Simulating the Fiscal Impact of Anti-Obesity Medications as an Obesity Reduction Strategy

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Abstract
While substantial public health investment in anti-smoking initiatives has had demonstrated benefits on health and fiscal outcomes, similar investment in reducing obesity has not been undertaken, despite the substantial burden obesity places on society. Anti-obesity medications (AOMs) are poorly prescribed despite evidence that weight loss is not sustained using other strategies alone.

We used a simulation model to estimate the potential impact of 100% uptake of AOMs on Medicare and Medicaid spending, disability payments, and taxes collected relative to status quo with negligible AOM use. Relative to status quo, AOM use simulation would result in Medicare and Medicaid savings of $231.5 billion and $188.8 billion respectively over 75 years. Government tax revenues would increase by $452.8 billion. Overall, the net benefit would be $746.6 billion. Anti-smoking efforts have had substantial benefits for society. A similar investment in obesity reduction, including broad use of AOMs, should be considered.

Keywords
obesity, public health, anti-obesity agents, Medicaid, Medicare, weight loss, economic modeling, microsimulation, health policy

What do we already know about this topic?
Despite the substantial societal burden of obesity, substantial public health investment in reducing obesity has not been undertaken.

How does your research contribute to the field?
We simulated the potential fiscal impacts of 100% uptake of anti-obesity medications relative to status quo with negligible anti-obesity medications use.

What are your research’s implications toward theory, practice, or policy?
We found a net benefit of $746.6 billion, suggesting public health investment in obesity reduction, including broad use of AOMs, should be considered.

Introduction
As the proportion of Americans who have obesity rises, the epidemic is having broadly negative consequences. Approximately 72% of United States (US) adults is overweight, while 39.8% of Americans has obesity¹ based on the anthropomorphic calculation of body mass index (BMI), a clinical indicator for obesity (BMI ≥ 30).² This excess weight costs the US $116 billion in additional healthcare costs on an annual basis, with most of these costs impacting Medicare and Medicaid.³ Health concerns caused or exacerbated by obesity include hypertension, dyslipidemia, polycystic ovary syndrome, fatty liver disease, type 2 diabetes, and respiratory problems.⁴ Increased prevalence of obesity-related comorbidities accounted for significant growth in Medicare spending...
between 1987 and 2011.\textsuperscript{5} Further, 77.6\% of healthcare spending growth is attributable to patients with chronic conditions related to obesity.\textsuperscript{4} Analysis by Wang et al\textsuperscript{3} found that class II patients with obesity (BMI = 35-40) cost the US approximately $69 billion, accounting for 60\% of all obesity-related costs.\textsuperscript{3} 41\% of these costs were borne by Medicaid, Medicare, and other federal spending.

The impact of obesity is compounded by the downward pressure that the disease puts on work force participation and the associated decrease in tax revenues.\textsuperscript{7-9} Workers with a BMI > 30 are more likely to report lost productive time (LPT) than workers with a normal or somewhat elevated BMI and cost an estimated $42.29 billion in LPT, of which 67.8\% is accounted for by presenteeism.\textsuperscript{10} Previous reports have also shown that increasing BMI is associated with lower workforce participation, independent of associated comorbidity and sociodemographic factors.\textsuperscript{11} The obesity epidemic deserves equal, if not more, attention as other public health fronts, such as smoking prevention and cessation.

Since the US Surgeon General’s Tobacco Report in 1964 causally linking smoking with cancer,\textsuperscript{12} smoking prevention and cessation have been prominent initiatives in public health, resulting in a 67\% decline in smoking from 1965 to 2018, when prevalence of cigarette smoking reached an all-time low among US adults. While the advent of “vaping” and legalized marijuana have created new fronts in public health efforts to reduce the impact of negative health behaviors on society, the investment in smoking cessation has been a remarkable success. In fact, public spending on smoking prevention and cessation initiatives has been substantial, amounting to $658 million in 2011.\textsuperscript{13}

Prior research has demonstrated the substantial potential impact of reducing BMI (weight loss) on morbidity, mortality, healthcare expenditures and revenues.\textsuperscript{14-17} Several research studies have suggested that investing in reducing weight in society will have a larger benefit in terms of healthcare savings and productivity relative to smoking reductions. A microsimulation by Goldman et al\textsuperscript{14} found that reducing weight in people with BMI > 30 had a demonstrably larger impact on Medicare and Medicaid compared to reducing smoking. The Goldman model estimated a $252 billion reduction in Medicare costs, and a $265 billion reduction in Medicaid costs over a 50-year simulation period by reducing obesity to 1978 levels. In comparison, achieving 1\% smoking prevalence had miniscule savings of $2.5 billion. Similarly, research by the Robert Wood Johnson Foundation estimated federal government savings from obesity prevention would grow over a 60+ year time horizon, whereas tobacco use prevention has early benefits but decline over time due to increased longevity of the non-smoking population.\textsuperscript{18-20}

Despite efforts to induce dietary change and to increase physical activity (commonly referred to as lifestyle change), the majority of people with obesity fail to achieve meaningful and sustainable weight loss.\textsuperscript{19,21,22} While some FDA-approved anti-obesity medications (AOMs) have been available to patients and their physicians for decades, uptake of AOMs remains low.\textsuperscript{22} This may in part reflect payer limits on access and reimbursement, misconceptions by health-care professionals about the use of these treatments, and lingering safety concerns from the Fenfluramine-Phentermine scare, where some patients experienced pulmonary hypertension and heart valve malfunction prompting market withdrawal by the FDA.\textsuperscript{23-26} While Fenfluramine-Phentermine was removed from the market many years ago, misconceptions persist around the modern, safe and effective FDA-approved class of AOMs.

Newer AOMs have demonstrated long-term safety and efficacy and offer an opportunity to enhance weight loss and weight maintenance. For example, AOMs have been shown to benefit a significantly larger group of patients versus placebo, with most patients achieving weight loss of ≥ 5\%.\textsuperscript{26-30} Further, new and novel AOMs are currently in development which will likely achieve even greater magnitude of weight loss.\textsuperscript{31}

Given the changing obesity landscape, both in terms of increasing prevalence, and in terms of new treatment opportunities, this study sought to estimate the potential benefits of an obesity reduction strategy using AOMs in the US population. We evaluated the potential impacts of AOM use on government expenditures for healthcare and disability payments, and on government revenues from employment participation, by comparing the status quo to a scenario where all patients with obesity are treated with current and next generation AOMs. The results of this study provide a framework for considering the impact of a large public-health effort similar to that seen in the area of smoking.

\section*{Methods}

We used a well-established microsimulation model\textsuperscript{15,16,32-38} to evaluate the impact of broad use of FDA-approved and next generation AOMs on government revenues and expenditures. Public healthcare expenditures and federal and state
tax revenues were estimated over 75 years, comparing a scenario with decreased obesity due to increased use of AOMs relative to a status quo scenario of little to no drug use. The 75-year analytic period was selected to parallel the Medicare Trustees report that projects 75-years into the future.\textsuperscript{39} The Health Economics Medical Innovation Simulation (THEMIS),\textsuperscript{32} an individual-level microsimulation model (Figure 1), estimates population health trends based on data from the Panel Study of Income Dynamics (PSID).\textsuperscript{40} As a nationally representative survey of population health and socioeconomic characteristics, the PSID allowed us to evaluate obesity trends under the current standard of care in a heterogeneous US population. The full technical specifications of THEMIS can be found in our online technical report.\textsuperscript{32}

**Statistical Analysis**

THEMIS projects future health and economic outcomes using historical and current trends estimated using real-world data sources. PSID data from 1999 to 2015 was used to estimate health and economic transitions, while the National Health and Nutrition Examination Survey from 1999 to 2010 was used to estimate BMI trends. The Medical Expenditures Panel Survey and Medicare Current Beneficiary Survey were used to estimate medical costs and the impact of BMI on those costs.\textsuperscript{32} For this study we created an obesity risk model using an ordinary least squares regression to predict an individual’s log(BMI) given his/her demographic and health characteristics in the PSID (Supplemental Appendix Exhibit A1). THEMIS also estimated the probability of developing cardiovascular diseases, type 2 diabetes, osteoarthritis, and depression using probit regressions estimated based on the PSID data (Supplemental Appendix Exhibit A2). We estimated the additional medical costs of these comorbidities using statistical models developed based on the Medical Expenditures Panel Survey and Medicare Current Beneficiary Survey data. Additionally, estimation of the impact of reduced BMI on income was based on PSID data. For this analysis, we estimated future government expenditures and revenues calculated as the mean for 100 replications of the Monte Carlo simulation using R and C++.

**Study Sample**

We simulated a nationally representative sample of Americans aged ≥25 years from 2019 through 2094, in parallels to the time horizon of the annual report on the Medicare trust fund. The sample was initially created from the PSID 2009 data. Birth rates, death rates, health trends, including obesity risk, were estimated from the historical PSID data through 2019 to create the starting sample. The starting sample was replenished every cycle from 2019 to 2094 by adding new cohorts of 25-year-old individuals that represented future US health trends, estimated based on the National Health Interview Survey and Medical Expenditure Panel Survey data.
AOM Treatment Analyses

We first estimated the status quo of government expenditures and revenues assuming no AOM use, given that less than 2% of individuals eligible for AOMs receive such therapies.22,38,41 This analysis served as the base case against which the subsequent scenario was compared. We then estimated a scenario where 100% of eligible, treatment-naïve individuals initiated use of a currently available AOM. We selected the 100% uptake as our scenario to provide perspective on the maximum potential benefits of AOM therapy given realistic assumptions on adherence and discontinuation. While a 100% uptake rate is likely unrealistic, understanding the potential benefits, particularly given the on-going concerns around public funding for Medicare and Medicaid, is warranted. Current FDA-approved AOMs included liraglutide 3.0 mg (Saxenda), lorcaserin (Belviq), phentermine-topiramate (Qsymia), and naltrexone-bupropion (Contrave). At the time of this analysis, lorcaserin (Belviq) had not been withdrawn from market. AOM efficacy was assumed to be 8.9%29,30,42-44 as a 1-time BMI reduction following initiation of therapy based on clinical trial results for these therapies. Starting in 2023 through the end of the simulation period, all eligible treatment-naïve individuals initiated therapy using next generation AOMs to represent the launch of pipeline AOMs (eg, semaglutide). The estimated efficacy was increased to 14% based on current clinical evidence for the next generation AOMs.31

Costs of AOMs were not estimated, as none are currently covered by Medicare and the goal of the study was to evaluate the potential impact of a public health effort, which will include unknown amounts of investment at the local, state and federal level.

Treatment eligibility was established using current clinical guidelines; anyone with BMI ≥ 30 kg/m² was eligible for treatment, while patients with BMI ≥ 27 kg/m² were required to have at least 1 weight-related comorbidity (hypertension or type 2 diabetes).45 We assumed that all treated patients adhered to therapy, followed a reduced-calorie diet, and increased physical activity.

To capture likely real world use, we assumed 30% of treated individuals would discontinue AOM treatment every year, similar to the rate observed with oral antidiabetic therapies.46 Once discontinued, a patient was assumed not to resume treatment. Following discontinuation, a patient’s BMI was assumed to follow the BMI trajectory as estimated by the predictive model for log(BMI), starting from their reduced BMI.

Outcomes

For our assessment of the impact of full uptake of AOMs, we estimated government expenditures and revenues over a 75-year observation period matching the projection window published in the Medicare Trustees report.39 We calculated the results at 10, 25, and 50 years to demonstrate how the expenditures and revenues would change over time. Expenditures included Medicare and Medicaid expenditures, and disability insurance expenditures (Supplemental Security Income [SSI] and Social Security Disability Insurance [SSDI]). Revenues included state and federal income taxes, Medicare payroll taxes and Old-Age and Survivors Insurance (OASI) payroll taxes. All outcomes were calculated as the difference from the status quo. The present values of monetized outcomes were discounted by 3% per year and converted to 2018 US dollars using the consumer price index.47

Results

Over the 75-year observation period, the number of treated patients fell as the pool of untreated individuals decreased (Figure 2). Because we did not consider re-treatment among patients who discontinued AOMs, only newly indicated patients—either newly added 25 year-olds who met treatment criteria or existing patients who developed the characteristics indicated for—were potential treatment candidates.

Relative to status quo, adding obesity treatment resulted in a substantial decrease in expenditures for Medicare, Medicaid, and disability payments over the 75-year simulation period (Table 1). The simulation estimated that Medicare would experience a reduction of $231.5 billion in expenditures due to obesity treatment over the period from 2019 to 2094. Similarly, Medicaid savings would reach $188.8 billion by the end of the 75-year simulation period. Offsetting these savings, more patients would survive to retirement and collect OASI, resulting in an increase in these retirement outlays of $184.8 billion. Net change in expenditures showed a substantial reduction in fiscal burden of obesity from widespread use of AOMs, with savings reaching $293.8 billion over the 75-year simulation period.

Expenditure changes observed in the first 10 years of the simulation were relatively modest—$66.4 billion relative to the status quo. Savings accrued to Medicaid and Medicare with a slightly larger benefit to the Medicaid program from
the initial population receiving treatment in the simulation. By the end of the 75-year simulation, the benefits of reducing obesity through 100% uptake of AOMs was 22% greater in Medicare than Medicaid.

The change in federal income taxes relative to status quo was a cumulative $18 billion after 10 years of AOM use, climbing to a cumulative $316.8 billion increase in federal income taxes after 75 years. Overall revenues increased from a cumulative $16 billion after 10 years of AOM use, to a cumulative $452.8 billion after 75 years.

The net change in fiscal impacts (ie, the difference between expenditures and revenue) of increased use of AOMs relative to status quo, increased from a cumulative $82.4 billion after just 10 years (+3.08% from status quo) to a cumulative $746.6 billion at the end of 75 years (+10.1% from status quo; Figure 3).

**Discussion**

Obesity is endemic in the US, and is projected to get substantially worse. A recently published study suggests that by 2030, nearly half of all Americans will have obesity. Using data from the Behavioral Risk Factor Surveillance System Survey, researchers estimated that the prevalence of obesity
will be higher than 50% in 29 states and not below 35% in any state. Nearly 25% of adults will have severe obesity (BMI ≥ 40). As obesity in the population increases over time, the consequences are likely to be substantial, both in terms of health and economic impact.

Our study demonstrated that taking a broad public-health approach that includes AOMs to address the impacts of obesity has the potential to generate substantial savings while simultaneously increasing revenues through productivity gains from a healthier population. We took an expansive approach to estimating the impact of savings from widespread use of current and future medications for treating obesity. This approach allowed us to estimate the magnitude of the benefit that may be achieved with a major shift in public health efforts to reduce obesity.

Relative to projections based on current AOM use, we estimated that the net fiscal benefits of broad AOM use could be close to $750 billion over 75 years, with substantial savings to both Medicare and Medicaid, and additional earned revenues from paid taxes. While the initial benefits of widespread AOM use were higher in Medicaid, by the end of the 75-year simulation, the economic benefit was 22% greater in Medicare than Medicaid. These findings provide an important reflection point for policymakers with jurisdiction over both Medicare and Medicaid, where there is the opportunity to update outdated law and regulation to capture the savings from treating obesity that is not currently realized into government healthcare savings. Revenues generated from treating obesity, $16 billion after 10 years of AOM use rising to $452.8 billion after 75 years, highlight a common sense solution to strengthen the US’ economic competitiveness into the future.

While our analysis focused specifically on public healthcare spending and revenues, the potential impacts of a wide spread obesity treatment initiative leveraging proven medications to achieve meaningful weight loss could be enormous. These tremendous improvements might manifest as improvements in work productivity and decreases in other private healthcare spending.

Potential benefits from a public-health initiative to reduce obesity can be drawn from the evidence from smoking cessation, where a multipronged approach has resulted in significant reductions in smoking. As one prong of this effort, improved coverage of smoking cessation treatments was shown to result in increased uptake of antismoking medications. The benefits of this uptake were modeled in a study which estimated that over 10 years a return of $3.22 in savings per dollar spent was generated for Medicare and $2.50 in savings per dollar spent was generated for Medicaid. We know from previous research that the potential savings generated from reducing obesity may be far greater than the gains observed from a focus on smoking. Our research similarly suggests substantial net benefits to society from such an investment.

Our findings are supported by other research examining the potential benefits of obesity reduction. One study modeling a 10-year period of widespread use of AOMs similarly found significant savings potential. In this study, for each beneficiary receiving AOMs, Medicare had the potential to save $6842 to $7155 over 10 years. Another study which modeled the impact of a 10% to 15% weight loss on Medicare spending over 10 years found gross savings per capita of $8287 to $9826, even when accounting for a weight rebound among most patients.

Today, we know that having an elevated BMI contributes negatively to morbidity, mortality, healthcare expenditures and revenues. Yet, treatment for obesity appears to be going unchecked. For those who do get medical interventions, these often come in the form of lap band or bariatric surgery. One estimate suggests that the total number of metabolic and bariatric procedures performed increased from approximately 196,000 to 216,000 from 2015 to 2016. This estimate likely represents as little as 1% of the clinically eligible population for surgical obesity treatment. Research has shown that use of AOMs is low and remains relatively stagnant at roughly 2% of the population with obesity, and physician knowledge may be a part of this low rate of use. Yet, with available treatments today and next generation AOMs in the near future, the potential to have a broader impact on obesity treatment/chronic weight management is available.

### Limitations

This study projected government expenditures and revenues over a 75-year time horizon. While all efforts were made to establish reasonable assumptions, the study could not take into account other potential changes to the Medicare benefit or other government programs, so it only estimates the fiscal impact relative to an assumption of the status quo. Further, we imputed medical expenses from information contained in the Medical Expenditures Panel Survey and Medicare Current Beneficiary Survey as medical expenditures from the PSID are considered unreliable. Our method is considered more reliable as the Medical Expenditures Panel Survey contains self-reports that have been calibrated to the National Health Expenditure accounts and the Medicare Current Beneficiary Survey takes spending from a combination of Medicare administrative data and calibrated self-reports, and has been widely published.

Additionally, there is likely more uncertainty associated with our outcomes related to the Markov transition probabilities and the sampling variability of the underlying PSID sample that was not accounted for by the simulation.

Further, we did not account for the costs of AOMs as none are currently covered by Medicare. Even if AOMs add a substantial cost to the system, even in the first 10 years, AOMs would need to cost $8.2 billion to offset the net savings to the system. Given the likely broader benefits of obesity reduction to society not captured in our model, even the additional cost of treatment will likely not diminish these important benefits.
We assumed that all patients who initiated treatment were adherent to their medication and the prescribed lifestyle modification program prior to the point they discontinue. Our assumption of a 30% discontinuation rate at each cycle, which paralleled literature on diabetes treatments, may be conservative. Our assumption of AOM adherence may overestimate the impact of AOMs, but our discontinuation rate may in fact underestimate the population that continues to benefit over time. Further, we assumed that a patient did not resume treatment once it is discontinued, although in reality an alternative treatment may be initiated. Given the poor access and use of AOMs today, no literature was available upon which to establish estimates of adherence and discontinuation. Broader coverage of AOMs may motivate better adherence and reduce discontinuation rates, making our estimates of the benefits conservative.

There remains limited information on the potential efficacy of next generation AOMs. We used an efficacy estimate based on published phase 2 clinical trial results of semaglutide.31 Future AOMs may offer better or worse efficacy than our estimate which would change the results of our analyses in either a positive or negative direction.

We did not adjust any other healthcare utilization inputs that might change with an increased use of AOMs, such as physician visits and monitoring. However, published research in the area of type 2 diabetes prevention suggests that the incremental cost of increased healthcare utilization is very small relative to the large improvement in health outcomes.50,51

Finally, we assumed a 100% uptake scenario for this model. While we recognize this is likely unrealistic, understanding the potential benefits, particularly given the ongoing concerns around public funding for Medicare and Medicaid, is warranted. Fundamentally, as this is a forward looking model, any scenario will have its limitations and our approach allows us to provide an upper bound possibility even within the context of the other assumptions around adherence, retreatment and changes in behaviors relative to baseline.

Conclusions

With current obesity rates and projections of a vastly growing population of Americans living with obesity, continuing to rely on recommendations of modifying diet and exercise is clearly not enough to address this epidemic, for which the negative health and economic consequences are substantial. This study demonstrated the potential benefits to federal and state budgets of using AOMs as a weight management treatment in the US. Broad use of AOMs, especially anticipated next generation AOMs, should offer an important tool in the medical arsenal for treating obesity in America. In addition, this study identifies policy solutions for sustainability of the Medicare Trust Fund.39 A broad and multipronged approach to reducing obesity in the US, similar to the successful public health initiatives to reduce smoking, is critical to stemming the tide of a growing wave of obesity-related consequences in the very near future.

Declaration of Conflicting Interests

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Supplemental Material

Supplemental material for this article is available online.

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