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Detection of high risk people for diabetes by American diabetes association risk score



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in PERSIAN Guilan cohort study

Abstract

Background Diabetes mellitus (DM) is known as one of the most prevalent non communicable diseases with high cost of health services in the world. Present study was conducted to assess the frequency of high risk people for diabetes mellitus based on American Diabetes Association (ADA) risk score among Iranian people.

Methods Present study was a cross sectional study on non-diabetic subjects aged 35–70 years from 10,520 PERSIAN Guilan Cohort Study (PGCS). ADA risk score was calculated for every individual through an online calculator. Receiver operating characteristic (ROC) curves was used to assess diagnostic accuracy of the anthropometric indices to identify individuals with high risk ADA score for developing DM, represented by the area under the curve (AUC).

Results From 7989 study subjects, ADA risk score found 3874 (48.5%) and 1912 (23%) at risk for developing PreDM and DM, respectively. The results of ROC curve analyses showed the highest diagnostic value was related to waist circumference (WC) in total population and Waist to Height Ratio in both sex (0.695 total, 0.743 female, 0.744 male). The cut-points of WC in total population to identifying high risk group were 97 cm.

Conclusions A considerable number of populations were classified as high ADA risk for developing DM and PreDM that provide the importance of prevention strategies. Present study showed WC and Waist to Height Ratio have the highest diagnostic value to identify high risk people for DM.

Keywords Diabetes mellitus, Risk factors, Cohort studies

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Introduction

Diabetes mellitus (DM) is one of the most prevalent chronic diseases in the world with high cost of medical services due to complications of the disease [1]. Over the past decade, the prevalence of diabetes has risen due to aging, urbanization, and increased unhealthy behaviors like bad dietary habits, physical inactivity [2]. According to International Federation of Diabetes (IDF) Atlas for Diabetes, Middle East region and Iran were known as one of the counties with high prevalence of diabetes. It is estimated 9.2 million Iranian individuals will have diabetes by the year 2030 [3]. Hence, this dramatic increase in the diabetes prevalence results



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the high economic cost for management of disease and its complications [4]. In spite of genetic susceptibility, environmental factors like unhealthy diet habits and sedentary lifestyle play an important role in the development of diabetes [5]. Evidence from studies has clearly shown early identification and behavioral intervention to lose weight, increase physical activity and choose healthy diet can significantly decrease the incidence of diabetes and prediabetes [6, 7]. To decrease the burden of DM, several guidelines and World Health Organization (WHO) recommended strategies for early detection of individuals are at risk of diabetes [8–10]. Till now, several non-invasive and easily practical risk prediction model have been developed to identifying those with high risk for diabetes including FINDRISC (Finnish Diabetes Risk Score) [11], AUS-DRISK (Australian Type 2 Diabetes Risk Assessment Tool) [12], ADA (American Diabetes Association)RISK SCORE [13, 14], and a risk score had been developed in Thailand [15]. In a recent study [16] the validity of the ADA risk prediction models had been confirmed for identifying high risk individuals for type 2 diabetes in a large sample of Iranian population related to the Tehran Lipid and Glucose Study (TLGS). In the recent report, over the 70% of Guilan population were found to be overweight or obese [17] and consequently at risk of non-communicable disease. Hence, identifying high risk people and implementing community based prevention program seems to be substantial. The aim of present study was to assess the prevalence of high risk individuals for diabetes or prediabetes among Iranian individuals according to ADA risk score.

Materials and methods

Study design and population

This is a cross-sectional study on PGCS participants (PERSIAN Guilan Cohort Study), a prospective, population-based cohort study in Guilan has been described in detail elsewhere [17-19]. Briefly, PGCS was conducted on 10,520 participants aged between 35 and 70 years in Guilan province, northern Iran, between October 8, 2014 and January 20, 2017 as part of the Prospective Epidemiological Research Studies in Iran (PERSIAN). Eligible subjects were contacted through phone by trained interviewers who can spoke the native language of the region to participate the study. After signed informed constant all study data including demographic characteristics, socioeconomic status, lifestyle and sleep habits, Anthropometric indices and blood pressure were recorded by trained research assistants. Also biological samples were collected. In phase 2, annually active follow up was planned for next 15 years for all participants according to the PERSIAN cohort protocol [18]. Present study data included 7989 non diabetic participants of the PGCS study. Diabetic subjects were excluded. Subjects with DM in the PGCS were defined as 1) history of diagnosed DM 2) history of anti-diabetic medication consumption 3) fasting blood sugar (FBS) > 126 in the initial cohort laboratory data [17].

Data collection and measurement

For every participant, we retrieved data from PGCS database that were collected through interviews, physical examinations, and laboratory tests according to cohort protocol [17]. For the present study, data included demographic factors like age, sex, living location (city or rural), Marital status, Occupation (employed, unemployed), anthropometric indices including weight, height, hip and waist circumference, waist to hip ratio (WHpR) and waist to height ratio (WHtR), history of hypertension (HTN), gestational DM in women subjects and any history of DM in their first degree family like father, mother, sister or brother and finally information about physical activity. All anthropometric indices including weight, height, Hip Circumference (HC), Waist Circumference (WC), WHpR, and WHtR were measured by trained research assistants according to GCS protocol. Body mass index (BMI) was categorized as underweight (BMI < 18.5 kg/ m2), normal weight (BMI = 18.5-24.99 kg/m2), overweight (BMI = 25 - 29.9 kg/m2) and obese $(BMI \ge 30 \text{ kg/m2})$ m2). The level of physical activity was reported as metabolic equivalent rates (METs) based on self-reported daily activity PERSIAN cohort questionnaire.

The risk of developing DM or prediabetes was calculated for every individual based on ADA risk prediction model through online calculator [13] the ADA risk prediction model was developed based on American population higher than 20 years without DM to identify high risk individuals for DM or prediabetes. ADA risk score included 7 questions like age, sex, race, weight, height, family history of DM, history of gestational DM, history of HTN and physical activity. Total score was calculated between 0 and 11. The higher score represents a higher risk of diabetes. The cut point 5 or higher shows the high risk for DM and cut point 4 shows the high risk for prediabetes [13]. All required data for calculating ADA risk were extracted from cohort study. Family history of DM in ADA risk score was defined any history of diabetes in mother, father, sister or brother. Gestational diabetes in PERSIAN cohort was considered yes if women answered yes to the question "did you have a history of diabetes in pregnancy or did you have given birth a baby with ≥ 4 kg?" For race, all participants were defined as white. For physical activity, the question in ADA risk score tool was "are you physically active? Yes or no" Low level of physical activity in PERSIAN cohort was defined as less than mean METs rates of participants (41 METs/hour/day) that have been previously described in details [20].

Ethics

This research project was approved by the Ethics Committee of the Gastrointestinal and Liver Disease Research Center and Guilan University of Medical Sciences (code number IR.GUMS.REC.1398.241). All participants expressed their consent for participation in the research.

Statistical analysis

In this study, continuous variables were expressed as mean±standard deviation (SD) and categorical variables as frequency (percentage). One-way ANOVA and Chi-square test were used to compare demographic characteristics and anthropometric indices among normal, prediabetes, and diabetes groups. Receiver operating characteristic (ROC) curves were used to study diagnostic accuracy of the anthropometric indices for detecting patients with diabetes, represented by area under the curve (AUC). An AUC value of 0.5 indicates an entirely random classifier and an AUC value of 1 indicates perfect classifier. The best cut-off value was defined as the value with the highest accuracy that maximizes you den's J statistic, i.e. J = sensitivity + specificity - 1. Data analysis was performed using IBM SPSS Statistics for Windows, version 26.0 (IBM Corp., Armonk, NY, USA), and a P < 0.05 was considered statistically significant.

Result

Characteristics of the participants

Totally, of 10,520 participants, 7989 non-diabetic individuals were included in the study. Prevalence of DM in PGCS was 2531 (24.1%) [17]. Demographic characteristics and anthropometric indices of the participants are presented in Table 1. The geographic distributions of study participants according to ADA score category (normal, high risk for preDM, high risk for DM) are presented in Fig. 1. The mean age of the participants was 50.52 ± 8.75 years. More than, 51% were female, 91.2% were married, 54.9% were resident in rural areas, and 27.5% had normal BMI, 53.6% had a family history of diabetes.

Distribution of ADA risk score

Figure 2 presents the frequency of ADA risk scores among participants. The mean ADA risk score for all population were 4.48 (SD=1.55), and using a recommended cut-off values, the frequency of high risk subjects

for preDM and DM were, 23.9% (n = 1912) and 48.5% (n = 3874), respectively.

Comparison of groups

As presented in Table 1, all of the anthropometric indices (i.e., BMI, HC, WC, WHpR, and WHtR) in diabetes group were higher than those in prediabetes and normal groups. In addition, all anthropometric indices in prediabetes group were also higher than in normal group.

ROC curve analysis

Table 2 shows the cut point of anthropometric indices in the study population and also findings of the ROC curve. The results of ROC curve analyses to examine the diagnostic accuracy of the anthropometric indices for detecting patients with diabetes based on ADA risk score are presented in Table 2. Based on the AUC values, the anthropometric indices that had the highest diagnostic value was "Waist Circumference" followed by "BMI" in total population and Waist to Height Ratio according to sex in differentiating patients with diabetes and healthy subjects. Table 2.

Discussion

Finding from PGCS showed that, near to half of nondiabetic participants (48%) were high risk for developing DM and also more than 23% were high risk for preDM. In a large survey (National Health and Nutrition Examination Survey) conducted from 1999 to 2006, ADA risk score found 35% of subjects were high risk for DM [15]. In a recent descriptive large study conducted in central of Iran, prevalence of DM and preDM was 16.1 and 24.5%, respectively [21]. Evidence shows an increase of 35% in DM prevalence in 2011 compared to 2005. In parallel with our prediction, a meta-analysis modeling study estimated 9.2 million Iranian people will have diabetes by the year 2030 [3]. This significant increase in DM prevalence and also in DM complications, implementation of prevention and control programs seems to be substantial. Finding from Iranian National Surveys (2007-2016) on 7665 and 93,733 adults with and without known diabetes showed secondary prevention in individual level was effective to control of FBS level but primary prevention in non-diabetic people had no positive effect [22].

According to our study, frequency of high risk subjects for DM were superior in male when compared to female as well as in urban area rather than rural area. Although, more subjects of PGCS population lived in rural area. In primary analysis of PGCS, diabetes was more prevalent in females (27.3%) rather than males (20.2%) [17]. The finding of PERSIAN Kharameh cohort study showed that subjects living in urban areas were more likely to display

	Total	Normal (N)	Prediabetes (PreD)	Diabetes (D)	Р	
Age ^b (y)	50.52 ± 8.75	44.62±5.83	48.59±7.48	54.84±8.40	< 0.001	N < PreD < D
Sex ^c					< 0.001	
Male	3898 (48.8)	990 (25.4)	913 (23.4)	1995 (51.2)		
Female	4091 (51.2)	1213 (29.7)	999 (24.4)	1879 (45.9)		
Marital status ^c					< 0.001	
Single	259 (3.2)	129 (49.8)	53 (20.5)	77 (29.7)		
Married	7282 (91.2)	1969 (27.0)	1772 (24.3)	3541 (48.6)		
Widowed	348 (4.4)	65 (18.7)	68 (19.5)	215 (61.8)		
Divorced	100 (1.3)	40 (40.0)	19 (19.0)	41 (41.0)		
Occupation ^c					< 0.001	
Employed	3372 (42.2)	793 (23.5)	785 (23.3)	1794 (53.2)		
Unemployed	4617 (57.8)	1410 (30.5)	1127 (24.4)	2080 (45.1)		
Place of residence ^c					< 0.001	
Urban	3601 (45.1)	893 (24.8)	868 (24.1)	1840 (51.1)		
Rural	4388 (54.9)	1310 (29.9)	1044 (23.8)	2034 (46.4)		
Height ^b (cm)	162.94±9.35	163.38±9.29	163.07±9.29	162.62±9.39	0.008	N>D
Weight ^b (kg)	73.91 ± 13.54	67.49±11.23	72.96 ± 12.75	78.03 ± 13.61	< 0.001	N < PreD < D
BMI ^c (kg/m ²)	27.90 ± 4.97	25.34 ± 4.08	27.49 ± 4.62	29.56 ± 4.94	< 0.001	N < PreD < D
Underweight	119 (1.5)	64 (53.8)	31 (26.1)	24 (20.2)	< 0.001	
Normal	2200 (27.5)	1063 (48.3)	545 (24.8)	592 (26.9)		
Overweight	3177 (39.8)	850 (26.8)	825 (26.0)	1502 (47.3)		
Obese	2493 (31.2)	226 (9.1)	511 (20.5)	1756 (70.4)		
Family history of diabetes ^c					< 0.001	N < PreD < D
No	3703 (46.4)	1435 (38.8)	904 (24.4)	1364 (36.8)		
Yes	4286 (53.6)	768 (17.9)	1008 (23.5)	2510 (58.6)		
Physical activity ^c					< 0.001	N < PreD < D
< 41 METs/hour/day	4595(57.5)	860(18.7)	1017(22.1)	2718(59.1)		
> 41 METs/hour/day	3394(42.5)	1341(39.5)	895(26.3)	1156 [22]		
Hypertension ^c					< 0.001	N < PreD < D
No	5041(63.1)	1985(39.4)	1427(28.3)	1629(32.3)		
Yes	2948(36.9)	218(7.4)	485(16.5)	2245(76.2)		
Hip Circumference ^b (cm)	102.92 ± 9.65	99.07 ± 8.16	102.14 ± 9.07	105.50 ± 9.91	< 0.001	N < PreD < D
Waist Circumference ^b (cm)	97.98 ± 12.32	91.64 ± 11.04	96.79 ± 11.23	102.18 ± 11.84	< 0.001	N < PreD < D
Wrist Circumference ^b (cm)	16.69 ± 1.34	16.17 ± 1.21	16.57 ± 1.25	17.04 ± 1.34	< 0.001	N < PreD < D
Waist/Hip Ratio ^b	0.95 ± 0.06	0.92 ± 0.07	0.95 ± 0.06	0.97 ± 0.05	< 0.001	N < PreD < D
Waist/Height Ratio ^b	0.60 ± 0.09	0.56 ± 0.08	0.60 ± 0.08	0.63 ± 0.09	< 0.001	N < PreD < D

Table 1 Demographic and clinical characteristics of adult participants based on ADA risk scores in PGSC^a (n = 7989)

^a PERSIAN Guilan Cohort Study, ^b mean \pm SD, ^c number (%)

metabolic syndrome and DM than those living in rural areas [23]. Contrary to our study in Kharameh cohort study, prevalence of impaired fasting glucose in females was higher than males. On the other hand, according to International Diabetes Federation, there were about 14 million more men than women with diabetes (198 million men vs 184 million women) in 2013 and it seems the difference increases to 15 million (303 million men vs 288 million women) by 2035 [24]. Furthermore, in a cross sectional study among adults aged 20–80 years in

northern part of Iran was observed DM were most prevalent in males than females [25].

In present study, subjects with high risk for DM had higher waist and hip circumference, waist/hip ratio and waist/height ratio compared to those with low risk group and also to preDM group. Correlation of obesity and risk of developing DM was reported in previous evidence [25–28].

Our study showed that, the calculated cut points of BMI, Hip Circumference and Waist Circumference in

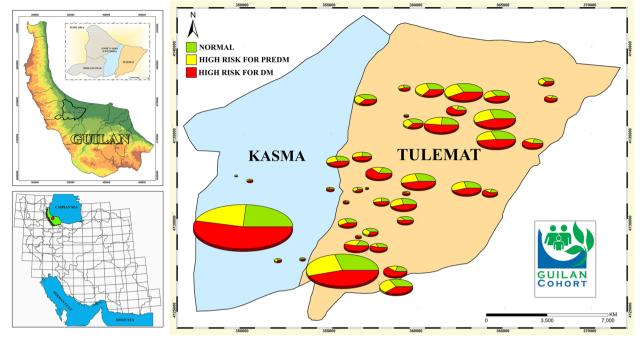


Fig. 1 The geographic distributions of study participants according to ADA score category

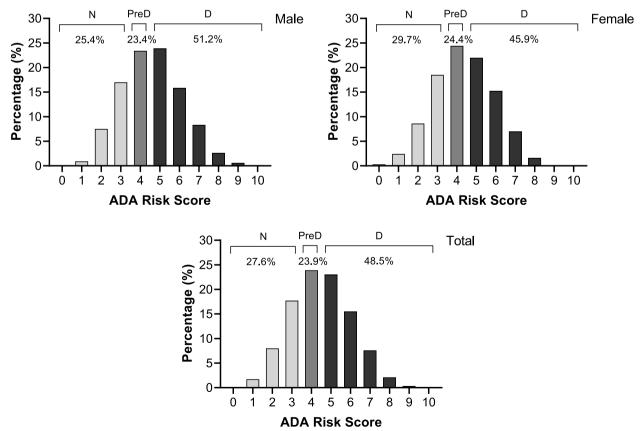


Fig. 2 Distribution of ADA risk score among adults participants without diagnosed DM in the Persian Guilan Cohort Study (*n* = 7989). N: Normal; PreD: Prediabetes; D: Diabetes

Table 2 Diagnostic accuracy of anthropometric indices for detecting participants with diabetes using ROC curve analysis

	Cut-Point	Sensitivity (%)	Specificity (%)	AUC
Male				
Weight	eight 76.0		68.5	0.663
BMI	24.74	77.1	56.8	0.720
Hip Circumfer- ence	100.1	54.5	69.7	0.668
Waist Circumfer- ence	93.1	65.9	66.5	0.720
Wrist Circumfer- ence	17.2	58.3	63.8	0.648
Waist to Hip Ratio	0.94	67.8	63.5	0.708
Waist to Height Ratio	0.56	59.1	76.9	0.744
Female				
Weight	72.5	62.5	64.1	0.676
BMI	29.44	71.3	66.6	0.724
Hip Circumfer- ence	106.4	61.8	66.5	0.683
Waist Circumfer- ence	103.1	64.3	70.3	0.728
Wrist Circumfer- ence	16.2	54.4	66.7	0.649
Waist to Hip Ratio	0.97	59.1	63.6	0.647
Waist to Height Ratio	0.64	76.1	60.8	0.743
Total				
Weight	73	62.1	63.0	0.670
BMI	29.16	52.8	77.2	0.693
Hip Circumfer- ence	103	55.1	67.6	0.653
Waist Circumfer- ence	97.1	66.1	63.4	0.695
Wrist Circumfer- ence	17	44.5	75.4	0.643
Waist to Hip Ratio	0.94	73.8	50.0	0.663
Waist to Height Ratio	0.59	66.1	56.8	0.666

^a AUC: Area Under The Curve

women were higher than in men. Parallel to the findings of present study, PERSIAN study on 17 cohort centers showed the prevalence of overweight and obesity in male and female was 60 and 78%, respectively [29]. Also, based on another cross sectional study on the PERSIAN Guilan Cohort Study, 86% of women and 68% of men were in BMI > 25 category. As well as, the frequency of women and men with high waist circumference was 93 and 21%, respectively [30].

According to our finding, WC followed by BMI had the highest diagnostic value in identifying high risk men and women for developing DM. Although, a prospective study on Iranian adult men in 2006 indicated WHtR is better than BMI and WC in detecting urban men population who was at risk of diabetes [31]. On the other hand, according to a study based on Isfahan Cohort Study (ICS), WC compared to other anthropometric indices was better indicator of metabolic syndrome in Iranian women and men population [32]. Furthermore, previous researches showed WC is strongly related to all-cause and cardiovascular mortality with or without adjustment for BMI [33, 34]. Recent review indicated waist circumference is associated with health outcomes within all BMI categories in every sex and age [35].

In the present study, cut-points of WC and BMI for identifying high risk people for developing DM were 97 and 29, respectively which were higher than the recommended cutoff for major CVD risk factors in previous studies [32, 36, 37]. The first Iranian study on anthropometric indices proposed WC and BMI cut-offs for detecting DM, between 82 and 95 cm and 25–29 in women and men, in various age groups [36]. Iranian National Committee of Obesity reported people with WC of \geq 90 cm are at high risk for CVD event [37].

Cut-points of WHpR to identify high risk individual for developing DM in the present study were 0.94 that somewhat close to the recommended cut point in other studies. For example, P Mirmiran et al. found cut-points of WHR between 0.86 and 0.97 for men and between 0.78 and 0.92 for women were high risk for various CVD risk factors [36]. In our study, the diagnostic values of WHpR and WHtR in identifying high risk people for DM were relatively similar. The diagnostic value of WHtR in Chinese cohort study was reported 0.679 that was in parallel with our finding(AUC: 0.666) [38]. A recent study in middle east region showed WHtR can better predict the risk of DM and also HTN [39]. Finding from a population based study of 1852 Iranian males aged \geq 20 years showed WHtR was a strong predictor for developing type 2 diabetes in the future [31].

In total, finding high risk people in individual and community level may help people and policy makers to develop and plan prevention strategies. We detect considerable numbers of Iranian adult lived in northern part of Iran were high risk for developing DM and PreDM. Hence, note to lifestyle modification in individual and community level seems to be substantial. Our study was based on PGCS with large sample size and accurate data collection. Data collection and measurement were based on Persian cohort study standards that increase the precision of the finding. However, this study involves some limitation. Firs due to cross sectional nature of present study design, we couldn't define the actual risk of study subjects and compare to their calculated risk. However, the validity and sensitivity of ADA risk score among PGCS population could be assess in the future years using long term follow up duration. Furthermore, some study variables like physical activity, history of gestational diabetes were measured based on self-reported that increases the probability of recall bias.

Conclusion

In conclusion, present study showed considerable number of people lived in the northern part of Iran were classified in high risk category of ADA risk score for developing DM and PreDM. High risk group were more prevalent in male rather than female and also urban residents. According to our finding, waist circumference and Waist to Height Ratio appears to be better diagnostic value in identifying high risk people for developing DM.

Abbreviations

DM	Diabetes,Mellitus
ADA	American Diabetes Association
PGCS	PERSIAN Guilan Cohort Study
ROC	Receiver operating characteristic
AUC	Area under the Curve
WC	Waist Circumference
WHO	World Health Organization
TLGS	Tehran Lipid and Glucose Study
GCS	Guilan cohort study
WHpR	Waist to Hip Ratio
WHtR	Waist to Height Ratio
HTN	History of Hypertension
HC	Hip Circumference
METs	Metabolic Equivalent Rates
BMI	Body Mass Index

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Authors' contributions

TH, FJ and FM-G were involved in the study design. SM and MN data analysis. SS data collection and contributed to data interpretation. SS and TH literature searched. TH, FJ, FM-G,MN and ZH wrote the initial draft of the manuscript, TH and FJ and FM-G contributed toward its final version. FJ and ZH generated of figures. All authors were involved in writing the paper and had final approval of the submitted and published versions.

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Availability of data and materials

Datasets used during the study are available from the corresponding author on reasonable request.

Declarations

Ethics approval and consent to participate

All participants gave written informed consent in accordance with the Declaration of Helsinki. This research project was approved by the Ethics Committee of the Gastrointestinal and Liver Disease Research Center and Guilan University of Medical Sciences (code number IR.GUMS.REC.1398.241).

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

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