# The Effect of Cost Sharing on an Employee Weight Loss Program: A Randomized Trial

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#### **Abstract**

**Purpose:** To test the effects of employer subsidies on employee enrollment, attendance, and weight loss in a nationally available weight management program.

**Design:** A randomized trial tested the impact of employer subsidy: 100%; 80%, 50%, and a hybrid 50% subsidy that could become a 100% subsidy by attaining attendance targets. Trial registration: NCT01756066.

Setting and Participants: Twenty three thousand twenty-three employees of 2 US companies.

Measures: The primary outcome was the percentage of employees who enrolled in the weight management program. We also tested whether the subsidies were associated with differential attendance and weight loss over 12 months, as might be predicted by the expectation that they attract employees with differing degrees of motivation.

**Analysis and Results:** Enrollment differed significantly by subsidy level (P < .0001). The 100% subsidy produced the highest enrollment (7.7%), significantly higher than each of the lower subsidies (vs 80% subsidy: 6.2%, P = .002; vs 50% subsidy: 3.9%, P < .0001; vs hybrid: 3.7%, P < .0001). Enrollment in the 80% subsidy group was significantly higher than both lower subsidy groups (vs 50% subsidy: 3.9%, P < .0001); vs hybrid: 3.7%, P < .0001). Among enrollees, there were no differences among the 4 groups in attendance or weight loss.

**Conclusion:** This pragmatic trial, conducted in a real-world workplace setting, suggests that higher rates of employer subsidization help individuals to enroll in weight loss programs, without a decrement in program effectiveness. Future research could explore the cost-effectiveness of such subsidies or alternative designs.

#### **Keywords**

affordable care act, cost sharing and subsidies, weight loss, weight management, obesity, incentives, behavioral economics

More than one-third of US adults are obese,<sup>1</sup> and the annual medical cost of caring for these individuals is estimated to be US\$147 billion. Despite the prevalence of obesity,

participation in weight loss programs is low in employer settings.<sup>2</sup> Financial incentives have shown promise in increasing weight loss,<sup>3-10</sup> and approximately 85% of large employers

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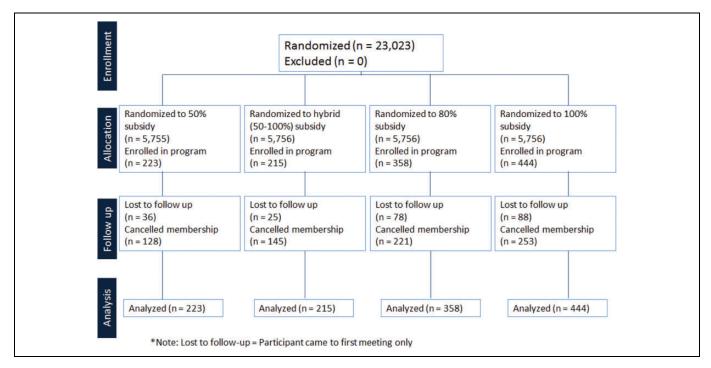


Figure 1. Consort diagram.

used financial incentives for health behavior in 2014. <sup>11</sup> Under the Patient Protection and Affordable Care Act, cost sharing will be allowed for some (though not all) preventive services, and the use of incentives to improve health outcomes is being more strongly encouraged. <sup>12</sup> The impact of subsidizing health promotion programs on both participation and outcomes is an important unresolved question.

Reducing the price of cost-effective treatments or preventive services, such as weight management programs, could encourage enrollment and increase the use of such services. However, it is possible that reducing cost (by offering the program at subsidized rates) may simply attract employees who are less committed to losing weight (ie, a screening effect)<sup>13-15</sup> or cause patients to devalue the treatment (consistent with sunk cost effects),<sup>16,17</sup> both of which would result in higher attrition rates and a less successful program overall. Expenditures to recruit more participants might not be an efficient use of resources in such cases. On the other hand, if subsidization helps people to overcome the inertia they face in beginning a weight loss program, one might expect subsidies to boost enrollment without reducing program effectiveness.

To determine the impact of varying levels of employer subsidy on employee enrollment in an effective nationally available weight management program <sup>18-22</sup> as well as on attendance and weight loss, we conducted a randomized trial among 23 023 employees of 2 large US companies. Participants were randomized to receive a 100% subsidy; an 80% subsidy, a 50% subsidy, or a hybrid 50% subsidy that could become a 100% subsidy based on participants meeting attendance targets. Our primary outcome measure was enrollment rate, with secondary outcomes of attrition rates and weight loss at 12 months.

# **Methods**

### Sample

The flow of participants through enrollment, intervention, and follow-up is shown in Figure 1. Enrollment was done on a rolling basis from January 2013 until July 2013. The intervention period was 12 months and data collection finished in July 2014. Participants meeting initial eligibility requirements were recruited using mailings. Eligible participants were benefits-eligible employees at 2 large employers within the United States. Employees had to be at least 18 years of age, have a body mass index (BMI)  $\geq$ 21 kg/m² (this is standard enrollment criteria for Weight Watchers, which we retained out of concern for external validity), and been hired prior to January 1, 2013.

# Design and Intervention

Participants were randomized into 1 of the 4 intervention arms (1:1:1:1). Randomization was stratified by company and worksite (11 worksites at company A and 31 worksites at company B) and used variable block sizes of 4, 8, and 12. The randomization assignments and study identification numbers were merged by on-site human resources personnel with employee lists at each location, after which participants were informed of their offer. Study investigators were blinded to individual intervention assignments until the analytic data set was finalized at the completion of the trial. Program leaders were blinded to the randomization assignment; however, due to the nature of the intervention, participants could not be blinded to their subsidy level.

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The study was approved by the institutional review board of the University of Pennsylvania, which granted a waiver of consent.

Eligible employees ( $N = 23\ 023$ ) were offered 12 months of a behavioral counseling program consisting of weekly group meetings (Weight Watchers) at 1 of the 4 subsidized rates. Each employee received an offer letter at his/her home address that communicated the subsidy to which he/she was allocated. In addition, the standard Weight Watchers at Work marketing campaign was implemented; this included posters around the worksite and information sessions highlighting the potential to receive at least 50% off the cost of the Weight Watchers monthly pass program (the monthly pass program provides subscribers with access to weekly Weight Watchers meetings and e-tools that promote self-monitoring) and the time-limited nature of the offer. Employees were given a personalized ID number and password and directed to the Weight Watchers website to enroll in the program. Baseline weight measurements were obtained at the first meeting that was attended. After the 12-month subsidy period, employees had the option of continuing with the full-priced program.

The regular price of the program, as offered through employers, was US\$34.35 per month, payable by credit card at the end of the month. We tested the impact of the following employer subsidies on program enrollment: 100% (program is free to employee), 80% (employee pays 20% of price), 50% (employee pays 50% of price), or a hybrid subsidy. In the hybrid subsidy arm, participants received a guaranteed 50% subsidy, which was increased to 100% contingent on attendance. Specifically, participants in this arm received a 100% subsidy for months in which they attended at least 3 meetings. These participants were charged the 50% price up front, which was subsequently reimbursed at the end of each month in which the attendance goal had been met.

Enrollees were instructed to attend a group weight loss meeting every week and could do so at work and/or in their communities. Participants were weighed at each meeting, and attendance was recorded per standard Weight Watchers procedures; a centralized system recorded enrollees' weight measurements and attendance rates, which served as our secondary dependent measures. We also received data on all use of Weight Watchers' online *e-tools* (a suite of digital applications, including a food tracker) by study participants. In addition, at the end of the 12-month program, enrollees were offered a US\$20 bonus for providing a final weigh-in at a Weight Watchers location.

# **Analysis**

Our primary outcome was the percentage of employees who enrolled in the program, assessed using  $\chi^2$  tests. We hypothesized that enrollment would increase as the subsidy increased. We also assessed program attendance and weight loss among enrollees using generalized linear models. We adopted a perprotocol approach, evaluating each enrollee according to his/her randomized offer, regardless of the degree of

participation. The per-protocol approach enabled us to test for a possible perverse effect of the subsidies—that employees who are motivated by higher subsidies to join health promotion programs could be less committed to losing weight; therefore, higher subsidy arms might be associated with less weight loss.

Some enrollees failed to provide a monthly weight; we multiply imputed missing weight measurements based on the following variables—arm indicator (blinded), enrollment calendar month, cancellation within 12 months (yes/no), age, gender, baseline height, total food tracking days, total exercise tracking days, week of most recent weigh-in, weight at most recent weigh-in, interaction between week of most recent weigh-in and weight at most recent weigh-in, and number of total weigh-ins since enrollment. We assessed the robustness of our results using different imputation approaches (baseline observation carried forward, which assumes participants lost no weight, and last observation carried forward, which assumes participants had no change in weight beyond what was measured). We controlled for baseline weight since it differed between arms among enrollees. We report weight loss in pounds because all communication with study participants about weight loss was in pounds (the study population was more familiar with pounds than kilograms).

Our power calculations were aimed at detecting a difference in participation rates between arms of approximately 1.5 percentage points. A sample size of 20 000, evenly randomized to the 4 arms, provided more than 80% power to detect this difference. All tests were 2-sided; pairwise tests between arms used a significance level of 0.017 to adjust for multiple comparisons when comparing the intervention arms to the 50% subsidy arm. We used SPSS v15.0 (SPSS Inc, Chicago, Illinois) and SAS 9.3 (SAS institute Inc, Cary, North Carolina) to analyze the data.

#### **Results**

The sample was predominantly female (90%); mean age was 48 years, mean baseline weight was 200.6 lb, and mean BMI was 33.3 kg/m<sup>2</sup> (Table 1), and 92% of the sample had overweight or obese BMIs (ie, BMIs of at least 25).

Enrollment rates were significantly different based on the level of the subsidy offered (P < .0001; Figure 2). The 100% subsidy produced the highest enrollment rate (7.7%), which was significantly higher than each of the lower subsidy groups (vs 80% subsidy: 6.2%, P = .002; vs 50% subsidy: 3.9%, P < .0001; vs hybrid subsidy: 3.7%, P < .0001). The 80% subsidy enrollment rate of 6.2% was significantly higher than both of the lower subsidy groups (vs 50% subsidy: 3.9%, P < .0001; vs hybrid subsidy: 3.7%, P < .0001). The enrollment rates among participants in the 50% and the hybrid subsidy arms were not significantly different (P = .70). Interestingly, enrollees in the higher subsidy arms (ie, 80% subsidy and 100% subsidy) had, on average, lower baseline BMIs relative to those in the lower subsidy arms (Table 1).

Meeting attendance decreased steadily over time and declined at similar rates across arms (Figure 3). About 60%

Table	I Raseline	Characteristics	of Enrollees

Attribute	50% Subsidy $(n = 223)$	50% or 100% Subsidy (n = 215)	80% Subsidy (n = 358)	100% Subsidy (n = 444)	Entire Sample $(N = 1240)$	P Value <sup>a</sup>
% from site I	65	63	65	63	64	NA
% Female	91	89	91	89	90	NS
Mean age (SD), years	49.0 (10.2)	48.3 (10.0)	46.9 (11.1)	47.7 (10.4)	47.8 (10.5)	NS
Mean baseline weight (SD), Ib	205.2 (49.2)	205.8 (48.8)	198.9 (48.6)	197.3 (42.9)	200.6 (46.9)	.06
Mean BMI (SD), kg/m <sup>2</sup>	34.1 (7.1)	34.1 (7.1)	33.3 (7.4)	32.5 (6.7)	33.3 (7.1)	.01

Abbreviations: BMI, body mass index; NA, not available; NS, not significant; SD, standard deviation.

<sup>&</sup>lt;sup>a</sup> P values are from F test for continuous variables and  $\chi^2$  test for categorical variables.

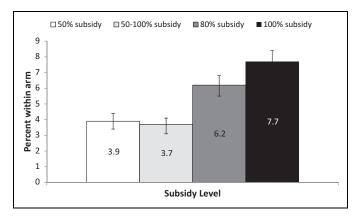


Figure 2. Enrollment rates were the highest in the 100% subsidy arm.

of participants across arms weighed in by the end of 1 month, about 20% by the end of 6 months, and about 10% by the end of 12 months. Although members on average attended about 2 meetings per month in the first few months, by month 5, this dropped to an average of about 1 meeting per month. We found no differences in e-tool utilization by arm (P = .95), with rates of utilization of about 60% per month initially dropping to about 20% by month 6 and 10% by month 12.

Mean weight loss was also similar across arms at 12 months (P=.29), with a mean weight loss of 2.7 lb (95% confidence interval [CI]: 6.4 lb loss to 1.3 lb gain) in the 100% subsidy arm; 1.5 lb (95% CI: 5.6 lb loss to 2.7 lb gain) in the 80% subsidy arm; 3.8 lb (95% CI: 7.9 lb loss to 0.4 lb gain) in the 50% subsidy arm; and 4.0 lb (95% CI: 8.1 lb loss to 0.1 lb gain) in the hybrid subsidy arm. Overall, participants weighed significantly less on average at the end of the 12-month program than they did upon enrollment (average weight loss = 2.7 lb, P < 0.07 versus 0 lb). The percentage of participants who had lost at least 5% of body weight peaked around month 4 at about 30% and was the highest in the hybrid arm, though by 12 months, this was similar across arms and was about 10% in all arms.

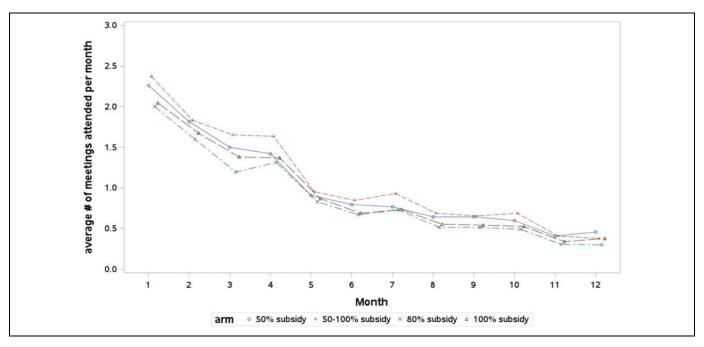
# **Discussion**

Previous research has found that inertia is a significant barrier to engaging in self-beneficial behaviors such as exercise and weight loss. 23,24 Our pragmatic trial—conducted using standard Weight Watchers recruitment materials, enrollment, and implementation procedures for the worksite—suggests that higher rates of employer subsidization are an effective way to increase enrollment in a weight management program, helping people to initiate positive change (ie, weight loss). Program enrollment rates increased with the degree of subsidy such that a 100% subsidy doubled the rate of enrollment compared to a 50% subsidy. Although the higher subsidies attracted individuals with lower BMIs, and hence, possibly reduced motivation to lose weight relative to the average person in the lower subsidy arms, program effectiveness was inconsistent with such a screening effect—weight loss at 12 months and program attendance did not differ significantly by subsidy level. This pattern of findings suggests that the subsidies served to help people to overcome the inertia they face in beginning a weight loss program.

These findings have broader implications for employer subsidization of participation in health improvement programs, suggesting that higher degrees of subsidization are effective at increasing enrollment and may not result in lower rates of performance within the program among enrollees. Employers and health plans often struggle with low rates of enrollment and ongoing participation in health improvement programs; they may want to consider subsidization as a path to increasing enrollment. Employers often subsidize gym membership, health insurance, and other activities partly as a way of increasing the attractiveness of working at a particular firm and partly to encourage certain types of activity.

Surprisingly, the 50% subsidy and the hybrid subsidy—in which enrollees were guaranteed a 50% subsidy but could earn a 100% subsidy contingent on attendance—produced equivalent enrollment rates. Beyond simple misunderstanding (ie, failing to realize that one is eligible for an extra 50% discount contingent on attendance), the behavioral economics literature suggests a couple of possible explanations for this equivalence, the first having to do with (un)awareness of bias. It is possible that people are naive, in the sense that in prospect, they have difficulty appreciating how challenging it will be for them to lose weight.<sup>25</sup> This would cause a person to underappreciate, and hence fail to be motivated by, the hybrid incentive system.

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**Figure 3.** Attendance rates drop steadily but at similar rates by arm (P = .81).

The psychology of value also provides clues to explain the observed equivalence between the 50% subsidy and the hybrid subsidy arms. <sup>26</sup> Participants in our hybrid arm paid the (halfprice) rate up front and subsequently were reimbursed if they attained the participation goal, bringing them up to the 100% subsidy. If they failed to attain the goal, they simply forewent the reimbursement (ie, gain). An alternative potentially more effective approach would have been to only charge these participants on the back end, if they failed to attain the goal, in which case failure is a loss, as participants must pay the (halfprice) monthly fee. On the other hand, the latter could backfire: fining employees for failures could cause serious backlash (and in fact, this is the primary reason why we opted against this approach). Future research could compare the effectiveness of these approaches.

In our study, discounts were framed as such—employees were aware that they were being offered the weight loss program at a subsidized rate. In the Affordable Care Act, preventive services are instead framed as free—offered "at no cost to you."<sup>27</sup> Future research might test the framing of cost sharing programs; framing them as subsidized might make them seem like a deal, which could increase usage rates. By contrast, people may devalue services that are framed as free.<sup>28</sup>

Although the relative difference in enrollment as a function of the incentive subsidy was large (uptake in the 100% subsidy arm was double that of the 50% subsidy arm), in absolute terms, it was fairly modest: 7.7% of those offered a *free* weight loss program choose to enroll. It is possible that enrollment rates were restricted by our inability to broadly market the subsidies. Since employees at the same firm were randomized to different subsidies, we could only privately inform

employees of their subsidy offer (broadly and publicly marketing the different subsidies across the firm would have seriously undermined internal validity). If the 100% subsidy were used universally, it would be possible to market it aggressively. Thus, our observed enrollment rates likely represent a conservative estimate of the incremental effect of higher subsidies on enrollment. In addition, we did not have access to e-mail addresses; this type of communication might have further helped to increase awareness of the program and allowed for further accentuation of the differences between programs.

Randomizing employees within the same firm to the different treatments is advantageous from an experimental design perspective, for it enabled us to keep possible firm effects constant. A downside of this design choice is that it raises the possibility for contamination: it is possible that employees discussed their (differing) subsidy levels with each other. However, the benefit of within-firm randomization offsets this downside; moreover, to the extent that contamination occurred, we think it is likely to have only made it more difficult for us to detect effects of the intervention. A further limitation is that attrition rates were high, limiting our ability to conduct robust imputation of missing data, as well as our ability to detect small differences in weight loss at 6- and 12- month follow-ups.

In this pragmatic, real-world experiment, we observed that employer subsidies increased enrollment in a nationally available weight management program without adversely affecting program participation or weight loss. Subsequent research should assess the cost-effectiveness of such subsidies and could test alternative ways of increasing enrollment, reducing attrition, and boosting weight loss once subsidies have been applied to get employees into the program.

#### SO WHAT?

# What is already known on this topic?

More than one-third of US adults are obese; the annual medical cost of caring for them is US\$147 billion. Previous research has found inertia to be a significant barrier to engaging in self-beneficial behaviors such as exercise and weight loss.

#### What does this article add?

Despite the prevalence and costs of obesity, participation in weight loss programs is low in employer settings. In this article, we addressed the important and previously unresolved question of the degree to which subsidization of such programs by employers affects enrollment, participation, and success rates in such programs.

# What are the implications for health promotion practice or research?

This pragmatic trial, conducted in a real-world work-place setting, suggests that higher rates of employer subsidization can help individuals to overcome the inertia they face in beginning a weight loss program. Large subsidies produced enrollment increases that were large relative to lower subsidies, though modest in absolute terms. The increased enrollment did not seem to come at the expense of program outcomes: attendance and weight loss did not differ significantly by employer subsidy level. Future research could explore the cost-effectiveness of such subsidies.

#### **Authors' Note**

Clinical trials registration # NCT01756066. Weight Watchers assisted with the design and conduct of the study, the collection of the data, and reviewed the manuscript. Management, analysis, and interpretation of the data; preparation and approval of the manuscript; and decision to submit the manuscript for publication were all controlled by the authors.

#### **Declaration of Conflicting Interests**

The author(s) declared the following potential conflicts of interest with respect to the research, authorship, and/or publication of this article: Dr Troxel serves on the Scientific Advisory Board of VAL Health. Dr Galvin is an employee of the Blackstone Group.

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