings from Vietnam National Nutrition Survey 2019–2020 [press release]. 2020.
11. Biswas T, Tran N, Thi My Hanh H, Van Hien P, Thi Thu Cuc N, Hong Van P, et al. Type 2 diabetes and hypertension in Vietnam: a systematic review and meta-analysis of studies between 2000 and 2020. BMJ Open. 2022; 12(8):e052725. https://doi.org/10.1136/bmjopen-2021-052725 PMID: 35940839
12. Euromonitor. Soft drinks in Vietnam. http://www.euromonitor.com/soft-drinks-in-vietnam/report. 2018.
13. Vietnam Ministry of Finance. Official Dispatch No. 10958/BTC-CST dated 17/8/2017 on the Draft Law on Amendments and Supplements to some articles of the Laws on Value-Added Tax, Special consumption tax, Corporate income Tax and Resources Tax Hanoi2017.
14. National Lung Heart and Blood Institute. Managing Overweight and Obesity in Adults: Systematic Evidence Review from the Obesity Expert Panel. National Institute of Health; 2013.
15. Dai H, Alsaihe TA, Chałęgafa N, Riccó M, Bragazzi NL, Wu J. The global burden of disease attributable to high body mass index in 195 countries and territories, 1990–2017: An analysis of the Global Burden of Disease Study. PLoS Med. 2020; 17(7):e1003198. https://doi.org/10.1371/journal.pmed.1003198 PMID: 32722671
16. Long MW, Gortmaker SL, Ward ZJ, Resch SC, Moodie ML, Sacks G, et al. Cost Effectiveness of a Sugar-Sweetened Beverage Excise Tax in the U.S. Am J Prev Med. 2015; 49(1):112–23. https://doi.org/10.1016/j.amepre.2015.03.004 PMID: 26094232
17. Basto-Abreu A, Barrientos-Gutiérrez T, Vidaña-Pérez D, Colchero MA, Hernández-FM, Hernández-Avilà M, et al. Cost-Effectiveness Of The Sugar-Sweetened Beverage Excise Tax In Mexico. Health Aff (Millwood). 2019; 38(11):1824–31. https://doi.org/10.1377/hlthaff.2018.05469 PMID: 31682510
18. Phonsuk P, Vongmongkol V, Ponguthia S, Supanachaimat R, Rojroongyasinkul N, Swinburn BA. Impacts of a sugar sweetened beverage tax on body mass index and obesity in Thailand: A modelling study. PLoS One. 2021; 16(4):e0250841. https://doi.org/10.1371/journal.pone.0250841 PMID: 33914822
19. Briggs AD, Mytton OT, Kehlbacher A, Tiffin R, Rayner M, Scarborough P. Overall and income specific effect on prevalence of overweight and obesity of 20% sugar sweetened drink tax in UK: econometric and comparative risk assessment modelling study. Bmj. 2013; 347:f6189. https://doi.org/10.1136/bmj.f6189 PMID: 24179043
20. Manyema M, Veerman LJ, Chola L, Tugendhaft A, Sartorius B, Labadarios D, et al. The potential impact of a 20% tax on sugar-sweetened beverages on obesity in South African adults: a mathematical model. PLoS One. 2014; 9(6):e105287. https://doi.org/10.1371/journal.pone.0105287 PMID: 25136987
21. Bourke EJ, Veerman JL. The potential impact of taxing sugar drinks on health inequality in Indonesia. BMJ Glob Health. 2018; 3(6):e000923. https://doi.org/10.1136/bmjgh-2018-000923 PMID: 30555724
22. Lal A, Mantilla-Herrera AM, Veerman L, Backholer K, Sacks G, Moodie M, et al. Modelled health benefits of a sugar-sweetened beverage tax across different socioeconomic groups in Australia: A cost-effectiveness and equity analysis. PLoS Med. 2017; 14(6):e1002326. https://doi.org/10.1371/journal.pmed.1002326 PMID: 28654688

23. Luong L, Vu LH. Impacts of Excise Taxation on Non-Alcoholic Beverage Consumption in Vietnam. Sustainability. 2020; 12(3):1092.

24. World Health Organization; Health Bridge Canada in Vietnam. Simulation model on Sugar Sweetened Beverages Tax in Vietnam (unpublished). 2021.

25. Paraje Guilleramo. Fiscal tools for reducing the consumption of sugar-sweetened beverages in Vietnam (Consultancy report). Hanoi: World Health Organization; 2016.

26. Ni Mhurchu C, Parag V, Nakamura M, Patel A, Rodgers A, Lam TH. Body mass index and risk of diabetes mellitus in the Asia-Pacific region. Asia Pac J Clin Nutr. 2006; 15(2):127–33. PMID: 16672195

27. Tuan Kiet Pham H, Tuyet Mai Kieu T, Duc Duong T, Dieu Van Nguyen K, Tran NQ, Hung Tran T, et al. Direct medical costs of diabetes and its complications in Vietnam: A national health insurance database study. Diabetes Res Clin Pract. 2020; 162:108051. https://doi.org/10.1016/j.diabres.2020.108051 PMID: 32027924

28. Hall KD, Sacks G, Chandramohan D, Chow CC, Wang YC, Gortmaker SL, et al. Quantification of the effect of energy imbalance on bodyweight. Lancet. 2011; 378(9793):826–37. https://doi.org/10.1016/S0140-6736(11)60812-X PMID: 21872751

29. World Health Organization. Health taxes: a primer (a WHO policy brief). Switzerland: World Health Organization; 2019.

30. Manyema M, Veerman LJ, Tollman SM, Bertram MY, Hofman KJ. Evidence that a tax on sugar sweetened beverages reduces the obesity rate: a meta-analysis. BMC Public Health. 2013; 13(1):1072. https://doi.org/10.1186/1471-2458-13-1072 PMID: 24225016

31. World Health Organization. Guideline: Sugars intake for adults and children. Geneva: World Health Organization; 2015.

32. Briggs ADM, Mytton OT, Madden D, O'Shea D, Rayner M, Scarborough P. The potential impact of a 10% tax on sugar-sweetened beverages in Ireland, an effect assessment modelling study. BMC Public Health. 2013; 13(1):860. https://doi.org/10.1016/s12889-016-3085-y PMID: 27240422

33. Redondo M, Hernández-Aguado I, Lumbreras B. The impact of the tax on sweetened beverages: a systematic review. Am J Clin Nutr. 2018; 108(3):548–63. https://doi.org/10.1093/ajcn/nqy135 PMID: 30535085

34. Russell C, Grimes C, Baker P, Sievert K, Lawrence MA. The drivers, trends and dietary impacts of non-nutritive sweeteners in the food supply: a narrative review. (1475–2700 (Electronic)).

35. Pell D, Mytton O, Penney TL, Briggs A, Cummins S, Penn-Jones C, et al. Changes in soft drinks purchased by British households associated with the UK soft drinks industry levy: controlled interrupted time series analysis. Br J. 2021; 372:n254. https://doi.org/10.1136/brmj.n254 PMID: 33992200
44. Niebylski ML, Redburn KA, Duhaney T, Campbell NR. Healthy food subsidies and unhealthy food taxation: A systematic review of the evidence. Nutrition. 2015; 31(6):787–95. https://doi.org/10.1016/j.nut.2014.12.010 PMID: 25933484

45. Mounsey S, Veeraman L, Jan S, Thow AM. The macroeconomic impacts of diet-related fiscal policy for NCD prevention: A systematic review. Econ Hum Biol. 2020; 37:100854. https://doi.org/10.1016/j.ehb.2020.100854 PMID: 32062400

46. UNICEF. Sugar—Sweetened Beverage Taxation (policy brief). 2022.

47. Emmons KM, Chambers DA. Policy Implementation Science—An Unexplored Strategy to Address Social Determinants of Health. Ethn Dis. 2021; 31(1):133–8. https://doi.org/10.18865/ed.31.1.133 PMID: 33519163