

RYAN, M., YI, D., AVENELL, A., DOUGLAS, F., AUCOTT, L., VAN TEIJLINGEN, E. and VALE, L. 2015. Gaining pounds by losing pounds: preferences for lifestyle interventions to reduce obesity. *Health economics, policy and law* [online], 10(2), pages 161-182. Available from: <https://doi.org/10.1017/S1744133114000413>

Gaining pounds by losing pounds: preferences for lifestyle interventions to reduce obesity.

RYAN, M., YI, D., AVENELL, A., DOUGLAS, F., AUCOTT, L., VAN TEIJLINGEN, E. and VALE, L.

2015

Gaining pounds by losing pounds: preferences for lifestyle interventions to reduce obesity

MANDY RYAN*

Health Economics Research Unit, Institute of Applied Health Sciences, University of Aberdeen, UK

**Correspondence to: Mandy Ryan, Health Economics Research Unit, University of Aberdeen, Institute of Applied Health Sciences, Foresterhill, Aberdeen AB25 2QN, UK. Email: m.ryan@abdn.ac.uk*

DEOKHEE YI^a

Health Economics Research Unit, Institute of Applied Health Sciences, University of Aberdeen, UK

^aPresent address: Department of Palliative Care, Policy & Rehabilitation, Cicely Saunders Institute, King's College London, Bessemer Road, London SE5 9PJ, UK.

ALISON AVENELL

Health Services Research Unit, Institute of Applied Health Sciences, University of Aberdeen, UK

FLORA DOUGLAS

Division of Applied Health Sciences, University of Aberdeen, UK

LORNA AUCOTT

Medical Statistics Team, Division of Applied Health Sciences, University of Aberdeen, UK

EDWIN VAN TEIJLINGEN^b

Department of Public Health, University of Aberdeen, UK

^bPresent address: School of Health & Social Care, Bournemouth House, Bournemouth University, Christchurch Road, Bournemouth BH1 3LH, UK.

LUKE VALE^c

Health Economics Research Unit, University of Aberdeen, UK

^cPresent address: Institute of Health & Society, Newcastle University, Baddiley-Clark Building, Richardson Road, Newcastle NE2 4AX, UK.

Abstract: While there is evidence that weight-loss interventions reduce morbidity, indications of their acceptability are limited. Understanding preferences for lifestyle interventions will help policymakers design interventions. We used a discrete choice experiment to investigate preferences for lifestyle interventions to reduce adult obesity. Attributes focused on: the components of the programme; weight change; short-term and longer-term health gains; time spent on the intervention and financial costs incurred. Data were collected through a web-based questionnaire, with 504 UK adults responding. Despite evidence that dietary interventions are the most effective way to lose weight, respondents preferred lifestyle interventions involving physical activity. While the evidence suggests that behaviour change support improves effectiveness of interventions, its value to participants was limited. A general preference to maintain current lifestyles, together with the sensitivity of take up to financial costs, suggests financial incentives could be used to help maximise uptake of healthy lifestyle interventions.

An important target group for change, men, required more compensation to take up healthier lifestyles. Those of normal weight, who will increase in weight over time if they do not change their lifestyle, required the highest compensation. Policymakers face challenges in inducing people to change their behaviour and adopt healthy lifestyles.

1. Introduction

Obesity is a global problem (World Health Organization, 2003) that is on the increase (International Obesity Task Force, 2009). If the current trend in population weight gain continues, more than half of the population in England will be obese by 2050 (Foresight, 2007). Being overweight in early- and mid-adulthood increases the risk of developing a wide range of diseases in later life (Sun *et al.*, 2009). The National Health Service (NHS) costs directly related to obesity and resulting ill health have been estimated for 2015 as £3.2 billion (Foresight, 2007). There is also evidence that reducing weight among overweight people reduces risks of developing several serious chronic diseases including diabetes and hypertension (Avenell *et al.*, 2004; Aucott *et al.*, 2005; Aucott, 2008; Aucott *et al.*, 2009). Preventive measures to slow down and reverse this trend may reduce these risks and consequent costs to society and individuals.

While there is evidence that interventions to prevent overweight and obese people gaining more weight reduce morbidity, less is known about the factors that influence compliance with such programmes. For example, we know that people register for weight-loss regimens in huge numbers and drop out of them in equally huge numbers, but not what factors determine such behaviour. We also know from observing individual behaviour that people differ in their propensity to take up and maintain healthy lifestyles. Understanding take up and compliance of lifestyle intervention programmes is necessary to design effective interventions for potential beneficiaries (Green and Tones, 2010). One interesting question then becomes why, and what interventions can be designed to encourage individuals to adopt and maintain a healthy body mass index (BMI) throughout their lifespan. This study used a discrete choice experiment (DCE) to investigate the general population's preferences for alternative lifestyle interventions to prevent and reduce obesity (Hensher *et al.*, 2005; Ryan *et al.*, 2008; de Bekker-Grob *et al.*, 2012). The DCE approach was used for a number of reasons. The methodology allows estimation of the contribution of individual attributes and levels to overall value. Such information is useful from a policy perspective, allowing targeted policies to be developed. DCEs also allow willingness to pay (WTP), a monetary measure of value, to be estimated. Output generated from a DCE can then be incorporated into a cost-benefit analysis (CBA) framework, allowing informed decisions about optimal programmes. An advantage of the DCE approach, over the more direct contingent valuation approach to generating monetary values, is that value can be generated for a number of different real or potential policy interventions that differ with respect to the levels of the attributes included in the DCE. The DCE also allows a broader measure of value than that typically picked up within the quality-adjusted life-year approach (Ryan *et al.*, 2008). DCEs also provide information on the trade-offs individuals make between attributes, that is, how much of one attribute are individuals willing to give up to have more of another. While DCEs have been widely used to address health policy questions (de Bekker-Grob *et al.*, 2012), their application to lifestyle interventions is limited (Roux *et al.*, 2004; Owen *et al.*, 2009).

2. Material and Methods

In the DCE, respondents were asked to make choices between different lifestyle intervention programmes to manage their weight. The questionnaire is available from the authors on request. Descriptions of the final set of attributes and levels are shown in the Appendix.

2.1 Defining attributes and levels

The first stage of a DCE is to define attributes and levels. This DCE was part of a larger multiphase project that aimed to identify the efficiency of alternative interventions to prevent obesity. Three prior phases informed the choice of attributes and levels: one set of semi-structured interviews. The attributes and levels are shown in Table 1.

The first systematic review identified evidence from randomised controlled trials (RCTs) on types of lifestyle interventions and their effects on weight, and longer-term health outcomes (e.g. mortality, incidence of heart disease, cancers and diabetes) (Brown *et al.*, 2009). Many RCTs do not measure longer-term outcomes; hence, a second systematic review of cohort studies was conducted to provide information about longer-term effects (Aucott, 2008; Aucott *et al.*, 2009; Aucott *et al.*, 2011). Both reviews suggested that the *content* of 'effective' lifestyle interventions commonly involved healthy eating, physical activity and behaviour change support. The reviews also provided evidence on the magnitude of weight loss and changes in the risk of specific health effects. There was insufficient evidence to establish any link between weight loss due to risk of cancer, but evidence of a link to measures of heart disease (e.g. risk of hypertension) and developing type 2 diabetes (also a risk factor for heart disease) was identified (Aucott *et al.*, 2005; Aucott, 2008; Brown *et al.*, 2009). Based on this review evidence, the risk reduction for type 2 diabetes and high blood pressure was categorised into four levels (no change; up to 20% and up to 25%, respectively; 20–40% and 25–50%, respectively; and 40–60% and 50–75%, respectively).

Semi-structured interviews were conducted throughout the United Kingdom with 34 18-to-50-year-old overweight people from diverse ethnic and socio-economic backgrounds (Douglas *et al.*, 2008; Greener *et al.*, 2010). Different recruitment methods were employed, including contacting people in public places, general practice (GP) surgeries, dietetic services and weight management groups. The interviews explored, among other things, opinions regarding effective obesity/ overweight interventions. Overweight respondents were motivated to try to lose weight. An attribute was therefore included to reflect '*Weight change after two years*'. Realistic levels, determined from the systematic reviews, and known to have beneficial effects on risk factors for disease, were: no change, lose half stone (~3.2 kg), lose one stone (~6.4 kg) and lose one and half stone (~9.5 kg). Factors influencing take up of lifestyle interventions included psychological/motivational (motivational support to help maintain lifestyle interventions), social (looking and feeling better) and material (time and money costs of participating in lifestyle interventions to maintain/reduce weight). Motivational support was included under the content of the programme. A 'short term goal' attribute was included, allowing for the benefits of looking and feeling better. '*Time per day*' was included as an attribute. This was defined in terms of the time respondents are prepared to give to the programme per day, and was defined as factors such as preparation time, travel and activity on the programme. Levels were guided by the times taken for interventions quoted in the RCTs included in the systematic review (Brown *et al.*, 2009). '*Costs per week*' of the programme was introduced as an attribute. This allowed willingness to pay (WTP), a monetary measure of value, to be estimated. Respondents were asked what they would personally be willing and able to pay for the programme they choose. They were told that this would include any travel costs as well as other direct costs of the programme. Levels for the cost attribute were derived from a direct WTP question included in pilot work. In this pilot, an example lifestyle intervention programme was presented to respondents (*Content of programme* = healthy eating and physical activity with support for management; *weight loss after two years* = one and half stone (9.6 kg); *short-term goal* = looking better and feeling better;

Table 1. Attributes and levels within the discrete choice experiment, regression labelling and coding

Attributes	Levels	Regression label	Regression coding
Categorical variables – effects coded			
Content of the programme	Healthy eating	<i>Content1</i>	β_1
	Healthy eating with support for management	<i>Content2</i>	β_2
	Physical activity	<i>Content3</i>	β_3
	Physical activity with support for management	<i>Content4</i>	β_4
	Healthy eating and physical activity	<i>Content5</i>	β_5
	Healthy eating and physical activity with support for management	<i>Content6</i>	β_6
Weight change after two years	No change	<i>Weight0</i>	β_7
	Lose half stone	<i>Weight½</i>	β_8
	Lose one stone	<i>Weight1</i>	β_9
	Lose one and half stone	<i>Weight1½</i>	β_{10}
	Look better	<i>Look better</i>	β_{11}
Short-term goal	Feel better	<i>Feel better</i>	β_{12}
	Look better and feel better	<i>Look better and Feel better</i>	β_{13}
	Reduced risk of developing type 2 diabetes ^a	No reduction	<i>DB_0</i>
	Reduction by up to 20% → Small reduction	<i>DB_S</i>	β_{15}
	Reduction by 20–40% → Moderate reduction	<i>DB_M</i>	β_{16}
	Reduction by 40–60% → Large reduction	<i>DB_L</i>	β_{17}
Reduced risk of high blood pressure ^b	No reduction	<i>HP_0</i>	β_{18}
	Reduction by up to 25% → Small reduction	<i>HP_S</i>	β_{19}
	Reduction by 25–50% → Moderate reduction	<i>HP_M</i>	β_{20}
	Reduction by 50–75% → Large reduction	<i>HP_L</i>	β_{21}
Continuous variables			
Time per day ^c	30, 60, 90, 120 min	<i>Time per day</i>	β_{22}, β_{23}
Costs per week	£1, £5, £10, £20	<i>Costs per week</i>	β_{24}

^{a,b}Levels for reduced risk of developing type 2 diabetes and high blood pressure were changed after pilots.

^cA squared term, β_{23} , was included to allow for non-linearity in preferences.

reduced risk of developing type 2 diabetes = 40–60%; reduced risk of high blood pressure = 50–75%; time per day = 30 minutes/day). This lifestyle intervention presented what, *a priori*, was thought to be best levels of an intervention, thereby providing an upper value of a lifestyle intervention. A payment card approach was used to elicit values (Donaldson *et al.*, 2012). Respondents were asked to state their maximum WTP, with a range from £0 to £50/week, based on the responses from the pilot study. Levels were also guided by what participants actually pay for UK commercial weight-loss interventions (see e.g. <http://www.lighterlife.com/how-it-works/lighterlife-explained/>; <http://www.cambridgeweightplan.com/whats-the-price?gclid=COeFkMKcvb0CFTCWtAodiFUAVA>). Those who stated they were willing to pay the maximum level on the payment card, £50, were asked to provide their maximum WTP.

This combination of attributes and levels provide useful policy information on a number of fronts. For example, how important is weight loss to the general population? How important is future risk of disease? And do people differ in how they value such attributes? How do respondents trade risk of disease for ‘poorer’ lifestyles? What is the monetary value (WTP) of different lifestyle components and programmes (potentially for application within a CBA framework)? Are individuals more likely to participate in life-style interventions that involve healthy eating or physical activity? Is support for management of programmes valued? How important is looking and feeling better (potentially important for health promotion campaigns, see e.g. Grogan *et al.*, 2011; Whitehead *et al.*, 2012)? How much time can we expect individuals to spend on lifestyle intervention programmes?

2.2 Developing the DCE questionnaire

The combinations of attributes and levels resulted in 18,432 possible lifestyle interventions [five attributes with four levels, one attribute with six levels and one attribute with three levels (Table 1); $4^5 \times 6^1 \times 3^1$]. SAS software generated a main-effects D-efficient design, minimising uncertainty around parameter estimates (by minimising the determinant of the covariance matrix) (Kuhfeld *et al.*, 2009). The experimental design generated 72 choice sets.

A ‘Current lifestyle’ option was added to each choice set. Before responding to the choices respondents were asked to provide information about their current lifestyle with respect to all the attributes and levels in the DCE. Responses were used to define the respondent’s ‘Current lifestyle’ in terms of the attributes and levels of the DCE for use in the econometric analysis (see below).

Two ‘warm-up’ choices were included to familiarise respondents with the task and two rationality tests were added (Sen’s expansion property, Sen, 1993) to test if respondents were engaged in the experiment. There is debate in health economics about what to do with ‘irrational’ responses, with some arguing that random utility theory allows for random errors and therefore those failing such tests should be included in the analysis (Lancsar and Louviere, 2006). It has also been found that responses that fail rationality tests can often be explained ‘rationally’ (San Miguel *et al.*, 2004; Ryan *et al.*, 2009). We include standard rationality tests, and compare results with and without those who failed both tests.

Following completion of the choices, respondents who always chose ‘Current lifestyle’ were asked to give reasons. Possible responses were: not overweight; satisfied with current weight; cannot afford to pay for programme and have alternative ways to maintain weight. In addition to the DCE choices, information was collected on respondent’s personal and socio-economic characteristics (age, height, weight, general health status, whether they smoke) and time to complete the questionnaire.

2.3 Pilot work and changes to questionnaire

While in applications of DCEs to health care the mean number of choices included in a DCE is 14 (with a mean of five attributes), this standard practice is not based on empirical work (de Bekker-Grob *et al.*, 2012). Pilot work was conducted with three versions of the questionnaire, differing according to number of choices: 40 (36 choices+2 rationality test+2 warm-ups) choices in two blocks, 22 (18+2+2) choices in four blocks and 12 (8+2+2) choices in nine blocks. Consideration was given to variations in rationality of responses, item response and overall response rates by questionnaire. A random sample of 446 of the UK population identified from the electoral roll was mailed the questionnaires. A stamped addressed envelope was included and 27 questionnaires were returned completed. Response rates for all three versions of the questionnaire were poor (40 choices = 5.33%; 22 choices = 5.92%; 12 choices = 6.94%). Sensitivity of the study topic (weight and obesity), lack of interest, length and format of the questionnaires, and choice of target population (general public from the electoral roll) were hypothesised to be causes of the low response.

The literature was reviewed to increase response rates (Edwards *et al.*, 2007; Mallen *et al.*, 2008). The format, layout and data collection method were all in accordance with ‘best practice’. Therefore, a new design with 24 choices was generated by allowing one violation of desirable design properties. These 24 choices were divided into three blocks, each with eight choices, two warm-ups and two rationality tests. A total of eight choices have been shown to be acceptable in DCEs, and are on the low side (de Bekker-Grob *et al.*, 2012). Two versions of the questionnaire were produced, based on the design above, varying according to the number of personal/socio-economic questions (to explore the linkage of the DCE with secondary data as a separate part to the project).

For this second pilot a further 300 questionnaires/version, 600 in total, were mailed out with a return envelope to a random sample of the UK population, again using the electoral roll. Of the 94 returned, only 33 were completed sufficiently for analysis. Some responses indicated difficulty understanding the risk of developing type 2 diabetes and high blood pressure, expressed in percentages (e.g. reduction in risk by 25–50%). This finding is consistent with the psychological literature that individuals have difficulty understanding risks, and that they often code risk data categorically that is ‘high’ or ‘low’ (de Bekker-Grob *et al.*, 2012). Hence, for the main study (see below), the levels for risk attributes were defined qualitatively: ‘no reduction’, ‘small reduction’, ‘moderate reduction’ and ‘large reduction’. Figure 1 shows an example of choice.

The introductory information given to respondents, together with the information on attributes and levels, is provided in the Appendix.

2.4 Data collection

Given the persistent poor response rate in both pilot studies a web-based online survey method was used to collect the final data set, using a market research company (<http://www.researchnow.co.uk/>). This company contacted registered individuals, by email, inviting them to complete the DCE. A financial incentive of £2 was promised for completion, credited to the respondent’s personal account. Following discussions with the company further modifications were made to the questionnaire to clarify meanings and to accommodate the online survey format. For example, respondents were given a separate icon to click for a reminder of definitions of attributes and levels in choices.

Given the DCE was concerned with obesity prevention, that weight increases with age, and that the proportion of the population becoming overweight/obese is increasing, all adults aged 18–64 and living in the United Kingdom were invited to respond. The company’s internal protocol was used to stratify by age and gender, ensuring respondents were representative of the general population (according to these characteristics). Given pregnant women would have an elevated weight and

Lifestyle	Lifestyle A	Lifestyle B
The programme	Healthy eating and physical activity	Physical activity
Weight change in 2 years	Lose half a stone	Lose a stone
Short term goals	Feeling better	Looking better
Reduction in risk of type 2 diabetes	Moderate reducing in risk	No reduction
Reduction in risk of high blood pressure	No reduction	Small reducing in risk
Time per day	90 min/day	30 min/day
Costs per week	£5/week	£20/week

Which option would you choose?

(tick one box only)

Choose Lifestyle A Choose Lifestyle B Current Lifestyle

Figure 1. Example choice set

BMI, they were screened out. The long format from the second mailed pilot, with 12 choices including two warm-up choices and two rationality tests (three versions), and a larger set of information on personal and social characteristics, was used (since from the second pilot this larger collection of data did not reduce the response rate).

Responses from 37 respondents from the online panel were initially collected and provisional analysis was conducted. Item response rate was assessed and analysis of the choice questions was conducted to ensure parameters were moving in the right direction (theoretical validity). The sample size was too small to generate WTP estimates. Following minor changes to correct language, the main survey was implemented on a new sample with quotas by the block of questionnaire, age group and gender (*The data was collected in January 2009*).

2.5 Econometric analysis

Initial analysis employed the conditional logit model. However, the independence of irrelevant alternatives (IIA) assumption was violated (Hausman test; $p < 0.001$). The mixed logit model (MXL) was then employed, but did not converge following various assumptions on distribution of parameters. Problems of convergence are common when employing MXL and often distributions are imposed on the parameters to ensure the model runs (rather than to ensure realism; i.e. parameters are assumed to have normal distributions when a negative coefficient is not predicted; de Bekker-Grob *et al.*, 2012). One possibility for the failure of our MXL model to converge was that we demanded ‘too much’ from our data. Models such as the MXL are known to be ‘sponges for data’ (personal communication with Joffre Swait). Our large number of categorical variable (five of the seven attributes), which were effects coded (see below), may have contributed to the convergence problems, as well as the relatively high number of individuals who always chose their current lifestyle. Another contributor is potential multicollinearity, though given the experimental design used to generate our set of independent variables (attributes) this is less likely to be relevant in our study.

To overcome convergence problems we used the multinomial probit model (or alternative specific probit model) within STATA 11.0 (asmprobit), allowing for a general covariance structure in error terms to address violations of IIA. Clustering around observations from the same respondents was accounted for. The equation estimated is described in the following equation:

$$\begin{aligned}
 V_{ij} = & \beta_{0j} + \beta_1 \text{Content}1_{ij} + \beta_2 \text{Content}2_{ij} + \beta_3 \text{Content}3_{ij} \\
 & + \beta_4 \text{Content}4_{ij} + \beta_5 \text{Content}5_{ij} + \beta_6 \text{Content}6_{ij} \\
 & + \beta_7 \text{Weight}0_{ij} + \beta_8 \text{Weight}1_{ij} + \beta_9 \text{Weight}2_{ij} \\
 & + \beta_{10} \text{Weight}1_{ij} + \beta_{11} \text{Look better}_{jt} \\
 & + \beta_{12} \text{Feel better}_{ij} + \beta_{13} \text{Look better and feel better}_{jt} \\
 & + \beta_{14} \text{DB } 0_{ij} + \beta_{15} \text{DB } S_{ij} + \beta_{16} \text{DB } M_{ij} \\
 & + \beta_{17} \text{DB } L_{ij} + \beta_{18} \text{HP } 0_{ij} + \beta_{19} \text{HP } S_{ij} \\
 & + \beta_{20} \text{HP } M_{ij} + \beta_{21} \text{HP } L_{ij} + \beta_{22} \text{Time per day}_{ij} \\
 & + \beta_{23} \text{Time per day}^2_{ij} + \beta_{24} \text{Cost per week}_{ij} + \varepsilon_{ij}; \quad (1)
 \end{aligned}$$

where utility from the proposed lifestyle intervention programme is represented by V , characterised by different combinations of the attribute levels (Table 1). Subscript i denotes the individual respondent and j the alternatives within a choice set. β_{0j} is the alternative specific constant (ASC), showing the general preference to continue with current lifestyle if positive (given the coding). A negative β_0 would imply a general preference to change lifestyle. ε_{ij} is the error term, assumed to be normally distributed. Effects coding was employed for ‘Content’, ‘Weight change after two years’,

Box 1. Hypothetical lifestyle interventions valued

Lifestyle 1 – involving: healthy eating; no weight change after two years; resulting in looking better; and no reduction in risks of *Type 2 diabetes* and *high blood pressure*; and spending 30 min/day on the intervention.

Lifestyle 2 – involving: healthy eating and physical activity; one and half stone (9.6 kg) weight loss after two years; looking and feeling better; moderate reduction in risks of *Type 2 diabetes* and *high blood pressure*; and spending 90 min/day on the intervention.

‘Short-term goal’ and ‘Risk reduction in diabetes/high blood pressure’. ‘Time per day’ and ‘Costs per week’ were modelled as continuous variables. It was hypothesised that while individuals may enjoy time spent on lifestyle activities, this relationship may reach a peak, at which point utility/benefit would start to fall. To represent this potential non-linearity (Time per day)² was also included.

Drawing on equation (1), WTP for a marginal change in one of the attributes of a DCE is estimated as $\frac{\beta_i}{\beta_{Costs\ per}}$. Thus, for example, from equation (1) $\frac{\beta_{10}}{\beta_2}$ indicates WTP per week for a lifestyle intervention programme that will lead to losing one and half stone (9.6 kg) after two years.¹ Similarly, $\frac{\beta_2}{\beta_2}$ indicates WTP for a lifestyle intervention that includes healthy eating with support for management. $\frac{\beta_0}{\beta_{Costs\ per}}$ indicates a preference to continue with the current situation if positive. WTP was estimated for a marginal change in all statistically significant attributes, with confidence intervals obtained from bootstrapping with 1000 replications.

Following estimation of WTP for marginal changes in individual components of a healthy lifestyle intervention, overall WTP was estimated for two illustrative lifestyle interventions (Box 1).

From a policy perspective, the question of who chooses the current situation is important – policy should be focused on those who always choose their current situation when objectively they need some sort of intervention. To model preference heterogeneity, the ASC was interacted with three socio-demographic indicators: BMI (underweight; normal; overweight and obese, as defined in Table 2), age (18–30; 31–45; 46–64) and gender. This allowed investigation of the characteristics of respondents who always chose their current situation. WTP for the defined lifestyle interventions above was estimated for these sub-groups, with confidence intervals again obtained from bootstrapping with 1000 replications.

3. Results and discussion

3.1 Respondent characteristics

Of 19,042 individuals invited to participate by email, 3642 individuals started the survey. Of these 452 were screened out by sampling rules: five were younger than

¹ Given the squared term, WTP for *Time per day* is calculated as:

$$\frac{\beta_{time} + 2 \times \beta_{time^2} \times Time\ per\ day}{\beta_{costs\ per\ week}} \quad \frac{\beta_{22} + 2 \times \beta_{23} \times Time\ per\ day}{\beta_{24}}$$

18 years, 26 were not in the United Kingdom, 12 were pregnant and 409 had missing values for the variables such as age and gender. In addition, 1962 attempted the survey after it closed (i.e. recruitment had reached its pre-specified target) and 191 and 184 were screened out because quotas for age and design block, respectively, had been met. Data on responses to choice questions were not available for 349 respondents owing to drop-out before completion. Of the individuals who dropped out before completion, 51% were male and the average age was 43. This was comparable to the final sample (52% males; average age 40). While distribution of gender was not statistically different between the two groups, drop-outs were slightly older than those who completed. The final data set comprised 504 respondents with 173, 166 and 165 in blocks 1, 2 and 3, respectively.

Table 2 presents characteristics of the 504 respondents. In all, 278 (55%) were overweight or obese, estimated by combining self-reported information on height and current weight (BMI). Given individuals are known to overestimate their height and understate their weight (Spencer *et al.*, 2002) and the change in perceptions regarding what is a normal weight (Johnson *et al.*, 2008), this may understate the number of overweight/obese respondents. In all, 131 respondents always chose their current lifestyle. There is concern in the literature that individuals choose the current situation as a way to complete the task quickly, with little information revealed about preferences. The average time to complete the survey was 16.1 minutes for those who chose *Current Lifestyle* for all choices and 16.6 minutes for 373 respondents who did not. This difference was not significantly different ($p < 0.41$), suggesting those who always chose their current lifestyle did not 'rush' through the questionnaire (any quicker than those who did not always choose their current lifestyle).

The majority of respondents were not participating in a lifestyle intervention programme (79%), and for those who were physical activity was the preferred intervention. It is also worth noting that of the 131 respondents who consistently chose their *Current lifestyle*, 69% stated they were overweight, while 61% were satisfied with their current weight. These findings points to potential challenges in getting those who are overweight or obese to participate in lifestyle interventions programmes.

3.2 Analysis of DCE data

No respondent failed both rationality tests and all response data were used to estimate equation (1). Results from the probit model are presented in Table 3.

The positive and significant constant implies a general preference for *Current lifestyle*. This suggests that, everything else being equal, respondents prefer to do what they are currently doing rather than participate in a new lifestyle intervention programme. This raises some important policy challenges. In the face of this mind set regarding preferences for the current situation, the notion that we can nudge people gently in the direction of making the health-improving changes to their lifestyle looks naive, and gives a real sense of the magnitude of the problem policymakers face. That is, policymakers are asking people to lead more austere lives to maintain a healthy weight and lose weight if overweight/obese. This may be defined as embracing the idea and practice of less benefits (e.g. pleasure and indulgence) and more disbenefits (restricting the intake of foods they enjoy eating, that tastes nice and denying themselves the bodily gratification this gives them, while doing more activities that they may find challenging). This may go some way to explaining why so many people value their current lifestyle, which is conceivably more pleasurable than the options on offer (from policy advice) that could help them to prevent obesity.

Further, current demographic data for countries such as the United Kingdom show that the prevalence of obesity increases with age up until people are in their 70s (Health and Social Care Information Centre, 2011; 2012). The preference for current lifestyles among those who are currently of normal weight suggests close observation is needed of this group since failure to change their lifestyle over time will exasperate the overweight/obesity problem.

Table 2. Characteristics of respondents

	Female		Male	
	<i>n</i>	Mean	<i>n</i>	Mean
Age	244	38.6	260	42.0
18–30	79		69	
31–45	89		75	
46–64	76		116	
Height (cm)	244	164.7	260	178.3
Weight (kg)	244	72.5	260	84.6
Body mass index (kg/m ²)	244		260	
Underweight (<18.5)	11	26.7	5	26.58
Normal (≤18.5 and < 25)	107		103	
Overweight (≤25 and < 30)	71		99	
Obese (≥30)	55		53	
General health status	244		260	
Very good (1)	38	2.3	35	2.38
Good (2)	112		122	
Fair (3)	81		81	
Bad (4)	13		19	
Very bad (5)	0		3	
Smoking	244		260	
Currently smoking	55		57	
Ex-smoker	50		77	
Never smoked	139		126	
Current lifestyle intervention	244		260	
Healthy eating	10		16	
Healthy eating with support	9		5	
Physical activity	16		18	
Physical activity with support	2		3	
Health eating and physical activity	17		11	
Health eating and physical activity with support	6		3	
Doing nothing	184		204	
Time spent per day (minutes)	60	78.4	56	56.3
Costs paid per week (£)	60	9.6	56	9.13
Those who chose current lifestyle only ^a	49		82	
Not overweight	10		31	
Satisfied with the current weight	25		55	
Cannot afford to pay for the programme	13		22	
Have alternative ways to maintain weight	18		24	

^aRespondents could choose multiple responses.

Table 3. Probit regression results of preference for lifestyle interventions

	β	SE	Willingness to pay
Constant (= 1 if <i>Current lifestyle</i>)	0.7233***	0.2691	14.40 (7.04, 21.76)
Programme			
Healthy eating	-0.1311**	0.0580	- 2.61 (-4.72, - 0.50)
Healthy eating with support for management	0.0089	0.0449	
Physical activity	-0.0060	0.0460	
Physical activity with support for management	-0.0506	0.0518	
Healthy eating and physical activity	0.0810*	0.0422	1.61 (-0.34, + 3.57)
Healthy eating and physical activity with support	0.0978**	0.0486	1.95 (+0.24, + 3.65)
Weight change after two years			
No change	-0.0245	0.0381	
Lose half a stone	0.0287	0.0259	
Lose one stone	-0.0515	0.0541	
Lose one and half stone	0.0472	0.0342	
Short-term goal			
Look better	-0.0177	0.0249	
Feel better	0.0045	0.0189	
Look better and feel better	0.0133	0.0219	
Risk reduction in diabetes			
No reduction	-0.1411***	0.0336	-2.81 (-4.31, -1.31)
Small reduction	0.0100	0.0315	
Moderate reduction	0.0420	0.0342	
Large reduction	0.0892**	0.0351	1.77(+0.30, 3.25)
Risk reduction in high blood pressure			
No reduction	-0.1764***	0.0312	-3.51 (-5.21, -1.81)
Small reduction	0.0275	0.0270	
Moderate reduction	0.0038	0.0241	
Large reduction	0.1451***	0.0425	2.89 (+0.92, + 4.86)
Time per day	0.0207**	0.0081	0.26 (+0.14, + 0.38) ^a
Time per day ²	-0.0001***	0.0001	-0.06 (-0.10, -0.02) ^a
Cost per week	-0.0502***	0.0133	
Log likelihood	-3668.4877		
Pseudo R ²	0.0084		
N of observations	12,096		
N of individuals	504		

Huber cluster heteroskedasticity errors estimated around choices from the same respondents.

^aCalculated at 30 min.

* $p < 0.10$, ** $p < 0.05$, *** $p < 0.01$.

Despite the overall preference to maintain current lifestyle, certain lifestyle interventions are more likely to be taken up.² There was a negative preference towards interventions including a healthy eating component alone, while those involving physical activity were preferred. This suggests that individuals regard increasing physical activity as the more acceptable solution for reducing weight, rather than reducing food intake. Swinburn *et al.* (2009) argued that this philosophy has been promoted by the food industry and politicians. This is despite the evidence that

² Analysis was conducted excluding respondents who always chose their current lifestyle. This changed the magnitude of the constant term (as expected since the constant term reflects the tendency to choose the current lifestyle), but the general pattern of preferences remained the same.

reducing food intake is far more likely to reduce obesity than increasing physical activity (Westerterp and Speakman, 2008; Swinburn *et al.*, 2009). It has been predicted that the amount of physical activity required by individuals to offset their food (over) consumption is unrealistic for obese individuals. For example, Speakman (2010) stated that: ‘An obese person with a body mass index of 35 could reach a more healthy weight and BMI of 22 by reducing their calorie intake by one third. That is equivalent to exercising for around five hours a day. That is not realistic’.

Support for management of weight changes provided with either healthy eating or physical activity was also of limited value. Respondents in the qualitative research self-identified as overweight or obese, and most reported considerable past weight-loss experience. Thus, this may have been more important for them than for our general population. However, from a policy perspective it should be noted that results from RCTs and systematic reviews suggest that support for management (behaviour change support) of weight change is important in terms of promoting and maintaining weight loss (Avenell *et al.*, 2004).

No preference was identified for ‘*Weight change after two years*’. This finding may reflect the fact that this is a general population survey, or that participants favour rapid weight loss rather than a gradual loss of weight. The latter interpretation is consistent with the findings of Greener *et al.* (2010). There is also emerging evidence to suggest that some obese individuals do not perceive themselves to be overweight, particularly men (Kuchler and Variyam, 2003; Miller *et al.*, 2008).

The finding that the ‘short-term goal’ attribute was not significant may reflect the fact that respondents would decide themselves about whether a defined amount of weight loss would make them look and feel better. An alternative approach would be to value such ‘internal states’ indirectly. For example, in a study on the value of ‘*knowing you have done everything possible to have a child*’ following fertility treatment, respondents were asked to state their level of agreement with statements relating to internal states. Regression techniques were then employed to relate agreement with such statements to WTP for infertility treatment (Ryan, 1998). Within the context of this study, respondents would be asked to respond to internal statements such as ‘if I lose weight I will look and feel better’, and responses could be used to explain preferences.

As expected, respondents had a negative preference for programmes with *no risk reduction* for type 2 diabetes or high blood pressure, whereas those resulting in a large reduction were preferred.

The positive significant coefficient on ‘*Time per day*’ and the negative significant coefficient on ‘*Time per day*²’ implies that respondents liked to spend some time on a lifestyle intervention programme to achieve goals (in terms of preparation, travel and activity on the programme), up to a given point, after which time utility would start to fall.³ Using the coefficients from Table 3, this can be calculated as 79 minutes.⁴ Thus, up to 79 minutes/day, utility from participation in lifestyle interventions increases, after that it falls. This gives insight into the time individuals are willing to spend on lifestyle intervention programmes.

The ‘*Costs per week*’ attribute is negative, implying lower costs are preferred. Table 3 (column 4) shows WTP per week for different components of a lifestyle intervention. The positive WTP for the ASC indicates that respondents are willing to pay £14.40/week to continue with their current lifestyle rather than take up a lifestyle intervention programme. A negative overall WTP implies respondents are worse off if the programme is implemented, and they would require compensation by that amount of money to remain on the same level of utility. For example, the negative WTP of –£2.61/week from a programme

3 We also estimated a model with time entered linearly. The coefficient had a positive sign, and there was little impact on the other parameters. Goodness of fit was improved with the addition of the squared term.

4 Calculated as:

$$\frac{-\beta_{22}}{2 \times \beta_{23}} = \frac{0.0207}{2 \times (0.0001)} \approx 78.72$$

with Healthy eating implies that everything else equal, respondents would be worse off if they moved from their current lifestyle to that new lifestyle intervention with a content of Healthy eating, and they would have to be compensated by £2.61/week, in addition to £14.40 for moving from their current situation to a new situation, to leave them on the same level of utility, that is to ensure they were no worse off (reflecting a general preference to continue doing what they are currently doing). However, respondents do value reducing the risk of diabetes and high blood pressure, and they would be willing to pay £1.61/week for a programme providing ‘*Healthy eating and physical activity*’ and £1.95/week for a programme providing *Healthy eating and physical activity with support*. Similarly with risk reduction, while respondents were willing to pay for large reductions in the risk of diabetes and high blood pressure, programmes that led to no reduction resulted in a negative WTP (i.e. they had to be compensated).

These values were used to estimate WTP for different lifestyle intervention programmes – WTP for choosing Lifestyle 1 intervention is – £23.91/week and for Lifestyle 2 –£10.73/week (Table 4). The negative value suggests compensation is required to encourage participation in lifestyle interventions, that is respondents must be compensated (or paid) £23.91/week to encourage them to participate in Lifestyle 1 and £10.73/week in Lifestyle 2. Financial compensation (or WTP) required to encourage participation varies according to the characteristics of respondents. For example, those of normal weight and men require higher levels of compensation to participate in healthy lifestyles.

These results suggest that one way of incentivising weight loss that a policy maker (with the necessary financial resources) can implement is paying individuals to participate in healthy lifestyles/adopt healthier dietary and physical activity behaviours, or reducing the cost of a healthier diet. Our results also suggest that different monetary incentives may be required for different groups within society. The use of financial incentive schemes to induce individuals to take up healthy lifestyles may be cost-effective and is clearly an important area for future research. For example, attendance at many commercial weight loss organisations in the United Kingdom costs ~ £5/week, whereas the cost of the weight-loss drug orlistat alone is £7.92/week (2010 prices), and the evidence suggests it results in comparable weight loss (National Institute for Health and Clinical Excellence, 2006). Providing free attendance at commercial slimming organisations may be a useful incentive and be cost saving for the NHS compared with alternative interventions. This study was not set-up to investigate the role of financial incentives – a price proxy was included to look at the monetary value of lifestyle interventions (in much the same way economists have looked at the monetary value of a numbers of goods and services). However, unlike most applications, negative values were generated; implying compensation is required to encourage the uptake of a service. This finding suggests that interventions to improve lifestyles may need to be coupled with incentive packages that encourage uptake and adherence (as well as possibly maintenance of initial good outcomes). Future studies could also explore the importance of financial payments within stated preference experiments, with the price proxy being defined in terms of financial payments to respondents. They may also explore the mechanism by which the incentive is given as individuals may have preferences not just about the size of the incentive but also about how it is delivered, for example, cash, vouchers, stepped payments, etc.

While the DCE produced some important findings for policymakers concerned with inducing individuals to adopt healthy lifestyle, a number of potential limitations of the DCE are recognised. The results are based on responses to hypothetical questions. The importance of validating the DCE results using subsequent monitoring and evaluation of policies has been recognised (de Bekker- Grob *et al.*, 2012). Future work should explore the external validity of DCE. Given individuals are used to paying for lifestyle interventions, this area offers a potentially fruitful area for future empirical research. The pilot work suggested respondents had difficulty understanding risk, resulting in a qualitatively described attribute. It is recognised that individuals may have attached different risk levels to the different qualitative descriptions. Future work should explore how quantitative risk data can be better described to individuals within a DCE.

Table 4. Willingness to pay (WTP) for lifestyle interventions

	Willingness to pay
Lifestyle 1 ^a	
All	-23.91 (-32.57, -15.26)
BMI (kg/m ²)	
Normal	-33.26 (-56.69, -9.82)
Overweight	-14.94 (-24.08, -5.81)
Obese	-38.37 (-68.12, -8.61)
Age	
31-45	-22.96 (-35.29, -10.63)
46-64	-18.67 (-28.72, -8.63)
Gender	
Female	-23.37 (-39.79, -6.96)
Male	-25.20 (-38.83, -11.58)
Lifestyle 2 ^b	
All	-10.73 (-19.30, -2.16)
BMI (kg/m ²)	
Normal	-28.53 (-52.00, -5.07)
Overweight	-3.52 (-10.64, 3.60)
Obese	-0.48 (-17.82, 16.86)
Age	
31-45	-6.26 (-16.08, 3.57)
46-64	-8.15 (-15.41, -0.89)
Gender	
Female	-2.26 (-13.16, 8.64)
Male	-18.45 (-33.74, -3.17)

BMI = body mass index.

The model would not converge for underweight or 18-30 age group. Confidence intervals were obtained from bootstrapping with 1000 replications.

^aInvolving: healthy eating; no weight change after two years; resulting in looking better and no reduction in risks of *Type 2 diabetes* and *high blood pressure*; and spending 30 min/day on the intervention.

^bInvolving: healthy eating and physical activity; one and half stone (9.6 kg) weight loss after two years; looking and feeling better; moderate reduction in risks of *Type 2 diabetes* and *high blood pressure*; and spending 90 min/day on the intervention.

4. Conclusion

This study applied the DCE methodology to look at preferences for lifestyle interventions regarding diet and physical activity.⁵ A key finding was that paying people to participate could increase uptake of exercise and dietary lifestyle interventions. Preferences varied according to the characteristics of respondents, suggesting different groups would require different incentives to achieve a given take up. Men required more compensation than women – within the United Kingdom this is the group with the biggest health problems, and the most pressing policy issues. Further, those of normal weight required the highest levels of compensation. While this is not surprising, given that weight increases with age, such individuals will need to make changes to their lifestyle to prevent them from becoming overweight/obese. If lifestyle changes are not made the obesity problem we are currently experiencing looks set to continue. Our finding that people prefer physical activity and diet to dietary changes alone

⁵ It is recognised that there are many real world constraints to healthy lifestyles, such as social policies that enable (or otherwise) access to employment and education and influence the day-to-day structures and processes that govern people's lives (Kawachi and Kennedy, 2006; Bird and Reiker, 2008).

and that there is limited support for behavioural support for lifestyle interventions is also important (as the evidence suggests that diet and behavioural support are effective in reducing obesity), raising questions regarding which type of policy interventions will more effectively deal with the obesity epidemics. Policymakers clearly face challenges in inducing people to change their behaviour and adopt healthy lifestyles.

Acknowledgement

We would like to thank all respondents to the discrete choice experiment (DCE) questionnaire and Tamara Brown and Joe Greener for their contribution to the stages of the project that informed the attributes and levels for the DCE. This work was conducted as part of PROGRESS (Prevent Obesity GRowing Economic Synthesis Study) which was funded by the National Preventative Research Initiative and the Universities of Aberdeen and Melbourne. The PROGRESS group consists of the following applicants: Alison Avenell, University of Aberdeen Health Services Research Unit (HSRU), Mandy Ryan, University of Aberdeen Health Economics Research Unit (HERU), Luke Value, University of Aberdeen HERU and HSRU, Lorna Aucott and Flora Douglas, University of Aberdeen, Section of Population Health, Edwin van Teijlingen, Bournemouth University, Alison Goode and Kostas Mavromaras, University of Adelaide and Matt Sutton, University of Manchester. HERU and HSRU are core funded by the Chief Scientist's Office of the Scottish Government Health and Social Care Directorates. AA was funded by a Career Scientist award from the Scottish Government Health Directorates.

References

- Aucott, J. (2008), 'Influences of weight loss on long-term diabetes outcomes', *Proceedings of the Nutrition Society*, 67: 54–59.
- Aucott, L. S., D. Gray, H. Rothnie, M. Thapa and C. Waweru (2011), 'Effects of lifestyle interventions and long-term weight loss on lipid outcomes – a systematic review', *Obesity Review*, 12(5): 412–425.
- Aucott, L. S., A. S. Poobalan, W. C. S. Smith, A. Avenell, R. Jung and J. Broom (2005), 'Effects of weight loss in overweight/obese individuals and long-term hypertension outcomes: a systematic review', *Hypertension*, 45(6): 1035–1041.
- Aucott, L. S., H. Rothnie, L. McIntyre, M. Thapa C. Waweru and D. Gray (2009), 'Long-term weight loss from lifestyle intervention benefits blood pressure? A systematic review', *Hypertension*, 54(4): 756–762.
- Avenell, A., J. Broom, T. J. Brown, A. Poobalan, L. Aucott S. C. Stearns, W. C. S. Smith, R. T. Jung, M. K. Campbell and A. M. Grant (2004), 'Systematic review of the long-term effects and economic consequences of treatments for obesity and implications for health improvement', *Health Technology Assessment*, 8(21): 1–182.
- Bird, C. E. and P. P. Reiker (2008), *National Social Policies and Constrained Choice in Gender and Health: The Effects of Constrained Choices and Social Policies*, Cambridge: Cambridge University Press.
- Brown, T., A. Avenell, E. Edmunds, H. Moore V. Whittaker, L. Avery, C. Summerbell, and the PROGRESS group (2009), 'Systematic review of long-term lifestyle interventions to prevent obesity in adults', *Obesity Review*, 10(6): 627–638.
- de Bekker-Grob, E. W., R. Ryan and K. Gerard (2012), 'Discrete choice experiments in health economics: a review of the literature', *Health Economics*, 21: 145–172.

- Donaldson, C., H. Mason and P. Shackley (2012), 'Contingent Valuation in Health Care', in A. M. Jones (ed.), *The Elgar Companion to Health Economics*, Cheltenham: Edward Elgar.
- Douglas, F., J. Greener and E. van Teijlingen (2008), "'Ask ME Why I'm Fat!' The need to engage with potential recipients of health promotion policy to prevent obesity", *Australian Economic Review*, 41(1): 72–77.
- Edwards, P. J., I. G. Roberts, M. J. Clarke, C. DiGuseppi, R. Wentz, I. Kwan, R. Cooper, L. Felix and S. Pratap (2007), 'Methods to increase response rates to postal questionnaires', *The Cochrane Database of Systematic Reviews*, 2: MR000008.
- Foresight (2007), *Tackling obesity: future choices – project report*, London: The Stationery Office, 2007. http://www.foresight.gov.uk/Obesity/obesity_final/Index.html [11 October 2014].
- Green, J. and K. Tones (2010), *Health Promotion: Planning and Strategies*, Los Angeles: Sage Publications.
- Greener, J., F. Douglas and E. van Teijlingen (2010), 'More of the same? Conflicting perspectives of obesity causation and intervention amongst overweight people, health professionals and policy makers', *Social Science and Medicine*, 70: 1042–1104.
- Grogan, S., K. Flett, D. Clark-Carter, B. Gough, R. Davey, D. Richardson and G. Rajaratnam (2011), 'Women smokers' experiences of an age-appearance anti-smoking intervention: a qualitative study', *British Journal of Health Psychology*, 16(4): 675–689.
- Health and Social Care Information Centre (2011), *Health Survey for England – 2010*<http://www.ic.nhs.uk/pubs/hse10report> [13 August 2012].
- Health and Social Care Information Centre (2012), *Health Survey for England – 2011, health, social care and lifestyles*<http://www.ic.nhs.uk/catalogue/PUB09300> [13 August 2012].
- Hensher, D. A., J. M. Rose and W. H. Greene (2005), *Applied Choice Analysis: A Primer*, Cambridge: Cambridge University Press.
- International Obesity Task Force (2009), *IOTF Prevalence Data: Global Obesity Prevalence in Adults*,<http://www.who.int/diabetes/iotf/2006/index.asp>
- Johnson, F., L. Cooke, H. Croker and J. Wardle (2008), 'Changing perceptions of weight in great Britain: comparison of two population surveys', *British Medical Journal*, 337: 270–272.
- Kawachi, I. and B. P. Kennedy (2006), *The Health of Nations: Why Inequality is Harmful to Your Health*, New York: The New Press.
- Kuchler, F. and J. N. Variyam (2003), 'Mistakes were made: misperception as a barrier to reducing overweight', *International Journal of Obesity*, 27: 856–861.
- Kuhfeld, W. F., R. D. Tobias and M. Garratt (2009), *Efficient Experimental Design with Marketing Research Applications. Marketing Research Methods in SAS – Experimental Design, Choice, Conjoint, and Graphical Techniques*, Cary, NC, USA: SAS Institute Inc., <http://support.sas.com/techsup/technote/mr2009.pdf>
- Lancsar, E. and J. Louviere (2006), 'Deleting 'irrational' responses from discrete choice experiments: a case of investigating or imposing preferences?', *Health Economics*, 15: 797–811.
- Louviere, J., D. A. Hensher and J. D. Swait (2000), *Stated Choice Methods: Analysis and Application*, Cambridge: Cambridge University Press.
- Mallen, C. D., K. M. Dunn, E. Thomas and G. Peat (2008), 'Thicker paper and larger font increased response and completeness in a postal survey', *Journal of Clinical Epidemiology*, 61(11): 1296–1300.
- Miller, E. C., M. R. Schulz, D. L. Bibeau, A. Galka, L. I. Spann, L. B. Martin, R. E. Aronson and C. M. Chase (2008), 'Factors associated with misperception of weight in the stroke belt', *Journal of General Internal Medicine*, 23(3): 323–328.
- National Institute for Health and Clinical Excellence (2006), *Obesity: The Prevention, Identification, Assessment and Management of Overweight and Obesity in Adults and Children*, London: NICE. <http://guidance.nice.org.uk/CG43/Guidance/Section>

- Owen, K., T. Pettman, M. Haas, R. Viney and G. Misan (2009), 'Individual preferences for diet and exercise programmes: changes over a lifestyle intervention and their link with outcomes', *Public Health Nutrition*, 13(2): 245–252.
- Roux, L., C. Ubach, C. Donaldson and M. Ryan (2004), 'Valuing the benefits of weight loss programs: participants' views: an application of the discrete choice experiment', *Obesity Research*, 12: 1342–1351.
- Ryan, M. (1998), 'Valuing psychological factors in the provision of assisted reproductive techniques using the economic instrument of willingness to pay', *Journal of Economic Psychology*, 19: 179–204.
- Ryan, M., K. Gerard and M. Amaya-Amaya (2008), *Using Discrete Choice Experiments to Value Health and Health Care*, Vol. 11, Dordrecht, The Netherlands: Springer.
- Ryan, M., V. Watson and V. Entwistle (2009), 'Rationalising the 'irrational': a think aloud study of discrete choice experiment responses', *Health Economics*, 18(3): 321–336.
- San Miguel, F., M. Ryan and M. Amaya-Amaya (2004), 'Irrational stated preferences: a quantitative and qualitative investigation', *Health Economics*, 14: 307–322.
- Sen, A. (1993), 'Internal consistency of choice', *Econometrica*, 61(3): 495–521.
- Speakman, R. (2010), <http://www.guardian.co.uk/society/2010/sep/15/obesity-crisis-cannot-solved-exercise> [13 August 2012].
- Spencer, E. A., P. Appleby, G. K. Davey and T. J. Key (2002), 'Validity of self-reported height and weight in 4808 EPIC–Oxford participants', *Public Health Nutrition*, 5(4): 561–565.
- Sun, Q., M. J. Townsend, O. I. Okereke, O. H. Franco, F. B. Hu and F. Grodstein (2009), 'Adiposity and weight change in mid-life in relation to healthy survival after age 70 in women: prospective cohort study', *British Medical Journal*, 339: b:3796. <http://www.bmj.com/content/339/bmj.b3796.full.pdf>
- Swinburn, B., G. Sacks and E. Ravussin (2009), 'Increased food energy supply is more than sufficient to explain the US epidemic of obesity', *The American Journal of Clinical Nutrition*, 90: 1453–1456.
- Westerterp, K. R. and J. R. Speakman (2008), 'Physical activity energy expenditure has not declined since the 1980s and matches energy expenditures of wild mammals', *International Journal of Obesity*, 32: 1256–1263.
- Whitehead, R., D. Re, D. Xiao G. Ozakinci and D. Perrett (2012), 'You are what you eat: within-subject increases in fruit and vegetable consumption confer beneficial skin-color changes', *PLoS One*, 7(3): e32988.
- World Health Organization (2003), *Obesity. Preventing and Managing the Global Epidemic. Report of a WHO Consultation on Obesity*, Geneva: World Health Organization.

Appendix: Background information provided in DCE

The average weight of people in the United Kingdom is increasing, resulting in an increase in the number of obese people. This has led to concerns concerning the effect of obesity on people's health. One reason for the increase in obesity is the way we live our lives.

In this questionnaire we are interested in your preferences for different ways you might change your lifestyle in order to prevent obesity. The choices presented below refer to lifestyle intervention programmes to reduce or prevent obesity, involving a three- to six-month intensive course and longer-term follow-up. The components of the programme are:

What the programme contains – the programme may involve advice and training on: healthy eating, physical activity and/or support for management of stressful situations.

- *Healthy eating* – nutritionally balanced (e.g. more vegetables and fruit, low fat and less intake per day) and regular meals.
- *Physical activity* – enhance energy used up by increasing daily activities (e.g. walking or cycling to work).
- *Support for management of weight changes* – how a person responds to stress is important. The intervention will teach you how to manage stressful situations and practical skills for eating a healthier diet and being more active.

Weight change after two years – the amount your weight has changed two years after you commit to the lifestyle intervention programme.

Short-term goals – as a result of participation in the lifestyle intervention programme, you may feel better and/or look better. For example, you look better because you wear smaller size clothes or because you are fitter; or you feel better because it is easier to do things or you enjoy cooking or interacting with people for sports.

Reduced chance of developing type 2 diabetes – diabetes mellitus is a condition caused by a higher than normal level of blood sugar. Diabetes can be a potential cause of medical problems such as damaged vision, kidney failure, heart diseases and so forth. Type 2 diabetes is associated with obesity and often managed by exercise and healthy diet.

Improvement in blood pressure – high blood pressure increases the risk of heart attack, heart failure and stroke. Normal blood pressure is 120 over 80 mm/Hg and it naturally increases with age.

Time per day – time spent during a day on the lifestyle intervention (e.g. preparation, travel and activity for the programme).

Costs per week – we are concerned with how much you value lifestyle intervention programmes to reduce or prevent obesity. One way of knowing this is to ask you how much you would be willing to pay for the programme. Please consider what you would be personally willing and able to pay for the programme you choose. *Remember that any money you spend on this programme will not be available to spend on other things.