# Diagnostic Accuracy of Body Mass Index to Identify Obesity in Older Adults: NHANES 1999-2004 

John A. Batsis, MD ${ }^{\text {a,b,c,de, }}$, Todd A. Mackenzie, PhD ${ }^{\text {b }}$, Stephen J. Bartels, MD, MS ${ }^{\text {b,c, }}$, Karine R. Sahakyan, MD, PhD, MPH ${ }^{\dagger}$, Virend K. Somers, MD, PhD ${ }^{\dagger}$, and Francisco LopezJimenez, MD, MSc ${ }^{\dagger}$<br>${ }^{\text {a }}$ Section of General Internal Medicine, Dartmouth-Hitchcock Medical Center, Lebanon, NH<br>${ }^{\mathrm{b}}$ Geisel School of Medicine at Dartmouth and The Dartmouth Institute for Health Policy \& Clinical Practice, Lebanon, NH<br>${ }^{\text {c Dartmouth Centers for Health and Aging, Dartmouth College, Hanover, NH }}$<br>${ }^{\text {dHealth Promotion Research Center at Dartmouth, Lebanon, NH }}$<br>${ }^{\text {e Dartmouth Weight \& Wellness Center, Lebanon, } \mathrm{NH}, ~}$<br>'Division of Cardiovascular Disease, Department of Medicine, Mayo Clinic, Rochester, MN, 55905


#### Abstract

Background-Body composition changes with aging lead to increased adiposity and decreased muscle mass, making the diagnosis of obesity challenging. Conventional anthropometry, including body mass index (BMI), while easy to use clinically may misrepresent adiposity. We determined the diagnostic accuracy of BMI using dual energy x-ray absorptiometry (DEXA) in assessing the degree of obesity in older adults.

Methods-The National Health and Nutrition Examination Surveys 1999-2004 were used to identify adults aged $¥ 60$ years with DEXA measures. They were categorized (yes/no) as having elevated body fat by gender (men $\geq 25 \%$; females $\geq 35 \%$ ) and by body mass index (BMI) $\geq 2$ and $\geq 30 \mathrm{~kg} / \mathrm{m}^{2}$. The diagnostic performance of BMI was assessed. Metabolic characteristics were compared in discordant cases of BMI/body fat. Weighting and analyses were performed per NHANES guidelines.

Results—We identified 4,984 subjects (men:2,453; female:2,531). Mean BMI and $\%$ body fat was $28.0 \mathrm{~kg} / \mathrm{m}^{2}$ and $30.8 \%$ in men, and $28.5 \mathrm{~kg} / \mathrm{m}^{2}$ and $42.1 \%$ in females. A BMI $\geq 30 \mathrm{~kg} / \mathrm{m}^{2}$ had a low sensitivity and moderately high specificity (men: $32.9 \%$ and $80.8 \%$, concordance index 0.66 ; females: $38.5 \%$ and $78.5 \%$, concordance 0.69 ) correctly classifying 41.0 and $45.1 \%$ of obese subjects. A BMI $25 \mathrm{~kg} / \mathrm{m}^{2}$ had a moderately high sensitivity and specificity (men: $80.7 \%$ and $99.6 \%$, concordance 0.81 ;females: $76.9 \%$ and $98.8 \%$, concordance 0.84 ) correctly classifying 80.8


[^0]and $78.5 \%$ of obese subjects. In subjects with BMI $<30 \mathrm{~kg} / \mathrm{m}^{2}$ body fat was considered elevated in $67.1 \%$ and $61.5 \%$ of males and females, respectively. For a BMI $>30 \mathrm{~kg} / \mathrm{m}^{2}$, sensitivity drops from 40.3 to $14.5 \%$ and 44.5 to $23.4 \%$, while specificity remains elevated ( $>98 \%$ ), in males and females, respectively in those $60-69.9$ years to subjects aged $>80$ years. Correct classification of obesity using a cutoff of $30 \mathrm{~kg} / \mathrm{m}^{2}$ drops from 48.1 to $23.9 \%$ and 49.0 to $19.6 \%$, in males and females in these two age groups.

Conclusions—Traditional measures poorly identify obesity in the elderly. In older adults, BMI may be a suboptimal marker for adiposity.

## Keywords

obesity; diagnostic accuracy; body mass index; body fat; epidemiology

## INTRODUCTION

Obesity is a global public health crisis ${ }^{1}$ associated with considerable health risks that increase the risk of coronary artery disease, stroke, cancer and premature mortality ${ }^{2,3}$. The importance of identifying obesity as a disease in a clinical care setting is critical to the management of such patients ${ }^{4}$. Accurate diagnosis of obesity in older adults is an essential first step in delivering effective treatment to older adults most at risk.

Body mass index (BMI) is the most common method to diagnose obesity in primary care and subspecialty settings. Population-based studies have proven the metabolic consequences of having a BMI $\geq 25 \mathrm{~kg} / \mathrm{m}^{2}$ and the mortality risk of a BMI $\geq 30 \mathrm{~kg} / \mathrm{m}^{22,3}$. These guidelines have been incorporated in public health campaigns and have become common practice. Other anthropometric measures have been suggested for use, including waist circumference, as they additionally place individuals at high overall cardiometabolic risk, independent of $\mathrm{BMI}^{5}$. However, they have not been fully recommended to be used in recent national guidelines ${ }^{4}$.

While BMI may reasonably predict adverse outcomes in global population-based adult studies, recent studies have demonstrated that traditional BMI cutoffs may in fact misrepresent the degree of adverse outcomes in older populations ${ }^{5,6}$. This is partly explained by the changes observed in body composition occurring with aging ${ }^{7}$ including the gradual increase in fat mass, the decrease in muscle mass and quality or sarcopenia, and the degree of underlying systemic inflammation. Identifying the predictive validity and diagnostic accuracy of BMI in this older subpopulation is critically important to provide reasonable recommendations to front-line clinicians. The purpose of this study was to determine the diagnostic performance of BMI to identify obesity based on body fat in elderly subjects using established cutoffs for overweight and obesity. We also determined the differences in underlying metabolic abnormalities in those with varying degrees of body fat content using body composition measurements but not otherwise classified as having obesity.

## METHODS

The National Health and Nutrition Examination Surveys are cross-sectional surveys conducted by the Centers for Disease Prevention and Control since 1971. The survey samples non-institutionalized adults of the United States and oversamples minorities and elderly adults. It is a complex stratified multistage probability sampling design allowing generalizability of the results to the rest of the population. All of the survey contents and procedures are available online at http://www.cdc.gov/nchs/nhanes.htm (accessed February 2015). Data for this analysis were limited to the 1999-2004 datasets. The survey has been approved by an internal Institutional Review Board, and was exempt from local review because of the de-identified nature of the results.

Of the 38,077 total participants screened, 31,125 were interviewed, and 29,402 were examined in a standardized mobile examination center. We limited our analysis to those aged 60 and older as the relationship between obesity and BMI is less clear in an elderly population. In the cohort aged $\Varangle 60$ years, 7,729 were screened, $5,607(72.5 \%)$ were interviewed, and 4,984 ( $64.5 \%$ ) were examined. All subjects included in our analysis had body composition data obtained by dual-energy X-ray absorptiometry (DEXA). There were 4,984 participants fulfilling these criteria and were classified by race (non-Hispanic White, non-Hispanic Black, Hispanic, and Other), and by age group, where applicable (60-69.9, $70-79.9$, and $\geq 80$ years). All baseline demographic characteristics were assessed using a selfreport questionnaire.

Measurements were all performed on the right side of the body to the nearest 0.1 cm , except where casts, amputations and other factors prevented such assessment. Height was measured using a stadiometer after deep inhalation, and weight was measured using an electronic digital scale, calibrated in kilograms. Body mass index was calculated as weight ( kg ) divided by height (m) squared. Waist circumference was measured in the standing position at the iliac crest, crossing the mid-axillary line, with the measuring tape placed around the trunk. Blood pressure was measured in the mobile examination center by a trained examiner following the latest recommendations of the American Heart Association Human Blood Pressure Determination by a mercury sphygmomanometer ${ }^{8}$. Determinations were recorded directly onto a computerized data collection form and the blood pressure reported to the examinee is that reported in this study. All DEXA data were obtained using a QDR-4500, Hologic scanner (Bedford, MA) by trained technicians. The procedure lasted roughly 3 minutes. DEXA exclusions consisted of subjects who were $\geq 192.5 \mathrm{~cm}$ or weighed $\geq 136.4 \mathrm{~kg}$ in this subgroup. Metal objects, except false dentition and hearing aids, were removed. Overall fat mass, muscle mass, bone measurements, appendicular skeletal muscle mass of all limbs, and bone mineral content were assessed. Total body fat percent and lean mass percent were subsequently calculated. These techniques were similar in all NHANES cycles.

Detailed specimen collection and processing instructions are discussed in the NHANES Laboratory/Medical Technologists Procedures Manual located on the NHANES website (http://www.cdc.gov/nhanes). Vials were stored under appropriate frozen $\left(-20^{\circ} \mathrm{C}\right)$ conditions until they were shipped for testing. Non-fasting routine biochemistries, including glucose, triglycerides were performed with a Hitachi Model 704 multichannel analyzer (Boehringer

Mannheim Diagnostics, Indianopolis, IN). Total cholesterol, HDL, triglycerides, and LDL cholesterol were shipped to Johns Hopkins University Lipoprotein Analytical Laboratory for testing. Blood specimens for fasting glucose, insulin, were processed, stored, and shipped to the University of Missouri-Columbia for analysis, and C-reactive protein was performed at the University of Washington. The homeostatic assessment model-1 was determined using published equations to determine insulin resistance and $\beta$-cell function ${ }^{9}$. HOMA-IR was calculated as: (fasting insulin $\times$ fasting glucose $(\mathrm{mg} / \mathrm{dL})$ )/405. Homa-B was calculated as $(360 \times$ insulin) $/($ glucose-63), represented as a percentage.

## Statistical Analysis

All data were merged and analyzed according to the policies and procedures outlined by NHANES. Baseline characteristics are presented as weighted means with standard errors for all continuous variables, and weighted percentages for categorical determinations. Because of the known differences in body composition ${ }^{7}$, baseline characteristics were stratified by sex. The gold standard assessment was considered body fat percent based on DEXAobtained adiposity to determine the diagnostic performance of BMI. Obesity diagnosis based on fat content measured with DEXA was defined as having body fat equal or greater than $25 \%$ for males, and $35 \%$ for females ${ }^{10}$, based on values recommended by the American Association for Clinical Endocrinology and those used in our previous studies ${ }^{5,}$, 11 . Subjects were also classified according to standard BMI cutoffs of $25 \mathrm{~kg} / \mathrm{m}^{2}$ and $30 \mathrm{~kg} / \mathrm{m}^{2}$ representing overweight and obesity.

Diagnostic performance was assessed by determining sensitivity, specificity, positive and negative predictive values, and positive and negative likelihood ratios. Receiver operating characteristics curves were constructed for BMI to detect BF\%-defined obesity for all subjects separately by sex and ethnicity. We additionally report the distribution of individuals with a normal BMI but elevated body fat and differences in metabolic variables in subjects whose $\mathrm{BMI}<30 \mathrm{~kg} / \mathrm{m}^{2}$ with differing sex-specific cutpoints of body fat and separately demonstrating cumulative distribution functions of percent body fat by BMI cutoff ( $30 \mathrm{~kg} / \mathrm{m}^{2}$ ) in both sexes. T-tests of unequal variances compared metabolic variables between these two groups in each sex. Replicates and data review were performed for quality assurance. All analyses were conducted using STATA v13 (College Station, TX) accounting for strata, primary sampling unit, and weighting. Separate weights were used for the fasting morning subsample. Interview weights were used according to NHANES procedures to account for the unequal probabilities of selection, participant non-response, non-reponse to the in-home interview and mobile center examination, and also were poststratified to match estimates of the US non-institutionalized adult population. A P value $<0.05$ was considered statistically significant and Bonferroni multiple comparison adjustments were performed when necessary.

## RESULTS

Our final dataset consisted of 2,531 men and 2,453 females aged over 60 years, as indicated in Table 1. Mean BMI was 28.0 and $28.5 \mathrm{~kg} / \mathrm{m}^{2}$ in men and females, respectively, with $28.9 \%$ and $34.3 \%$ of older adults classified as having obesity based on BMI. Based on body
fat, 87.5 and $89.1 \%$ of men and females are classified as having obesity. In those aged $\geq 80$ years, a BMI $\geq 30 \mathrm{~kg} / \mathrm{m}^{2}$ had a very low sensitivity, negative predictive value, and concordance rates as compared to younger cohorts. Notably, both lean mass and appendicular skeletal mass were higher in men than females.

Table 2A represents the diagnostic performance for a BMI of 25 and $30 \mathrm{~kg} / \mathrm{m}^{2}$. As the cutoff for BMI increases from 25 to $30 \mathrm{~kg} / \mathrm{m}^{2}$, the sensitivity drops, and the specificity increases in both sexes. Correct classification of obesity drops markedly with age with both cutoffs, but is markedly lower using a BMI $>30 \mathrm{~kg} / \mathrm{m}^{2}$. The ideal BMI to identify obesity in men and females is 24.91 and $24.1 \mathrm{~kg} / \mathrm{m}^{2}$, respectively (Figure 1). Table 2 B represents using standard WC cutoffs and Figure 2 Represents the receiver operator curves noting the optimal thresholds are 97.6 and 87.4 cm , respectively. In Table 3, we present data on metabolic variables in the subset of subjects in each sex with a BMI $<30 \mathrm{~kg} / \mathrm{m}^{2}$ and a low WC stratified by body fat. Across both non-fasting and fasting samples, a number of indicators suggest the heterogeneity of those with a $\mathrm{BMI}<30 \mathrm{~kg} / \mathrm{m}^{2}$ with regard to cardiometabolic dysfunction. These differences were not observed in females with a low WC. Cumulative distribution functions are presented in Figure 3. We present in Figure 4, the distribution and weighted prevalence in those with a $\mathrm{BMI}<30 \mathrm{~kg} / \mathrm{m}^{2}$ and body fat. The line designates the standard body fat cutoff for obesity (men: $25 \%$; females: $35 \%$ ). Lastly, Table 4 represents the adjusted correlation coefficients between BMI and body fat, lean mass and appendicular skeletal mass, both by sex, and by age-group.

## DISCUSSION

Our study highlights the challenges with utilizing BMI as the most widely used and accepted method to diagnose obesity in clinical care setting, particularly in older adults. With the changes observed in body composition in this patient population, our data provides an opportunity to caution clinicians in solely relying on this anthropometric measure for counseling patients on reducing their weight and lowering their cardiovascular risk.

To our knowledge, this is the first analysis using nationally representative data to determine the diagnostic performance of BMI using DEXA as the gold standard and that focuses specifically on older adults. Previous studies using DEXA data from NHANES have focused on those with and without physical limitations ${ }^{12}$. These authors noted excellent specificity but poor sensitivity, in addition to considerable misclassification based on body fat percent. Flegal's analysis using differing anthropometric indices, including BMI, WC, waist hip circumference, and waist to stature ratio, focused predominantly on correlation coefficients and agreement between metrics ${ }^{13}$, rather than focusing on diagnostic accuracy using our the methods utilized in this analysis. Our group has explored this relationship previously ${ }^{14}$ in a systematic review that demonstrated BMI $\geq 30 \mathrm{~kg} / \mathrm{m}^{2}$ had an overall pooled sensitivity of $50 \%$ and specificity of $90 \%$. A specific analysis that used bioelectrical impedance demonstrated the changes observed in diagnostic accuracy in the general population using similar cutoffs, albeit in a general population ${ }^{11}$. In this study, sensitivity of a BMI $\geq 30 \mathrm{~kg} / \mathrm{m}^{2}$ for obesity peaked in the $40-49.9$ year age group at $44 \%$ in men, and in the $50-59.9$ years at $54 \%$ in females. This dropped to $27 \%$ and $43 \%$ in the $70-79$ year age group, respectively. Specificity remained high in both sexes ( $>90 \%$ ), although negative predictive value dropped with age
from $70 \%$ and $69 \%$ in males and females in the 20-29year age group, to $51 \%$ in both sexes in the 70-79year group. For all subjects, area under the curve was 0.88 with an ideal BMI of $25.5 \mathrm{~kg} / \mathrm{m}^{2}$ (sensitivity $83 \%$, specificity $76 \%$ ). However, BIA is highly inaccurate in older adults and can be influenced by food consumption, exercise, ethnicity and certain medical conditions. As body water content differs in older adults, this may also influence its precision and accuracy. Others have used body-plethysmography and have observed similar results ${ }^{15}$. DEXA-scanning does not have these limitations and has less bias than BIA ${ }^{16}$ and in older adults could be a better modality for the ascertainment of body fat. Our results are similar to others that have demonstrated the poor discrimination between body fat $\%$ in populations with coronary artery disease ${ }^{17}$. In an Australian study, one group suggested the importance of gender and age-specific thresholds when using BMI to indicate adiposity ${ }^{18}$. Notably, BMI is even inaccurate in assessing adiposity in pediatric populations ${ }^{19}$.

Our analysis proves that the diagnostic accuracy of BMI is markedly poor in both sexes with increased age, reflected by the lower concordance indices. The ideal cutpoint for BMI in this population-based cohort is $\sim 25 \mathrm{~kg} / \mathrm{m}^{2}$ in both sexes, a cutoff markedly lower than the current criterion to diagnose obesity. A BMI of $25 \mathrm{~kg} / \mathrm{m}^{2}$ is associated with the lowest mortality point in a number of longitudinal studies. In fact, our results, coupled with those linking a BMI $\sim 26-27 \mathrm{~kg} / \mathrm{m}^{2}$ with the lowest mortality, suggest that traditional BMI cutoffs are likely inaccurate and conceivably should be revisited. While the degree of correlation was satisfactory between BMI, body fat and measures of muscle mass, we believe that the interplay between muscle mass and fat is likely to not only impact the degree of functional capacity in older adults, but may obscure the adequacy of using BMI as a simple measure of adiposity. Additionally, the majority of subjects with a BMI $>25 \mathrm{~kg} / \mathrm{m}^{2}$ have obesity based on body fat.

We believe that while BMI has its shortcomings, it still may be a useful measure to use. For instance, in older adults, previous studies have predicted a direct relationship between obesity, disability and mortality ${ }^{2,20}$. Recent consensus statements from the Foundation for the National Institutes of Health Sarcopenia Project ${ }^{21}$ have indeed incorporated BMI in grip strength cutoffs for clinical identification of at risk subjects for weakness. However, its utility in clinical practice for obesity alone should be used with great caution informed by our study findings. Two major initiatives rely on BMI in an older adult population, including the Physician Quality reporting measures ${ }^{22}$, and the Medicare Obesity Benefit ${ }^{23}$. Our data proves the limitations of using this measure, but also demonstrate that the majority of older people in the United States population that have obesity based on body composition, may otherwise be classified as not having obesity based on a $\mathrm{BMI}<30 \mathrm{~kg} / \mathrm{m}^{25}$. We purposefully presented discordant cases in Table 3 to determine the difference in metabolic profiles in those with a non-obese BMI but different body fat composition. This subset analysis proves that subjects with obesity mischaracterized by BMI (BMI<30kg $/ \mathrm{m}^{2}$ ) have differing metabolic profiles and there may be sex-specific differences based on central obesity. Additionally, there are certain populations where an elevated BMI may lead to improved outcomes, a phenomenon known as the obesity paradox ${ }^{24}$. Strongly encouraging the sole use of BMI in practice-based settings may target inappropriate populations or outcomes and other measures including WC should be considered. In older adults, adiposity localized centrally, and WC may be a possible alternative for adiposity assessment. While DEXA may

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be widely available for measurement of body composition, in the United States, it is not a reimbursable procedure for this indication and hence the need to consider alternative anthropometrics. Physical function and quality of life are important patient-specific outcomes in older adults and targeted outcomes of primary care obesity interventions in this population should alter the focus from weight or BMI to such measures as advocated by others ${ }^{23,} 25$.

As with any cross-sectional study, we acknowledge the intrinsic methodological limitations of NHANES. While there is oversampling of older adults, we are limited by the number of subjects in the older age categories. Additionally, our results can only be extrapolated to community-based adults, and not institutionalized adults. While body fat \% is considered the gold standard in defining obesity, the cutoffs appear to be arbitrary. While other authors have repeatedly used these cutoffs and inadvertently referred to the 1995 WHO Technical Report ${ }^{26}$, there remains no scientific rationale for using such cutoffs other than expert opinion ${ }^{27-29}$. Future validation threshold studies by age, gender and race are critically needed.

A disadvantage of categorizing a continuous variable into categories is not only the loss of study power, but values slightly above the threshold may have only incremental and modest long-term risk, potentially resulting in overdiagnosis ${ }^{30}$. Misclassification is possible as well, and this has implications for public health in the identification and management of higher risk populations. While DEXA scanning is a reasonably inexpensive modality to routinely assess body composition, it is performed for unrelated clinical indications and not for this sole purpose. Future research and advocacy would provide more accurate assessments of obesity status, than present anthropometric measures. Its accuracy in older adults is superior to that of bioelectrical impedance, in that the latter may underestimate truncal obesity and is highly dependent on water content, making it suboptimal for use in older adults.

Our study confirms using DEXA-based body composition measures that BMI suboptimally identifies adiposity. While gold-standard methods such as CT and MRI may provide accurate whole-body and regional assessment of fat and muscle ${ }^{31}$, these are clinically impractical and costly for routine assessment. We suggest that accurate measurements of adiposity be considered using DEXA in older adults, particularly when this test is performed for other indications, such as osteoporosis screening or monitoring. This can eliminate the challenges observed with using BMI as a clinical tool and its lack of diagnostic accuracy. Future studies should evaluate the added cost-burden compared to the information that this modality can provide to a clinician.

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A Body Mass Index
Receiver Operator Curve


Optimal Threshold: BMI $24.91 \mathrm{~kg} / \mathrm{m}^{2}$
Sensitivity: 80.0\%
Specificity: 77.0\%

## B Body Mass Index



Figure 1.
A, B Receiver Operator Curves for body mass index (BMI) for all subjects aged $\begin{array}{r} \\ \text { Oyears in }\end{array}$ the National Health and Nutrition Examination Survey 1999-2004 sample included in this analysis to detect body fat percentage by sex. Men - Figure a; Females - Figure b.

A Waist Circumference

## Receiver Operator Curve

 8 Men

Optimal Threshold: WC 97.6cm
Sensitivity: 74.0\%
Specificity: 89.0\%

## B Waist Circumference



Figure 2.
A, B Receiver Operator Curves for waist circumference (WC) for all subjects aged $\Varangle 60$ years in the National Health and Nutrition Examination Survey 1999-2004 sample included in this analysis to detect body fat percentage by sex. Men - Figure a; Females - Figure b

A


B


Figure 3.
A, B Cumulative Distribution Functions of percent body fat in men (panel A) and females (panel B) in subjects with a body mass index $\geq 30 \mathrm{~kg} / \mathrm{m}^{2}$ and $<30 \mathrm{~kg} / \mathrm{m}^{2}$. Vertical lines represent percent body fat cutoffs for males (25\%) and females (35\%).



Figure 4.
Variations in percent body fat in men (panel a) and females (panel B) in subjects with a body mass index $<30 \mathrm{~kg} / \mathrm{m}^{2}$ ). Line represents body fat cutoffs for each sex ( $\geq 25 \%$ in men; $\geq 35 \%$ in females)
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Baseline Characteristics - National Health and Nutrition Examination Surveys 1999-2004
All values presented are designated as means $\pm$ standard errors, or weighted prevalence rates
Abbreviations: ASM - appendicular skeletal muscle; BF - body fat; BMI - body mass index; WC - waist circumference
${ }^{a}$ BMI classified as having obesity was based as $230 \mathrm{~kg} / \mathrm{m}^{2}$
${ }^{b}$ BF obese is classified as having a body fat $\geq 25 \%$ for men and $\geq 35 \%$ for females
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Table 2
A: Diagnostic Performance for Body Mass Index using cutoffs of $25 \mathrm{~kg} / \mathrm{m}^{2}$ and $230 \mathrm{~kg} / \mathrm{m}^{2}$ by Age Group and Sex

|  | BMI $25 \mathrm{~kg} / \mathrm{m}^{\mathbf{2}}$ |  |  |  |  |  |  |  | BMI $230 \mathrm{~kg} / \mathrm{m}^{2}$ |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Sensitivity | Specificity | Correctly Classified | PPV | NPV | +LR | -LR | $\begin{gathered} \text { C- } \\ \text { index } \end{gathered}$ | Sensitivity | Specificity | Correctly Classified | PPV | NPV | + LR | -LR | C- index |
| Men |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| zoyears | 80.7 | 81.4 | 80.8 | 96.9 | 37.0 | 4.34 | 0.24 | 0.81 | 32.9 | 99.6 | 41.0 | 99.8 | 17.2 | 79.7 | 0.67 | 0.66 |
| 60-69.9years | 87.2 | 76.3 | 85.7 | 96.0 | 47.6 | 3.68 | 0.17 | 0.82 | 40.3 | 99.2 | 48.1 | 99.7 | 20.2 | 51.8 | 0.60 | 0.70 |
| 70-79.9years | 79.5 | 87.3 | 80.4 | 98.0 | 35.4 | 6.25 | 0.24 | 0.83 | 30.9 | 100.0 | 38.7 | 100.0 | 15.7 | --- | 0.69 | 0.65 |
| 80+ years | 63.2 | 86.9 | 65.8 | 97.5 | 22.4 | 4.80 | 0.42 | 0.75 | 14.5 | 100.0 | 23.9 | 100.0 | 12.7 | --- | 0.86 | 0.57 |
| Females |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| z0years | 76.9 | 91.6 | 78.5 | 98.7 | 32.2 | 9.10 | 0.25 | 0.84 | 38.5 | 98.8 | 45.1 | 99.9 | 88.5 | 233.4 | 0.62 | 0.69 |
| 60-69.9years | 79.7 | 91.3 | 80.7 | 99.1 | 28.3 | 9.12 | 0.22 | 0.86 | 44.5 | 99.5 | 49.0 | 99.9 | 13.6 | 96.8 | 0.56 | 0.72 |
| 70-79.9years | 78.8 | 92.2 | 80.0 | 99.0 | 30.4 | 10.1 | 0.23 | 0.85 | 37.7 | 100.0 | 43.4 | 100.0 | 13.9 | --- | 0.62 | 0.69 |
| 80+ years | 65.7 | 91.3 | 70.8 | 96.9 | 39.4 | 7.59 | 0.38 | 0.79 | 23.4 | 100.0 | 38.4 | 100.0 | 24.1 | --- | 0.77 | 0.62 |


|  | Waist Circumference $\mathbf{~} 102 \mathrm{~cm}$ in Males or $\mathbf{8 8} \mathbf{8 m}$ in Females |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Sensitivity | Specificity | Correctly Classified | PPV | NPV | +LR | -LR | C-index |
| Men |  |  |  |  |  |  |  |  |
| 860years | 59.7 | 95.5 | 64.2 | 98.9 | 74.4 | 13.11 | 0.42 | 0.78 |
| 60-69.9years | 64.9 | 96.0 | 69.1 | 99.0 | 69.7 | 16.2 | 0.37 | 0.80 |
| 70-79.9years | 59.8 | 92.6 | 63.7 | 98.4 | 76.4 | 8.03 | 0.43 | 0.76 |
| $80+$ years | 44.0 | 100 | 50.3 | 100.0 | 81.3 | --- | 0.56 | 0.72 |
| Females |  |  |  |  |  |  |  |  |
| $260 y \mathrm{ears}$ | 80.5 | 85.5 | 81.0 | 97.9 | 65.7 | 5.54 | 0.23 | 0.83 |
| 60-69.9years | 80.6 | 89.6 | 81.4 | 98.9 | 70.7 | 7.77 | 0.22 | 0.85 |
| 70-79.9years | 82.1 | 85.5 | 82.4 | 98.3 | 67.6 | 5.65 | 0.21 | 0.84 |
| 80+ years | 77.0 | 81.2 | 77.8 | 100.0 | 83.7 | 4.08 | 0.28 | 0.79 |

Metabolic Differences Based on Body Fat Content among Men and Women with a BMI $<30 \mathrm{~kg} / \mathrm{m}^{2}$

|  | BMI< $30 \mathrm{~kg} / \mathrm{m}^{2}$ |  |  |  |  |  |  | Waist Circumference $<\mathbf{1 0 2} \mathbf{c m}$ (Men); $<\mathbf{8 8} \mathbf{c m}$ (Females) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Men |  |  | Females |  |  | Men |  |  | Females |  |  |
|  | BF<25\% | BF $\mathbf{2 5 \%}$ | $\stackrel{\text { p- }}{\text { value }} \dagger$ | BF<35\% | BF $\mathbf{2 3 5 \%}$ | $\begin{gathered} \text { p- } \\ \text { value }^{\dagger-} \end{gathered}$ | BF<25\% | BF $\mathbf{2 5 \%}$ | $\stackrel{\mathrm{p}-}{\text { value }^{\dagger-}}$ | BF<35\% | BF $\mathbf{2 3 5 \%}$ | $\stackrel{\text { p- }}{\text { value }^{\dagger-}}$ |
| Non-Fasting | $\mathrm{N}=1,352$ | $\mathrm{N}=624$ |  | 1,285 | N=833 |  | $\mathrm{N}=296$ | N=777 |  | $\mathrm{n}=198$ | N=375 |  |
| Glucose, $\mathrm{mg} / \mathrm{dL}$ | $105.5 \pm 1.35$ | $112.0 \pm 1.90$ | 0.009 | $100.7 \pm 1.31$ | $108.9 \pm 2.22$ | 0.005 | $102.4 \pm 2.7$ | 104.5さ1.4 | 0.46 | $98.1 \pm 5.1$ | $95.7 \pm 1.8$ | 0.21 |
| Triglycerides, $\mathrm{mg} / \mathrm{dL}$ | $152.1 \pm 5.89$ | $167.6 \pm 4.50$ | 0.005 | $148.6 \pm 4.10$ | $167.6 \pm 3.78$ | <0.001 | $121.0 \pm 6.1$ | $144.7 \pm 7.9$ | 0.028 | $120.4 \pm 5.9$ | $127.8 \pm 4.2$ | 0.19 |
| HDL mg/dL | $48.1 \pm 0.69$ | $44.7 \pm 0.56$ | $<0.001$ | $60.3 \pm 0.63$ | $53.2 \pm 0.61$ | <0.001 | $53.7 \pm 1.1$ | $49.1 \pm 1.0$ | 0.002 | $67.2 \pm 2.2$ | $65.1 \pm 1.0$ | 0.31 |
| CRP, mg/dL | $0.51 \pm 0.04$ | $0.50 \pm 0.04$ | 0.88 | $0.51 \pm 0.05$ | $0.74 \pm 0.03$ | <0.001 | $0.40 \pm 0.06$ | $0.52 \pm 0.05$ | 0.13 | $0.40 \pm 0.04$ | $0.58 \pm 0.15$ | 0.24 |
| Systolic <br> Blood <br> Pressure, <br> mmHg | $135.6 \pm 0.98$ | $134.4 \pm 1.16$ | 0.40 | $141.7 \pm 0.87$ | $141.9 \pm 1.04$ | 0.05 | $133.7 \pm 1.5$ | $135.6 \pm 1.18$ | 0.34 | $142.7 \pm 2.2$ | $137.7 \pm 1.6$ | 0.10 |
| Diastolic blood pressure mmHg | $68.1 \pm 0.87$ | $71.5 \pm 0.70$ | <0.001 | $67.6 \pm 0.56$ | $68.8 \pm 0.71$ | 0.19 | $69.7 \pm 1.1$ | $67.4 \pm 1.1$ | 0.11 | $66.2 \pm 1.5$ | $67.3 \pm 0.7$ | 0.47 |
| TChol, mg/dL | $201.4 \pm 1.93$ | $198.6 \pm 1.49$ | 0.29 | $221.8 \pm 1.21$ | $218.2 \pm 2.12$ | 0.15 | $199.0 \pm 3.3$ | $200.4 \pm 2.5$ | 0.12 | $215.0 \pm 4.2$ | $220.6 \pm 1.8$ | 0.27 |
| Fasting Subsample * |  |  |  |  |  |  | $\mathrm{N}=124$ | $\mathrm{N}=361$ |  | $\mathrm{N}=92$ | $\mathrm{N}=171$ |  |
| Glucose, $\mathrm{mg} / \mathrm{dL}$ | $110.9 \pm 1.52$ | $122.2 \pm 4.35$ | 0.02 | $106.2 \pm 2.07$ | $114.2 \pm 2.89$ | 0.007 | $103.6 \pm 1.88$ | $110.1 \pm 1.9$ | 0.026 | $96.5 \pm 1.6$ | $96.7 \pm 1.3$ | 0.91 |
| Triglycerides | $155.5 \pm 4.90$ | $169.6 \pm 8.98$ | 0.18 | $158.3 \pm 4.21$ | $168.5 \pm 5.60$ | 0.08 | $114.2 \pm 7.3$ | $142.9 \pm 5.0$ | <0.001 | 135.1 $\pm 9.5$ | $141.2 \pm 5.7$ | 0.65 |
| Insulin $\mu \mathrm{U} / \mathrm{mL}$ | $10.8 \pm 0.30$ | $20.6 \pm 1.81$ | <0.001 | $10.2 \pm 0.33$ | $16.1 \pm 0.86$ | <0.001 | $6.93 \pm 0.44$ | $9.50 \pm 0.29$ | <. 001 | $6.68 \pm 0.36$ | $7.63 \pm 0.39$ | 0.08 |
| LDL- <br> Cholesterol | $122.9 \pm 1.56$ | $117.2 \pm 2.55$ | 0.03 | $129.8 \pm 1.72$ | $131.8 \pm 2.76$ | 0.47 | $119.5 \pm 3.5$ | $123.7 \pm 2.1$ | 0.36 | $122.0 \pm 3.6$ | $128.9 \pm 2.2$ | 0.06 |
| HOMA IR | $3.04 \pm 0.11$ | $6.44 \pm 0.79$ | <0.001 | $2.82 \pm 0.13$ | $4.80 \pm 0.36$ | <0.001 | $1.83 \pm 0.13$ | $2.66 \pm 0.12$ | <0.001 | $1.63 \pm 0.11$ | $1.86 \pm 0.10$ | 0.12 |
| Homa- $\beta$ | $94.0 \pm 3.99$ | $120.5 \pm 22.2$ | 0.24 | 95.2 2 2.83 | $126.1 \pm 6.54$ | <0.001 | $66.8 \pm 4.0$ | $86.5 \pm 5.1$ | 0.005 | $75.7 \pm 3.4$ | $86.4 \pm 6.2$ | 0.18 |

All values represent means $\pm$ standard errors. P-values test the difference in means between subjects with a high and low body fat content

* represents a subsample of subjects in NHANES with a morning fasting sample of these variables
Abbreviations: CRP: C-reactive protein; HDL: high density lipoprotein; HOMA - homeostatic model assessment; IR - insulin resistance; LDL - low density lipoprotein; TChol - Total cholesterol;
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$$
\begin{aligned}
& \text { Adjusted Correlation Coefficients between BMI, BF\% Lean Mass, and ASM by Sex and Age Group } \\
& \text { Abbreviations: ASM - appendicular skeletal mass; BF - body fat; BMI - body mass index } \\
& \text { * } \mathrm{P}<0.001 \\
& { }^{a} \text { additionally adjusted for age }
\end{aligned}
$$


[^0]:    Corresponding author: John A. Batsis, MD, FACP, Dartmouth-Hitchcock Medical Center, 1 Medical Center Drive, Lebanon, NH 03756, Telephone: (603) 653-9500, Facsimile: (603) 650-0915, john.batsis@ gmail.com.
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    Supplementary information is available at IJO's website.

[^1]:    Drs. Batsis \& Mackenzie had full access to all the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis.

    Dr. Batsis - conception, design, acquisition, analysis, interpretation of data, drafted manuscript, statistical analysis, and material support, obtaining funding.

    Dr. Mackenzie - conception, design, acquisition, analysis, interpretation of data, critical revision of the manuscript for important intellectual content, statistical analysis, and supervision

