



# Evaluation of Finnish Diabetes Risk Score in Screening Undiagnosed Diabetes and Prediabetes among U.S. Adults by Gender and Race: NHANES 1999-2010

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## Abstract

**Objective:** To evaluate the performance of Finnish Diabetes Risk Score (FINDRISC) in detecting undiagnosed diabetes and prediabetes among U.S. adults by gender and race.

**Methods:** This cross-sectional analysis included participants (aged  $\geq 20$  years) from the National Health and Nutrition Examination Survey (NHANES) 1999–2010. Sensitivity, specificity, area under the receiver operating characteristic (ROC) curve and the optimal cutoff points for identifying undiagnosed diabetes and prediabetes were calculated for FINDRISC by gender and race/ethnicity.

**Results:** Among the 20,633 adults ( $\geq 20$  years), 49.8% were women and 53.0% were non-Hispanic White. The prevalence of undiagnosed diabetes and prediabetes was 4.1% and 35.6%, respectively. FINDRISC was positively associated with the prevalence of diabetes (OR = 1.48 for 1 unit increase,  $p < 0.001$ ) and prediabetes (OR = 1.15 for 1 unit increase,  $p < 0.001$ ). The area under ROC for detecting undiagnosed diabetes was 0.75 for total population, 0.74 for men and 0.78 for women ( $p = 0.04$ ); 0.76 for White, 0.76 for Black and 0.72 for Hispanics ( $p = 0.03$  for White vs. Hispanics). The area under ROC for detecting prediabetes was 0.67 for total population, 0.66 for men and 0.70 for women ( $p < 0.001$ ); 0.68 for White, 0.67 for Black and 0.65 for Hispanics ( $p < 0.001$  for White vs. Hispanics). The optimal cutoff point was 10 (sensitivity = 0.75) for men and 12 (sensitivity = 0.72) for women for detecting undiagnosed diabetes; 9 (sensitivity = 0.61) for men and 10 (sensitivity = 0.69) for women for detecting prediabetes.

**Conclusions:** FINDRISC is a simple and non-invasive screening tool to identify individuals at high risk for diabetes in the U.S. adults.

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## Introduction

Type 2 diabetes prevalence in the U.S. is increasing dramatically, with the age-adjusted prevalence of adults (aged 18 years or older) increased from 4.5% in 1995 to 8.2% in 2010 [1]. The economic cost of diabetes in the U.S., estimated by American Diabetes Association (ADA), was \$255 billion in 2012, a 41% increase since 2007 [2]. Under the current diabetes incidence trend, it is projected that 1 in every 3 U.S. adults will have diabetes (diagnosed or undiagnosed diabetes) in 2050 [3]. Additionally, a relative high rate of undiagnosed diabetes has been identified in the U.S., accounting for about 27% of the total diabetes cases of all ages [1]. Also, in 2005–2008, 35% of U.S. adults (older than 20 years) and 50% of those older than 65 years had prediabetes, a high risk stage of type 2 diabetes [4].

Emerging evidence from both observational studies and randomized controlled trials (RCTs) has clearly shown that people with high risk for type 2 diabetes or people at prediabetes stage will be benefited by early identification followed by the intensive lifestyle intervention and pharmacological treatment [5–9]. Thus, identifying those individuals becomes crucial and cost efficient. The traditional diabetes screening methods, including the fasting plasma glucose (FPG), the 2-hour oral glucose tolerance test (OGTT) or HbA1c test, are invasive, inconvenient and expensive [10,11]. This is also one of the important reasons why there are a large number of diabetic patients remaining undiagnosed. Seeking a simple, reliable and cost-effective diabetes screening method, such as a diabetes risk score that can be easily conducted in clinical or community setting, has been proposed by many investigators in many countries [12–23]. However, a recent research indicated

that diabetes risk scores derived from certain populations could have low validity when they were applied to the other populations [24]. Therefore, it is important to evaluate the performance of the diabetes risk score in a specific population before applying it in this population [24].

World-wide, more than 10 diabetes risk assessment tools have been developed from different populations [12–23]. Among them, Finnish Diabetes Risk Score (FINDRISC) is the most commonly used risk score in detecting undiagnosed diabetes. FINDRISC has multiple advantages over other diabetes risk scores. First, FINDRISC is a simple self-administered questionnaire which can be used as an initial diabetes screening in primary care or community settings. It can be well understood and easily calculated by the lay person or clinical personnel without any laboratory test. Second, FINDRISC was developed in a prospective study with an excellent performance in predicting the 10-year incident diabetes in Finnish population [16]. Third, FINDRISC includes 8 clearly defined questions that cover all well known risk factors of diabetes. Last but not the least, FINDRISC has been evaluated in detecting individuals with undiagnosed diabetes and prediabetes in a cross-sectional study in Finland [25] and 15 other countries or regions and gained good validity in most of these populations [24,26–39]. However, most previous studies have been conducted in European countries with the majority of participants as Caucasians [26–32] or other single racial groups [24,33–39]. The performance of the FINDRISC in the U.S., a country with multiple racial/ethnic groups, is still unknown. The aim of this study is to evaluate the performance of FINDRISC in identifying undiagnosed diabetes and prediabetes in U.S. population by sex and race/ethnicity. With the increase in the prevalence of type 2 diabetes and its associated economic burden in the U.S., identifying type 2 diabetes at early stage with simple and accurate methods becomes a public health priority.

## Methods

### Study Population (NHANES 1999–2010)

The National Health and Nutrition Examination Survey (NHANES) is designed to assess the health and nutritional status of adults and children in the U.S. through surveys including national representative sample of non-institutionalized U.S. population. From 1999, the NHANES survey became a continuous program and data were collected every 2 years. The NHANES 2009–2010 is the most updated survey released for public and research. Details of the NHANES design and procedures are available at Center for Disease Control and Prevention (CDC) website [40]. In brief, NHANES 1999–2010 includes 6 cross-sectional surveys (1999–2000, 2001–2002, 2003–2004, 2005–2006, 2007–2008, 2009–2010) that were based on a stratified multistage probability sampling design. Low-income persons, adolescents aged 12–19 years, persons aged 60 years or older, African Americans and Mexican Americans were over-sampled in NHANES surveys. Each survey included two components: a household interview and a health examination. The household interview included questionnaires on demographic, socioeconomic, dietary, and health-related information. The health examination component consisted of medical, dental, and physiological measurements, as well as laboratory tests administered by trained medical personnel in a fully equipped mobile examination center (MEC).

For this study, we included all participants from NHANES 1999–2010 aged 20 years or above who had complete information to calculate FINDRISC. The final sample size included in this analysis was 20,633.

### Finnish Diabetes Risk Score

FINDRISC was originally developed to predict the 10 years diabetes incidence in Finnish population (35 to 64 years) in a cohort study [16]. The FINDRISC is calculated based on a simple questionnaire with 8 questions, including age (years), body mass index (BMI: kg/m<sup>2</sup>), waist circumference (WC: cm), history of antihypertensive drug treatment, history of high blood glucose, family history of diabetes, daily consumption of fruits, berries, or vegetables (consume every day vs. not), and daily physical activity (having at least 30 minutes of physical activity during work or at leisure time vs. not) [16]. The questionnaire can be completed without any laboratory test. The answer of every question is assigned with different weighted scores according to the risk increase associated with the respective values in the regression model in the original cohort. The final score is the sum of the scores from 8 questions and ranges from 0 to 26 [25].

In our study, BMI and WC were identified from the anthropometric data measured by trained personnel in MEC. Daily physical activity time was calculated as the sum of the minutes spent on physical activity for commuting, recreation, and work on average for each day. The frequency of vegetables, fruits or berries consumption was initially collected through 24-hour food recall, and only those who consumed vegetables or fruits at least 100 grams/day were considered as consuming vegetables or fruits or berries every day. The answers to all the other questions of the FINDRISC were identified via self-reported answers from NHANES questionnaires.

### Diabetes and Prediabetes Definition and Measurement

In the present study, we categorized individuals into different groups according to their self-reported diabetes status and laboratory test results. The criteria of lab diagnosed diabetes and prediabetes were based on the most updated ADA 2013 definitions [41]. Specifically, self-reported/diagnosed diabetes was defined as having answered “Yes” to the question “Other than during pregnancy, have you ever been told by a doctor or health professional that you have diabetes or sugar diabetes?”. Undiagnosed diabetes was defined as having HbA1c  $\geq 6.5\%$ , or FPG  $\geq 126$  mg/dl, or 2-h OGTT plasma glucose  $\geq 200$  mg/dl, but not having self-reported diabetes. Diabetes included individuals either in the self-reported/diagnosed diabetes category or in the undiagnosed diabetes category. Prediabetes was defined as not having diagnosed or undiagnosed diabetes, but having HbA1c between 5.7 and 6.4%, or FPG between 100 and 125 mg/dl, or 2-h OGTT plasma glucose between 140 and 199 mg/dl. Normal glycemic level included individuals who did not have self-reported diabetes and did not meet the diabetes and prediabetes diagnosis criteria according to the FPG, 2-h OGTT, and/or HbA1c values.

### Statistical Analysis

**Primary Analyses.** Descriptive data on study participants' characteristics were expressed as means  $\pm$  standard deviations (SD) for continuous variables and percentage for categorical variables. Student's t-test and  $\chi^2$  test were applied to compare continuous and categorical variables, respectively. These procedures allow users to specify primary sampling units, stratification identification and sampling weights in the statistical procedures, as well as to generate design-adjusted means, percentages, standard errors (SE) and regression coefficients ( $\beta$ ). Unadjusted and adjusted logistic regressions were performed to estimate the association of FINDRISC with diabetes, undiagnosed diabetes, and prediabetes, separately, where the smoking status (never, former, vs. current smoker), current alcohol drinking (yes vs. no), highest education level (with vs. without college degree or above), annual household

income (more than vs. less than annual household income of \$45,000) have been controlled in the adjusted analyses. Sensitivity, specificity, positive (PV+) and negative (PV-) predictive values were calculated for each FINDRISC score from 5 to 15 points for detecting undiagnosed diabetes (individuals with self-reported diabetes were excluded from this analysis) and prediabetes (individuals with self-reported or undiagnosed diabetes were excluded from this analysis). Gender- and race-specific receiver operating characteristic (ROC) curves were constructed to visually show the relationship between true-positive (sensitivity) and false positive (1-specificity). The area under the curve (AUC) was used to evaluate the performance of FINDRISC in detecting undiagnosed diabetes and prediabetes. An AUC = 0.5 indicated the test performed no better than chance and AUC = 1.0 indicated perfect discrimination. The optimal cutoff points were determined by the point with the shortest distance in the ROC curve which was calculated as the square root of  $[(1-\text{sensitivity})^2 + (1-\text{specificity})^2]$  [42]. All the statistical analyses were performed using SAS software, version 9.3 (SAS Institute, Cary, NC).

**Secondary Analyses.** Our secondary analyses were aimed to 1) compare FINDRISC with another diabetes risk score developed among Americans [12]; 2) conduct a stratified analysis by age (<65 vs.  $\geq 65$  years of age); and 3) conduct a sensitivity analysis among a subgroup of individuals who had all results of FPG, OGTT and HbA1c.

## Results

A total of 20,633 adults aged  $\geq 20$  years (mean:  $47.5 \pm 17.8$  years) were included in this analysis. Characteristics of participants according to the FINDRISC group were presented in Table 1. Around half of the population were women (49.79%), non-Hispanic White (52.97%), having household income less than \$45,000/year (51.16%), currently married (56.42%) and having college degree or above (51.51%). The majority of the population were current alcohol drinkers (72.58%) but were non-smokers (78.47%). Among all participants of NHANES 1999–2010, the weighted percentage of self-reported/diagnosed diabetes, undiagnosed diabetes and prediabetes were 10.47%, 4.14% and 35.55%, respectively. Age, female percentage, percentage of annual household income below \$45,000, percentage of married status, BMI, waist circumference, FPG, HbA1c, and systolic blood pressure increased with greater FINDRISC score (for each,  $P < 0.0001$ ).

Figure 1 shows the prevalence of diabetes (both self-reported and undiagnosed diabetes,  $N = 20,633$ ) and prediabetes (self-reported/diagnosed and undiagnosed diabetes excluded,  $N = 18,113$ ) by gender and race/ethnicity across the six FINDRISC groups (0–3, 4–6, 7–10, 11–14, 15–19, and 20–26). The FINDRISC was positively associated with the presence of diabetes and prediabetes in all the gender and racial/ethnic groups: peaked in the highest FINDRISC score group (20–26 points). The prevalence of diabetes increased from 0.83% to 93.99% for men and from 0.44% to 90.27% for women in the lowest FINDRISC group (0–3 points) compared to the highest FINDRISC group (20–26 points) (Figure 1A). The same increasing trend was identified by racial/ethnic group. In the highest FINDRISC group (20–26 points), the prevalence of diabetes was 89.63% among non-Hispanic White, 92.95% among non-Hispanic Black and 93.77% among Hispanics (Figure 1B). The prevalence of undiagnosed diabetes ( $N = 18,879$ ) was also found to be positively associated with FINDRISC after excluding the diagnosed diabetes, with 28.57% for men, 18.97% for women, 22.00% for non-Hispanic White, 29.17% for non-Hispanic Black, 15.79% for

Hispanics in the highest FINDRISC group (20–26 points) (data not shown). After excluding all diabetic patients, the prevalence of prediabetes also peaked in the highest FINDRISC group (20–26 points): 88.00% for men, 59.57% for women, 64.10% for non-Hispanic White, 82.35% for non-Hispanic Black, and 68.75% for Hispanics (Figure 1 C and D). Despite of the same positive association trend for the 3 diabetic categories with FINDRISC, there were gender and racial/ethnic differences in terms of the distribution of the prevalence. Men had higher prevalence of diabetes, undiagnosed diabetes and prediabetes than women in all the FINDRISC score groups. Hispanics had a higher prevalence of diabetes while Non-Hispanic Black had a higher prevalence of undiagnosed diabetes and prediabetes over the other racial/ethnic groups.

Results from the logistic regressions also showed significant associations of FINDRISC with all diabetes, undiagnosed diabetes and prediabetes. One unit increase in FINDRISC was associated with a 48.2% (95% CI: 46.0%, 50.5%) increased odds of having diabetes, a 22.3% (95% CI: 20.0%, 24.7%) increased odds of having undiagnosed diabetes and a 14.9% (95% CI: 14.0%, 15.8%) increased odds of having prediabetes after adjusting for the smoking status, alcohol drinking, highest education level, and the annual household income (data not shown). There was no interaction between gender and FINDRISC score, indicating the associations between FINDRISC and the prevalence of diabetes, undiagnosed diabetes or prediabetes were similar comparing men with women.

As shown in Table 2, the sensitivity of FINDRISC for identifying undiagnosed diabetes and prediabetes decreased as the specificity increased in both men and women. At the cutoff value of 10 in men (sensitivity = 74.68%; specificity = 62.74%) and 12 in women (sensitivity = 72.17%; specificity = 68.60%), the distance in ROC was the shortest for undiagnosed diabetes (0.45 in men and 0.42 in women). Accordingly, using the optimal cutoff point of FINDRISC of 9 in men (sensitivity = 60.94%; specificity = 62.43%) and 10 in women (sensitivity = 68.72%; specificity = 60.89%) resulted in the shortest distance in ROC for prediabetes (0.54 in men and 0.50 in women). We also evaluated the racial/ethnic specific optimal cutoff points for both undiagnosed diabetes and prediabetes (data not shown). We found that the best cutoff point for undiagnosed diabetes was 11 for non-Hispanic White (sensitivity = 74.93%), 12 for non-Hispanic Black (sensitivity = 71.25%), and 11 for Hispanics (sensitivity = 65.98%). The optimal cutoff point for prediabetes was 10 for each race/ethnicity, but with the highest sensitivity for non-Hispanic Black (62.42%) and the lowest sensitivity for Hispanics (55.88%). By combining all men and women, the optimal cutoff point for undiagnosed diabetes was 11 (sensitivity = 72.13%; specificity = 65.48%); for prediabetes, the optimal cutoff point was 10 (sensitivity = 59.34%; specificity = 65.43%) in this U.S. population (data not shown).

The area under the ROC curve for identifying undiagnosed diabetes were 0.74 in men and 0.78 in women ( $p < 0.001$ ); 0.76 for White, 0.76 for Black and 0.72 for Hispanics ( $p = 0.03$  for White vs. Hispanics) (Figure 2 A and B). Whereas for identifying prediabetes, the area under the ROC curve was 0.66 for men and 0.70 for women ( $p < 0.001$ ); 0.68 for White, 0.67 for Black and 0.65 for Hispanics ( $p < 0.001$  for White vs. Hispanics) (Figure 2 C and D). After combining all the men and women participants, the area under the ROC curve was 0.75 for identifying undiagnosed diabetes and 0.67 for identifying prediabetes.

We performed stratified analysis by age (<65 vs.  $\geq 65$  years of age, men and women combined) because the original FINDRISC was developed in a population with age younger than 65 years

**Table 1.** Characteristics of the participants aged 20 years or above in NHANES 1999–2010, by FINDRISC group.\*

Characteristics	FINDRISC Group					P	All Participants
	1 <sup>st</sup>	2 <sup>nd</sup>	3 <sup>rd</sup>	4 <sup>th</sup>	5 <sup>th</sup>		
<b>FINDRISC value</b>							
Mean (SD)	3.33 (2.05)	8.91 (1.43)	12.86 (0.83)	16.87 (1.63)	22.49 (1.38)	<.0001	9.49 (5.37)
Median (range)	4 (0–6)	9 (7–11)	13 (12–14)	17 (15–20)	22 (21–26)		9 (0–26)
<b>N</b>	6,126	7,311	3,687	2,845	664		20,633
<b>Age, year</b>	36.98 (14.28)	47.49 (17.45)	51.85 (17.17)	60.62 (13.20)	63.90 (10.11)	<.0001	47.49 (17.81)
<b>Female, %</b>	42.87	51.18	54.62	53.99	53.46	<.0001	49.79
<b>Race/Ethnicity, %</b>							
Non-Hispanic White	54.05	55.41	51.59	48.86	41.57	<.0001	52.97
Non-Hispanic Black	16.68	16.00	19.88	22.07	27.56		18.11
Hispanics	23.84	24.93	25.14	26.12	27.71		24.90
Other <sup>†</sup>	5.44	3.65	3.39	2.95	3.16		4.02
<b>Annual household income, %</b>							
Above \$45,000/year	51.34	48.60	43.40	37.49	32.38	<.0001	46.42
Below \$45,000/year	46.21	48.90	54.19	60.49	64.44		51.16
Other <sup>‡</sup>	2.45	2.50	2.40	2.02	3.17		2.42
<b>Marriage status (married), %</b>	49.98	59.37	58.68	58.90	60.06	<.0001	56.42
<b>Education (have college degree or above), %</b>	57.03	52.81	49.93	41.51	37.66	<.0001	51.51
<b>Current smoking (yes), %</b>	27.39	20.76	19.27	16.03	12.20	<.0001	21.53
<b>Current alcohol intake (yes), %</b>	78.55	74.14	68.17	65.03	58.58	<.0001	72.58
<b>BMI, kg/m<sup>2</sup></b>	23.68 (3.05)	28.76 (5.62)	31.47 (6.06)	32.47 (6.00)	33.65 (6.09)	<.0001	28.41 (6.18)
<b>Waist circumference, cm</b>	84.36 (8.95)	98.81 (13.16)	105.24 (13.41)	108.51 (13.10)	112.35 (13.00)	<.0001	97.44 (15.25)
<b>FPG<sup>§</sup>, mg/dl</b>	93.86 (14.40)	99.31 (21.41)	106.25 (30.00)	126.26 (51.97)	161.15 (69.65)	<.0001	104.75 (33.66)
<b>HbA1c, %</b>	5.20 (0.41)	5.41 (0.64)	5.65 (0.89)	6.30 (1.47)	7.33 (1.60)	<.0001	5.58 (0.97)
<b>Systolic BP</b>	115.81 (14.89)	122.77 (18.21)	126.46 (18.61)	132.65 (20.23)	133.39 (20.93)	<.0001	123.07 (18.70)
<b>Diastolic BP</b>	68.79 (11.55)	70.65 (13.10)	71.55 (13.59)	70.91 (14.81)	67.35 (15.20)	<.0001	70.19 (13.13)
<b>Diabetes, %</b>							
unweighted	0.93	4.17	11.09	39.30	99.10	<.0001	12.34
Weighted	1.05	4.54	11.01	39.33	98.27		10.47
<b>Undiagnosed diabetes, %</b>							
Unweighted	0.85	3.31	6.54	9.00	0.30	<.0001	3.84
Weighted	0.97	3.61	7.35	11.03	0.27		4.14
<b>Prediabetes, %</b>							
Unweighted	16.59	28.70	36.94	33.74	0.60	<.0001	26.37
Weighted	24.22	39.76	48.73	42.07	1.73		35.55

Data are means (SD) except where noted otherwise.

\*FINDRISC group: = 1 if score <7, = 2 if score 7–11, = 3 if score 12–14, = 4 if score 15–20, = 5 if score >20;

<sup>†</sup>Other race, including multiracial;

<sup>‡</sup>The participants select the annual household income as over \$20,000;

<sup>§</sup>Fasting plasma glucose.

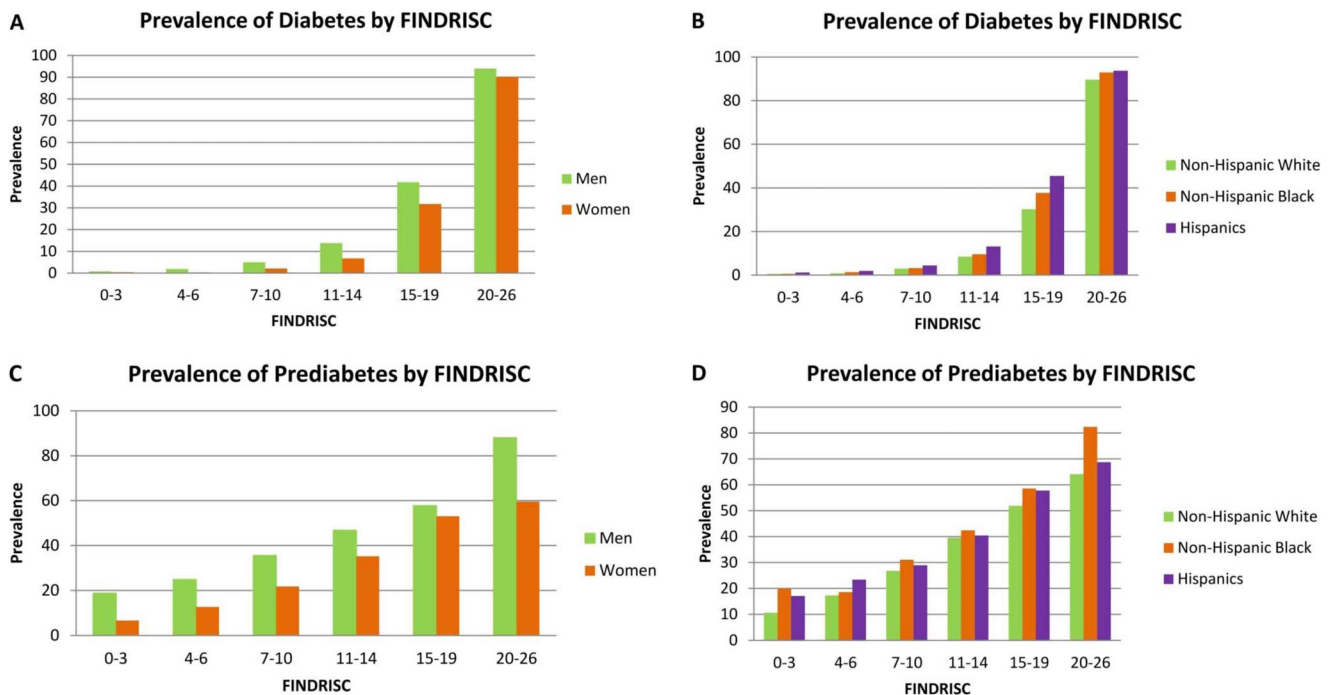
doi:10.1371/journal.pone.0097865.t001

(data not shown). For undiagnosed diabetes, the area under the ROC curve was 0.75 for all individuals, 0.75 for participants younger than 65 years (N = 17,072), and 0.65 for participants aged 65 years or above (N = 3,561). The sensitivity (cutoff point = 10) was 75.27% for participants younger than 65 years and 87.04% for participants aged 65 years or above. For prediabetes, the area under the ROC curve was 0.67 for all individuals, 0.66 for participants younger than 65 years, and 0.57 for participants aged 65 years or above. The sensitivity (cutoff point = 9) was 61.40%

for participants younger than 65 years and 82.98% for participants aged 65 years or above.

## Discussion

In this large, cross-sectional study of national representative sample of free-living adults in the U.S., we found that the FINDRISC had good performance in identifying undiagnosed



**Figure 1. Prevalence of diabetes (A and B) and prediabetes (C and D) by Finnish Diabetes Risk Score (FINDRISC) by gender and race/ethnicity, in US men and women aged 20 years or above, NHANES 1999–2010.** The prevalence of diabetes (including diagnosed and undiagnosed diabetes) was calculated among all participants; the prevalence of prediabetes was calculated among participants excluding the diagnosed and undiagnosed diabetes. doi:10.1371/journal.pone.0097865.g001

diabetes and prediabetes in both men and women in all racial/ethnic groups.

Type 2 diabetes usually starts from increased insulin resistance, a disorder that cells cannot respond to insulin normally and the pancreas gradually loses its ability to generate enough insulin. Two population-based studies have confirmed that the FINDRISC is associated with insulin resistance [43,44], which supports the use of FINDRISC in detecting type 2 diabetes from the biological aspect.

The current ADA guideline for type 2 diabetes screening among asymptomatic population is based on the laboratory testing [45]. However, there is always a trade-off between simplicity and accuracy for each screening method. Thus, using a simple and valid questionnaire as a preliminary screening method followed with more invasive and accurate diagnosis in primary care and/or community settings, can be a cost-effective and practical method. FINDRISC is such a simple and non-invasive diabetes risk score which can be well understood by lay people and easily calculated by the lay people or clinical personnel without any laboratory test. It has been evaluated and performed well in many European countries [26–32]. To our knowledge, this study is the first study to validate the FINDRISC in national representative population in U.S.. As we expected, FINDRISC had a good validity in detecting undiagnosed diabetes and prediabetes in the U.S. adults. The areas under ROC curve for detecting undiagnosed diabetes were 0.74 in men and 0.78 in women in the U.S., which were very similar with those in other European populations. FINDRISC can also be used to detect prediabetes with the areas under ROC curve of 0.66 for men and 0.70 for women.

A risk score for undiagnosed diabetes using the data of NHANES 1999–2004 was developed by Bang et al. in 2009 [12]. This risk score (NHANES DRS) is calculated out of 6

variables, including age, sex, family history of diabetes, personal history of hypertension, obesity, and physical activity. Although NHANES DRS is comprised of readily available health information without using any laboratory test results and is originated among Americans, it was constructed from a cross-sectional dataset. The definition of diabetes used in developing this risk score was only based on the fasting plasma glucose value, ignoring the OGTT or HbA1c value. In addition, NHANES DRS does not use any information on dietary intake which is well known to play an important role in diabetes development. However, as the NHANES DRS was developed from U.S. populations, it could be informative to compare FINDRISC and NHANES DRS using the current dataset. For undiagnosed diabetes, the area under the ROC curve of NHANES DRS was 0.77 (vs. 0.75 of FINDRISC) in all individuals, 0.76 (vs. 0.74 of FINDRISC) in men, and 0.78 in women (vs. 0.78 of FINDRISC). Although NHANES DRS has the advantage of being generated using NHANES data, the FINDRISC has very similar discriminating ability as compared to NHANES DRS from our results.

Compared with previous evaluation of FINDRISC in European populations, the most difference of this study is the composition of the study participants, the sample size and the diabetes diagnosis criteria. For every previous evaluation in Europe, the study population was all middle aged or old participants or patients with one or more cardiovascular disease risk. However, the participants of our study are nationally representative U.S. adults aged 20 years or older, which indicates the FINDRISC performs well not only in high risk population but also in the general free-living population. Although our stratified analysis indicated that the discriminating ability of FINDRISC is lower in people aged 65 years or above, the sensitivity was 87.04% for undiagnosed diabetes and 82.98% for prediabetes, which is acceptable for a first line screening tool.

**Table 2.** Sensitivity, specificity, positive predictive value, negative predictive value and distance in ROC of FINDRISC cutoffs in identifying undiagnosed diabetes\* and prediabetes† in US men and women aged 20 years or above, NHANES 1999–2010.

FINDRISC	Men					Women					
	se <sup>‡</sup> %	sp <sup>§</sup> %	sum <sup>  </sup> %	PV+ <sup>  </sup> %	Distance in ROC**	Se %	Sp %	Sum %	PV+ %	PV- %	Distance in ROC
Undiagnosed Diabetes											
5	93.99	26.16	120.15	6.21	0.74	98.47	16.47	114.94	4.05	99.67	0.84
6	92.92	31.77	124.69	6.62	0.69	97.55	23.66	121.21	4.38	99.63	0.76
7	90.99	38.57	129.56	7.16	0.62	96.94	28.64	125.58	4.64	99.62	0.71
8	86.27	47.66	133.93	7.90	0.54	92.97	38.45	131.42	5.13	99.35	0.62
9	83.05	54.33	137.38	8.65	0.49	91.13	45.29	136.42	5.63	99.30	0.55
10	<b>74.68</b>	<b>62.74</b>	<b>137.42</b>	<b>9.45</b>	<b>0.45</b>	87.77	53.31	141.08	6.31	99.19	0.48
11	66.74	69.51	136.25	10.23	0.45	79.82	61.54	141.36	6.92	98.84	0.43
12	56.44	76.06	132.50	10.93	0.50	<b>72.17</b>	<b>68.60</b>	<b>140.77</b>	<b>7.60</b>	<b>98.57</b>	<b>0.42</b>
13	46.57	82.98	129.55	12.46	0.56	63.00	77.55	140.55	9.13	98.32	0.43
14	34.98	87.99	122.97	13.17	0.66	50.46	83.09	133.55	9.65	97.91	0.52
15	15.39	91.90	107.29	14.50	0.85	41.28	88.96	130.24	11.81	97.69	0.60
Prediabetes											
5	84.60	31.86	116.46	39.71	0.70	94.74	20.32	115.06	29.02	91.82	0.80
6	81.15	38.62	119.77	41.22	0.64	91.53	28.88	120.41	30.68	90.84	0.72
7	75.70	46.14	121.84	42.71	0.59	88.79	34.64	123.43	31.84	89.98	0.66
8	67.71	55.81	123.52	44.84	0.55	81.69	45.38	127.07	33.96	87.81	0.58
9	<b>60.94</b>	<b>62.43</b>	<b>123.37</b>	<b>46.25</b>	<b>0.54</b>	76.77	52.87	129.64	35.90	86.87	0.53
10	52.27	70.70	122.97	48.62	0.56	<b>68.72</b>	<b>60.89</b>	<b>129.61</b>	<b>37.66</b>	<b>84.99</b>	<b>0.50</b>
11	43.96	76.65	120.61	49.96	0.61	60.80	68.22	129.02	40.45	83.70	0.50
12	35.45	82.17	117.62	51.33	0.67	52.46	75.84	128.30	42.75	82.27	0.53
13	26.75	88.14	114.89	54.46	0.74	41.34	84.05	125.39	47.12	80.64	0.61
14	19.27	91.85	111.12	55.63	0.81	32.22	88.36	120.58	48.77	79.13	0.69
15	13.73	94.89	108.62	58.76	0.86	23.02	93.08	116.10	53.37	77.86	0.77

Data are percentages (%).

\*Detecting undiagnosed diabetes among all participants with complete FINDRISC information;

†Detecting prediabetes among participants with complete FINDRISC excluding undiagnosed diabetes;

‡Sensitivity; §Specificity;

||Sum of sensitivity and specificity;

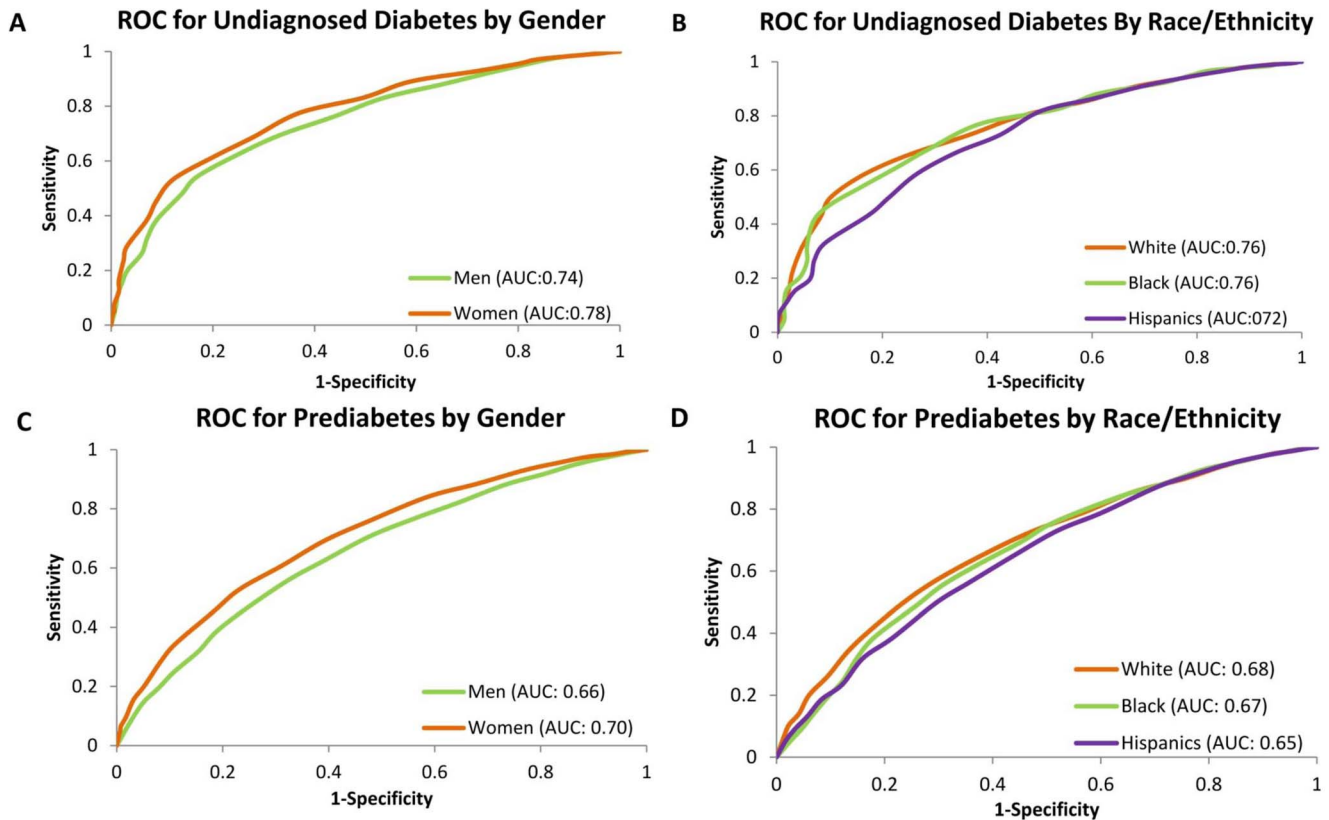
||Positive predictive value;

||Negative predictive value;

\*\*Distance in ROC curve =  $\sqrt{(1 - \text{sensitivity})^2 + (1 - \text{specificity})^2}$ .

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**Figure 2. Receiver operating characteristic (ROC) curve for identifying undiagnosed diabetes (A and B) and prediabetes (C and D) by gender and race/ethnicity in US men and women aged 20 years or above, NHANES 1999–2010.**  
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Thus, FINDRISC can work as an initial screening tool at the community or population level for American adults aged 20 or above, for Whites, Blacks, and Hispanics. The large sample size is also the strength of our study, which can produce more reliable results. Combined with the multiple racial/ethnic feature of our study population, this allows us to evaluate the validity of FINDRISC in different gender and racial/ethnic strata.

Using ADA diabetes diagnosis criteria 2013 to validate FINDRISC for the first time is another strength of our study. Compared with WHO diabetes diagnosis criteria or only FPG value used in previous studies of FINDRISC evaluation among other populations, our study added HbA1c as a diagnosis criterion. As a more convenient screening method than FPG and OGTT, HbA1c test does not require fasting and is not influenced by the day to day variation. HbA1c has also been found to have a very high specificity in identifying diabetic patients in different racial/ethnic groups [46,47]. Thus, including HbA1c as diagnosis criteria for both diabetes and prediabetes leads to reducing the false negative results in our study.

Another improvement in the present study is investigating the gender and racial/ethnic difference in the performance of FINDRISC with a single population, as well as identifying the optimal cutoff point for each subgroup. Only in a cross-sectional evaluation of FINDRISC in Finland, FINDRISC was evaluated for different performance in detecting undiagnosed diabetes, abnormal glucose tolerance and metabolic syndrome by gender. FINDRISC was identified as performing a little better in women than in men only in distinguishing the metabolic syndrome without statistical significance [25]. However, in the current study among U.S. general population, FINDRISC performs significantly

better in women than in men in detecting both undiagnosed diabetes and prediabetes. No previous study compared the performance of FINDRISC by race/ethnicity. In the present study we found the FINDRISC performed significantly better in non-Hispanic White than in Hispanics. The difference in the performance by gender or race/ethnicity could be due to the different sensitivity of the question by gender and race/ethnicity, such as BMI and waist circumference. One study has found that central obesity is more related with non-insulin-dependent diabetes mellitus in women than in men [48], and another study has shown that waist circumference has lower impact in metabolic syndrome in Hispanics than in non-Hispanic White and non-Hispanic Black [49]. The different performance in each subgroup even supports the rationality of evaluation of FINDRISC before applying it to a specific population. However, despite of the different performance, our results still indicate FINDRISC is a reliable screening tool in the general U.S. population. The different optimal cutoff points identified in the study could be applied to each subgroup in the practical application.

One limitation of our study is that we cannot evaluate the FINDRISC in predicting the future incident diabetes because the NHANES is a cross-sectional survey which did not provide follow-up data. However, FINDRISC was developed for both predicting future diabetes and detecting undiagnosed diabetes [16]. In addition, detecting the prediabetes in the general population also identifies the population at higher risk of type 2 diabetes in the future, given the continuum of the risk for diabetes [50]. Another limitation of current study is the possibility of misclassification on diagnosis of diabetes and prediabetes because not all participants have results from all 3 tests (i.e. FPG, OGTT, and HbA1C). To

evaluate the impact of this limitation on our results, we conducted a sensitivity analysis among individuals who had results from all 3 tests ( $N = 3,978$ ). The results showed that among this subgroup of individuals who had 3 tests results, the area under the ROC curve was 0.71 (vs. 0.75 for all individuals) for undiagnosed diabetes and 0.67 (vs. 0.67 for all individuals) for prediabetes, indicating the influence of the possible misclassification is minor.

Our evaluation was based on a relative healthy adult population. Different cutoff values may be applied for other populations such as children and adolescents and obese people. Further research is warranted to investigate whether the cutoffs of FINDRISC suggested by this study could be applied to some other specific youth and obese populations given the increased prevalence of obesity and type 2 diabetes in children and adolescents in the U.S..

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## Conclusions

In conclusion, FINDRISC can be used as a simple and non-invasive screening tool to identify individuals at high risk for diabetes and prediabetes in the U.S. adults. A cutoff point of 10 for men and 12 for women are suggested to identify undiagnosed diabetes; a cutoff point of 9 for men and 10 for women are suggested to identify prediabetes.

## Author Contributions

Conceived and designed the experiments: LC LZ ZZ YZ GH. Performed the experiments: LZ LC. Analyzed the data: LC LZ. Wrote the paper: LC LZ ZZ. Revised the manuscript: LC LZ ZZ GH YZ.



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