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## Associations between Weight Change, Knee Subcutaneous Fat and Cartilage Thickness in Overweight and Obese Individuals: 4-Year Data from the Osteoarthritis Initiative

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### Abstract

**Objective:** To assess (i) the impact of changes in body weight on changes in joint-adjacent subcutaneous fat (SCF) and cartilage thickness over 4-years and (ii) the relation between changes in joint-adjacent SCF and knee cartilage thickness.

**Design:** Individuals from the Osteoarthritis Initiative (total=399) with >10% weight gain (n=100) and >10% weight loss (n=100) over 4 years were compared to a matched control cohort with less than 3% change in weight (n=199). 3.0T MRI of the right knee was performed at baseline and after 4 years to quantify joint-adjacent SCF and cartilage thickness. Linear regression models were used to evaluate the associations between the (i) weight change group and 4-year changes in both knee SCF and cartilage thickness, and (ii) 4-year changes in knee SCF and in cartilage thickness. Analyses were adjusted for age, sex, baseline BMI, tibial diameter (and weight change group in analysis (ii)).

**Results:** Individuals who lost weight over 4-years had significantly less joint-adjacent SCF (beta range, medial/lateral joint sides: 2.2mm to 4.2mm, p<0.001) than controls; individuals who gained weight had significantly greater joint-adjacent SCF than controls (beta range: -1.4mm- -3.9mm, p<0.001). No statistically significant associations were found between weight change

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- Conception and design (GBJ, MT, GA, JAL, VP, SM, NEL, MCN, CEM, TML)
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- Collection and assembly of data (GBJ, MT, GA, JAL, VP)
- Drafting of the article (GBJ, MT, GA, TML)
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and cartilage thickness change. However, increases in joint-adjacent SCF over 4-years were significantly associated with decreases in cartilage thickness ( $p=0.04$ ).

**Conclusions:** Weight change was associated with joint-adjacent SCF, but not with change in cartilage thickness. However, 4-year increases in joint-adjacent SCF were associated with decreases in cartilage thickness independent of baseline BMI and weight change group.

### Keywords

Knee Subcutaneous Fat; Cartilage Thickness; Weight Change

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## INTRODUCTION

Osteoarthritis (OA) is the most common cause of disability in the United States, affecting over 32.5 million adults<sup>1</sup>. One important modifiable risk factor for knee OA is obesity: weight loss is protective for the development of symptomatic knee OA<sup>2</sup>, while weight gain may exacerbate knee OA symptoms<sup>3</sup> and increase the risk for knee replacement<sup>4</sup>. Recently, joint-adjacent subcutaneous fat (SCF) has gained interest as an independent risk factor and a potential biomarker of OA progression.

While most research studies on obesity and OA have focused on BMI measurements as exposure variables<sup>5</sup>, BMI has inherent limitations as it does not capture the distribution of fat around the body and cannot distinguish adipose tissue from non-adipose body mass<sup>3</sup>. In contrast, joint-adjacent knee SCF is a *localized* measure of the amount of fat surrounding a joint that may provide additional insights (relative to BMI) on the effects of adipose tissue change on OA progression.

Recent studies have investigated the impact of localized fat depots including joint-adjacent SCF in the thigh and surrounding the knee joint on OA. These studies reported that SCF thickness was significantly higher in individuals presenting with chondromalacia<sup>6</sup>, increases in thigh SCF over 2-years were associated with the progression of knee OA in men<sup>7</sup>, and greater joint-adjacent SCF levels at baseline were associated with higher odds for cartilage and meniscal structural progression over 4 years, independent of baseline BMI<sup>8</sup>. Thus, understanding the impact of localized adipose changes on adjacent knee joint tissue may provide novel insights OA pathogenesis, that are beyond the systemic effects of overall weight change.

The overarching goal of this study is to examine both weight change and change in joint-adjacent SCF in relation to knee OA progression (independent of BMI), using imaging data from the Osteoarthritis Initiative (OAI), a multi-center, longitudinal study OA study (sponsored by the US National Institutes of Health (NIH)). Since the relationship between weight loss and cartilage thickness change has shown varied results<sup>9-12</sup>, the assessment of localized changes in SCF in relation to cartilage thickness change may provide novel insights on the effects of adipose tissue on knee joint degeneration. Thus, the clinical motivation for this study is to gain an understanding of how longitudinal changes in body weight and changes in localized adipose tissue are related to changes in cartilage thickness. Specifically, this study will assess (i) the impact of body weight on joint-adjacent

subcutaneous fat (SCF) and cartilage thickness over 4-years and (ii) the relationship between joint-adjacent SCF and knee cartilage thickness.

## METHOD

### Subject Selection

This study utilized data from the Osteoarthritis Initiative (OAI; <https://nda.nih.gov/oai>)<sup>13</sup>, a multi-center, longitudinal study of individuals aged 45-79 years at enrollment. The OAI dataset includes MRI and radiographic knee images of participants over eight years. The study protocol, amendments, and informed consent documentation were reviewed and approved by the local institutional review boards of all participating centers.

The present study analyzed participants enrolled in the OAI with the following inclusion criteria: (i) individuals with at least 2 BMI timepoints available from baseline to 4-year follow-up (ii) a baseline Kellgren Lawrence score (KL)  $\geq 3$  in the right or left knee, (iii) baseline BMI  $> 25$ . Participants with rheumatoid arthritis were excluded. Based on these criteria, individuals were classified in three groups: weight gain ( $>10\%$ ,  $n=221$ ), weight loss ( $>-10\%$ ,  $n=227$ ) and controls ( $-3$  to  $3\%$  change,  $n=1237$ ). The cut off values were chosen based on previously published studies including Messier et al.<sup>14</sup> who reported that “long-term weight loss between 10-19.9% of baseline body weight has substantial clinical and mechanistic benefits compared to less weight loss” when analyzing data from Intensive Diet and Exercise for Arthritis (IDEA) randomized controlled clinical trial<sup>14</sup>. For this study, participants were randomly selected and frequency matched for age, sex, BMI, and KL grade at baseline, yielding a total of 399 individuals: weight gain ( $>10\%$ ,  $n=100$ ), weight loss ( $>10\%$ ,  $n=100$ ) and controls ( $-3$  to  $3\%$  change,  $n=199$ ), Figure 1.

### Group Definitions

BMI measurements were used to determine the rate of change in BMI over 4 years in each participant using all BMI data available from baseline to 4 years. The slope of the regression line (*in units of change per year*) was multiplied by four to determine magnitude of BMI change over 4 years, and the percentage change in BMI over 4 years was calculated. We employed a regression line to quantify change in BMI over 4-years (rather than only baseline and 4-year data) to comprehensively assess the overall change BMI using all available data. Individuals were classified into three groups based on their changes in BMI: weight loss ( $>10\%$  change), weight gain ( $>10\%$  change), and controls without weight change ( $-3$  to  $3\%$  change).

### Clinical Questionnaires

Knee pain was assessed using the *WOMAC (Western Ontario McMaster Universities Osteoarthritis) Index*, a standard questionnaire used to evaluate symptoms related to knee OA, including pain<sup>15-17</sup>.

The participants' physical activity levels were determined using a Physical Activity Scale for the Elderly (PASE) with a range of 0 to 400. This is a well-established, reliable, validated

questionnaire that has been used to measure physical activity in individuals of similar age to those investigated in the current study<sup>18-21</sup>.

## Radiographs

Standardized bilateral standing posterior-anterior fixed flexion knee radiographs were acquired in all participants in the OAI. For eligibility and to assess baseline disease burden, knee Kellgren Lawrence (KL) gradings<sup>22</sup> from the OAI baseline visit were scored as has been previously described<sup>23</sup>.

## MR Imaging Acquisition and Analyzed Parameters

MR imaging was performed using 3T MRI scanners (Trio, Siemens, Erlangen, Germany) at four centers as part of the imaging OAI protocol at baseline and after 4 years. The following sequences of the right knee were analyzed in this study: 1) coronal 3D fast low angle shot with water excitation (FLASH WE) [7.57 ms/20 ms; 0.313 mm × 0.313 mm; 160 mm; 1.5 mm; 0 mm] and 2) sagittal 3D dual-echo steady state sequence with water excitation (DESS WE) [4.7 ms/16.3 ms; 0.365 mm × 0.456 mm; 140 mm; 1.5 mm; 0 mm] with axial and coronal reformations. Joint-adjacent SCF was measured on coronal 3D FLASH WE MRI sequence, while the DESS sequence was used for cartilage thickness measurements. Additional details on image acquisition parameters have been previously published<sup>24</sup>.

## Joint-adjacent SCF Quantification

Joint-adjacent SCF was measured on coronal 3D FLASH WE MRI sequences at four locations on the medial and lateral sides of the knee joint (Figure 2) by two observers (M.T. and G.A., both 1 year of experience), who were trained by an experienced musculoskeletal radiologist (T.M.L., 25 years of experience). Measurements were performed at baseline and 4-year follow-up in the right knee. The 3D coronal flash sequence was chosen for its precise delineation of the joint-adjacent SCF boundaries and the larger field of view compared to the other available coronal sequences. A section centered on the medial tibial spine was selected, using sagittal and axial reformations of the DESS sequence. SCF thickness was measured on the coronal section at the level of the medial joint space and the superior boundary of the medial tibial spine, both medially and laterally<sup>8</sup>. The inter- and intra-observer reproducibility of SCF measurements has been previously measured<sup>8</sup> and demonstrated good reproducibility ( $CV_{\text{inter-observer}} = 2.72\%$ ;  $CV_{\text{intra-observer}} = 2.01\%$ ). The difference between the baseline and 4-year follow-up SCF measurements were quantified.

## Cartilage Thickness

A fully-automatic method was developed and validated by our group for reliable cartilage segmentation and thickness measurement of knee MRI volumes as previously described<sup>25</sup>. Three identical 3D VNet architectures and three 2D UNet-like architectures were trained to segment DESS sequence volumes. Cartilage segmentation was sub-segmented into lateral tibia, medial tibia, patella, lateral femur, and medial femur regions in the right knee. Per compartment and per sagittal slice, a Euclidean distance transformation and skeletonization was performed. The value of the distance map was sampled at each skeleton point, and all points across all slices were averaged to calculate mean thickness. Lateral and medial

femoral compartments underwent Euclidean distance transform and skeletonization before sub-segmentation. Only the weight-bearing region was included in the mean thickness calculation for the lateral and medial femur<sup>25</sup>. Cartilage thickness was quantified at baseline and at 4-year follow-up.

## Statistical Analysis

Descriptive statistics were performed using a SAS Studio (version 3.8, SAS Institute Inc., Cary, NC, USA) macro program called “Tablen”<sup>26</sup>. Differences in continuous parameters between weight change groups were assessed using Kruskal Wallis tests, and differences in categorical parameters between groups were assessed using Chi-squared tests.

The primary statistical analyses were performed using STATA version 17 software (StataCorp LP, College Station, TX, USA) with significance set to  $p < 0.05$ . Changes in SCF and cartilage thickness, respectively, were defined by subtracting the baseline measurement from the 4-year follow-up measurement. Linear regression models were used to evaluate the associations between (1) weight change group and 4-year changes in both knee SCF and cartilage thickness and (2) 4-year changes in knee SCF and 4-year changes in cartilage thickness. Analysis (2) was conducted on a standardized scale so that the beta coefficients represent the standard deviation change of the outcome, per standard deviation change of the predictor. All analyses were adjusted for age, sex, baseline BMI, and tibial diameter (and weight change group in analysis (2)).

The measurement variables were designated as primary or exploratory to address potential issues stemming from multiple testing. The primary joint adjacent SCF variables were 4-year changes in the medial femur and medial tibia SCF. The lateral SCF variables were designated as exploratory. The primary cartilage thickness variables were the average of all regions, the medial femur, and the medial tibia. The medial compartment of the knee was chosen as primary because medial OA occurs more frequently than lateral OA<sup>27, 28</sup>, data from the OAI have shown that decreases in cartilage thickness over one year were greater in the medial compartment than in the lateral compartment<sup>29</sup>, cartilage lesions are more prevalent on the medial side of the joint<sup>28</sup>, and the medial femur is a concentrated region of weight-bearing<sup>28</sup>.

Three sensitivity analyses were performed: First, a group-sex interaction was added to analysis 1, to assess whether the effects of group on fat outcomes and thickness outcomes differed by sex. Second, a SCF-sex interaction was added to analysis 2 to assess whether the effects of SCF change on thickness change outcomes differed by sex. Third, an additional adjustment for PASE was added to both analyses to assess whether physical activity had an impact on the relationship between group and SCF/thickness outcomes and between SCF and thickness outcomes.

## RESULTS

### Participant Characteristics

A total of 399 participants were included in this study; of those 100 had >10% weight gain over 4 years, 100 had >10% weight loss over 4 years, and 199 were matched controls with -3 to 3% weight change over 4 years. The participant characteristics are listed in Table 1. There were no significant differences in baseline BMI between weight change groups (weight gain:  $31.2 \pm 4.13$  kg/m<sup>2</sup>; weight loss:  $31.5 \pm 3.93$  kg/m<sup>2</sup>; controls:  $31.2 \pm 4.11$  kg/m<sup>2</sup>;  $p = 0.68$ ). There were no significant differences in the age between groups ( $p = 0.19$ ), with the greatest age in participants who lost weight ( $62.3 \pm 9.93$  years). There were no significant differences in the distribution of race ( $p = 0.50$ ) and knee KL grade ( $p_{\text{right\_knee}} = 0.88$ ,  $p_{\text{left\_knee}} = 0.87$ ) between weight change groups.

### Weight change and knee joint-adjacent SCF

Individuals who gained weight over 4-years had significantly greater increases in joint-adjacent SCF than controls after 4 years ( $p < 0.001$  for all regions), while individuals who lost weight had significantly greater decreases in joint-adjacent SCF than controls ( $p < 0.001$  for all regions) as shown in Table 2 and Figure 3. For the weight gain group, the greatest increases in joint adjacent SCF were in the medial tibia SCF (adjusted mean: 4.86mm, 95% CI = 3.48-6.23) compared to controls (adjusted mean: 0.097mm, 95% CI = -0.70-0.89), Beta = 4.76,  $p < 0.001$ ), while the smallest increases were in the lateral femur SCF (adjusted mean: 2.52mm, 95% CI = 1.84-3.22) compared to controls (adjusted mean: 0.49mm, 95% CI = 0.09-0.89), Beta = 4.76,  $p < 0.001$ ). For the weight loss group, the greatest decreases in joint-adjacent SCF were in the medial femur SCF (adjusted mean: -3.64mm, 95% CI = -5.17- -2.10) compared to controls (adjusted mean: 0.30mm, 95% CI = -0.53, -1.13), Beta = -3.94,  $p < 0.001$ ), while the smallest decreases were in the lateral tibia SCF (adjusted mean: -1.01mm, 95% CI = -1.73, -0.27) compared to controls (adjusted mean: 0.40mm, Beta = -1.41, 95% CI = 0.01-0.79),  $p < 0.001$ ). The between-group differences and 95% confidence intervals are listed in Table 2. The results were similar after adjusting for PASE. There were no statistically significant interactions ( $p$ -value range: 0.08 to 0.97) between weight change group and sex on 4-year changes in joint-adjacent SCF outcomes.

### Weight change and cartilage thickness

No statistically significant ( $p > 0.05$ ) associations were found between weight change group and cartilage thickness change in any cartilage region over 4 years. For the weight gain group, the coefficients of cartilage thickness change compared to the control group ranged from -0.009mm in the patella ( $p = 0.68$ , 95% CI = -0.05 to 0.03) to 0.02mm in the medial femur ( $p = 0.19$ , 95% CI = -0.01 to 0.05). For the weight loss group, the coefficients of cartilage thickness change compared to the control group ranged from -0.008mm in the lateral femur ( $p = 0.64$ , 95% CI = -0.04 to 0.03) to 0.01mm in the medial tibia ( $p = 0.25$ , 95% CI = -0.01 to 0.04). The results were similar after adjusting for PASE. There were no statistically significant interactions ( $p$ -value range: 0.08 to 0.99) between weight change group and sex on 4-year changes in thickness outcomes.



### Joint-adjacent SCF and knee cartilage thickness

Increases in joint-adjacent SCF over 4-years were significantly associated with decreases in cartilage thickness (a 1 SD increase in medial femur SCF was associated with 0.14 SD decrease in average thickness,  $p=0.04$ ) as shown in Figure 4 and Table 3. In addition to the average cartilage thickness, increases in medial femur SCF were significantly associated with decreases in medial femur cartilage thickness (coeff\_standardized=-1.5,  $p=0.03$ ), lateral tibia thickness (coeff\_standardized=-0.17,  $p=0.01$ ), and patella thickness (coeff\_standardized=-0.14,  $p=0.04$ ). The remaining associations between joint-adjacent SCF changes and cartilage thickness changes over 4 years were not statistically significant ( $p>0.05$ ). The results were similar after adjusting for PASE. There were no statistically significant interactions ( $p$ -value range: 0.07 to 0.87) between joint adjacent SCF change and sex on 4-year changes in thickness outcomes.

## DISCUSSION

In this study, weight gain was associated with increases in joint-adjacent SCF, while weight loss was associated with decreases in joint-adjacent SCF, independent of baseline BMI. While there were no significant associations between weight change group and cartilage thickness change (all confidence intervals cross 0mm), 4-year increases in joint-adjacent SCF were associated with decreases in cartilage thickness (and vice versa) independent of baseline BMI and weight change group. Thus, cartilage thickness changes may be more sensitive to changes in joint-adjacent SCF compared to changes in BMI, potentially due to the localized nature of joint-adjacent SCF measurements.

While several studies have assessed the relationship between weight loss and cartilage thickness change<sup>9-12</sup>, their conclusions were inconsistent. For reference, a previous study has shown in 3910 individuals that the average cartilage thickness in the femur is was 2.34 mm (standard deviation, 0.71; 95% confidence interval, 0.95-3.73)<sup>30</sup>. Anandacoomarasamy et al. reported that after a 12-month follow-up and a mean weight loss of 9.3%, percentage weight loss was negatively associated with cartilage thickness loss in the medial knee compartment, but not the lateral knee compartment<sup>10</sup>. However, Jafarzadeh et al. reported that 1-year after bariatric surgery, a majority of the cartilage regions (14/16) did not show significant changes in cartilage thickness, and there were “little if any” correlations between cartilage thickness change and weight change percentage<sup>11</sup>. Moreover, Hunter et al. reported no significant associations between weight loss over 18 months (after various interventions including diet, diet and exercise, and exercise only) and cartilage thickness loss<sup>12</sup>. The results from the current study, which show no significant associations between weight change and cartilage thickness change, are in agreement with Hunter et al.<sup>12</sup>, and complementary to the results from Jafarzadeh et al.<sup>11</sup>. This study further demonstrates that these associations hold true over 4 years, and are applicable to not only weight loss, but also to weight gain.

Many regions of lower limb SCF including thigh SCF and infrapatellar/suprapatellar fat pads have been investigated in relation to knee joint degeneration<sup>31</sup>; in contrast, fewer studies have assessed joint adjacent SCF, which is a unique and motivating feature of this study. One previous study assessed joint adjacent SCF at baseline only, reporting

a cross-sectional relationship between SCF and knee joint morphology (as measured by Whole-Organ Magnetic Resonance Imaging Score (WORMS)), and a positive relationship between baseline SCF and increases in cartilage and meniscus degeneration scores over 4 years<sup>8</sup>. The current study focuses on the *longitudinal changes* in joint-adjacent SCF over 4 years, demonstrating that increases in joint-adjacent SCF and are associated with decreases in cartilage thickness. A majority of the associations were present in the medial femur SCF region in relation to cartilage thickness in the average all regions, medial femur, lateral tibia and the patella. Two notable findings are (1) the associations between joint-adjacent SCF and cartilage thickness held true despite statistically adjusting for baseline BMI and weight change group (thus suggesting that the relationship between SCF and cartilage thickness is independent of BMI and weight change) and (2) the association between weight change and cartilage thickness change was not statistically significant. Collectively, these two key findings emphasize that the *localized* nature of joint-adjacent SCF measurements may play a distinct role in the complex pathogenesis of cartilage degeneration in OA.

The mechanisms responsible for the associations between increases in joint adjacent SCF and decreases cartilage thickness are complex but may be attributed to localized inflammatory factors such as adipokines that are secreted from adipose tissue. Various adipokines are associated with cartilage degeneration including adiponectin, visfatin, and leptin<sup>31</sup>. In particular, serum leptin levels are correlated with reduced cartilage thickness (both cross-sectionally and over 2.7 years), and “the associations between measures of adiposity and cartilage thickness are mediated by leptin, suggesting leptin may play a key role in cartilage thinning<sup>32</sup>.” Since leptin is a hormone released from fat cells in adipose tissue, and in this study increased localized levels of adipose tissue were related to loss of cartilage thickness, leptin secretion may be a potential mechanism responsible for this relationship. In addition, visfatin inhibition has been shown protective for collagen-induced OA in mice<sup>33</sup>, and adiponectin (produced by adipocytes) may be protective against inflammation<sup>34</sup>. Overall, we hypothesize that joint-adjacent SCF may impact cartilage thickness by increasing localized inflammation.

One potential clinical implication of this study is that spot reduction of subcutaneous fat around the knee could slow cartilage thickness loss. While the research on spot reduction of subcutaneous fat is limited and somewhat inconclusive, there have been two studies suggesting spot reduction is feasible through localized exercises<sup>35,36</sup>. If spot reduction can be achieved, it may help preserve cartilage thickness through decreases in localized levels of inflammation (in addition to general exercise, which is associated with decreases in metabolic and localized inflammation)<sup>37</sup>.

The primary limitations of this study are analysis of the OAI data in a retrospective manner (which does not allow for conclusions on causal associations), and that the reasons for a participant’s weight loss or weight gain were unknown (no data available in the OAI); a future study with a prospective design may address this limitation. In addition, the OAI did not provide data on adipokine levels, thereby precluding the analysis of these hormone levels in relation to weight change, joint-adjacent SCF, and cartilage thickness. Despite these limitations, this study also has pertinent strengths, particularly its longitudinal follow-up and quantitative cartilage thickness outcomes.



Overall, this study suggests that increases in joint-adjacent SCF are associated with progression of cartilage degeneration, while decreases in joint-adjacent SCF are associated with less cartilage loss. Weight loss was associated with decreases in joint-adjacent SCF, but not with changes in cartilage thickness. Changes in cartilage thickness were significantly associated with changes in joint-adjacent SCF (independent of BMI) while changes in BMI were not, suggesting that the localized nature of adipose tissue may play a vital role in the pathogenesis of cartilage loss in knee OA.

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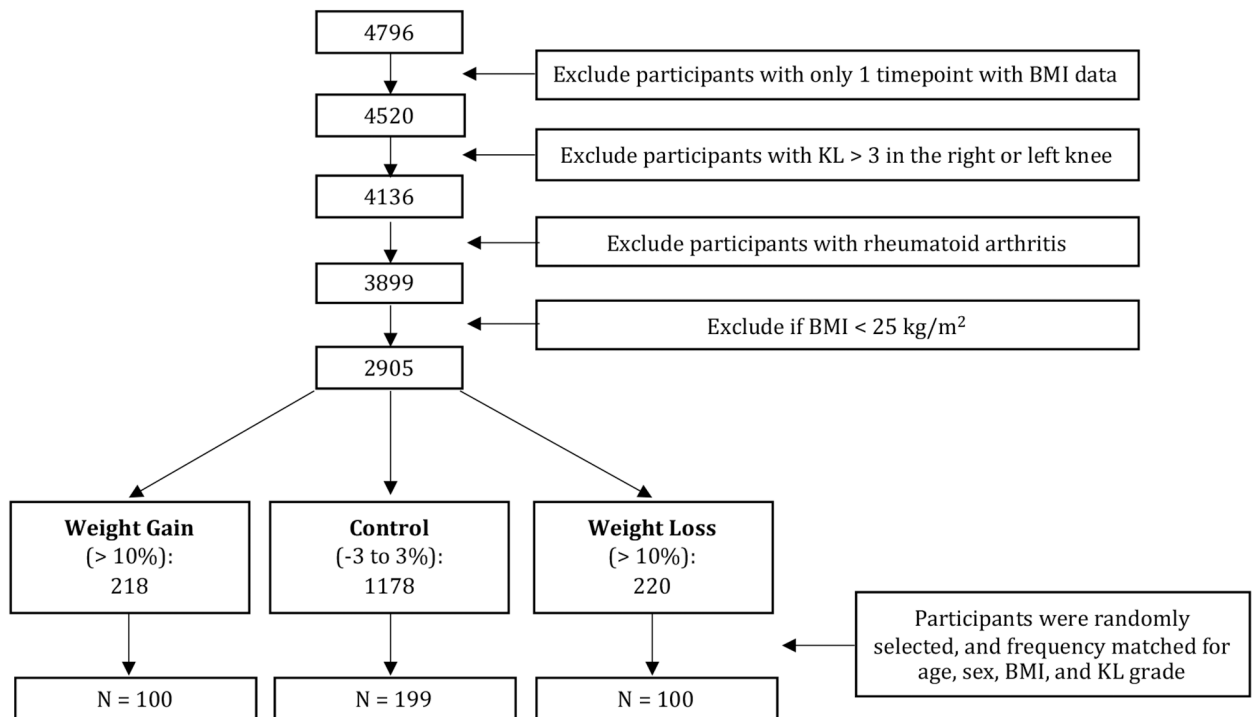
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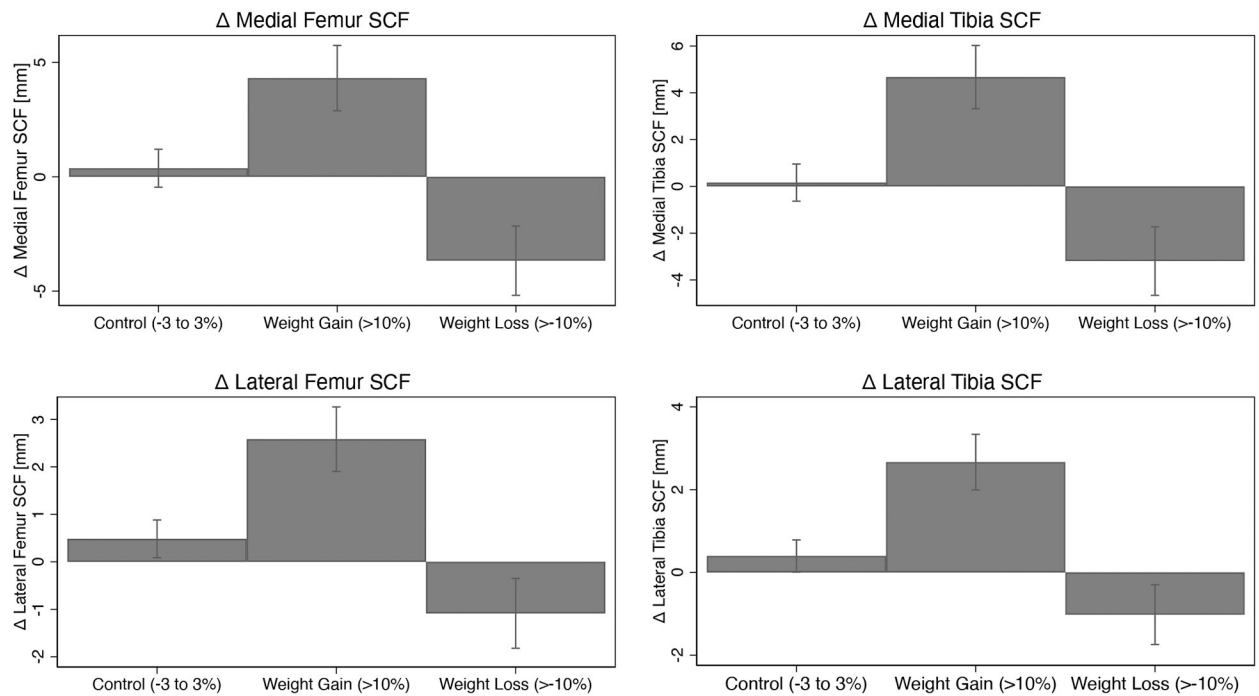


**Figure 1:** Participant Selection from the OAI. Abbreviations: KL: Kellgren-Lawrence, BMI Body Mass Index.



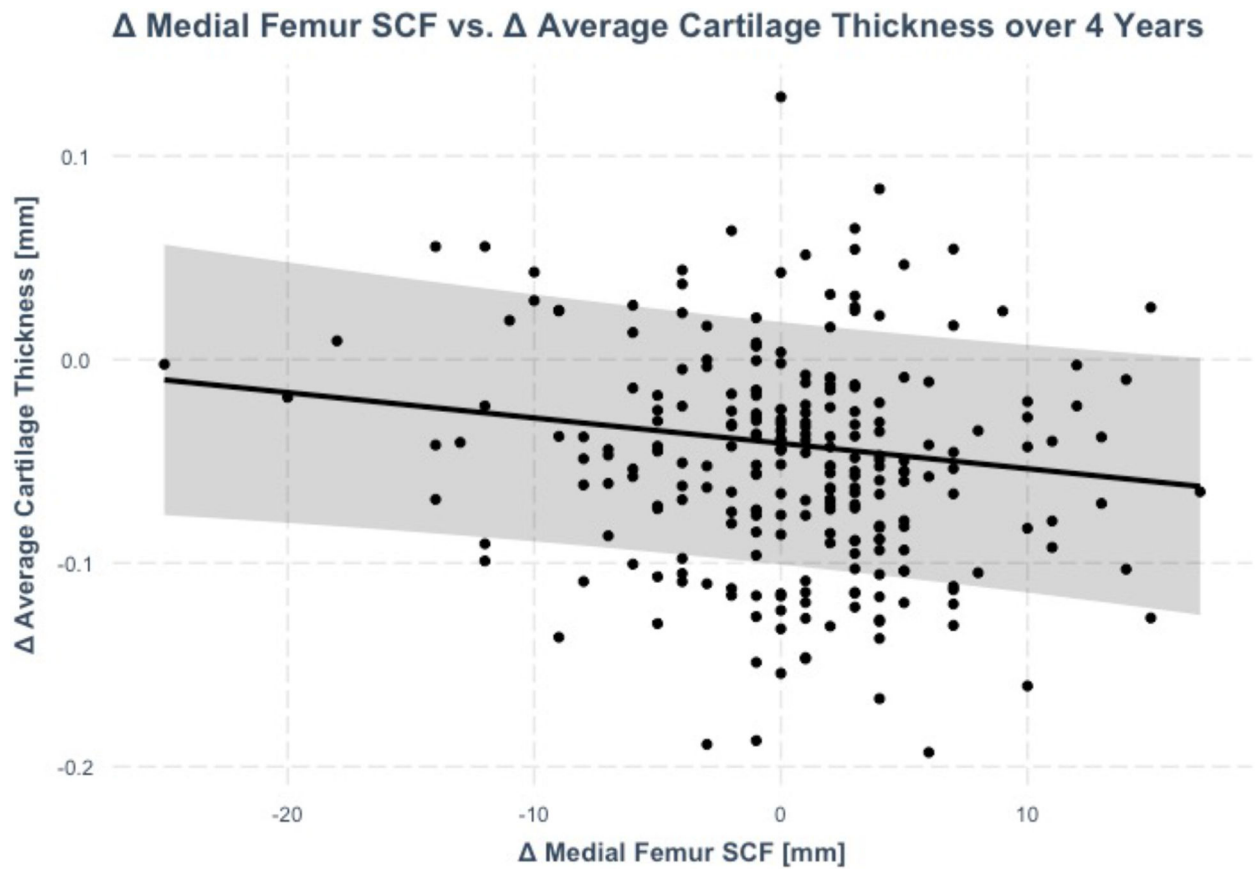
**Figure 2:**

A coronal reformation of the dual echo steady state (DESS) sequence. Subcutaneous fat (SCF) measurements are shown at the medial femur, medial tibia and lateral femur and lateral tibia. The tip of the medial tibial spine is used to define the axial slice level, on which medial and lateral measurements are taken.



**Figure 3:** Changes in subcutaneous fat (SCF) by weight change group over 4 years. Adjusted means are shown (adjustments: age, sex, BMI, race, tibia diameter) with error bars representing 95% confidence intervals.





**Figure 4:**

Association between changes in medial femur SCF and average cartilage thickness over 4 years (beta: 1mm increase in medial femur SCF was associated with 0.001mm decrease average in thickness (standardized beta =  $-0.14$ ,  $p=0.04$ )). The regression line is adjusted for age, sex, BMI, race, tibia diameter, and weight change group. The shaded area represents the 95% confidence interval.

Adjusted means; Error Bars represent 95% CIs

**Table 1:**

Participant characteristics at the baseline timepoint. Abbreviations: KL: Kellgren Lawrence, PASE: physical activity scale for the elderly. WOMAC: *Western Ontario McMaster Universities Osteoarthritis*.

	Controls (N=199)	Weight Gain (>10%) (N=100)	Weight Loss (>-10%) (N=100)	Total (N=399)	P-value
<b>Age</b>					0.19 <sup>1</sup>
Mean (SD)	60.8 (9.07)	60.0 (8.68)	62.3 (8.93)	60.9 (8.95)	
<b>BMI</b>					0.68 <sup>1</sup>
Mean (SD)	31.2 (4.11)	31.2 (4.13)	31.5 (3.93)	31.3 (4.06)	
<b>Sex, n (%)</b>					0.98 <sup>2</sup>
Males	88 (44.2%)	45 (45.0%)	44 (44.0%)	177 (44.4%)	
Females	111 (55.8%)	55 (55.0%)	56 (56.0%)	222 (55.6%)	
<b>PASE score</b>					0.12 <sup>1</sup>
Mean (SD)	168.6 (86.36)	168.0 (91.05)	148.5 (83.11)	163.4 (86.98)	
<b>WOMAC Pain Score, right knee</b>					0.019 <sup>1</sup>
Mean (SD)	2.2 (2.91)	3.0 (3.48)	2.9 (3.13)	2.6 (3.14)	
<b>WOMAC Pain score, left knee</b>					0.032 <sup>1</sup>
Mean (SD)	2.1 (3.20)	3.0 (3.79)	2.4 (3.32)	2.4 (3.39)	
<b>Race, n (%)</b>					0.50 <sup>2</sup>
0 – Other-non-white	1 (0.5%)	2 (2.0%)	1 (1.0%)	4 (1.0%)	
1 – White or Caucasian	150 (75.4%)	76 (76.0%)	70 (70.0%)	296 (74.2%)	
2 – Black or African American	47 (23.6%)	22 (22.0%)	27 (27.0%)	96 (24.1%)	
3 - Asian	1 (0.5%)	0 (0.0%)	2 (2.0%)	3 (0.8%)	
<b>KL grade right knee, n (%)</b>					0.88 <sup>2</sup>
0	53 (26.6%)	32 (32.0%)	23 (23.0%)	108 (27.1%)	
1	48 (24.1%)	21 (21.0%)	26 (26.0%)	95 (23.8%)	
2	54 (27.1%)	27 (27.0%)	29 (29.0%)	110 (27.6%)	
3	44 (22.1%)	20 (20.0%)	22 (22.0%)	86 (21.6%)	
<b>KL grade left knee, n (%)</b>					0.87 <sup>2</sup>
0	69 (34.7%)	33 (33.0%)	29 (29.0%)	131 (32.8%)	
1	41 (20.6%)	20 (20.0%)	20 (20.0%)	81 (20.3%)	
2	52 (26.1%)	32 (32.0%)	30 (30.0%)	114 (28.6%)	
3	32 (16.1%)	13 (13.0%)	16 (16.0%)	61 (15.3%)	

**Table 2:**

Differences in joint-adjacent SCF change over 4 years in the weight gain (<10%) and weight loss (>-10%) groups compared to controls (-3 to 3% change in weight). The beta coefficient represents the differences in change in SCF (mm) over 4 years between the group with weight change (weight loss or weight gain) and the reference group (controls).

Group	Medial Femur SCF		Medial Tibia SCF		Lateral Femur SCF*		Lateral Tibia SCF*	
	Beta	p	Beta	p	Beta	p	Beta	p
Controls (-3 to 3% change)	Reference		Reference		Reference		Reference	
Weight Gain (>10%)	4.21 (2.52 – 5.89)	<0.001	4.76 (3.16 – 6.36)	<0.001	2.03 (1.23 – 2.83)	<0.001	2.23 (1.43 – 3.02)	<0.001
Weight Loss (>-10%)	-3.94 (-5.69 – -2.19)	<0.001	-3.29 (-4.97 – -1.60)	<0.001	-1.57 (-2.42 – -0.73)	<0.001	-1.41 (-2.24 – -0.58)	0.001

Linear regression adjusted for age, sex, BMI, race, and tibial diameter at baseline

Note fat measurements are changes between baseline and 4-year follow-up

\* denotes exploratory variables

**Table 3:**

Associations between increases in joint-adjacent SCF and decreases in cartilage thickness over 4 years. The beta coefficients represent the change in cartilage thickness outcome (in SD units) per one SD change in the predictor (SCF).

Predictors	Average Thickness		Medial Femur Thickness		Medial Tibia Thickness		Lateral Femur Thickness		Lateral Tibia Thickness		Patella Thickness	
	Estimates	p	Estimates	p	Estimates	p	Estimates	p	Estimates	p	Estimates	p
<b>Medial Femur SCF</b>	<b>-0.14</b> (-0.27 – -0.01)	<b>0.04</b>	<b>-0.15</b> (-0.28 – -0.01)	<b>0.03</b>	0.05 (-0.08 – 0.19)	0.45	-0.09 (-0.22 – 0.04)	0.19	<b>-0.17</b> (-0.31 – -0.04)	<b>0.01</b>	<b>-0.14</b> (-0.28 – -0.00)	<b>0.04</b>
<b>Medial Tibia SCF</b>	-0.09 (-0.22 – 0.04)	0.18	-0.11 (-0.24 – 0.03)	0.12	0.07 (-0.06 – 0.21)	0.3	-0.09 (-0.23 – 0.04)	0.17	<b>-0.19</b> (-0.32 – -0.06)	<b>0.005</b>	-0.1 (-0.24 – 0.04)	0.17
<b>Lateral Femur SCF</b>	-0.07 (-0.20 – 0.06)	0.27	0.03 (-0.10 – 0.17)	0.61	0.1 (-0.03 – 0.23)	0.15	-0.06 (-0.19 – 0.07)	0.38	-0.04 (-0.17 – 0.09)	0.54	-0.11 (-0.25 – 0.04)	0.15
<b>Lateral Tibia SCF</b>	-0.04 (-0.18 – 0.09)	0.5	0.06 (-0.07 – 0.19)	0.39	0.09 (-0.05 – 0.22)	0.21	-0.01 (-0.14 – 0.12)	0.83	-0.01 (-0.14 – 0.12)	0.88	-0.11 (-0.25 – 0.03)	0.12

Linear Regression adjusted for age, sex, BMI, race, and tibia diameter and weight change group