# This is a self-archived version of an original article. This version may differ from the original in pagination and typographic details. 

Author(s):<br>Haapanen, Markus J.; Mikkola, Tuija M.; Kortelainen, Lauri; Jylhävä, Juulia; Wasenius, Niko S.; Kajantie, Eero; Eriksson, Johan G.; von Bonsdorff, Mikaela B.

Title: Body Composition in Late Midlife as a Predictor of Accelerated Age-associated Deficitaccumulation From Late Midlife into Old Age : A Longitudinal Birth Cohort Study

Year: 2023

Version: Published version

Copyright: © The Author(s) 2022. Published by Oxford University Press on behalf of The Gero

Rights: CC BY 4.0

Rights url: https://creativecommons.org/licenses/by/4.0/

## Please cite the original version:

Haapanen, M. J., Mikkola, T. M., Kortelainen, L., Jylhävä, J., Wasenius, N. S., Kajantie, E., Eriksson, J. G., \& von Bonsdorff, M. B. (2023). Body Composition in Late Midlife as a Predictor of Accelerated Age-associated Deficit-accumulation From Late Midlife into Old Age : A Longitudinal Birth Cohort Study. Journals of Gerontology Series A: Biological Sciences and Medical Sciences, 78(6), 980-987. https://doi.org/10.1093/gerona/glac233

Research Article

# Body Composition in Late Midlife as a Predictor of Accelerated Age-associated Deficit-accumulation From Late Midlife into Old Age: A Longitudinal Birth Cohort Study 

Markus J. Haapanen, MD, PhD, ${ }^{1,2, *, 0}$ Tuija M. Mikkola, PhD, ${ }^{1,3,0}$ Lauri Kortelainen, ${ }^{1,4}$ Juulia Jylhävä, PhD, 2,5, Niko S. Wasenius, PhD, ${ }^{1,6}$ Eero Kajantie, MD, PhD, ${ }^{7,8, \odot}$ Johan G. Eriksson, MD, DMSc, ${ }^{1,9}$ and Mikaela B. von Bonsdorff, PhD ${ }^{1,10}$<br>${ }^{1}$ Folkhälsan Research Center, Helsinki, Finland. ${ }^{2}$ Department of Medical Epidemiology and Biostatistics, Karolinska Institutet, Stockholm, Sweden. ${ }^{3}$ Clinicum, Faculty of Medicine, University of Helsinki, Helsinki, Finland. ${ }^{4}$ Department of Health and Social Management, University of Eastern Finland, Kuopio, Finland. ${ }^{5}$ Faculty of Social Sciences (Health Sciences) and Gerontology Research Center, Tampere University, Tampere, Finland. ${ }^{6}$ Department of General Practice and Primary Health Care, University of Helsinki, Helsinki, Finland. ${ }^{7}$ Department of Public Health and Welfare, Population Health Unit, Finnish Institute for Health and Welfare, Helsinki, Finland. ${ }^{8}$ PEDEGO Research Unit, Medical Research Center Oulu, Oulu University Hospital, University of Oulu, Oulu, Finland. ${ }^{9}$ Department of Obstetrics and Gynecology and Human Potential Translational Research Programme, Yong Loo Lin School of Medicine, National University Singapore, Singapore. ${ }^{10}$ Gerontology Research Center and Faculty of Sport and Health Sciences, University of Jyväskylä, Jyväskylä, Finland.<br>*Address correspondence to: Markus J. Haapanen, MD, PhD, Folkhälsan Research Center, Tukholmankatu 8, 00250 Helsinki, Finland. E-mail: markus.haapanen@helsinki.fi

Received: July 2, 2022; Editorial Decision Date: November 11, 2022
Decision Editor: Jay Magaziner, PhD, MSHyg


#### Abstract

Background: Body mass index (BMI) may not be an optimal predictor of frailty as its constituents, lean and fat mass, may have opposite associations with frailty. Methods: A linear mixed model analysis was performed in the Helsinki Birth Cohort Study ( $n=2000$ ) spanning from 57 to 84 years. A 39item frailty index ( FI ) was calculated on three occasions over 17 years. Body composition in late midlife included BMI, percent body fat ( $\% \mathrm{BF}$ ), waist-to-hip ratio (WHR), lean mass index (LMI), and fat mass index (FMI). Results: Mean FI levels increased by $0.28 \% /$ year among men and by $0.34 \% /$ year among women. Among women, per each $\mathrm{kg} / \mathrm{m}^{2}$ higher BMI and each unit higher \%BF the increases in FI levels per year were 0.013 percentage points (PP) steeper ( $95 \% \mathrm{CI}=0.004,0.023$ ) and 0.009 PP steeper $(95 \% \mathrm{CI}=0.002,0.016)$ from late midlife into old age. Among men, per each 0.1 -unit greater WHR the increase in FI levels was 0.074 PP steeper per year $(95 \% \mathrm{CI}=-0.0004,0.148)$. Cross-sectionally, greater FMI and LMI in late midlife were associated with higher FI levels but the direction of the association regarding LMI changed after adjustment for FMI. The categories "high FMI and high LMI" and "high FMI and low LMI" showed the highest FI levels relative to the category "low FMI and low LMI". Conclusions: In late midlife, greater adiposity ( $\% \mathrm{BF}$ ) among women and abdominal obesity (WHR) among men may predispose to higher levels of frailty from late midlife into old age. Greater lean mass alone may be protective of frailty, but not in the presence of high fat mass.


Keywords: Body composition, Frailty, Life-course, Risk factor

Frailty is a geriatric syndrome characterized by reduced homeostatic reserves and an impaired response to stressors, which predispositions
people with frailty at risk of adverse health outcomes (1). The results of a recent meta-analysis show higher waist circumference and
underweight or obese body mass index (BMI) to be associated with an elevated risk of frailty (2). Although a strong predictor of frailty, BMI has been criticized because its different constituents, namely lean and fat mass, may have opposite associations with frailty. Thus, individuals with a similar BMI may present with different body compositions and consequent risk of frailty.

Aging accompanies changes to body composition including increasing fat mass and decreasing lean mass (3). Jointly assessed fat and lean mass should be studied in longitudinal settings to further our understanding of the association between body composition and frailty. Thus far, fat mass indices have not been observed to be associated with prevalent frailty (4). However, fat mass may be associated with increased risk of frailty through higher levels of inflammation (5) and impairment of muscle quality because of higher fat infiltration (6). Some (4) but not all (7) cross-sectional studies show higher lean mass indices associating with a lower prevalence of frailty. In older populations, higher lean mass indices have been associated with better survival (8), providing an alternative to BMI, which predicts survival better when measured earlier in life (9). Omitting the consideration of mutual effects, fat, and lean mass may induce confounding bias given their positive correlativeness (10). Longitudinally, compared to men without low lean mass or obesity, men with obesity alone and sarcopenic obesity (low lean mass and obesity) both had a two-fold increased risk of frailty (11).

In this study, joint assessment of fat and lean mass in late midlife were performed on participants of the Helsinki Birth Cohort Study and their level of frailty tracked over 17 years into old age using a frailty index (FI). We hypothesize higher levels and faster increases in frailty among participants with body compositions characterized with higher fat mass.

## Materials and Methods

## Study Design

Participants of the Helsinki Birth Cohort Study were born at Helsinki University Central Hospital between 1934 and 1944, visited child welfare clinics in the city and lived in Finland in 1971 when a unique personal id number had been allocated to all residents of Finland (12). Figure 1 presents a flowchart over the study population. The present study uses information from the baseline clinical investigation conducted between 2001 and $2004(n=2003$; mean age $=61.5$ years; $S D=2.7$ years) and clinical follow-up visits conducted in 2011-2013 ( $n=1094$; mean age $=71.1$ years; $S D=2.7$ years) and 2017-2018 ( $n=815$; mean age $=75.9$ years; $S D=2.7$ years). Body composition and anthropometry were assessed at baseline and a 39 -item FI (13) was calculated at all three occasions. The study was approved by the coordinating and Epidemiology and Public Health Ethics Committees of the Hospital District of Helsinki and Uusimaa and that of the National Public Health Institute, Helsinki.

## Frailty Index AssessedThreeTimes During 2001-2018

The previously published deficit-accumulation based 41-item FI (13) includes diseases, clinical measurements, laboratory test values, functioning measures, and information on general health. We followed the standard procedure (14) in its creation and found its distribution according to age and sex similar to those of published deficitaccumulation based FIs (14-16). For the present study, the deficits $B M I$ and waist-to-hip ratio were among the studied body composition variables and were excluded from the FI. The resulting 39 -item FI was


Figure 1. Flowchart of participants in the Helsinki Birth Cohort Study.
used for our analyses; the 39 items and their scoring into deficits can be found in Supplementary Table 1. The FI could be calculated for $99.6 \%$, $99.9 \%$, and $99.1 \%$ of participants participating at each consecutive clinical visit, respectively (13). A total of 2000 participants had data on FI available from at least one clinical measurement occasion.

## Body Composition and Anthropometry Assessed at Clinical Baseline During 2001-2004

Measured weight rounded to the nearest 0.1 kg and height to the nearest 0.1 cm were used in the calculation of BMI, expressed as $\mathrm{kg} / \mathrm{m}^{2}$. Waist-to-hip ratio (WHR) was calculated by dividing waist circumference with hip circumference. Percentage body fat ( $\% \mathrm{BF}$ ) and fat mass were assessed by bioelectrical impedance analysis using the InBody 720 eight-polar tactile electrode system (Biospace Co, Ltd, Seoul, Korea) (17). To calculate lean mass, fat mass was subtracted from total body weight. Fat mass index (FMI) and lean mass index (LMI) were calculated as fat or lean mass in kilograms divided by height in meters to the power of two, expressed as $\mathrm{kg} / \mathrm{m}^{2}$. FMI and LMI values were then divided into high/low groups according to their median values separately for men ( $6.29 \mathrm{~kg} / \mathrm{m}^{2}$ for FMI and $20.77 \mathrm{~kg} / \mathrm{m}^{2}$ for LMI) and women ( $9.20 \mathrm{~kg} / \mathrm{m}^{2}$ for FMI and $17.93 \mathrm{~kg} / \mathrm{m}^{2}$ for LMI). This information was used in creating four body composition groups: (i) high FMI and high LMI, (ii) high FMI and low LMI, (iii) low FMI and low LMI, and (iv) low FMI and high LMI, chosen as reference group in our analyses.

## Clinical Covariate Data Obtained During 2001-2004

Self-administered questionnaires were used to assess smoking, coded into never, former, and current smoker. The highest attained
occupational status at 5 -year intervals between 1970 and 1995 was used to indicate socioeconomic status (SES) in adulthood and was obtained from Statistics Finland (18).

## Statistical Methods

We used linear mixed models to examine the associations between body composition and FI levels at age 57 years and the rate of change in FI levels from late midlife into old age. Age was used as the underlying time scale and centered at 57 years, the youngest age in the data. Other continuous variables were centered at their mean values. We stratified our analyses by sex because of marked differences in body composition between men and women (19) and previously observed sex differences in the association between body composition and frailty $(4,20)$. Body composition and anthropometry were first examined in separate models. FMI and LMI were then studied jointly; first through mutual adjustment of FMI and LMI and then as FMI-LMI categories. We adjusted our models with key lifestyle factors (smoking) that were not already included among the studied variables or in the FI, socioeconomic factors (adult SES), and their interactions with age. To account for sample attrition during the study, we repeated our main analysis assuming missing not at random sample attrition (21). To improve the interpretability of our model estimates, we multiplied the FI by 100 and treat them as a percentage. Estimates of the FI level correspond to percentage (\%) lower/higher levels of frailty whereas estimates of the rate of change
in FI levels correspond to percentage point (PP) differences of change per year from late midlife into old age. Negative estimates indicate lower levels of frailty at age 57 years or slower increase in FI levels from late midlife into old age. Parametric bootstrap was used to calculate $95 \%$ confidence intervals in the figures. $p$-value $<.05$ was used to indicate statistical significance. The analyses were performed using the R software (22) packages 1 me (23) and lmerTest (24).

## Results

## Body Composition Variables Defined as BMI, WHR, \%BF, FMI, LMI, and FMI-LMI Categories

Bivariate correlations between body composition variables are shown in Supplementary Table 2. Table 1 shows the cohort characteristics by sex. While mean BMI was similar among men and women ( 27.5 and $27.7 \mathrm{~kg} / \mathrm{m}^{2}$ ), both sexes showed distinct body compositions. Mean WHR (1.0 vs. 0.9) and LMI (20.8 vs. $18.0 \mathrm{~kg} / \mathrm{m}^{2}$ ) were higher among men, whereas women showed body compositions characterized by higher mean FMI ( 9.7 vs. $6.7 \mathrm{~kg} / \mathrm{m}^{2}$ ) and \%BF (33.9 vs. $23.8 \%$ ). FMI - LMI categories identified distinct body composition groups, shown in Supplementary Table 3. As not all participated in the follow-up visit, we tested body composition variables for differences among invited, lost, and dead participants at the follow-up, showing no evidence of body composition affecting participation status (Supplementary Table 4).

Table 1. Characteristics of the 2003 Individuals Participating in Baseline Clinical Measurements During 2001-2004

|  | Total study population ( $n=2003$ ) | Women ( $n=1075$ ) | Men ( $n=928$ ) |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Mean (SD) | Mean (SD) | Mean (SD) | $p$ |
| Participant characteristics assessed at baseline |  |  |  |  |
| Age (years) | 61.5 (2.9) | 61.5 (2.8) | 61.5 (3.0) | . 694 |
| Smoking status |  |  |  | <. 001 |
| Never smoker, $n(\%)$ | 839 (42.2) | 593 (55.7) | 246 (26.7) |  |
| Quit smoking, $n(\%)$ | 673 (33.9) | 251 (23.6) | 422 (45.8) |  |
| Current smoker, $n(\%)$ | 475 (23.9) | 221 (20.7) | 254 (27.5) |  |
| Body composition |  |  |  |  |
| BMI ( $\mathrm{kg} / \mathrm{m}^{2}$ ) | 27.6 (4.7) | 27.7 (5.0) | 27.5 (4.2) | . 783 |
| Waist-to-hip ratio | 0.9 (0.1) | 0.9 (0.1) | 1.0 (0.1) | <. 001 |
| Lean mass index ( $\mathrm{kg} / \mathrm{m}^{2}$ ) | 19.3 (2.3) | 18.0 (1.7) | 20.8 (1.9) | <. 001 |
| Fat mass index (kg/m ${ }^{2}$ ) | 8.3 (3.6) | 9.7 (3.7) | 6.7 (2.8) | <. 001 |
| Percent body fat (\%) | 29.2 (8.2) | 33.9 (6.9) | 23.8 (6.0) | <. 001 |
| Categories of fat and lean body mass index |  |  |  | . 007 |
| High FMI and high LMI, $n(\%)$ | 688 (35.9) | 387 (37.5) | 301 (34.0) |  |
| High FMI and low LMI, $n(\%)$ | 271 (14.1) | 129 (12.5) | 142 (16.0) |  |
| Low FMI and high LMI, $n(\%)$ | 270 (14.1) | 128 (12.4) | 142 (16.0) |  |
| Low FMI and low LMI, $n(\%)$ | 689 (35.9) | 388 (37.6) | 301 (34.0) |  |
| Adult socioeconomic status |  |  |  | <. 001 |
| Manual worker, $n(\%)$ | 671 (33.5) | 276 (25.7) | 395 (42.6) |  |
| Self-employed, $n(\%)$ | 187 (9.3) | 91 (8.5) | 96 (10.3) |  |
| Lower official, $n(\%)$ | 858 (42.9) | 603 (56.2) | 255 (27.5) |  |
| Upper official, $n(\%)$ | 286 (14.3) | 104 (9.7) | 182 (19.6) |  |
| Frailty index |  |  |  |  |
| Baseline measurement occasion in 2001-2004 ${ }^{\text {a }}$ | 0.20 (0.10) | 0.21 (0.10) | 0.20 (0.10) | . 120 |
| Frail (FI $\geq 0.25$ ) at baseline, $n(\%)$ | 575 (28.71) | 336 (31.26) | 239 (25.75) | . 007 |
| Follow-up visit in 2011-2013 ${ }^{\text {b }}$ | 0.21 (0.10) | 0.23 (0.10) | 0.19 (0.10) | <. 001 |
| Follow-up visit in 2017-2018 ${ }^{\text {c }}$ | 0.23 (0.11) | 0.24 (0.11) | 0.21 (0.10) | <. 001 |

[^0]
## Body Composition Variables and the FI Level Assessed in Late Midlife

At the age of 57 years, the mean FI level was 0.161 among men and 0.174 among women. Greater BMI, WHR, \%BF, LMI, and FMI were all associated with a higher FI level in late midlife among both men and women after adjustment for smoking and adult SES (Table 2). For each $\mathrm{kg} / \mathrm{m}^{2}$ unit higher in BMI the percentage increase in FI levels was of similar magnitude for men $(0.72 \%$, $p<.001)$ and women $(0.63 \%, p<.001)$. FMI was driving the association among men: per each $\mathrm{kg} / \mathrm{m}^{2}$ unit higher in FMI the level FI was $1.30 \%$ greater among men and $0.92 \%$ greater among women ( $p$-values < .001). Further adjustment for LMI strengthened the associations. Among women, the association was driven by LMI: per each $\mathrm{kg} / \mathrm{m}^{2}$ unit higher in LMI the FI level was $1.23 \%$ greater among women and $0.77 \%$ greater among men ( $p$-values < .001). Further adjustment with FMI changed the direction of the associations: per each $\mathrm{kg} / \mathrm{m}^{2}$ unit higher in LMI the FI level was $0.63 \%$ lower among men ( $p=.009$ ) and $0.46 \%$ lower among women ( $p=.116$ ). The associations were attenuated when LMI was adjusted with percent body fat (Table 2).

FMI-LMI categories characterized by "high FMI" were associated with a higher FI level in late midlife in both sexes combined (Supplementary Table 5). Relative to the category "low FMI and high LMI", membership in the categories "high FMI and high LMI", "high FMI and low LMI" and "low FMI and low LMI" were associated with $6.90 \%, 4.54 \%$ ( $p$-values < .001) and $1.27 \%$ ( $p=.112$ ) greater FI levels in late midlife, respectively.

## Body Composition Variables and the Rate of Change in FI Levels from Late Midlife into Old Age

The mean increase in FI levels was $0.28 \% /$ year among men and $0.34 \% /$ year among women from late midlife into old age. Greater BMI, \%BF, LMI, and FMI were associated with a steeper increase in FI levels from late midlife into old age among women when adjusted for smoking and adult SES (Table 2). Among women, per each $\mathrm{kg} / \mathrm{m}^{2}$ higher in BMI and per each unit higher in $\% \mathrm{BF}$ the respective increases in FI levels were $0.013 \mathrm{PP}(95 \% \mathrm{CI}=0.004,0.023)$ and 0.009 PP $(95 \% \mathrm{CI}=0.002,0.016)$ steeper per year from late midlife into old age. Figure 2A-C present the development of FI levels in groups of BMI (cut-offs at $25 \mathrm{~kg} / \mathrm{m}^{2}$ and $30 \mathrm{~kg} / \mathrm{m}^{2}$ ), $\% \mathrm{BF}$, and WHR (cut-offs at sex-specific 25 th and 75 th percentiles). Each kg/ $\mathrm{m}^{2}$ higher FMI and LMI at baseline were associated with a steeper increase in FI levels from late midlife into old age. However, adjustment of FMI with LMI, and vice versa, attenuated these associations. Among men, per each 0.1 -unit greater WHR the increase in FI levels was 0.074 PP steeper per year $(95 \% \mathrm{CI}=-0.0004,0.148)$ from late midlife into old age. Estimates of Table 2-predictors assuming missing not at random sample attrition showed parallel results (Supplementary Table 6).

Figure 3 presents the development of FI levels in FMI-LMI categories and show that the FI level in late midlife was the highest in the category "high FMI and high LMI", followed by "high FMI and low LMI", which persisted from late midlife into old age. The lowest levels of frailty in late midlife were observed in the groups

Table 2. Body Composition Variables and their Associations with Point Estimates of the FI Level at Age 57 Years and the Annual Rate of Change in FI Levels from Late Midlife into Old Age

|  | Level ${ }^{\text {a }}$ | $95 \% \mathrm{CI}$ | $p$ | Rate of change ${ }^{\text {b }}$ | 95 \% CI | $p$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Body composition variable ${ }^{\text {c }}$ |  |  |  |  |  |  |
| BMI ( $\mathrm{kg} / \mathrm{m}^{2}$ ) |  |  |  |  |  |  |
| Women | 0.63 | 0.50, 0.76 | <. 001 | 0.013 | 0.004, 0.023 | . 007 |
| Men | 0.72 | 0.55, 0.88 | <. 001 | 0.008 | -0.004, 0.021 | . 216 |
| Waist-to-hip ratio |  |  |  |  |  |  |
| Women | 3.98 | 3.08, 4.89 | <. 001 | 0.009 | -0.052, 0.070 | . 766 |
| Men | 4.80 | 3.71, 5.89 | <. 001 | 0.074 | -0.0004, 0.148 | . 051 |
| Percent body fat (\%) |  |  |  |  |  |  |
| Women | 0.48 | 0.38, 0.58 | <. 001 | 0.009 | 0.002, 0.016 | . 012 |
| Men | 0.61 | 0.49, 0.73 | <. 001 | 0.001 | -0.007, 0.010 | . 739 |
| Lean mass index ( $\mathrm{kg} / \mathrm{m}^{2}$ ) |  |  |  |  |  |  |
| Women | 1.23 | 0.81, 1.64 | <. 001 | 0.035 | 0.007, 0.063 | . 016 |
| Men | 0.77 | 0.38, 1.16 | <. 001 | 0.010 | -0.018, 0.038 | . 493 |
| Women ${ }^{\text {d }}$ | -0.46 | -1.03, 0.11 | . 116 | 0.023 | -0.015, 0.062 | . 236 |
| Men ${ }^{\text {d }}$ | -0.63 | -1.11, -0.16 | . 009 | 0.019 | -0.014, 0.053 | . 262 |
| Women ${ }^{\text {e }}$ | 0.25 | -0.22, 0.72 | . 303 | 0.025 | -0.007, 0.057 | . 128 |
| Men ${ }^{\text {e }}$ | -0.03 | -0.45, 0.38 | . 871 | 0.014 | -0.016, 0.045 | . 353 |
| Fat mass index (kg/m ${ }^{2}$ ) |  |  |  |  |  |  |
| Women | 0.93 | 0.74, 1.11 | <. 001 | 0.018 | 0.005, 0.031 | . 008 |
| Men | 1.29 | 1.04, 1.54 | <. 001 | 0.008 | -0.012, 0.027 | . 440 |
| Women ${ }^{\text {f }}$ | 1.08 | 0.81, 1.34 | <. 001 | 0.010 | -0.008, 0.029 | . 274 |
| Men ${ }^{\text {f }}$ | 1.55 | 1.23, 1.86 | <. 001 | -0.001 | -0.025, 0.024 | . 979 |

Notes: $\mathrm{BMI}=$ body mass index; $\mathrm{CI}=$ confidence interval; $\mathrm{FI}=$ frailty index; .
${ }^{a}$ In FI $\times 100$ units, which correspond percentage increases/decreases in FI levels at age 57 years (mean FI level at age 57 years was 0.161 among men and 0.174 among women).
${ }^{\text {b }}$ In percentage points per year from late midlife into old age (mean annual rate of change in FI levels from late midlife into old age was 0.28 percent/year among
${ }^{\text {c Analyzed individually. Linear mixed model adjusted with age, smoking, and adult socioeconomic status. }}$
${ }^{\mathrm{d}}$ Adjusted additionally for fat mass index $\left(\mathrm{kg} / \mathrm{m}^{2}\right)$.
${ }^{\mathrm{c}}$ Adjusted additionally for percent body fat (\%).
${ }^{\mathrm{f}}$ Adjusted additionally for lean mass index $\left(\mathrm{kg} / \mathrm{m}^{2}\right)$.


Figure 2. ( $\mathbf{A}-\mathbf{C}$ ) Mean frailty index levels ( $\mathrm{FI} \times 100$ ) as a function of age from late midlife into old age in the Helsinki Birth Cohort Study for body composition variables which were significantly associated with the rate of change in FI levels from late midlife into old age: shown (A) separately for men and women in groups of $\mathrm{BMI}\left(<25.0 \mathrm{~kg} / \mathrm{m}^{2}, \geq 25.0\right.$ and $\leq 30.0 \mathrm{~kg} / \mathrm{m}^{2}$, $>30.0 \mathrm{~kg} / \mathrm{m}^{2}$ ), (B) separately for men and women in groups of percent body fat (\%BF) (sex-specific 25th and 75 th percentile), (C) separately for men and women in groups of waist-to-hip ratio (WHR) (sex-specific 25th and 75th percentile). Adjusted with smoking, adult socioeconomic status, and their interactions with age. Parametric bootstrap was used to calculate $95 \%$ confidence intervals.
where FMI was low. However, we observed no associations between FMI-LMI categories and the rate of change in FI levels from late midlife into old age (Supplementary Tables 5 and 7).

## Discussion

Longitudinal studies show that higher BMI is associated with an increased risk of frailty. However, BMI is not an optimal predictor of health outcomes as its different constituents, namely lean and fat mass, may have opposite associations with frailty. In this study of community-dwelling individuals, the FI levels of women with a higher BMI and greater adiposity ( $\% \mathrm{BF}$ ) and men with greater abdominal obesity (WHR) in late midlife increased steeper from late midlife into old age (ages 57-84 years). Cross-sectionally, fatter body composition in late midlife was strongly associated with a higher level of frailty among both sexes. Higher LMI seemed to be protective of frailty particularly among men, but no longer in the presence of high FMI. Our findings suggest potential improvement to frailty risk prevention through identification of high BMI and \%BF among women and WHR among men in late midlife. Joint assessment of body composition variables may be of significance, as we observed the direction of the association between LMI and frailty level change after adjustment with FMI.

## Cross-sectional Findings

In line with previous studies, we observed positive cross-sectional associations between higher BMI $(25)$ and $\% \mathrm{BF}(26,27)$ associating with higher FI levels. Fewer previous studies have focused on indices of body composition relative to height including FMI (4), LMI $(4,28)$, skeletal muscle index (7), and waist-to-height ratio (20). In


Figure 3. Mean frailty index levels ( $\mathrm{FI} \times 100$ ) as a function of age from late midlife into old age in the Helsinki Birth Cohort Study shown in FMILMI categories. The cut-off for low/high FMI was $6.29 \mathrm{~kg} / \mathrm{m}^{2}$ for men and $9.20 \mathrm{~kg} / \mathrm{m}^{2}$ for women and the cut-off for low/high LMI was $20.77 \mathrm{~kg} / \mathrm{m}^{2}$ for men and $17.93 \mathrm{~kg} / \mathrm{m}^{2}$ for women. Adjusted with smoking, adult socioeconomic status, and their interactions with age. Parametric bootstrap was used to calculate $95 \%$ confidence intervals.
line with observations in the present study, Soh et al. (4) observed higher LMI associating with a lower prevalence of frailty among older community-dwelling Koreans. However, the authors observed no associations between FMI or \%BF and frailty. Williams et al. (7) found that muscle density, rather than skeletal muscle index, was associated with frailty among patients with cancer. Kim et al. (20) suggested mediating effects of waist-to-height ratio on the association between obesity and frailty among older Korean women. In their study, the risk attributable to obesity was attenuated after adjustment for waist-to-height ratio. Taken together, the evidence from individually analyzed indices of fat and lean mass and frailty is inconsistent but suggests potentially higher risk in individuals with high indices of obesity and potential protection from risk through higher lean indices.

We were able to extend these findings through joint assessment of FMI and LMI and show that FMI seems to drive the association between higher BMI and FI levels. Higher LMI may be protective of frailty among men, but not in the simultaneous presence high FMI. This dominating effect of fat indices was further supported in FMILMI categories, where the level of frailty was the highest in groups where FMI was high and lowest where LMI was low. Our sample, consisting of relatively fit older adults, was characterized with higher LMI and average FMI values when compared with reference values from a European cohort (19). Our results highlight that FMI and LMI act together, and optimally, both should be accounted for in future studies assessing body composition.

## Longitudinal Findings

In the present study, we observed no associations between jointly assessed FMI-LMI categories and the rate of change in FI levels from late midlife into old age. In other words, the pace at which the participants' level of frailty increased per year was similar in jointly assessed FMI-LMI categories. However, those with higher fat mass indices in late midlife were frailer and stayed so until old age compared with those with lower fat mass indices. The participants who were most frail throughout were those with high fat and lean mass indices. In the previous study by Hirani et al. (11) the risk of frailty
was minimally incremented when measures of high adiposity were combined with low lean mass. In their study of men aged 70 years and older, men who had either low muscle mass or sarcopenic obesity (combined low muscle mass and high fat percentage) both had an approximately two-fold risk of frailty during the study period compared with men without obesity or low muscle mass. In this study of initially younger men and women, it was not low muscle mass that was associated with participants becoming frailer earlier, but instead indices of higher body mass (BMI) and adiposity ( $\% \mathrm{BF}$ ) among women and abdominal obesity (WHR) among men. This means that among men and women, there was evidence of an interaction between sex and body composition on the participants' annual pace of increase in frailty levels from midlife into old age. Our results agree with previous observations of higher BMI associating with incident frailty (29), its progression $(29,30)$, and of higher WHR associating with the progression of frailty $(29,30)$ and extend them by providing evidence of differences in body composition between men and women that increase the risk of becoming frailer earlier.

Furthermore, we found that BMI assessed in late midlife was not consistently associated with the risk of frailty. It was associated with risk among women, who also have higher levels of total body fat than men in given BMI values (31). This means that BMI better captures fatness among women than men. The potential protective association of higher LMI and lower risk of frailty (4) may conflate the use of BMI in estimating the risk of frailty among men. Our results suggest that WHR may outperform BMI among men in capturing fatness and their consequent risk of frailty.

## Mechanisms

Aging involves changes to body composition including increasing fat mass, decreasing lean mass, and an altering distribution of lean/fat mass (3). Higher adiposity in particular has been associated with frailty in a life-course perspective, where abnormal patterns of childhood growth (32), midlife obesity $(33,34)$, weight gain (35), and long-term obesity (36) were all associated with an increased risk of frailty. Higher levels of adiposity may contribute to a chronic pro-inflammatory state (5) and infiltration of lipids to other tissues including muscle (6). Insulin resistance $(37,38)$ and other cardiovascular risk factors (39) may follow, which have been shown to increase the risk of frailty $(34,40)$. Besides cardiovascular risk factors, obesity may also predispose to declining mobility and higher levels of disability (41).

## Strengths and Limitations

Strengths of the present study include detailed clinical data with follow-up from late midlife into old age. We were able to study lean and fat mass indices separately and jointly to further our understanding on the association between body composition and frailty. The FI (13) used in the study emphasizes weight loss less (one of the 39 deficits) than the frailty phenotype (one of five criteria), which may help to reduce confounding between body composition and frailty. The study results should be interpreted considering the following weaknesses. First, body composition was assessed using bioelectric impedance analysis, which is subject to inferior validity (42) and may overestimate lean and underestimate fat mass relative to those assessed by dual-energy X-ray absorptiometry (43). Second, while the FI used in the study had exceeded the minimum of 30 deficits, it does not include deficits related to cognitive test results or sensory problems due to insufficient data. While two deficits were excluded for the present study, the FI has not been shown to be sensitive to missing deficits (44). Third, moderate sample attrition
occurred over the 17-year follow-up. However, we found baseline body composition to be minimally associated with participant status at the follow-up visit. Furthermore, assuming not missing at random sample attrition did not significantly alter the results. Fourth, we used information on body composition at baseline only and we cannot exclude that body composition varied with time in the cohort. Finally, we report findings among relatively fit communitydwelling Caucasians and suggest caution in generalizing the results to other populations or ethnicities.

## Implications

Fat and lean mass showed opposite associations with the risk of frailty; we found evidence that higher fat mass overruled lean mass as a predictor of frailty in late midlife. While higher lean mass has previously been suggested to prove beneficial for frailty, its significance may be greatly reduced with high levels of fat mass. There was an interaction between age and waist-to-hip ratio on frailty among men, which meant that men with higher waist-to-hip ratios became frailer earlier. Therefore, avoiding high levels of abdominal obesity in midlife among men could help lowering one's future risk of frailty. The body composition predisposing women to becoming frailer earlier was different; women who had a higher BMI and \%BF became frailer earlier. Avoiding a high BMI and high levels of adiposity (\%BF) among women in midlife may help in the prevention of future frailty. The use of multiple/jointly assessed indices of body composition may be useful, as single measures alone may produce inconsistent risk estimates or overestimate risk. Future studies may choose to address, besides fat and lean indices, indices of muscle quality.

## Conclusion

Fat and lean mass showed opposite associations with the risk of frailty in late midlife. Higher fat mass overruled possible protective effects of lean mass on the risk of frailty in late midlife. The FI levels of women with a greater BMI and level of adiposity ( $\% \mathrm{BF}$ ) and men with greater abdominal obesity (WHR) increased steeper in the period ranging from late midlife into old age. Avoiding high levels of adiposity/abdominal obesity in midlife may help to reduce one's future risk of frailty.

## Supplementary Material

Supplementary data are available at The Journals of Gerontology, Series A: Biological Sciences and Medical Sciences online.

## Funding

This work was supported by Medicinska Understödföreningen Liv och Hälsa, Finska Läkaresällskapet, and the Academy of Finland grant no. 349336. The funder had no role in the design, methods, results, or their interpretation in the study.

## Conflict of Interest

None declared

## Acknowledgments

The authors would like to thank the research participants of the Helsinki Birth Cohort Study for their participation.

## Author Contributions

Concept and design (M.J.H., M.B.v.B., J.G.E.), acquisition of data (T.M.M., N.S.W., E.K., J.G.E.), analysis and/or interpretation of data (M.J.H., L.K.), drafting the article (M.J.H.), critical revision of the article (M.J.H., J.J., L.K., T.M.M., M.S., N.S.W., E.K., J.G.E., M.B.v.B.). All authors approved the article.

## References

1. Hoogendijk EO, Afilalo J, Ensrud KE, Kowal P, Onder G, Fried LP. Frailty: implications for clinical practice and public health. Lancet. 2019;394(10206):1365-1375. doi:10.1016/S0140-6736(19)31786-6
2. Yuan L, Chang M, Wang J. Abdominal obesity, body mass index and the risk of frailty in community-dwelling older adults: a systematic review and meta-analysis. Age Ageing. 2021;50(4):1118-1128. doi:10.1093/ageing/ afab039
3. Beaufrère $B$, Morio $B$. Fat and protein redistribution with aging: metabolic considerations. Eur J Clin Nutr. 2000;54(3):S48-S53. doi:10.1038/ sj.ejen. 1601025
4. Soh Y, Won CW. Sex differences in association between body composition and frailty or physical performance in community-dwelling older adults. Medicine (Baltim). 2021;100(4):e24400. doi:10.1097/MD.0000000000024400
5. Reilly SM, Saltiel AR. Adapting to obesity with adipose tissue inflammation. Nat Rev Endocrinol. 2017;13(11):633-643. doi:10.1038/ nrendo. 2017.90
6. Zoico E, Rossi A, Di Francesco V, et al. Adipose tissue infiltration in skeletal muscle of healthy elderly men: relationships with body composition, insulin resistance, and inflammation at the systemic and tissue level. $J$ Gerontol A Biol Sci Med Sci. 2010;65(3):295-299. doi:10.1093/gerona/ glp155
7. Williams GR, Deal AM, Muss HB, et al. Frailty and skeletal muscle in older adults with cancer. J Geriatr Oncol. 2018;9(1):68-73. doi:10.1016/j. jgo.2017.08.002
8. Srikanthan P, Karlamangla AS. Muscle mass index as a predictor of longevity in older adults. Am J Med. 2014;127(6):547-553. doi:10.1016/j. amjmed.2014.02.007
9. Winter JE, MacInnis RJ, Nowson CA. The influence of age on the BMI and all-cause mortality association: a meta-analysis. J Nutr Heal Aging. 2017;21(10):1254-1258. doi:10.1007/s12603-016-0837-4
10. Heymsfield SB, Gonzalez MCC, Shen W, Redman L, Thomas D. Weight loss composition is one-fourth fat-free mass: a critical review and critique of this widely cited rule. Obes Rev. 2014;15(4):310-321. doi:10.1111/obr. 12143
11. Hirani V, Naganathan V, Blyth F, et al. Longitudinal associations between body composition, sarcopenic obesity and outcomes of frailty, disability, institutionalisation and mortality in community-dwelling older men: The Concord Health and Ageing in Men Project. Age Ageing. 2017;46(3):413420. doi:10.1093/ageing/afw214
12. Barker DJP, Osmond C, Forsén TJ, Kajantie E, Eriksson JG. Trajectories of growth among children who have coronary events as adults. N Engl J Med. 2005;353(17):1802-1809. doi:10.1056/NEJMoa044160
13. Haapanen MJ, Jylhävä J, Kortelainen L, et al. Early life factors as predictors of age-associated deficit accumulation across 17 years from midlife into old age. J Gerontol A Biol Sci Med Sci. 2022;77(11):2281-2287.
14. Searle SD, Mitnitski A, Gahbauer EA, Gill TM, Rockwood K. A standard procedure for creating a frailty index. BMC Geriatr. 2008;8(1):24. doi:10.1186/1471-2318-8-24
15. Rockwood K, Song X, Mitnitski A. Changes in relative fitness and frailty across the adult lifespan: evidence from the Canadian National Population Health Survey. CMAJ. 2011;183(8):E487-E494. doi:10.1503/ cmaj. 101271
16. Kulminski AM, Ukraintseva SV, Kulminskaya IV, Arbeev KG, Land K, Yashin AI. Cumulative deficits better characterize susceptibility to death in elderly people than phenotypic frailty: lessons from the Cardiovascular Health Study. J Am Geriatr Soc. 2008;56(5):898-903. doi:10.1111/j.1532-5415.2008.01656.x
17. Malavolti M, Mussi C, Poli M, et al. Cross-calibration of eight-polar bioelectrical impedance analysis versus dual-energy X-ray absorptiometry for the assessment of total and appendicular body composition in healthy subjects aged 21-82 years. Ann Hum Biol. 2003;30(4):380-391. doi:10.1080/0301446031000095211
18. Official Statistics of Finland (OSF). Classification of Socio-Economic Groups; 1989. Accessed May 6, 2020. https://www.stat.fi/en/luokitukset/ sosioekon_asema/.
19. Ofenheimer A, Breyer-Kohansal R, Hartl S, et al. Reference values of body composition parameters and visceral adipose tissue (VAT) by DXA in adults aged 18-81 years-results from the LEAD cohort. Eur J Clin Nutr. 2020;74(8):1181-1191. doi:10.1038/s41430-020-0596-5
20. Kim M, Lee Y, Kim EY, Park Y. Mediating effect of waist:height ratio on the association between BMI and frailty: the Korean Frailty and Aging Cohort Study. Br J Nutr. 2020;124(5):513-520. doi:10.1017/ S0007114519002058
21. Stolz E, Mayerl H, Rásky V, Freidl W. Does sample attrition affect the assessment of frailty trajectories among older adults? A joint model approach. Gerontology. 2018;64(5):430-439. doi:10.1159/000489335
22. R Core Team. R: A language and environment for statistical computing. 2020. Accessed July 11, 2021. https://www.r-project.org/.
23. Bates D, Mächler M, Bolker B, Walker S. Fitting linear mixed-effects models using lme4. J Stat Softw. 2015;67(1):1-48. doi:10.18637/JSS. V067.I01
24. Kuznetsova A, Brockhoff PB, Christensen RHB. lmerTest Package: tests in linear mixed effects models. J Stat Softw. 2017;82(1):1-26. doi:10.18637/ JSS.V082.I13
25. Ramsay SE, Arianayagam DS, Whincup PH, et al. Cardiovascular risk profile and frailty in a population-based study of older British men. Heart. 2015;101(8):616-622. doi:10.1136/heartjnl-2014-306472
26. Crow RS, Lohman MC, Titus AJ, et al. Association of obesity and frailty in older adults: NHANES 1999-2004. J Nutr Health Aging. 2019;23(2):138144. doi:10.1007/S12603-018-1138-X
27. Falsarella GR, Gasparotto LPR, Barcelos CC, et al. Body composition as a frailty marker for the elderly community. Clin Interv Aging. 2015;10:1661-1666. doi:10.2147/CIA.S84632
28. Jung H-W, Kim S-W, Lim J-Y, et al. Frailty status can predict further lean body mass decline in older adults. J Am Geriatr Soc. 2014;62(11):21102117. doi:10.1111/jgs. 13107
29. Niederstrasser NG, Rogers NT, Bandelow S. Determinants of frailty development and progression using a multidimensional frailty index: evidence from the English Longitudinal Study of Ageing. PLoS One. 2019;14(10):e0223799e0223799. doi:10.1371/journal.pone. 0223799
30. Fan J, Yu C, Pang Y, et al. Adherence to healthy lifestyle and attenuation of biological aging in middle-aged and older Chinese adults. J Gerontol Ser A. 2021;76(12):2232-2241. doi:10.1093/GERONA/GLAB213
31. Gallagher D, Visser M, Sepúlveda D, Pierson RN, Harris T, Heymsfieid SB. How useful is body mass index for comparison of body fatness across age, sex, and ethnic groups? Am J Epidemiol. 1996;143(3):228-239. doi:10.1093/OXFORDJOURNALS.AJE.A008733
32. Haapanen MJ, Perälä MM, Osmond C, et al. Infant and childhood growth and frailty in old age: the Helsinki Birth Cohort Study. Aging Clin Exp Res. 2019;31(5):717-721. doi:10.1007/s40520-018-1011-0
33. Stenholm S, Strandberg TE, Pitkala K, Sainio P, Heliovaara M, Koskinen S. Midlife obesity and risk of frailty in old age during a 22-year follow-up in men and women: The Mini-Finland Follow-up Survey. J Gerontol Ser A Biol Sci Med Sci. 2014;69(1):73-78. doi:10.1093/ gerona/glt052
34. Strandberg TE, Sirola J, Pitkälä KH, Tilvis RS, Strandberg AY, Stenholm S. Association of midlife obesity and cardiovascular risk with old age frailty: a 26-year follow-up of initially healthy men. Int J Obes. 2012;36(9):11531157. doi:10.1038/ijo. 2012.83
35. Mezuk B, Lohman MC, Rock AK, Payne ME. Trajectories of body mass indices and development of frailty: evidence from the Health and Retirement Study. Obesity (Silver Spring). 2016;24(8):1643-1647. doi:10.1002/oby. 21572
36. Landré B, Czernichow S, Goldberg M, Zins M, Ankri J, Herr M. Association between life-course obesity and frailty in older adults: findings in the GAZEL cohort. Obesity. 2020;28(2):388-396. doi:10.1002/oby. 22682
37. Albu JB, Kovera AJ, Allen L, et al. Independent association of insulin resistance with larger amounts of intermuscular adipose tissue and a greater acute insulin response to glucose in African American than in white nondiabetic women. Am J Clin Nutr. 2005;82(6):1210-1217. doi:10.1093/ ajcn/82.6.1210
38. Lumeng CN, Bodzin JL, Saltiel AR. Obesity induces a phenotypic switch in adipose tissue macrophage polarization. J Clin Invest. 2007;117(1):175184. doi:10.1172/JCI29881
39. Gómez-Ambrosi J, Silva C, Galofré JC, et al. Body mass index classification misses subjects with increased cardiometabolic risk factors related to elevated adiposity. Int J Obes. 2011;36(2):286-294. doi:10.1038/ ijo. 2011.100
40. Clegg A,Hassan-Smith Z. Frailty and the endocrine system. Lancet Diabetes Endocrinol. 2018;6(9):743-752. doi:10.1016/S2213-8587(18)30110-4
41. Vincent HK, Vincent KR, Lamb KM. Obesity and mobility disability in the older adult. Obes Rev. 2010;11(8):568-579. doi:10.1111/j.1467-789X.2009.00703.x
42. Safer VB, Kulcu DG. Bioimpedance analysis and frailty. J Am Geriatr Soc. 2015;63(5):1050-1050. doi:10.1111/JGS. 13414
43. Sillanpää E, Cheng S, Häkkinen K, et al. Body composition in 18- to 88 -yearold adults-comparison of multifrequency bioimpedance and dual-energy X-ray absorptiometry. Obesity (Silver Spring). 2014;22(1):101-109. doi:10.1002/oby. 20583
44. Rockwood K, Mitnitski A, Song X, Steen B, Skoog I. Long-term risks of death and institutionalization of elderly people in relation to deficit accumulation at age 70. J Am Geriatr Soc. 2006;54(6):975-979. doi:10.1111/j.1532-5415.2006.00738.x

[^0]:    Notes: $\mathrm{BMI}=$ body mass index; $\mathrm{FMI}=$ fat mass index; $\mathrm{LMI}=$ lean mass index; $\mathrm{SD}=$ standard deviation.
    ${ }^{\mathrm{a}} n=1995$.
    ${ }^{\mathrm{b}} n=1081$.
    ${ }^{c} n=806$.

