Assessing longitudinal and cross-sectional effects of age on adult obesity in an Iranian population: results from a large population-based cohort study

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Abstract

Background
Obesity is a significant risk factor for Noncommunicable diseases, and it is related to many adverse health consequences. The risk of obesity commonly changes with age, which is called a longitudinal or aging effect. Also, individuals born or enter to the study of the same age have similar living conditions that may influence their obesity risk in a particular way; this is a cross-sectional effect. In the current study, an advanced statistical model is used to distinguish between longitudinal and cross-sectional effects of age on the risk of obesity for men and women.

Methods
Participants are a group of 6504 Iranian adults over 35 years of age in 2001, who live in the central region of Iran. They were followed up for 12 years in a large community-based study. Various medical indexes, including Body Mass Index, were collected in 2001, 2007, and 2013. The Marginal Logistic Regression model, which includes linear and quadratic effects of the Baseline Age and its difference with current age, is used.

Results
Between 2001 and 2013, the prevalence of obesity raised from 13% to 18% in men and from 31% to 44% in women. The odds of obesity for women was approximately three times the odds of obesity for men on average adjusting for the age effects. Both cross-sectional and longitudinal effects of age were significantly associated with the odds ratio of obesity. There was a rise in the prevalence of obesity for individuals with Baseline Age 35 to 55 and a decline thereafter. Also, the odds ratio of obesity across one’s life course, had about 3% increase, on average, by each year aging, regardless of the age at baseline.

Conclusions
The high rate of obesity and its fast growth is a serious public health issue among Iranians, especially in adults age 35-55, and women. In the present study, Baseline Age was more strongly associated with the risk of obesity than aging. Considering both cross-sectional and longitudinal effects of age, helps us to understand the effect of age on obesity better and to identify the related factors.

Key Words: Obesity, Adult, Age, Longitudinal, Cross-sectional, Prevalence

Background

Noncommunicable Diseases (NCDs) account for more than 70% of early deaths all over the world(1, 2). Obesity, as a significant risk factor for NCDs, has an association with life expectancy reduction (3), and it raises the risk of metabolic diseases to a considerable extend(1). Also, obesity is associated with several adverse health consequences, and it is tied to an increased risk of conditions. Furthermore, obesity leads to a reduction in the quality of life, lack of employment, lower productivity, and inadequate social points. The World Obesity Federation and other organizations have defined obesity not only as a risk factor for several diseases but also as a chronic progressive disease (3). Obesity is defined as excessive fat accumulation that might have a negative effect on health by the World Health Organization (WHO) and is identified as Body Mass Index (BMI) over or equal to 30 kg/m² (4, 5). Obesity has an association with age, gender, household income, urbanization, and lifestyle (6). It is a chronic and complex disease determined by lifestyle behaviors associated with positive energy balance, such as an inappropriate diet and a sedentary lifestyle(7, 8).
The prevalence of obesity has risen all over the world to pandemic proportions during the last 50 years (9, 10). Obesity and BMI prevalence vary across different countries according to the steepness of increases, slowing-down, and acceleration periods (11). The global prevalence of obesity almost tripled since 1975 and continues to grow in low- and middle- income countries, although it can be considered as a problem for high-income countries(10, 12, 13). A systematic review by Rahmani et al. (2015), reported the prevalence of obesity in Iran has increased between 1995 and 2010 (14). Also, Azizi et al. (2005) indicated that the prevalence of obesity was most rapidly rising in the 30 to 40-year-old group in both men and women in Tehran(15). Furthermore, in a study by Sarrafzadegan et al. on ICS (Isfahan Cohort Study) data (2001-2007), it was reported that younger individuals gained weight more than older ones(16). In a systematic review in Iran, increased age, urbanization, low educational levels, the female gender, and being married, were indicated as some variables that are associated with inequality in obesity (17).

Due to biological and sociocultural differences, obesity distribution patterns differ by gender and age (18). The risks of many chronic diseases commonly increase with age, which is called aging or longitudinal effect. Also, people born or enter the study of the same age have similar living conditions that may affect their disease risk in a particular way; this is a cohort or cross-sectional effect (19). Therefore, decomposition of cohort and aging effects could provide some valuable information. The changes in the risk of obesity were assessed using longitudinal and cross-sectional effects of age, in some studies (20-22). In many research, separation of these two effects of age on obesity is of interest. Estimates of the effect of age from cross-sectional analyses may confound Cohort effects on obesity. Longitudinal assessment is needed to determine the aging effect. In contrast with cross-sectional studies, a longitudinal study is defined as a study in which individuals are measured repeatedly through time. Longitudinal
studies help us to distinguish changes over time within individuals (longitudinal effect) from differences among people in their baseline levels (cross-sectional effect) (23, 24).

A limited number of longitudinal analyses of the prevalence of obesity in population-based samples were done to separate aging and cohort effects and allow simultaneous assessment of aging-related changes and secular trends. In the current study, a longitudinal approach is used to distinguish between cross-sectional and longitudinal effects of age. This study is a large community-based study in a group of 6504 Iranian adults over 35 years of age who live in the central region of Iran. Based on BMI, repeated measurements of obesity were obtained in 2001, 2007, and 2013. A Marginal Logistic Regression (MLR) model was used: 1-To determine whether the prevalence of obesity changes with age in the target population and whether the patterns of change in obesity are the same for women and men. 2-To assess the cross-sectional and longitudinal effects of age. The current study is the first study in Iran that measures the longitudinal and cross-sectional effects of age on obesity, using an advanced statistical modeling approach for longitudinal measurements, the MLR model. This study is benefiting from a population-based cohort study with 12 years of follow-up and is performed among the Iranian adult population. Investigation of prevalence and trend of obesity in a population-based study provides opportunities to target subpopulations who need more care and attention in public health interventions.

Methods
Study population
Isfahan Cohort Study is a longitudinal ongoing population-based study, including 6504 adults aged over or equal to 35-year-old at the first measurement occasion, from three provenances in the central area of Iran (Isfahan, Arak, and Najafabad), living in urban or rural areas. The participants had been involved in the first survey of the Isfahan Healthy Heart Program (IHHP),
a community trial for prevention and control of Cardiovascular Diseases (CVDs) (25, 26).

These three cities were selected due to their population consistency and a smaller number of migrants in comparison with the capital and other cities in Iran. Also, Isfahan is the third-largest city in Iran. The multistage random cluster sampling method was used for sampling these provinces, which represent their society's distribution of age, genders, and residential area (urban/rural). Ethical permission was issued by the Ethics Committee of Isfahan Cardiovascular Research Center. Questionnaires and anthropometric information were collected after obtaining informed written consent in 2001, 2007, and 2013 (25). The number of individuals in the first measurement occasion was 6504, and then during the follow-up, the number decreased to 3284 and 1735 at the second and third phases, respectively. Details of the study design and ICS challenges, which led to a decrease in sample size, were described in previous papers (25-27).

Variables under study

Measurement of height was conducted using a secured metal ruler in barefoot and, weight was measured in light clothing using a calibrated scale (26). BMI was defined as the weight (Kg) divided by height squared (m²) (5). A BMI over or equal to 30 indicates obesity, according to the World Health Organization definition (12). Also, waist circumference (WC) (cm) was measured horizontally. It is defined as the smallest circumference below the lowest ribs (26).

In our study, although baseline measurements for all individuals were recorded at the same calendar time, age of individuals varied at the entry to the survey. Accordingly, the variations in the prevalence of obesity with age have two potential sources of information. First, the cross-sectional (or between-subject) information is about how obesity changes with age in the baseline observations obtained in 2001. Second, since individuals were measured repeatedly through the study time, the longitudinal (or within-subject) information raised. “Baseline Age” was defined as the individual age (year) at baseline and is used to assess the cross-sectional
effect of age. “Age - Baseline Age” was defined as the years passed since baseline and is used to assess the longitudinal effect of age.

Statistical analysis

The characteristics of the participants at the three measurement occasions (2001, 2007, and 2013) are presented as a percentage or mean and standard deviation (SD) when appropriate. Considering the outcome as a binary variable (obese or not obese), Marginal Logistic Regression Model was used (equation (1)). The parameters in the model were estimated using Generalized Estimating Equations (GEE) method.

\[
\log_e \left( \frac{P(Y_{ij})=1}{P(Y_{ij})=0} \right) = \beta_0 + \beta_1 X_{ij1} + \cdots + \beta_p X_{ijp}.
\]  

In equation (1), \(Y_{ij}\) denotes the binary response variable for the \(i^{th}\) individual on the \(j^{th}\) occasion. Also, \(X_{ij}\) denotes a \(p \times 1\) vector of covariates, associated with the response at each occasion, for each individual. In our study, the main effects include Baseline Age, Age - Baseline Age, and Gender. This model considers separate parameters for the longitudinal and cross-sectional effects of age on the binary response and provides an estimation of both effects of age, simultaneously (28). The hypothesis of the equality of the longitudinal and cross-sectional effect of age was examined, using the multivariate Wald test for contrasts. SPSS 19 and SAS 9.4, PROC GENMOD were used for the analysis, and the significance level was considered as 0.05.

Results
The study population was approximately balanced according to sex (51.3 percent women and 48.7 percent men). The characteristics of the individuals who participated in this study are represented in table 1 by gender and measurement time (2001, 2007 and 2013).

### Table 1

In this study, most of the participants had less than 12 years of education (93.9% in 2001, 91.7 in 2007, and 88.7 in 2013) and were married (90.6 in 2001, 89.1 in 2007, and 86.3 in 2013). The average age of participants was 50.2 in 2001, 56.1 in 2007, and 60.3 in 2013.

For both men and women, the average BMI and WC were increased over 12 years (2001 – 2013). Also, women had an average BMI and WC more than men in all three phases. The prevalence of general obesity was calculated in men and women in 2001, 2007, and 2013. According to table 1, the percentages of women classified as obese were 31 in 2001, 39 in 2007, and 44 in 2013, which is more than double the percentages of obese men (13 in 2001, 15 in 2007, and 18 in 2013). In other words, between 2001 and 2013, the prevalence of obesity raised from 13% to 18% in men and from 31% to 44% in women. In the total population, the prevalence of obesity raised from 22% in 2001 to 31% in 2013.

The percentages of individuals indicated as obese at each of the three measurement occasions for the Baseline Age groups of 35–44, 45–54, 55–64, and ≥65 years in men and women and longitudinal changes in the prevalence of obesity over the follow-up period, are displayed in table 2. These percentages were reported based on the available data at each occasion in each age-gender group.

### Table 2

In table 2, the rates of obesity for women are higher in all ages and on all three occasions. Also, we can identify the cross-sectional effect of age, by considering obesity prevalence in each year of measurement and compare it over different Baseline Age groups.
The associations between Baseline Age and prevalence of obesity in each occasion by gender are shown in Figure 1 in an additional file [see Additional file 1]. Growth in the prevalence of obesity from 35 to 55 Baseline Age groups can be identified, followed by a decrease for higher Baseline Age in all three phases and both genders, except for females in 2013, which had a peak in obesity prevalence in 55-65 Baseline Age groups. In other words, there is approximately an elevated probability for obesity for people in 35-55 Baseline Age groups, followed by a modest decrease in probability for people who were in the older age group (≥55).

Also, to identify the longitudinal effect of age, we can consider each Baseline Age group separately and compare the prevalence of obesity in different measurement times. The associations between aging and the probability of obesity by Baseline Age groups are shown in Figure 2 in an additional file [see Additional file 2]. It shows obesity prevalence for the same people over time. Obesity prevalence for each group raised with time through the study except for Baseline Age ≥65 in both men and women that means obesity prevalence increased with aging for individuals in Baseline Age groups 35-65. For women in higher than 65 Baseline Age groups, there is a moderate decrease after six years, and then the probability of obesity tending to be almost constant by aging. Also, for men in Baseline Age groups ≥65, there was a decrease after six years and then a moderate increase after twelve years.

According to the rates of obesity in table 2 and Figure 1 which show the curvilinear effect of age on the rate of obesity and higher rates of obesity for women of all ages, an MLR model including gender, linear and quadratic age, and the gender by age interactions was fitted (equation (2)). Individuals were classified as obese \( (Y_{ij} = 1) \) or not obese \( (Y_{ij} = 0) \).

\[
\log\left\{\frac{P(Y_{ij} = 1)}{P(Y_{ij} = 0)}\right\} = \beta_0 + \beta_1 \text{Gender}_i + \beta_2 \text{Age}_{ij} + \beta_3 \text{Age}_{ij}^2 + \beta_4 \text{Gender}_i \times \text{Age}_{ij} + \beta_5 \text{Gender}_i \times \text{Age}_{ij}^2.
\]  
(2)
In this model, the gender by age interactions was not significant (P-value=0.45 and 0.35 for
gender by age and gender by age squared respectively and the multivariate Wald test, \( H_0: \beta_4 = \beta_5 = 0 \) Chi-Square=2.75, DF=2, P-value=0.25), so the interaction terms were omitted from
the model. It shows there is no significant difference in changes (trend) of log OR of obesity
between men and women. The results are presented in an additional file [see Additional file 3
Table 1]. Also, the significant coefficients of age and age squared showed that the log OR of
obesity changes with age curvilinearly (P-value<0.0001). Next, to assess the longitudinal and
cross-sectional effects of age on log OR of obesity, another MLR model including linear and
quadratic effects of the Baseline Age and Age - Baseline Age (\( Age_{i1} \) and \( Age_{ij} - Age_{i1} \),
respectively), was fitted. According to descriptive statistics and the coefficient in the model,
the quadratic effect of Age - Baseline Age had a little and negligible effect on the prevalence of
obesity (\( \beta = -0.0006 \) and \( \exp(\beta)=0.999 \)). Therefore, to simplify the model, we preferred to
omit this effect also, and the model in equation (3) was considered.

\[
\log_e \left( \frac{P(Y_{ij})=1}{P(Y_{ij})=0} \right) = \beta_0 + \beta_1 Gender_i + \beta_2 Age_{i1} + \beta_3 Age_{i1}^2 + \beta_4 \left( Age_{ij} - Age_{i1} \right) . \tag{3}
\]

In equation (3), the linear combination of \( \beta_2 \) and \( \beta_3 \) indicates the cross-sectional effect of age.
They describe how the log odds ratio (OR) of obesity changes with age at baseline. On the
other hand, \( \beta_4 \) indicates the longitudinal effect of age because it represents how within-subject
differences in the log OR of obesity are associated with within-subject changes in age \( (23, 29) \).
Then, using the multivariate Wald test for contrasts, the hypothesis of equality of cross-
sectional and longitudinal effects was examined. The hypothesis is equivalent to equality of
the coefficients of (Baseline Age) with (Age- Baseline Age) or \( H_0: \beta_2 = \beta_4 \) in equation (3).
The Wald test was significant (Chi-Square=12.63, DF=1, P-value<0.0004), which means the longitudinal effect is not equal to the cross-sectional effect of age and it shows the effect of aging on the odds of obesity.

Table 3

In Table 3, Alpha1, Alpha2, and Alpha3 are pairwise log OR among measurement occasions. The pairwise log OR between adjoining occasions are almost 2.9 and 3.5, which indicate that the OR for the within-subject association is about 18 and 33, respectively (or $e^{2.9}$ and $e^{3.5}$). Therefore, there is a severe positive association among the indicators of obesity status at all measurement occasions.

The significance coefficient of sex shows that log OR of obesity is different between women and men. By controlling the age effects (longitudinal and cross-sectional effects), odds of being obese for women is approximately $\exp(1.15) = 3.17$ times the odds of being obese for men on average (Gender=1 was considered for men in the dataset and reference group in the model). Hence, women are more likely to be obese (almost three times) than men.

For cross-sectional and longitudinal effects of age, the results of the model are compatible with the results of descriptive statistics. According to Table 3, the linear combination of the significant coefficients for Baseline Age and Baseline Age squared in the model can be interpreted as the overall Baseline Age group (or cross-sectional) effect controlling for the longitudinal effect of age and sex (20). The log OR of obesity alters curvilinearly with Baseline Age. According to the rates of obesity in Table 2, we understand there is an increase in the prevalence of obesity for individuals with Baseline Ages from 35 to 54 and a decline thereafter. Moreover, the significant coefficients for (Age - Baseline Age) in the model can be interpreted as the longitudinal effect controlling for the cross-sectional effect of age and gender (20). The odds of obesity changes over time within individuals. In other words, the odds of obesity across one’s life course, on average, has about 3% increase by each year aging, regardless of the
Baseline Age group which the individuals are come from (EXP(0.0295) = 1.029). According to table 2, we can conclude that obesity prevalence for each Baseline Age group raised with time during the study for both men and women except for Baseline Age group ≥65. In other words, obesity prevalence increased with aging for individuals in Baseline Age group 35-65.

Also, according to the estimated coefficients and ORs in Table 3, in this study, the cross-sectional effect of age was more considerable than the longitudinal effect of it. In other words, the Baseline Age was more strongly associated with odds of obesity than aging (linear combination of 0.1266 and -0.0013 for cross-sectional effect vs. 0.0295 for longitudinal effect).

**Discussion**

The goals in this study were first, to determine whether the probability of obesity changed with age and whether patterns of change in obesity were the same for women and men, and second, to assess the cross-sectional and longitudinal effects of age. Our study was a large community-based study in a group of 6504 Iranian adults over 35 years of age who live in the central region of Iran. In our study, the prevalence of obesity (in total) increased from 22% in 2001 to 31% in 2013, while according to the WHO report, between 2000 and 2016, in all WHO regions and income groups, the global prevalence of obesity raised from 9% in 2000 to 13% in 2016 (12).

It shows that the prevalence of obesity in Iran was higher than the global prevalence of obesity (almost double) in the same period. Also, the amount of increase in the prevalence of obesity in Iran was more than global prevalence (in Iran, an 8% increase in 12 years; global average, 4% in 16 years). This massive increase is almost as large as the increase in the American population, which increased from 20% in 2000 to 29% in 2016 (12). Also, the result of our study showed that, between 2001 and 2013, the prevalence of obesity increased from 13% to 18% (5 percentage points increase) in adult men and from 31% to 44% (13 percentage points increase) in adult women, while between 1975 and 2014, the global prevalence of obesity raised from 3.2% to 10.8% in men and from 6.4% to 14.9% in women (1). Shifts in diets and
eating behavior which include energy-dense foods, high in sugars and fat, higher consumption of red meat, salt, and saturated fatty acids among individuals because of the increasing economic status, and less physical activity due to the sedentary work styles, types of transportation and changes in lifestyle are combining to increase the possibility of becoming obese (4). This rate of increase is also reported by other studies (1, 6, 15, 16, 30). In both developed and developing countries and specifically in middle-east countries, the prevalence of obesity is rising at alarming rates (1, 4, 13).

Additionally, in our study, using the GEE model and descriptive analysis, the odds of being obese for women is more than for men. It is approximately \( \exp(1.15) = 3.158 \) times of odds of being obese for men on average and by controlling the age effects (aging and cross-sectional effects). In other words, we can conclude that women are more likely to be obese (almost three times) than men. In another national study in Iran (the National Health Survey), the adjusted odds of obesity for women among Iranian adults aged 20-59 years were 2.4, 2.35, and 1.58 times of odds of being obese for men in 2000, 2007, and 2011, respectively (31).

In our study, for both groups of men and women, the average BMI and WC were raised over 12 years (2001 – 2013), but women had a higher average BMI and WC than men in all three phases. Among women, lower physical activity level, pregnancy, menopause, a higher rate of depression, lack of employment, lower socioeconomic status, lower educational level, and gender differences in food intake may be some of the causes for the higher prevalence of obesity in comparison with men (30, 32-34). Iranian women pay less attention to their body shape in comparison to European and Oceanic women and also, less information and knowledge about weight loss may be another cause (15).

Considerable regional differences in BMI alters through time were reported in different studies. In Southern Asia (Bangladesh, Bhutan, India, Nepal, and Pakistan), in southeast Asia (Malaysia, Indonesia, Philippines, Sri Lanka, Vietnam, and Thailand), in the Caribbean (Cuba,
Belize, Jamaica, Puerto Rico, and the Dominican Republic), and in southern Latin America (Brazil, Argentina, Paraguay, Uruguay, and Chile), an accelerated rise in BMI was reported (1).

In our study, applying an MLR model, it was shown that there is a difference between the cross-sectional effect and longitudinal effect of age on obesity prevalence in the target population, controlling for the gender effect. In this study, the cross-sectional effect of age was more considerable than the longitudinal effect of it. In other words, the Baseline Age was more severely associated with the odds of obesity than aging. The cross-sectional effect of age shows differences among people in their Baseline Age. There was a growth in the prevalence of obesity for individuals with Baseline Ages from 35 to 55 and a decline thereafter. In other studies, it is reported that Iranian adults gain weight until the age of about 50-60 years old, and after this age, BMI tends to decrease. The results of our study on the association between the probability of obesity and age are close to some of the other studies (16, 17, 35-38). Previous studies reported that BMI had a tendency to be higher in individuals with middle-aged in comparison with young adults and also tended to be constant or decrease in older individuals. Also, in a study in the United States of America (USA), NHANES-III, BMI had tendency to go up for ages 20 to 29 years till ages 50 to 59 years, and after the age of 59, BMI tended to decline (38). In another study in the USA, an independent cross-sectional effect of age on obesity was reported and also, a higher probability for obesity in younger Baseline Age groups in comparison to older individuals after controlling the aging effects were observed (21). With increasing age, there are alterations in food intake, energy consumption, and appetite besides bone and muscle loss that affect body composition (30).

Also, the longitudinal effect of age shows changes over time within individuals or changes across one's life course, regardless of the Baseline Age group for individuals. In our study, obesity prevalence for each group increased with time within the study for both men and women except for Baseline Age group ≥65 in women. It can be concluded that obesity
prevalence increasing with aging for individuals in Baseline Age groups 35-65. For women in more than 65 Baseline Age groups, there is a moderate decrease after six years, and then the probability of obesity tending to be almost constant after twelve years. Also, for men in Baseline Age group ≥65, there was a decrease after six years and then a moderate increase after twelve years. Odds of obesity across one’s life course, on average, have about a 3% increase by each year aging, regardless of the membership in each of Baseline Age groups. Most studies confirmed a severe aging effect on the high prevalence of obesity in middle age. For example, in a study in the USA, a shape similar to an inverted U for age effect on obesity and a lifted probability for obesity as an individual transition from young adulthood to midlife and a moderate decrease probability as one approaches the end of life was reported (21). Several factors might be responsible for the reduction in the old Baseline Age group; the most possible is the decrease in appetite and abdominal obesity in the elderly. Frequent medical check-up and treatment in older people may be another cause for this result. Moreover, older people may not be interested in modern lifestyles, such as the changes in dietary preferences (39, 40).

This study had several strengths, including its large sample size from a longitudinal ongoing community-based study of adults living in urban or rural areas from three providences in the central region of Iran (Isfahan Healthy Heart Program). Furthermore, in this study, we assessed both longitudinal effect (aging effect) and cross-sectional (Baseline Age effect) of age on obesity prevalence. However, despite the unique coverage of our study in comparison with other studies in Iran, the sample represented the population of central parts of Iran, and it limits the generalizability of our findings to the entire country. Also, our study assessed the longitudinal effect based on only three measurements; using data with more repeated measures for individuals, the accuracy of results will improve. Also, in our study, the goal was only to assess the relationship between obesity prevalence with the cross-sectional and longitudinal effect of age in men and women, but other confounders were not considered.
Conclusions

Obesity is a severe public health issue among Iranian adults. Available data in our study indicates a high rate of obesity and its fast growth, especially in adults age 35-55 and women. Also, Baseline Age was more strongly associated with the risk of obesity than aging. Considering both cross-sectional and longitudinal effects of age, helps us to understand the effect of age on obesity better and to identify the related factors. It is necessary to determine the factors contributing to the growth in the prevalence of obesity.

List of Abbreviations

Noncommunicable Diseases (NCDs), World Health Organization (WHO), Body Mass Index (BMI), Isfahan Healthy Heart Program (IHHP), The Isfahan Cohort Study (ICS), Waist Circumference (WC), Standard Deviation (SD), Cardiovascular Diseases (CVDs), Generalized Estimating Equations (GEE), Odds Ratio (OR), United States of America (USA), Marginal Logistic Regression (MLR)

Declarations

Ethics approval and consent to participate

Ethical approval was obtained from the Ethics Committee of Isfahan Cardiovascular Research Center (ICRC), a World Health Organization-collaborating center, and all subjects gave written informed consent.

Consent for publication

Not applicable

Availability of data and materials

The data that support the findings of this study are available on request from the corresponding author MS. The data are not publicly available due to privacy.

Competing interests

The authors declare that they have no competing interests

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Authors' contributions

MR developed and wrote the manuscript. AK, FZ, MS screened the literature, designed, edited, and approved the final version. All authors read and approved the final manuscript.

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**Table**

Table 1. Characteristics of the Study Participants in 2001, 2007, and 2013 by Gender

|                | 2001 | 2007 | 2013 |
|----------------|------|------|------|
|                 | Female | Male | Total | Female | Male | Total | Female | Male | Total |
| Number of Participants | 3336 | 3168 | 6504 | 1680 | 1604 | 3284 | 881 | 854 | 1735 |
| Education (%) Level 1† | 80.7 | 63.4 | 72.3 | 76.7 | 59.1 | 68.1 | 68.3 | 49.8 | 59.1 |
| Level 2† | 16.7 | 26.8 | 21.6 | 19.7 | 27.6 | 23.6 | 24.9 | 34.3 | 29.6 |
| Level 3† | 2.5 | 9.6 | 6 | 2.9 | 12.5 | 7.6 | 5.5 | 15.4 | 10.4 |
| Married (%) | 83.5 | 98.1 | 90.6 | 80.8 | 97.8 | 89.1 | 77.3 | 95.4 | 86.3 |
| Age* | 49.7 | 50.7 | 50.2 | 55.5 | 56.7 | 56.1 | 60 | 60.6 | 60.3 |
| (11.5) | (12) | (11.7) | (10.2) | (10.8) | (10.5) | (9.6) | (9.8) | (9.7) |
| BMI* | 27.9 | 24.5 | 26.7 | 28.7 | 26.1 | 27.7 | 29.4 | 26.5 | 28 |
| (5.1) | (4) | (4.7) | (4.6) | (3.8) | (4.4) | (4.8) | (4.3) | (4.8) |
### Table 2. Prevalence of general obesity 2001, 2007, and 2013 by Gender

| Baseline Age categories | 2001 Female | 2001 Male | 2001 Total | 2007 Female | 2007 Male | 2007 Total | 2013 Female | 2013 Male | 2013 Total |
|-------------------------|-------------|-----------|------------|-------------|-----------|------------|-------------|-----------|------------|
| 35-44                   | 31.1        | 11.4      | 21.7       | 40.5        | 13.4      | 27.9       | 46.3        | 17        | 32.1       |
| 45-54                   | 35.5        | 15.5      | 25.9       | 41.8        | 19.3      | 30.7       | 42.7        | 21.5      | 31.8       |
| 55-64                   | 33.7        | 14.3      | 23.9       | 37.8        | 14.5      | 25.1       | 47.8        | 17.2      | 30.8       |
| ≥ 65                    | 24.5        | 10.8      | 17.2       | 21.9        | 9.3       | 15.4       | 22.4        | 16.4      | 19.7       |
| Total                   | 31.4        | 13        | 22.4       | 38.5        | 14.8      | 27         | 43.6        | 18.3      | 31         |

Data are presented as percentage.

Obesity, BMI≥30 (World Health Organization recommendation)

### Table 3. Results from MLR Model to assess Gender and longitudinal and cross-sectional Age effects on obesity

| Parameter               | Estimate ($β$) | Standard Error | P-value | OR   | 95% CI OR |
|-------------------------|----------------|----------------|---------|------|-----------|
| Intercept               | -4.9664        | 0.6952         | <0.001  | 0.006| (0.001, 0.027) |
| Gender (Female)         | 1.1546         | 0.0583         | <0.001  | 3.172| (2.830, 3.555) |
| Baseline Age            | 0.1266         | 0.0269         | <0.001  | 1.134| (1.076, 1.196) |
| Baseline Age squared    | -0.0013        | 0.0003         | <0.001  | 0.998| (0.998, 0.999) |
| Age - Baseline Age      | 0.0295         | 0.0038         | <0.001  | 1.029| (1.022, 1.037) |
| Alpha1                  | 2.9046         | 0.1050         | <0.001  | 18.257| (14.861, 22.432) |
| Alpha2                  | 2.6129         | 0.1421         | <0.001  | 13.638| (10.323, 18.018) |
| Alpha3                  | 3.5040         | 0.1754         | <0.001  | 33.248| (23.575, 46.885) |

QIC= 12070.3512; QICu= 12066.9720

### Additional Files

File name: Additional file 1.pdf

File format: pdf
Title of data: Figure 1. Cross-sectional effect of age on prevalence of obesity in men and women

File name: Additional file 2.pdf

File format: pdf

Title of data: Figure 2. Longitudinal effect of age on prevalence of obesity in men and women

File name: Additional file 3.pdf

File format: pdf

Title of data: Table 1. Results from MLR Model to assess Gender and Age effects on obesity