



Association between dietary patterns and overweight risk among Malaysian adults: evidence from nationally representative surveys

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Abstract

Objective: To investigate the association between dietary patterns (DP) and overweight risk in the Malaysian Adult Nutrition Surveys (MANS) of 2003 and 2014.

Design: DP were derived from the MANS FFQ using principal component analysis. The cross-sectional association of the derived DP with prevalence of overweight was analysed.

Setting: Malaysia.

Participants: Nationally representative sample of Malaysian adults from MANS (2003, *n* 6928; 2014, *n* 3000).

Results: Three major DP were identified for both years. These were 'Traditional' (fish, eggs, local cakes), 'Western' (fast foods, meat, carbonated beverages) and 'Mixed' (ready-to-eat cereals, bread, vegetables). A fourth DP was generated in 2003, 'Flatbread & Beverages' (flatbread, creamer, malted beverages), and 2014, 'Noodles & Meat' (noodles, meat, eggs). These DP accounted for 25.6 and 26.6 % of DP variations in 2003 and 2014, respectively. For both years, Traditional DP was significantly associated with rural households, lower income, men and Malay ethnicity, while Western DP was associated with younger age and higher income. Mixed DP was positively associated with women and higher income. None of the DP showed positive association with overweight risk, except for reduced adjusted odds of overweight with adherence to Traditional DP in 2003.

Conclusions: Overweight could not be attributed to adherence to a single dietary pattern among Malaysian adults. This may be due to the constantly morphing dietary landscape in Malaysia, especially in urban areas, given the ease of availability and relative affordability of multi-ethnic and international foods. Timely surveys are recommended to monitor implications of these changes.

Keywords
Dietary pattern
Malaysia
Obesity
Malaysian Adult Nutrition Survey

Obesity in Malaysian adults has escalated to alarming levels. Overweight and obesity prevalence was reported as 30.0 and 17.7 %, respectively, in 2014, indicating that one in two adults is either overweight or obese⁽¹⁾. Alarmed by the odds for the obesity pandemic continuing unabated and its consequent burden on the health-care system, the Ministry of Health has accorded priority to comprehensive national strategies to tackle drivers of excessive weight. The National Plan of Action for Nutrition for Malaysia III (NPANM III) 2016–2025 specifically identifies

'preventing and controlling obesity' as an enabling strategy to achieve its ultimate goal of achieving optimal nutritional well-being of Malaysians. Additionally, obesity prevention and management have been identified as Nutrition Research Priorities in Malaysia for the 11th Malaysia Plan (2016–2021)^(2,3).

Globally, the obesity pandemic is driven by multiple factors that include subsidised agriculture, availability of affordable processed foods that are energy-dense with refined fats, oils and carbohydrates, and increase in

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sedentary lifestyles⁽⁴⁾. Scientific evidence has irrevocably established unhealthy diets as a major determinant of obesity. The epidemiological transition occurring in developing countries is characterised by qualitative dietary shifts, namely a trend for increased consumption of energy from animal foods, refined cereals (including white rice), added sugars and vegetable oils⁽⁵⁾.

Traditionally, nutritional epidemiology has relied on studying the associations between intake of single nutrients such as carbohydrate or fat, or single foods such as sugar or rice, and health outcomes of interest. However, this simplistic approach has several limitations. The synergistic and interactive nature of nutrients and/or foods, the presence of high levels of inter-correlation between nutrients and the confounding effect of dietary patterns (DP) on single nutrient associations make the interpretation of health associations with a single nutrient or food increasingly complex⁽⁶⁾. In turn, translating these findings into appropriate dietary recommendations for the population also becomes challenging. In comparison, the investigation of DP provides a holistic approach to studying population diets as it looks at the spectrum of foods included and excluded, mimicking real-life diets. This approach makes it amenable to understand the nutrient and food profile of the DP and their associations with health outcomes of interest in existing data sets⁽⁷⁾.

Two national dietary intake surveys, namely the Malaysian Adult Nutrition Survey (MANS) undertaken in 2003 and 2014, had included, *inter alia*, frequency of food intake as well as the BMI of the participants. Hence, the MANS data provide an opportunity to determine the DP of Malaysian adults and the association between changes in DP and BMI status over the survey years. The present study aimed to identify the predominant DP among Malaysian adults and their associations with socio-demographic factors based on MANS 2003 and 2014. In addition, it intended to investigate the association between the identified DP and overweight risks in 2003 and 2014.

Methods

Study population and sampling procedure

The MANS 2003 and 2014 used a multistage stratified sampling design to select a representative sample of Malaysian adult population aged 18 to 60 years. Both surveys covered urban and rural areas throughout the country. Nutritionists and trained research assistants were recruited for data collection. The surveys were undertaken by the Institute of Public Health (*Institut Kesihatan Umum*), Ministry of Health, Malaysia. Complete details on the methodology are available on the Institute's website (<http://www.iku.gov.my>). The MANS 2003 comprised data of 6928 individuals while the MANS 2014 included 3000 individuals. The data sets provided information on body weight, age, sex,

ethnicity, state of residence, category of residence (urban or rural) and household monthly income.

Anthropometric measurements

Body weight and height measurements were taken of the survey respondents in 2003 (*n* 6766) and 2014 (*n* 2889) using standard procedures. BMI was calculated using the formula: $BMI = [\text{weight (kg)}]/[\text{height (m)}]^2$. The BMI results in kg/m^2 were classified according to WHO (2000) as follows: underweight, $BMI < 18.5 \text{ kg/m}^2$; normal weight, $BMI = 18.0\text{--}24.99 \text{ kg/m}^2$; overweight, $BMI \geq 25.0 \text{ kg/m}^2$. Further details are available in the methodology documents available from the Institute of Public Health⁽⁸⁾.

Dietary assessment

A pre-tested semi-quantitative FFQ was used in both surveys. Details on the MANS FFQ have been published earlier^(8–10). In brief, the MANS 2003 FFQ consisted of 126 commonly consumed food and beverage items which were listed into thirteen food groups. The MANS 2014 FFQ contained additional food and beverage items in each food group accounting for a total of 165 items⁽¹⁰⁾. The FFQ in MANS was administered by trained enumerators on a one-to-one basis and respondents were asked to report the frequency of intake of each food item ('per day', 'per week', 'per month', 'per year' or 'never') based on their habitual intake over the past year. Information on the number of servings consumed each time that the respondents ate the food was also elicited. Visual representation of food portions was used to improve accuracy of reporting.

Data analyses

DP were generated from the MANS FFQ using principal component analysis (PCA) with varimax rotation. The Kaiser–Mayer–Olkin test for sampling adequacy and Bartlett's test were applied to evaluate PCA applicability. For performing the PCA, the large numbers of variables from the MANS FFQ were aggregated into twenty-eight mutually exclusive groups on the basis of the similarity of food types and nutrient composition. These measures are suggested in the literature to facilitate data analysis and interpretation⁽¹¹⁾.

Based on past studies, we made certain assumptions in the categorisation of food groups. Sugar-sweetened beverages and sweetened condensed milk (creamer) are often implicated as constituents of unhealthy diets⁽¹²⁾. Likewise, there has been widespread concern about the popularity of Western fast foods, owing to increased globalisation^(13,14). Hence, in the current analysis, we identified specific categories for carbonated beverages, sugar and honey, creamer and fast foods. We also separated the cereal products into categories such as rice, noodles, local bread, corn, sagu and ready-to-eat cereals, since it is important to understand the contributions of these commonly consumed staples to the DP. The twenty-eight food

**Table 1** Food categories identified from the Malaysian Adult Nutrition Survey FFQ for performing principal component analysis

No.	Food group	Items
1	Breakfast cereals	Ready-to-eat cereals
2	Rice	All rice varieties (white, brown, glutinous and flavoured rice and rice porridge)
3	Bread	All kinds of bread and bun (except local breads)
4	Flatbread	<i>Chappati, roti canai, thosai, naan</i>
5	Pasta	Pasta
6	Noodle	All wheat and rice noodles
7	Corn	Corn
8	Sagu sago	Sagu sago (<i>Metroxylon sagu</i>)
9	Fast foods	Burger, pizza, fried chicken, French fries, mashed potatoes, coleslaw, sausage, hotdog and frankfurter
10	Meat	All meat except eggs and fish
11	Eggs	All eggs
12	Fish & seafood	All fish
13	Legumes	All pulses (including groundnuts and soyabeans)
14	Vegetables	All vegetables
15	Fruits	All fruits
16	Milk and milk products	Milk, cheese, yoghurt, etc.
17	Malted chocolate drink	Milo and other malted drinks
18	Tea & coffee	Tea and coffee drinks
19	Creamer	Creamer
20	Alcoholic beverages	Wine, brandy, beer, shandy, etc.
21	Soya milk	Soya milk varieties
22	Carbonated beverages	All carbonated beverages
23	Other beverages	Fruit juice, cordials, energy drinks, ready-to-drink beverages, herbal drinks
24	Confectionery	Sweets, chocolate bar, cake, jelly, lolly ice, ice cream, ice blended, cream crackers, flavoured cookies, pastry, snacks
25	Local cakes	<i>Kuih</i>
26	Spices & condiments	All flavourings
27	Spreads	Jam, <i>kaya</i> (egg & coconut milk)
28	Sugar and honey	Sugar and honey

categories identified are shown in Table 1. The analysis was based on the amounts consumed in grams per day.

Dietary patterns that emerged were identified and labelled based on the foods included and excluded for each factor. The number of DP extracted was determined based on information from the scree plot, component eigenvalues (>1.2) and their contributions to the total variation^(11,15). The number of factors extracted was based on each factor contributing a minimum of 5 % to the total variance. Small component coefficients (factor loading scores) of less than 0.2 were suppressed. Factor scores were estimated using the regression approach. The regression factor score for each DP was calculated and assigned to every participant. Changes in the DP between 2003 and 2014 were assessed by comparing the food factor loading scores for the individual DP between the two years. The statistical software package IBM SPSS Statistics version 24 was used to perform

the PCA and all statistical analyses. $P < 0.05$ was considered statistically significant. The scores of individual intakes obtained from the DP were categorised into quartiles as a measure of adherence, with quartile 1 denoting the lowest adherence and quartile 4 representing the highest adherence to a specific DP.

Associations between the quartiles of DP adherence and socio-economic factors (age, sex, ethnicity and household income) and body weight status based on presence or absence of overweight and obesity (i.e. $BMI \geq 25.0 \text{ kg/m}^2$), as a dichotomous variable, were determined using the χ^2 test for distribution of proportions.

Household income (as shown in the online supplementary material, Supplemental Table S5) was classified in three categories based on reports accrued from the Department of Statistics Malaysia (<https://www.dosm.gov.my>). Based on the Household Expenditure Surveys, undertaken by the Department of Statistics Malaysia every 5 years, it was gathered that the average monthly household expenditure on food and non-alcoholic beverages was 20.2 % in 2004–2005 and 18.9 % in 2014 out of total household expenditures⁽¹⁶⁾. During this period annual inflation was also reported as below 5 %. Based on these data, which appear to indicate that the impact of household income on food expenditures was not vastly different in 2003 and 2014, we made no further adjustments to the MANS data when analysing household income quartiles *v.* dietary patterns.

Logistic regression models were fitted by considering presence or absence of overweight and obesity as the outcome and the quartile of adherence to DP as a predictor. Since significant interactions between age, sex and ethnicity were detected during the preliminary analysis (shown in the supplementary files), a second model was developed for the derivation of OR when adjusted for age, sex and ethnicity. A sensitivity analysis was performed to study this association while excluding respondents who were underweight.

Results

Major dietary patterns

Four distinct *a posteriori* dietary patterns that satisfied the set criteria were extracted in both years. Together they described approximately 25.6 and 26.6 % of the DP variations in 2003 and 2014, respectively. Three of the DP were common to both years: 'Traditional' (high in fish, eggs, local cakes (*kuih*), confectionery, tea and coffee, sugar and honey); 'Mixed' (high in ready-to-eat cereals, bread, spread, legumes, vegetables, fruits, malted beverages, soya milk, corn, local cakes and confectionery); and 'Western' (high in fast foods and carbonated beverages). In addition, a 'Flatbread & Beverages' DP (high in local bread, creamer, malted chocolate drinks, carbonated beverages, soya milk) was generated for 2003 and 'Noodles

Table 2 Description of the dietary patterns (DP) identified from the Malaysian Adult Nutrition Survey 2003 and 2014

2003			2014		
Rank	DP	Foods consumed	Rank	DP	Foods consumed
1	Traditional	Fish, eggs, local <i>kuih</i> , confectionery, tea and coffee, sugar and honey, creamer, spices and condiments	1	Western	Fast foods, bread, spreads, carbonated beverages, juices, fruits, confectionery, local <i>kuih</i> , spices and condiments (sauces)
2	Mixed	Ready-to-eat cereal, bread, spread, legumes, vegetables, milk and milk products, malted chocolate drinks, soya milk, corn, local <i>kuih</i> , confectionery	2	Mixed	Ready-to-eat cereal, pasta, bread, spread, legumes, vegetables, fruits, milk and milk products, malted chocolate drinks, soya milk, corn, confectionery
3	Western	Fast foods, meat, noodles, rice, pasta, eggs, carbonated beverages	3	Traditional	Rice, sagu, legumes, fish, eggs, vegetables, local <i>kuih</i> , confectionery, tea and coffee, sugar and honey, spices and condiments (excludes pasta)
4	Flatbread & Beverages	Indian flatbreads (<i>chappati</i> , <i>roti canai</i> , <i>thosai</i> , <i>naan</i>), creamer, malted chocolate drinks, carbonated beverages, other beverages, soya milk (excludes rice)	4	Noodles & Meat	Noodles, meat, eggs, alcoholic beverages (excludes local <i>kuih</i>)

& Meat' DP (high in noodles, meat, eggs, alcoholic beverages) in 2014. Table 2 shows these DP and the predominant food items included. The rotated component matrix shows the grouping of the foods consumed into four DP for 2003 and 2014, respectively, based on the factor scores (see online supplementary material, Supplemental Table S1). The clustering of the food items within the DP is further shown as loading plots derived from PCA (Fig. 1). The percentage of total variation in the diet for each of these DP ranged from 5.7 to 7.6 % (Supplemental Fig. S1).

Association between sociodemographic factors and dietary patterns

A summary of the test for association between the socio-demographic factors of the respondents and the DP is shown in Table 3, while the detailed results are presented in the online supplementary material (Supplemental Tables S2 to S6). The Western DP was a preference among younger respondents both in 2003 and 2014 (both $P_{\text{trend}} < 0.001$). While the Mixed DP ($P_{\text{trend}} = 0.015$) was associated with younger respondents in 2003, no significant association with age was shown in 2014. The Traditional DP (2003 and 2014) and the Noodles & Meat DP of 2014 were not found to be associated with respondent age.

Men showed significant associations with several DP in the two MANS, namely Traditional DP (2003 and 2014), Flatbread & Beverages DP (2003), Noodles & Meat DP (2014) and Western DP (2014; all $P < 0.001$). In contrast, only the Mixed DP was significantly associated with women ($P < 0.001$ in both years).

As for household income, the Traditional DP was more prevalent with lower income, whereas the Western and Mixed DP were associated with higher household income ($P_{\text{trend}} < 0.001$ in both years). The Noodles & Meat DP of 2014 also showed a positive association with higher household income ($P_{\text{trend}} = 0.017$), while the Flatbread &

Beverages DP in 2003 was significantly associated with the middle income category ($P_{\text{trend}} = 0.002$).

Rural households were more likely to adhere to the Traditional DP in both years ($P < 0.001$), compared with the Mixed and Western DP that scored higher in urban areas. The Flatbread & Beverages DP in 2003 and the Noodles & Meat DP in 2014 were also more prevalent in urban areas ($P < 0.001$).

The MANS data also revealed significant associations between adherence to the DP and respondent ethnicity. In 2003, the Flatbread & Beverages DP showed higher prevalence among Indians, whereas in both years the Traditional DP was associated with Malays and the indigenous population groups in Sarawak ($P_{\text{trend}} < 0.001$). In 2014, the Mixed DP was associated with Chinese and Indian ethnicity ($P_{\text{trend}} < 0.001$), whereas the Noodles & Meat DP scores were higher among Chinese and Sarawak indigenous groups ($P_{\text{trend}} = 0.017$).

Association between dietary patterns and overweight risk

Results on the association between overweight risk and sociodemographic factors observed in the MANS 2003 and 2014 data are presented in Table 4. The test for the association between quartiles of DP and proportion of participants with BMI ≥ 25.0 kg/m² is presented in the online supplementary material, Supplemental Table S7 and Supplemental Fig. S2.

Results of unadjusted and adjusted OR for prevalence of overweight among the quartiles of DP adherence are shown in Table 5. Unadjusted OR, comparing the lower quartiles of DP adherence with the highest quartile as the reference, showed that lower adherence to the Western DP was associated with higher odds for overweight and obesity both in 2003 and 2014. However, the association was no longer significant after adjusting the model for age, sex and ethnicity. Overall, no significant

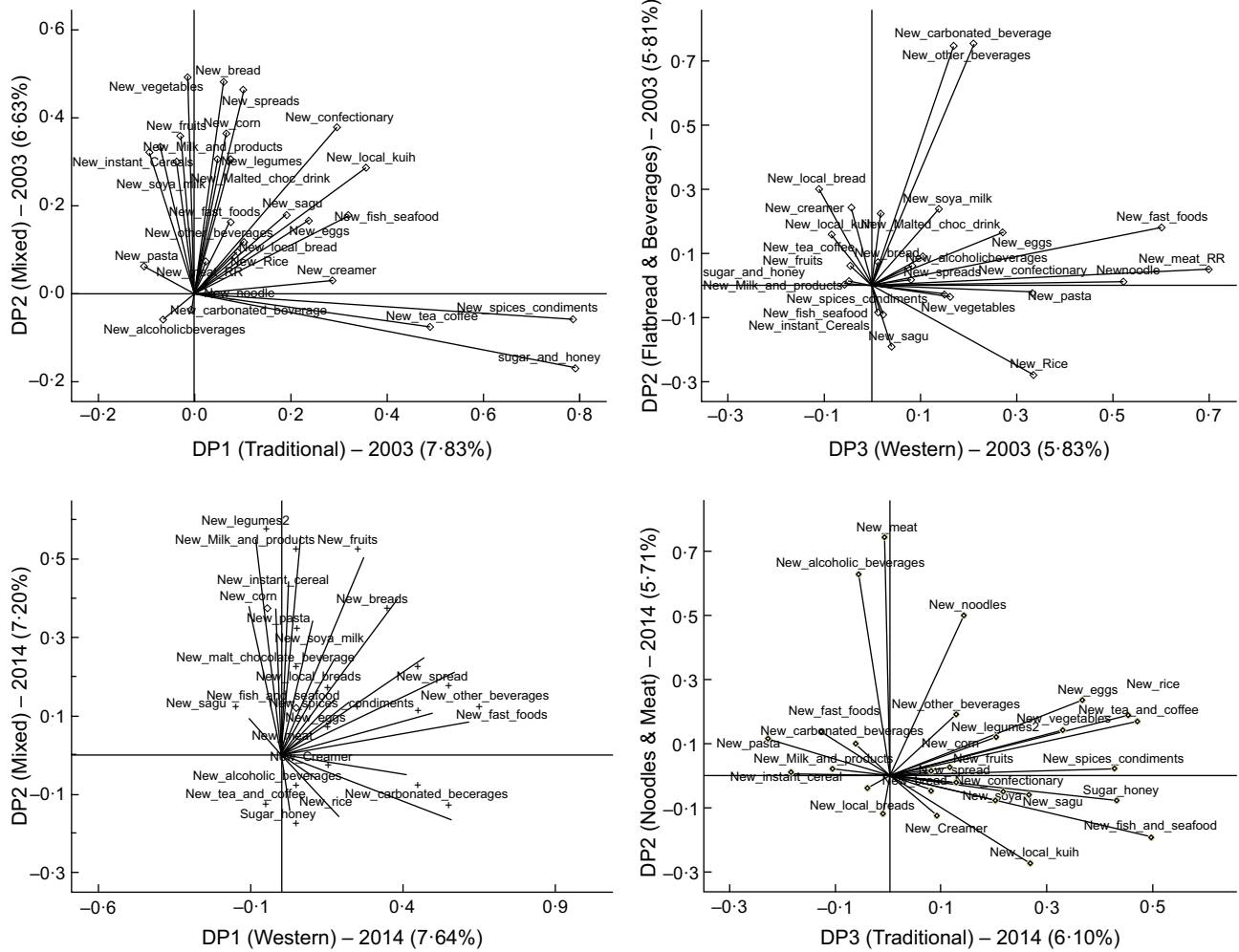


Fig. 1 Rotated component loading plots showing the clustering of food groups for the four dietary patterns (DP) derived by principal component analysis from the Malaysian Adult Nutrition Survey (MANS) 2003 and 2014 FFQ. The left column shows the loading plots with DP1 on the x-axis and DP2 on the y-axis; the right column shows the loading plots with DP3 on the x-axis and DP4 on the y-axis. The top row visualises the data from MANS 2003 and the bottom row the data from MANS 2014

association was found between prevalence of overweight and dietary patterns in 2003 and 2014, when adjusted for age, sex and ethnicity, with the exception of the finding for Traditional DP. These findings were consistent also when respondents with underweight were excluded during the secondary analysis (see online supplementary material, Supplemental Table S8).

Discussion

Major dietary patterns and changes

Typical of a rapidly developing economy, Malaysia has undergone substantial expansion and diversification in food consumption, as indicated by the major DP identified and the concomitant shifts observed over the study period. While Traditional, Mixed and Western DP were distinctly

identified in both the MANS 2003 and 2014, nevertheless, major shifts in the popularity of these DP were discerned over the years. Whereas Traditional DP ranked highest in explaining 7.4 % of the dietary variations in 2003, by 2014 however the Western DP had taken over the top position, contributing 7.6 % of the dietary variations (Supplemental Fig. S1). These observations parallel reports of rapid proliferation of the fast-food industry in recent decades in Malaysia⁽¹⁴⁾. Working status, especially among dual-career families, is associated with increased consumption of convenience and ready-to-eat fast foods as quick meal solutions⁽¹⁷⁻¹⁹⁾. High demand for convenience foods and beverages is one of the major food demand drivers in Asia, leading to continued emergence of processed foods⁽¹⁹⁾.

In this conjunction, Malaysia displays the consequences of a rapid convergence of global dietary influence on the

Table 3 Significant associations between adherence to dietary patterns (DP) and sociodemographic factors in the Malaysian Adult Nutrition Survey (MANS) 2003 and 2014

DP	MANS 2003	MANS 2014
Traditional	NS association with age	NS association with age
	Male sex Malays, Sarawak indigenous†	Male sex Sabah indigenous‡, Sarawak indigenous, Malays
Mixed	Rural households Lower household income‡	Rural households Lower household income
	Younger age (18–19 years) Female sex NS association with ethnicity	NS association with age Female sex Indians and Chinese
Western	Urban households Higher household income	Urban households Higher household income
	Younger age (18–19 years) NS association with sex Chinese	Younger age (18–19 years) Male sex NS association with ethnicity
Flatbread & Beverages	Urban households Higher household income	Urban households Higher household income
	Younger age (18–19 years) Male sex Indians Urban households Medium household income	–
Noodles & Meat	–	NS association with age Male sex Chinese and Sarawak indigenous Urban households Higher household income

†Sarawak indigenous groups include Melanau, Ibans and Bidayus.

‡Monthly household income (Malaysian Ringgit (RM)): lower, <RM 1500 (~<£280); middle, RM 1500–3500 (~£280–653); higher, >RM 3500 (~>£653).

§Sabah indigenous groups include Kadazans-Dusuns, Bajaus and Muruts.

local food consumption landscape. Whereas rice and noodles were key constituents of the Western DP in 2003, by 2014 both items were no longer components of the Western DP. The latter appears entrenched mainly with Western constituents, namely fast foods, spreads and carbonated beverages. Meanwhile, noodles made from different types of cereals and grains are an increasingly popular alternative to rice among the different ethnic groups. The escalating popularity of noodles reflects, in part, increasing international influence (spaghetti, ramen and soba noodles) and in part the perception in some segments of the population that ‘noodle is healthier than rice’. Rice, nevertheless, persists as a predominant staple as a component of the 2014 Traditional DP.

Table 4 Association of sociodemographic variables with prevalence of overweight† in the Malaysian Adult Nutrition Survey (MANS) 2003 and 2014

Sociodemographic variable‡	MANS 2003 ⁽³⁰⁾	MANS 2014 ⁽¹⁾
Age	50–59 years	50–59 years
Sex	Women	Women
Ethnicity	Indian and Malay ethnicities	Malay and Indian ethnicities
Household income	RM 1500–3500	>RM 3500
Residence	No clear urban–rural divide	No clear urban–rural divide

†Overweight is defined as BMI ≥ 25.0 kg/m².

‡Categorisation of sociodemographic variables studied. Age group: 18–19, 20–29, 30–39, 40–49, 50–59 years. Sex: male and female. Ethnicity: Malay, Chinese, Indian, Sarawak indigenous, Sabah indigenous, Other indigenous. Monthly household income (Malaysian Ringgit (RM)): lower, <RM 1500 (~<£280); middle, RM 1500–3500 (~£280–653); higher, >RM 3500 (~>£653). Residence: rural and urban.

Implications of socio-economic factors

The associations between sociodemographic factors and the major DP appear to be consistent in MANS 2003 and 2014. In general, the Western and Mixed DP were preferred by younger age groups, urban residents and those with higher household income. Affordability explains the finding in both years of the lower-income and rural areas adhering to the Traditional DP that comprises local food items such as rice, fish and spices.

The gender differentials revealed in the present study suggest that men tend to favour a variety of DP compared with women. While women were significantly associated with the Mixed DP, men were positively linked to several DP in both years of the survey. The Mixed DP that includes bread, ready-to-eat cereals, vegetables and fruits is similar to the ‘healthy diet’ pattern described in Singapore⁽²⁰⁾. It is postulated that women’s penchant for healthier lifestyle and increased health awareness⁽²¹⁾ are likely to lead to their adoption of healthier diets. The Mixed DP would also require limited food preparation time and could explain its adoption among women who constitute about 38–54% of the workforce in Malaysia^(22,23).

The Noodles & Meat DP showed greater association with men, higher income and urban dwellers, as well as Chinese and Sarawak indigenous ethnicity. It is not unexpected to observe alcoholic beverages in this DP, as among the ethnic groups studied only the Malays are known to be prohibited by religion from consumption of alcoholic beverages.

The Flatbread & Beverages DP typified by Southern Indian breads, such as *roti canai* (made from refined wheat flour) and *thosai* (made from fermented lentils and rice batter), is usually taken with beverages, including *teh tarik* (tea sweetened with creamer) and malted chocolate drinks. This cuisine is ubiquitous to the Malaysian *Mamak* food scene, popular for its affordability and long hours of availability⁽²⁴⁾. Perhaps for these factors this DP was reported above as

Table 5 Dietary patterns (DP) and the presence of overweight and obesity (BMI ≥ 25.0 kg/m²) among Malaysian Adult Nutrition Survey respondents in 2003 and 2014

DP	DP quartile†	Unadjusted		Adjusted for age		Adjusted for age and sex		Adjusted for age, sex and ethnicity		Adjusted for age, sex, ethnicity and household income	
		OR‡	95 % CI	OR‡	95 % CI	OR‡	95 % CI†	OR‡	95 % CI	OR‡	95 % CI†
Traditional – 2003	Q1	1.062	0.925, 1.218	1.044	0.907, 1.202	1.019	0.884, 1.174	1.251	1.075, 1.456**	1.225	1.051, 1.427**
	Q2	1.137	0.991, 1.304	1.134	0.986, 1.305	1.118	0.971, 1.286	1.271	1.099, 1.470***	1.253	1.083, 1.450**
	Q3	1.087	0.947, 1.247	1.081	0.940, 1.243	1.071	0.931, 1.233	1.122	0.974, 1.293	1.111	0.964, 1.281
	Q4	1		1		1		1		1	
Mixed – 2003	Q1	1.085	0.945, 1.245	1.051	0.913, 1.209	1.079	0.936, 1.243	1.071	0.929, 1.235	1.101	0.954, 1.271
	Q2	1.141	0.995, 1.309	1.122	0.975, 1.291	1.130	0.982, 1.300	1.133	0.984, 1.305	1.149	0.997, 1.324
	Q3	1.121	0.976, 1.286	1.099	0.955, 1.265	1.102	0.957, 1.268	1.114	0.967, 1.284	1.122	0.973, 1.293
	Q4	1		1		1		1		1.000	
Western – 2003	Q1	1.465	1.276, 1.681***	1.215	1.054, 1.401**	1.203	1.043, 1.387*	0.988	0.849, 1.149	1.015	0.872, 1.182
	Q2	1.302	1.134, 1.495***	1.148	0.996, 1.323	1.130	0.980, 1.303	0.990	0.855, 1.146	1.010	0.872, 1.169
	Q3	1.212	1.055, 1.392**	1.118	0.970, 1.288	1.104	0.958, 1.272	1.033	0.895, 1.192	1.050	0.909, 1.213
	Q4	1		1		1		1		1	
Flatbread & Beverages – 2003	Q1	1.075	0.936, 1.233	0.829	0.718, 0.958*	0.798	0.689, 0.923**	0.917	0.789, 1.006	0.931	0.800, 1.082
	Q2	1.137	0.991, 1.304	0.929	0.805, 1.071	0.902	0.782, 1.042	0.964	0.834, 1.115	0.974	0.842, 1.127
	Q3	1.148	1.001, 1.317*	1.014	0.881, 1.168	0.996	0.865, 1.147	1.002	0.869, 1.155	1.007	0.873, 1.161
	Q4	1		1		1		1		1	
Traditional – 2014	Q1	1.093	0.889, 1.343	1.111	0.901, 1.369	1.024	0.828, 1.268	1.132	0.908, 1.411	1.056	0.844, 1.321
	Q2	1.124	0.914, 1.382	1.133	0.919, 1.398	1.082	0.876, 1.337	1.165	0.939, 1.446	1.122	0.903, 1.395
	Q3	1.223	0.996, 1.502	1.236	1.003, 1.524*	1.201	0.973, 1.481	1.259	1.018, 1.556*	1.225	0.989, 1.517
	Q4	1		1		1		1		1	
Mixed – 2014	Q1	0.895	0.728, 1.100	0.889	0.721, 1.096	0.957	0.774, 1.184	0.921	0.741, 1.145	1.014	0.811, 1.268
	Q2	1.066	0.867, 1.311	1.061	0.860, 1.309	1.093	0.884, 1.350	1.064	0.860, 1.317	1.121	0.902, 1.393
	Q3	1.094	0.889, 1.346	1.061	0.859, 1.309	1.050	0.850, 1.297	1.048	0.847, 1.297	1.076	0.868, 1.336
	Q4	1		1		1		1		1	
Western – 2014	Q1	1.312	1.067, 1.603**	1.041	0.839, 1.291	1.001	0.805, 1.243	1.118	0.895, 1.395	1.174	0.938, 1.471
	Q2	1.391	1.130, 1.713**	1.156	0.933, 1.433	1.110	0.895, 1.378	1.166	0.937, 1.450	1.189	0.954, 1.481
	Q3	1.204	0.979, 1.480	1.064	0.861, 1.314	1.039	0.841, 1.285	1.059	0.855, 1.311	1.068	0.861, 1.326
	Q4	1		1		1		1		1	
Noodles & Meat – 2014	Q1	1.319	1.073, 1.622**	1.291	1.046, 1.592*	1.229	0.994, 1.518	0.908	0.705, 1.171	0.966	0.748, 1.249
	Q2	1.432	1.164, 1.762***	1.432	1.160, 1.767***	1.337	1.080, 1.655**	1.042	0.816, 1.331	1.095	0.85, 1.401
	Q3	1.283	1.044, 1.578*	1.266	1.027, 1.562*	1.206	0.976, 1.490	1.045	0.836, 1.306	1.084	0.865, 1.358
	Q4	1		1		1		1		1	

* $P < 0.05$; ** $P < 0.01$, *** $P < 0.001$.

†DP quartile refers to the quartile of adherence. Q1 and Q4 are the lowest and highest quartiles of adherence, respectively.

‡OR and 95 % CI are calculated with the highest quartile as the reference.

significantly associated with male, middle-income and urban respondents (Table 3). Nevertheless, the Flatbread & Beverages DP did not emerge in 2014, perhaps owing to competition and increasing popularity of multi-ethnic and so-called 'fusion cuisines' (blended Western and Asian ingredients in a single dish). In Malaysia, international influence and diversification of local cuisines are expected to be in demand in tandem with growing affluence of Malaysians and growing influx of foreign tourists.

Nutritional implications

There are concerns over the widespread acculturation of Western fast foods in the Malaysian diet^(13,14). Consumption of sugar-sweetened (carbonated) beverages and sweetened condensed milk/creamer is also a concern given the escalating prevalence of obesity and diabetes in the population⁽¹²⁾. Hence in the current analysis, while grouping foods for PCA, we created specific categories for sugar and honey, creamer and fast foods. The analysis of the contributions of key dietary items to the major DP revealed notable nutritional implications. For example, there appears a lower contribution of sugar and sweet foods in 2014 compared with 2003, as exemplified by the Traditional DP which was the DP characterised by the intake of sugary foods. For this DP, factor loading scores for several sweet items, including table sugar, honey, local cakes and confectionery, decreased from 2003 to 2014 (see online supplementary material, Supplemental Table S1). The factor loading score for sweetened milk (creamer) also showed a decrease for the Traditional DP over the same period (Supplemental Table S1). Since factor loadings are interpreted like standardised regression coefficients, a higher loading value would indicate a stronger correlation with the factor it is associated with. A decreased factor loading can be construed to indicate a lower degree correlation, thereby contributing less to a particular DP. Thus, lower factor loading scores for these elements can indicate decreased contribution of sugary products and sweetened milk to this DP, over time. This encouraging trend is consistent with the 2016 review of Amarra *et al.*, who reported that the per capita daily consumption of energy from sugar and sweeteners in Malaysia dropped dramatically between 2000 and 2004, after experiencing an increase from 1965 to 1999⁽²⁵⁾.

Another nutritional implication shown by the current study is that food consumption patterns among Malaysians expanded and diversified in 2014, including adding meat (Noodle & Meat DP), increased contribution of fruits and vegetables (Western, Mixed & Traditional DP), as well as higher loading scores for milk and dairy products (Mixed DP), in contrast to the DP in 2003. These dietary improvements within the DP may reflect increased availability of household economic means to access various food groups coupled with greater awareness about nutrition.

Dietary patterns and overweight risk

The prevalence of overweight and obesity (BMI ≥ 25.0 kg/m²) as reported by the MANS data was 38.3 % in 2003 and 50.9 % in 2014⁽¹⁾. In the present study, primary analysis found no significant association between DP and adjusted risk for overweight. The prevalence of underweight (BMI < 18.5 kg/m²) among the respondents was 9.3 and 5.6 % in 2003 and 2014, respectively. Nevertheless, a sensitivity analysis was carried out to assess any masking of the association by excluding those with BMI < 18.5 kg/m². This secondary analysis is presented in the online supplementary material. Supplemental Table S8. The direction of these associations remained consistent in both analyses. Only the practice of Traditional DP in 2003 revealed lower odds for overweight, after adjustment for age, sex, ethnicity and household income.

This lack of association between adherence to a DP and overweight risk agrees with a previous attempt at associating obesity with frequency of eating out in Malaysia, which found no significant association⁽²²⁾. These findings are also in line with the earlier investigation that explored DP in the MANS 2003 data using PCA, which found that DP were not significantly associated with obesity⁽¹⁹⁾. These observations differ from the evidence reported in other Asian populations^(26–28). As a commonality, the latter studies found that high fat, meat and sweets intakes were positively associated with body weight. These studies also found an inverse relationship between BMI and fruits, vegetables, fish and whole grains intakes. Interestingly, rice intake (in the Japanese Traditional diet⁽²⁸⁾) and potato intake (in the Korean transitional diet⁽²⁶⁾) were associated with obesity. In Singapore, high intakes of fruit, vegetables, dairy, whole-grain breads, breakfast cereals, and use of unsaturated cooking oils, coupled with low intakes of Western fast foods, sugar-sweetened beverages, poultry, processed meat and flavoured rice, were found to be associated with better cardiovascular risk profiles and body weight status among adults⁽²⁰⁾. These contradictory findings could be due to the cross-sectional nature of the MANS data that precludes assumptions of causality and the likely under-reporting among overweight and obese respondents, which is a well-established source of error in nutritional surveys⁽²⁹⁾.

Conclusion and recommendations

Analysis of the MANS 2003 and 2014 data generated three consistent major dietary patterns, namely Traditional, Mixed and Western. In general, overweight among Malaysian adults was not found to be significantly associated with adherence to any of these DP. This finding may be due to the constantly morphing dietary landscape in Malaysia, especially in urban areas, given the ease of availability and relative affordability of multi-ethnic and international foods.



National surveys of dietary intake of all ages should be undertaken in a timely manner to address the public health implications of the constantly changing dietary consumption behaviour of the people, concomitant with the country undergoing rapid nutrition transition. Such findings are particularly pertinent in view of the growing obesity and non-communicable disease burden on the health of the people and health-care costs of the country. In light of the findings that sociodemographic characteristics play an important influence in the people's dietary preferences, there is scope for targeting educational and health promotion messages towards improving nutritional well-being of Malaysians.

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Supplementary material

To view supplementary material for this article, please visit <https://doi.org/10.1017/S1368980019001861>

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