

TITLE: Sampling Design and Data Collection for the NEWPATH Survey

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## ABSTRACT

The design of sampling and data collection for the NEWPATH survey, conducted in the Region of Waterloo, Ontario, are presented as a case study in design of a complex survey of health behaviors, including travel patterns, objectively- and subjectively-measured physical activity behaviors, diet-related behaviors, and health outcomes. Features of this design include stratification of the sample with respect to neighborhood walkability, household income and household size with allocation to achieve high statistical power, and carrying out sampling in phases to achieve cost efficiencies. The final data set is approximately representative of the population in terms of demographic measures, and survey weights compensate for biases introduced by oversampling of high- and low-walkability areas as well as differential non-response.

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## INTRODUCTION

The NEWPATH study is a cross-sectional survey of households in the Region of Waterloo, Ontario, that has broken new ground in collecting data on travel patterns, activity and diet simultaneously. In brief, the objectives of the NEWPATH project are the following: to establish a model to integrate dietary, transportation, physical activity, built environment, and body weight data; to evaluate the impact of dietary behavior (energy in) versus physical activity levels (energy out) in explaining obesity across a range of income, age, and walkability levels; and to use the model to inform policy development within land use and transportation planning in the Region of Waterloo.

Key questions include whether neighborhood walkability is associated with activity levels and transportation choices, and whether access to healthy food is associated with diet quality, and thus whether aspects of the built environment can predict overweight and obesity.

Thus, besides the survey itself, two important ingredients of this study are constructed measures of the environment. One is a walkability surface, in which each six-digit postal code is associated with a walkability index score which takes into account residential density, connectivity (road and pedestrian), land use mix and ratio of retail floor area (1). The other is a set of objective measures of food access, food availability, food affordability, and food quality, obtained from a census of food stores and restaurants. A variety of food environment assessment tools were applied in one of each chain restaurant, convenience store, gas station and pharmacy; every grocery store; and every independently-owned restaurant, convenience store, gas station and pharmacy in the three cities that comprise the Region of Waterloo (Kitchener, Cambridge, and Waterloo) (2), (3).

In addition to the unique combination of travel, activity and diet data, the study has two notable features in its sampling design and methodology. The first is the *stratification* of the population, and the *allocation* of the sample among strata defined by walkability and other variables, in order to ensure high statistical power to detect the hypothesized effects of walkability. The second is a process akin to that of a *responsive design* in the sense of (4), in which the progress of fieldwork was monitored for sample composition and productivity, and sampling was carried out in phases corresponding to changes in protocol designed to reduce costs and increase representativity of the sample.

The organization of this paper is as follows. The survey data collection protocols and the measures collected for households and individuals are described. Then the study population and the sampling design are specified, and the principles for the allocation of the sample to strata are justified. The next section deals with the division of the sampling design into phases, and the consequences for the computation of survey weights. The results of the sampling design are presented in terms of conditional response rates and the representativity of the sample. The final section contains discussion and conclusions.

## SURVEY DATA COLLECTION PROTOCOLS AND INSTRUMENTS

Each respondent household was assigned to one of two groups, in a manner to be described in the next section. In the first group (the Complex group) every member of the household was asked to complete a travel diary, which included food records, for two days, and one household member wore an accelerometer during the same two days. Households in the second group (the Simple group) were to complete diary information pertaining to travel only, without including food eaten, and no one was assigned to wear an accelerometer. Both types of households completed a recruitment questionnaire by telephone, and mailed attitude and behavior questionnaires which asked about

52 neighborhood preferences and food shopping patterns. The remuneration was \$25 for the  
53 Complex group households (later increased to \$30 for larger households) and \$15 for the  
54 Simple group households. Remuneration was pre-paid for the Simple group, since pre-  
55 payment generally increases response rates (5), but post-paid for the Complex group, to  
56 increase the chances of retrieving the accelerometers.

57 The telephone recruitment questionnaire contained questions pertaining to all  
58 members of the household, concerning personal information, schools, workplaces,  
59 vehicles; this was responded to by an available adult knowledgeable about the household,  
60 often the person who had answered the telephone. This informant was labeled Person #1  
61 in the household. The paper neighborhood preference questionnaire was also filled out by  
62 Person #1. The paper food shopping questionnaire was completed by the person in the  
63 household responsible for the majority of food purchases. The two-day diary, either  
64 Simple or Complex, was to be filled out for every individual aged 11 or older in the  
65 household. The two days for a household were randomly chosen from pairs of  
66 consecutive days of the week. In Complex group households, Person #1 was asked to wear  
67 the accelerometer.

68 Households were recruited by telephone. The questionnaire and diary materials were  
69 sent to recruited households by courier, with instructions for mailing them back. One  
70 reminder call was made to each recruited household just before the diaries were to be used,  
71 and follow-up calls were made after the diaries were to be used.

72 Household-level background measures include data on income, number of persons,  
73 language, ethnicity, detailed information on household vehicles, ownership or rental of  
74 dwelling, factors in the decision to move into the neighborhood, whether or not moving is  
75 being considered, aspects of neighborhood walkability, and other local characteristics.

76 Household-level measures related to food include a fruit and vegetable frequency  
77 questionnaire (adapted from the Canadian Community Health Survey, Cycle 2.2),  
78 perceptions of the neighborhood food environment (related to food access, food  
79 availability, food quality, and food affordability), frequency of different type of food outlet  
80 use (stores and restaurant) and respondents' reasons for patronizing different kinds of food  
81 outlets, and the Rapid Risk Factor Surveillance Survey (RRFSS) food security  
82 questionnaire ([www.rrfss.ca](http://www.rrfss.ca)).

83 Individual-level measures include gender and age, length of time living in Canada,  
84 possession of a driver's license, work situation and primary occupation, work or school  
85 address, educational achievement, and presence of a medical condition affecting travel  
86 habits; chronic conditions and self-perceived health were also obtained for Person #1.  
87 Data were collected on travel and physical activity (habitual and over the previous 7 days  
88 for Person #1, and over the two diary days for everyone).

89 Self-reported body mass index ( $BMI=kg/m^2$ ) and waist circumference (WC) have  
90 been considered adequate proxies for measured BMI and WC in previous studies (6). In  
91 both Simple and Complex diaries, participants were asked their height and weight, and  
92 were provided with a paper tape measure and explicit instructions to measure WC. BMI  
93 was calculated from self-reported height and weight. Participants reported two measures of  
94 WC; mean WC (cm) was used as an individual-level outcome variable. For participants  
95 who completed Complex diaries, the Healthy Eating Index adapted for Canada (HEI-C)  
96 (7) was used to define diet quality. Participants' food record data were entered into the  
97 ESHA Food Processor SQL program, which analysed micro- and macro-nutrient content  
98 of the food reportedly eaten. The Canadian Nutrient File database (2007) was linked to the  
99 micro- and macro-nutrient datafile to determine the number of servings of different food  
100 groups based on Canada's Food Guide to Healthy Eating. The HEI-C reflects Canadian  
101 food intake recommendations based on participants' age and sex, and ranges from 0 to  
102 100, where scores less than 50 represent a poor diet; scores between 50 and 80 represent a

103 diet in need of improvement, and scores above 80 represent a good quality diet (7). Mean  
 104 HEI-C over the two days was used as an individual-level indicator of dietary quality.  
 105 Finally, Complex participants also reported each time they bought food prepared away  
 106 from home for immediate or for home consumption.

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## 108 **STUDY POPULATION AND SAMPLE**

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110 The survey was undertaken to document travel, food environment, food purchasing  
 111 patterns, and dietary consumption, body weight, urban form, and demographic measures,  
 112 for an initial target of approximately 2400 households, 1400 in the Simple group and 1000  
 113 in the Complex group. In the end, budget constraints forced the reduction of the intended  
 114 Complex group sample size to 750. At the completion of fieldwork, diary data were  
 115 obtained from 2228 households: 1473 in the Simple group and 755 in the Complex group.  
 116 Accelerometer data for at least one day were obtained from 746 individuals, while 716  
 117 provided complete accelerometer and diary data.

118

119 The sample was stratified by variables known to be predictors of the outcomes and  
 120 relationships of interest, and allocated in such a way as to give high power to comparisons  
 121 across walkability levels. As was observed by Frank et al (8), P. 69, “without a  
 122 stratification strategy it would be impossible to get enough variation to allow for  
 123 sophisticated and rigorous statistical analysis of the effect of land use patterns on travel  
 124 behavior”. The design was similar to the “orthogonal” approach for neighborhood level  
 125 sampling in (9), where high- and low-walkability and high- and low-income categories  
 126 were crossed to form strata of “blockgroups” (the building blocks of “neighborhoods”).

127

128 The household population consisted of households defined to be families and one-  
 129 person units living alone or with unrelated people, in the three major cities of the Region  
 130 of Waterloo, Ontario: Cambridge, Kitchener and Waterloo. The walkability index and  
 131 surface were to be used to classify postal codes in the three cities as being of high, medium  
 132 and low walkability. The high- and low-walkability areas consisted, respectively, of postal  
 133 codes with walkability scores more than one standard deviation higher than, and more than  
 134 one standard deviation lower than, the mean of the walkability scores for postal codes. At  
 135 the time of the 2006 Census of Canada, the proportions of households in the Region of  
 136 Waterloo in the high-, medium- and low-walkability areas were 4%, 85% and 11%. The  
 137 sampling design was to oversample the high- and low-walkability areas, and within each  
 138 walkability area, to stratify proportionally according to three ranges of household income  
 (< \$35K, \$35K-\$85K, >\$85K), and three levels of household size (1 person, 2 persons,  
 3+persons).

139

140 The theory behind the allocation to high- and low- walkability areas in the  
 141 NEWPATH study is as follows. For a regression model of form  $Y = X\beta + \varepsilon$ , the least  
 142 squares estimator for  $\beta$  is

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$$143 \hat{\beta} = (X^T X)^{-1}(X^T Y),$$

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145 and the covariance matrix for  $\hat{\beta}$  is  $\sigma^2(X^T X)^{-1}$ . The greatest precision for estimation of  
 146 a component of  $\beta$  is obtained when the corresponding element of the diagonal of  
 147  $(X^T X)^{-1}$  is largest. Therefore the detection of a case where a component of  $\beta$  is non-  
 148 zero is expected to be more powerful, the greater the variability in the relevant explanatory  
 149 variables. Maximum variability subject to bounds is generally obtained when the  
 150 explanatory variable corresponding to  $\beta$  is orthogonal to the others and equally likely to  
 151 be its lowest and its highest possible value (10).

152 At the same time, for close examination of the relationships between walkability and  
 153 important outcomes, it is desirable to have representation from the medium-walkability  
 154 areas. The theory just described assumes a linear relationship between walkability and  
 155 outcome, but this linearity may not hold for all outcomes. For example, for some  
 156 outcomes there may be thresholds of walkability below which no dependence of (say)  
 157 vehicle use on walkability exists. Thus a substantial number of households in the Simple  
 158 group were eventually recruited from medium-walkability areas. This part of the  
 159 allocation also meant that, with appropriate weighting, results of the survey could be  
 160 generalized to the whole population of the cities in the Region of Waterloo.

161 Once the walkability scores for postal codes were available, the Region of Waterloo  
 162 obtained tabulations from the 2006 Census of Canada by city and income group, by  
 163 walkability level and income group, by city and household size, and by walkability level  
 164 and household size. (Three-way cross tabulations were not available.) The targets for  
 165 numbers of households were then set by walkability level and income group, and by  
 166 walkability level and household size. For the Simple group, the allocations to low-,  
 167 medium- and high-walkability areas were 400, 600 and 400 households respectively. For  
 168 the Complex group, the allocations to low- and high-walkability areas were to be equal,  
 169 with 500 households in each; these target allocations were later reduced to 375 households  
 170 in each. Within walkability areas, targets were proportional to sizes of the income group  
 171 and household size strata from the 2006 census. The low-, medium- and high- income  
 172 group target proportions were approximately 25%, 41% and 34% in each of the  
 173 walkability areas, so that the walkability and income group allocations would be  
 174 approximately orthogonal.

175 Because the targets were not available at the beginning of fieldwork, and because it  
 176 typically took two to four weeks to determine whether a recruited household would  
 177 become a completely responding household, the targets were not achievable precisely;  
 178 continual assessments of the sample composition resulted in the phased structure of the  
 179 design discussed in the next section, and survey weights were constructed to calibrate the  
 180 sample to the 2006 Census of Canada tabulations.

181 The target and achieved numbers of households are given in Tables 1 to 4.

182  
 183 **TABLE 1 Sample sizes (upper) and targets (lower) for the Simple group, by**  
 184 **walkability area and income group**  
 185

| Walkability    | Income Groups |            |             | TOTAL  | %of Target |            |        |            |
|----------------|---------------|------------|-------------|--------|------------|------------|--------|------------|
|                | <\$35K        | %of Target | \$35K-\$85K |        |            | %of Target | >\$85K | %of Target |
| <b>Low</b>     | 71            | 177.5%     | 178         | 107.9% | 235        | 120.5%     | 484    | 121.0%     |
|                | 40            |            | 165         |        | 195        |            | 400    |            |
| <b>Medium</b>  | 131           | 93.5%      | 264         | 101.5% | 214        | 107.0%     | 609    | 101.5%     |
|                | 140           |            | 260         |        | 200        |            | 600    |            |
| <b>High</b>    | 105           | 63.6%      | 174         | 108.8% | 101        | 134.7%     | 380    | 95.0%      |
|                | 165           |            | 160         |        | 75         |            | 400    |            |
| <b>OVERALL</b> | 307           | 89.0%      | 616         | 105.3% | 550        | 117.0%     | 1473   | 105.2%     |
|                | 345           |            | 585         |        | 470        |            | 1400   |            |

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**TABLE 2 Sample sizes (upper) and targets (lower) for the Simple group, by walkability area and household size**

| Walkability    | Household Size |            |          |            |           |            |       |            |
|----------------|----------------|------------|----------|------------|-----------|------------|-------|------------|
|                | 1 person       | %of Target | 2 person | %of Target | 3+ person | %of Target | TOTAL | %of Target |
| <b>Low</b>     | 58             | 145.0%     | 180      | 144.0%     | 246       | 104.7%     | 484   | 121.0%     |
|                | 40             |            | 125      |            | 235       |            | 400   |            |
| <b>Medium</b>  | 153            | 102.0%     | 207      | 103.5%     | 249       | 99.6%      | 609   | 101.5%     |
|                | 150            |            | 200      |            | 250       |            | 600   |            |
| <b>High</b>    | 148            | 72.2%      | 139      | 120.9%     | 93        | 116.3%     | 380   | 95.0%      |
|                | 205            |            | 115      |            | 80        |            | 400   |            |
| <b>OVERALL</b> | 359            | 90.9%      | 526      | 119.5%     | 588       | 104.1%     | 1473  | 105.2%     |
|                | 395            |            | 440      |            | 565       |            | 1400  |            |

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**TABLE 3 Sample sizes (upper) and targets (lower) for the Complex group, by walkability area and income group**

| Walkability    | Income Groups |            |             |            |        |            |       |            |
|----------------|---------------|------------|-------------|------------|--------|------------|-------|------------|
|                | <\$35K        | %of Target | \$35K-\$85K | %of Target | >\$85K | %of Target | TOTAL | %of Target |
| <b>Low</b>     | 54            | 108.0%     | 133         | 64.9%      | 224    | 91.4%      | 411   | 82.2%      |
|                | 50            |            | 205         |            | 245    |            | 500   |            |
| <b>High</b>    | 126           | 61.5%      | 119         | 59.5%      | 99     | 104.2%     | 344   | 68.8%      |
|                | 205           |            | 200         |            | 95     |            | 500   |            |
| <b>OVERALL</b> | 180           | 70.5%      | 252         | 62.2%      | 323    | 95.0%      | 755   | 75.5%      |
|                | 255           |            | 405         |            | 340    |            | 1000  |            |

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**TABLE 4 Sample sizes (upper) and targets (lower) for the Complex group, by walkability area and household size**

| Walkability    | Household Size |            |          |            |           |            |       |            |
|----------------|----------------|------------|----------|------------|-----------|------------|-------|------------|
|                | 1 person       | %of Target | 2 person | %of Target | 3+ person | %of Target | TOTAL | %of Target |
| <b>Low</b>     | 41             | 82.0%      | 124      | 80.0%      | 246       | 83.4%      | 411   | 82.2%      |
|                | 50             |            | 155      |            | 295       |            | 500   |            |
| <b>High</b>    | 165            | 64.7%      | 84       | 57.9%      | 95        | 95.0%      | 344   | 68.8%      |
|                | 255            |            | 145      |            | 100       |            | 500   |            |
| <b>OVERALL</b> | 206            | 67.5%      | 208      | 69.3%      | 341       | 86.3%      | 755   | 75.5%      |
|                | 305            |            | 300      |            | 395       |            | 1000  |            |

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The reduction in Complex group sample size resulted in some reduction of expected statistical power, as in the following examples. Suppose standardized measures of physical activity variables, are used as the predictors in a logistic regression of obesity, having overall prevalence of about 23%. With walkability included as a variable, and the use of weights which sum to sample size within walkability areas, assume a survey design effect of 1.3 (factor by which variances are inflated over those for a simple random sample, using the variance inflation factor described in (11)). From power calculations using simulations of the logistic regression model, a sample size of 750 individuals from different households should give 80% power to detect an effect size (increase in log odds of obesity vs 1 unit increase in a predictor) of 0.28 (odds ratio 1.32), using a two-sided hypothesis test of size 5%. The corresponding effect size for 1000 individuals is 0.24. A sample size of 2228 individuals from different households would give 80% power to detect an effect size of 0.165 (odds ratio 1.18), using a two-sided test of size 5%. The corresponding effect size for 2400 individuals is 0.155.

The achieved allocation of the sample to high- and low-walkability areas is close to equal: it includes 895 households in the low-walkability areas and 724 households in the high-walkability areas. Assuming an average of 1.7 respondents per household, this division yields 80% power to detect a difference of 5.8 percentage points in the overweight/obesity rates of the two groups, with a two-sided hypothesis test of size 5%, and assuming a survey design effect of 1.5. If the sample had allocated in proportion to the numbers of households in the walkability areas, the numbers of households would have been about 90 for high walkability and 245 for low walkability, and the power to detect such a difference would have been about 22%.

**243           RESPONSIVE DESIGN OF THE SURVEY**

244

245           Complex household surveys are planned using assumptions of response rates and  
246           respondent effort which may not be realized in practice. Often, preliminary costing of the  
247           fieldwork is required before the instruments are fully developed, or before the sampling  
248           frames are available. Once fieldwork is underway, it is necessary to monitor the progress  
249           of fieldwork carefully, keeping track not only of sample sizes in categories (for  
250           households and for individuals) but also of productivity of field staff, and costs being  
251           incurred. At certain points, the frames, the targets, and sometimes the protocols, may  
252           need to be adjusted. These decisions divide the survey fieldwork into phases (Groves and  
253           Heeringa, 2006), which must later be taken into account in estimation, principally through  
254           calculation of the weights.

255

256           In the NEWPATH study, it was initially expected that data collection would occur in  
257           a spring wave and a fall wave, but the complexity of the data collection and the time  
258           required to develop the walkability surface meant that the time period had to be extended  
259           significantly. Difficulty in recruiting in certain categories resulted in the adjustment of  
260           targets in the last part of the time period. Thus the NEWPATH study had six phases in  
261           all.

261

262           Data collection began in the Spring of 2009, and was suspended for the summer  
263           months. Through the periods of May 14 – June 16, 2009 and August 28 – November 27,  
264           2009, recruitment for the Simple form and the Complex form of the survey was carried on  
265           using a randomly ordered telephone sampling frame (listed numbers with postal codes).  
266           Complex group recruitment was also carried out from February 23 – April 11, 2010.  
267           Finally, a UW student sample was added using the University's student email address  
268           frame, to address an under-representation of the student-age population. The student  
269           group was recruited from March to May, 2010.

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270           The six phases may be termed Spring 2009 Simple, Spring 2009 Complex, Fall 2009  
271           Simple, Fall 2009 Complex, Winter-Spring 2010 Complex General, and Winter-Spring  
272           2010 Complex Student.

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273           In the Spring 2009 Simple phase, sampling began before final targets were set for the  
274           quota cells, since determination of the walkability areas and calculations with census data  
275           to determine the characteristics of their populations were ongoing. Accordingly,  
276           households were recruited effectively randomly for the Simple version of the  
277           questionnaire and diary package.

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278           Recruitment for the Spring 2009 Complex phase was intermittent, being subject to the  
279           availability of accelerometers. Only 30 devices were available during the short  
280           recruitment period before the middle of June.

280

281           By the beginning of the Fall 2009 Simple phase, the boundaries of the walkability  
282           areas had been delineated, and it became apparent that more of the remaining households  
283           for the Simple questionnaire package would have to be recruited from the medium-  
284           walkability areas. Where it appeared that quota cells were becoming full, those quotas  
285           were closed to recruitment.

285

286           In the Fall 2009 Complex phase, households were recruited randomly from high-  
287           and low-walkability areas. A serious shortfall in the numbers of larger households in low-  
288           walkability areas meant that the Winter-Spring 2010 Complex General phase focused on  
289           this group, and the compensation was increased for larger households.

289

290           Under-representation of the high-walkability area student-age population in Waterloo  
291           led to the introduction of the Winter-Spring 2010 Complex Student phase, in which  
292           students were selected randomly from the University of Waterloo frame of student email  
293           addresses, and recruited by email. A total of 34,601 students were invited. To be eligible,  
294           they had to be living alone or with unrelated roommates, in a high-walkability area. (To

294 assess whether they would have been contactable through the telephone frame, they were  
 295 asked where they lived in each phase of the recruitment, and whether the dwelling was  
 296 cell-only, or had a landline connection.) In all, 79 students completed the survey.

297 Survey weights were constructed for participating households and for individuals.  
 298 They include “inflation weights”, which are the reciprocals of inclusion probabilities,  
 299 calibrated to sum to totals in geographic and age-gender categories cities in the Region of  
 300 Waterloo from the 2006 Census of Canada.

301 Since the design deliberately under-sampled medium-walkability areas, the inflation  
 302 weights in those areas are much larger than in the areas of low and high walkability. In  
 303 regression analyses, if the inflation weights were used, the sample points in the medium-  
 304 walkability areas would dominate, making inference very inefficient. For regression and  
 305 logistic regression analyses in which walkability is an explanatory variable, so-called  
 306 “analytic weights” were also constructed, to sum to sample size within walkability area.

307 There are separate inflation and analytic weights for each of the instruments in the  
 308 used in the survey. For example, there are household recruitment weights (inflation and  
 309 analytic), individual travel diary weights, and so on. Details of their construction and  
 310 advice on their uses are provided in the technical report of the study, available on request.  
 311 The basis for the calculation of weights, taking into account the phase structure, is here  
 312 illustrated for the household recruitment inflation weights.

313 The recruitment probability of inclusion of a household from the telephone frame is  
 314 the probability of its being recruited in one of the first five phases. Suppose first that in  
 315 each phase the probability of a household being recruited is approximately uniform in  
 316 household size crossed with walkability area. Thus for phase  $p$  an approximation to the  
 317 household inclusion probability is  $n_{psw}/N_{psw}$ , where  $n_{psw}$  is the number of households  
 318 in which people were recruited in phase  $p$  with household size  $s$  in walkability area  $w$ ,  
 319 and  $N_{psw}$  is the number of households with household size  $s$  in walkability area  $w$ .

320 For households of 2 persons or 3+ persons, the  $N_{psw}$  were taken from 2006 census  
 321 data for each phase. For households of 1 person (including single persons in shared  
 322 accommodation with unrelated others), the  $N_{psw}$  were estimated from census data  
 323 supplemented by information on student enrolment in the universities, which varies  
 324 considerably from university term to term. (Thus inclusion probabilities for households of  
 325 1 person were taken to be different in Fall, Winter and Spring.) For a household consisting  
 326 of a single person in shared accommodation with unrelated others,  $n_{psw}/N_{psw}$  should be  
 327 further divided by the number of unrelated people in the shared accommodation, assuming  
 328 them all equally likely to participate. However, this was not possible since by the number  
 329 of unrelated people in the shared accommodation was not collected. These quantities  
 330  $n_{psw}/N_{psw}$  were summed over the first five phases to obtain an overall household  
 331 inclusion probability.

332 The probability of inclusion of a student recruited in the Winter-Spring 2010  
 333 Complex Student phase was assumed to be the same as the probability for a household of 1  
 334 person plus  $n_{61w}/N_{61w}$ , where  $n_{61w}$  is the number of students in the sample in  
 335 walkability area  $w$  and  $N_{61w}$  is the estimated number of eligible students in the population  
 336 in walkability area  $w$ .

337 Basic inflation weights were taken to be the reciprocals of these inclusion probabilities.  
 338 However, their calculation ignored the fact that there were targets specified for walkability  
 339 area crossed with income group (low, medium, high). It also ignored differential  
 340 recruitment rates by city. (Recruiting in Cambridge proved to be more difficult than in  
 341 Waterloo and Kitchener.) To correct the weights to take these facts into account, the  
 342 weights were calibrated to sum to assumed totals (from census data) of households within

343 each city crossed with household size, assumed totals of walkability area crossed with  
 344 income group, and assumed totals of walkability area crossed with household size.

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### SAMPLE CHARACTERISTICS

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**TABLE 5 Population numbers and percentages from the 2006 Census of Canada, and [unweighted percentages] from the NEWPATH study**

| <b>Age group</b> | <b>Male</b> |      |        | <b>Female</b> |      |         |
|------------------|-------------|------|--------|---------------|------|---------|
| 11-17            | 21489       | 5.5% | [6.0%] | 20533         | 5.3% | [5.4%]  |
| 18-24            | 23730       | 6.1% | [3.9%] | 22979         | 5.9% | [5.0%]  |
| 25-34            | 31865       | 8.2% | [6.7%] | 31880         | 8.2% | [7.6%]  |
| 35-44            | 35815       | 9.2% | [8.8%] | 36270         | 9.3% | [9.4%]  |
| 45-54            | 32515       | 8.4% | [8.8%] | 33435         | 8.6% | [10.5%] |
| 55-64            | 22105       | 5.7% | [7.6%] | 23105         | 6.0% | [8.2%]  |
| 65+              | 22365       | 5.8% | [5.5%] | 29900         | 7.7% | [6.7%]  |

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### DISCUSSION AND CONCLUSIONS

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This paper has described a case study in complex household data collection with emphasis on two features of the sampling design and their implications.

The first feature was a considerable oversampling of households in high- and low-walkability areas, with enough sampling of households in medium-walkability areas to produce general population estimates. The oversampling in high- and low-walkability

385 areas allows for more powerful statistical analyses of differences in outcomes at extremes  
386 of walkability, controlling for important confounders related to socioeconomic status and  
387 household composition. The oversampling also renders the “inflation weights” (needed  
388 for estimation of descriptive attributes of the general population) very highly variable.  
389 For regression and logistic regression analyses, “analytic weights” which are rescaled to  
390 sum to walkability level sample sizes are required, and with the use of these weights  
391 walkability level must always be included in the regression model.

392 The second feature was the conduct of the survey in phases, defined in effect by the  
393 two types of task (simple and complex), the timing of availability of walkability data and  
394 targets, the length of time required to recruit, the need to adjust effort and compensation to  
395 reach larger households in the last few months of the survey, and the decision to recruit a  
396 separate sample of students. As indicated in the section on Responsive Design, it is still  
397 possible under such circumstances to calculate basic and calibrated weights to support a  
398 wide variety of analyses.

399 As originally envisaged, the survey would have taken place over two periods, one in  
400 the spring and one in the fall, avoiding the “atypical” summer months, and the harsh  
401 conditions of winter. Ultimately, there were effectively three periods, with Simple group  
402 surveys being carried out approximately half in Spring 2009 and half in Fall 2009, and  
403 Complex group surveys being carried out approximately two-thirds in Spring and Fall  
404 2009 and one third in late Winter and early Spring of 2010. Fortunately, the period in the  
405 Winter of 2010 was relatively mild, with very little snow, and March of 2010 was warmer  
406 than average.

407 This paper provides a concrete example of theoretical bases for designing studies  
408 on the built environment. Built environment research is becoming more popular, as urban  
409 planners and public health practitioners are increasingly interested in creating livable and  
410 healthy communities, with ample opportunities for physical activity and healthy eating.  
411 This kind of research is important because the built environment can be modified, or  
412 designed to incorporate improvements. Studies like the NEWPATH survey can provide an  
413 evidence base for planning healthy livable communities.

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#### 419 420 **REFERENCES**

- 421  
422 1. Fisher, P., R. Waheed, L. Frank and J. van Loon. Construction of the walkability index  
423 for the Region of Waterloo. In progress.
- 424 2. Minaker, L., K. Raine, C. Wild and C. Nykiforuk. Neighborhood food environments:  
425 objective features predict perceptions and diet-related health outcomes. Submitted to  
426 *Health & Place*.
- 427 3. Minaker, L., K. Raine, T. C. Wild, C. Nykiforuk and M. Thompson. Construct validation  
428 of four food environment assessment methods: adapting a multitrait-multimethod matrix  
429 approach for environmental measures. Submitted to *American Journal of Preventive*  
430 *Medicine*.
- 431 4. Groves, R. M. and S. G. Heeringa. Responsive design for household surveys: tools for  
432 actively controlling survey errors and costs. *Journal of the Royal Statistical Society,*  
433 *Series A*, Vol. 160, 2006, pp. 439-457.
- 434 5. Singer, E., J. Van Hoewyk and M. P. Maher. Experiments with incentives in telephone  
435 surveys. *Public Opinion Quarterly*, Vol. 64, 2000, pp. 171-188.

- 436 6. Dekkers, J. C., M. F. van Wier, I. J. M. Hendriksen, J. W. R. Twisk and W. van Mechelen.  
437 Accuracy of self-reported body weight, height and waist circumference in a Dutch  
438 overweight working population. *BMC Medical Research Methodology*, Vol. 8, 2008, p. 13.  
439 7. Garriguet, D. *Diet Quality in Canada*. Statistics Canada, Ottawa, 2009.
- 440 8. Frank, L. D. et al. *Survey Process Summary*, Excerpted from “SMARTRAQ: Integrating  
441 travel behavior and urban form data to address transportation and air quality problems in  
442 Atlanta”, report to the Georgia Department of Transportation and the State of Georgia,  
443 2004.
- 444 9. Frank, L. D., J. F. Sallis, B. E. Saelens, L. Leary, K. Cain, T. L. Conway and P. M. Hess.  
445 The development of a walkability index: application to the neighborhood quality of life  
446 study. *British Journal of Sports Medicine*, Vol. 44, 2009, Pp. 924-933.
- 447 10. Box, G. E. P., W. G. Hunter and J. S. Hunter. *Statistics for Experimenters*. Wiley, 1978.
- 448 11. Kalton, G. and I. Flores-Cervantes. Weighting methods. *Journal of Official Statistics*,  
449 Vol. 19, Pp. 81-97.
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