



# Intraindividual difference between supraclavicular and subcutaneous proton density fat fraction is associated with cold-induced thermogenesis

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**Background:** Brown adipose tissue (BAT) activity is triggered by cold exposure resulting in an increased resting energy expenditure, called cold-induced non-shivering thermogenesis (CIT). Magnetic resonance (MR)-based proton density fat fraction (PDFF) of the supraclavicular fossa has been proposed as a surrogate marker of human BAT. The present study investigates supraclavicular PDFF in relation to CIT.

**Methods:** For this prospective cross-sectional study 39 adults were recruited, from a cross-sectional study, exploring energy expenditure after cold exposure compared to thermoneutral conditions. Participants underwent additional MR examination of neck, pelvis, and abdomen. Supraclavicular and subcutaneous gluteal adipose tissue depots were segmented semi-automatically. Mean PDFF was assessed for each compartment and the delta PDFF was calculated as the difference of both. Correlation analysis of supraclavicular PDFF to CIT was performed for the whole cohort and subgroups, sorted by body mass index (BMI) and body fat percentage.

**Results:** Median age of participants (61.5% female) was 27 years. BMI ranged from 19.0 to 38.5 kg/m<sup>2</sup>, with body fat percentages from 4.6% to 45.3%. Median supraclavicular PDFF of 82.5% and median gluteal PDFF of 91.1%, were significantly different ( $P < 0.0001$ ). Median delta PDFF was 8.8% (3.9–21.9%). Mean CIT was 4.7%±9.0%. No statistically significant correlation of supraclavicular PDFF and CIT was found in the whole cohort and in most of the observed subgroups. Just the subgroup with normal body fat percentage revealed significant correlations between supraclavicular PDFF and CIT ( $\rho = -0.59$ ;  $P = 0.003$ ). Delta PDFF was significantly associated with CIT ( $\rho = 0.36$ ;  $P = 0.026$ ).

**Conclusions:** PDFF is influenced by adiposity. Therefore, if supraclavicular PDFF is used as approach to indirectly assess BAT presence, body composition should be considered. Delta PDFF, as the difference between gluteal and supraclavicular PDFF, may be a marker of CIT.

**Keywords:** Magnetic resonance imaging (MRI); brown adipose tissue (BAT); cold-induced thermogenesis (CIT); proton density fat fraction (PDFF); obesity; anthropometric obesity markers

Submitted Oct 07, 2021. Accepted for publication Jan 12, 2022.

doi: 10.21037/qims-21-986

View this article at: <https://dx.doi.org/10.21037/qims-21-986>

## Introduction

Brown adipose tissue (BAT) differs from white adipose tissue (WAT) in its distribution, morphology, and function. While white adipocytes are primarily responsible for energy storage, brown adipocytes are highly specified to produce heat for human thermoregulation by non-shivering thermogenesis (1). The supraclavicular fossa represents a typical adipose tissue depot containing BAT, WAT, as well as white adipocytes undergoing browning—a crossover with ability of both thermoregulation and energy storage depending on external regulation and often referred to as beige adipocytes (2,3). In general, it is a matter of debate as to whether BAT may play a role in human energy metabolism. However, in an activated state, BAT can increase energy expenditure by up to 400 kilocalories (kcal) per day (4,5) and may reduce insulin resistance by meal induced glucose consumption and triglyceride clearance (6,7). Since obesity plays a leading role in public health (8), those findings indicate BAT as a promising treatment target (9). BAT activation can also be induced by cold exposure, resulting in an increase of resting energy expenditure (REE) (10), which is especially triggered by activation of the sympathetic nervous system (11). This increase in calorie combustion is measured by indirect calorimetry and referred to as cold-induced thermogenesis (CIT) (12).

Fluorine-18 fluorodeoxyglucose ( $^{18}\text{F}$ -FDG) positron emission tomography (PET) is considered as the gold standard method for non-invasive BAT detection (13), even though its use is limited due to exposure to ionizing radiation, the type of tracer used (mainly glucose), and the method being bound to a metabolically active status of BAT. Magnetic resonance imaging (MRI) is an upcoming method for BAT imaging, mainly using water-fat imaging techniques to calculate tissue fat fraction both statically (14,15) and dynamically (16-23). Working with cooling protocols for BAT activation, while simultaneously observing changes in fat fraction, multiple studies have reported significant drops in fat fraction when observing BAT depots during cold exposure (16-23). In addition, fat fraction mapping at thermoneutral conditions rests on morphometric differences in adipose tissue types, with BAT exhibiting a lower fat fraction than WAT (15,24),

rendering MRI a potential modality for BAT detection regardless of its activation state (25). By now, the lower fat fraction of BAT has been validated in humans by histological and immunohistochemical confirmation (26,27) and by PET (25,28,29). Advances in fat fraction mapping rely on the extraction of the proton density fat fraction (PDFF), a standardized quantitative MRI-parameter based on a chemical-shift encoding-based water-fat separation, additionally accounting for known confounding factors (multiple fat peaks,  $T_2^*$  decay,  $T_1$  bias-effects). PDFF is already well established in MR-based metabolic phenotyping (30), for example in liver (31) and bone marrow imaging (32). A consensus implemented PDFF as MR-based biomarker for standardized fat quantification (33) and some studies have employed PDFF to study human supraclavicular fat (34-38). Consequently, exploring the quantitative relation of CIT and supraclavicular PDFF has been of rising interest, but so far no stable quantitative correlation of PDFF and CIT has been reported (39).

The lack in consistent outcomes in supraclavicular PDFF mapping could be based upon some confounding factors: First, supraclavicular fat is a mixture of brown, beige, and white adipocytes in varying proportions (40,41) and therefore BAT is hard to detect via MRI with limited resolution and partial volume effects embedded in complex anatomy. Thus, results are highly dependent on segmentation methods, for example small manually selected regions of interest (ROI) compared to segmenting the entire supraclavicular fossa. Second, adipose tissue PDFF in itself, both in potentially BAT-containing areas and in pure WAT, can differ noticeably between individuals and shows correlations to body mass index (BMI) and other anthropometric markers (34). Persons with overweight display a greater proportion of WAT, impairing the sensitivity of supraclavicular PDFF measurements.

In the present study, a breathing-triggered acquisition, and a reproducible segmentation technique, covering the whole supraclavicular fossa, are combined with referencing supraclavicular PDFF to gluteal subcutaneous PDFF, to compensate for interindividual and body compositional PDFF variability. The main purpose of the present work was to investigate the association between supraclavicular PDFF and CIT, while considering adiposity and gluteal

**Table 1** Characteristics of study population

Characteristics	Value
N	39
Female, n (%)	24 (61.5)
Normally distributed, mean $\pm$ SD [range]	
Weight, kg	77.3 $\pm$ 17.1 [50.1–121.4]
Height, cm	174.3 $\pm$ 10.5 [157.2–195.2]
BF%, %	25.2 $\pm$ 11.6 [4.6–45.3]
TF%, %	30.0 $\pm$ 11.7 [11.4–67.2]
CIT, %	4.7 $\pm$ 9.0 [–10.6 to 24.3]
Not normally distributed	
Age, years	27 [20–53]
BMI, kg/m <sup>2</sup>	23.2 [19.0–38.5]
SAT volume (normalized to trunk length), mL/cm	114.6 [28.6–447.8]
VAT volume (normalized to trunk length), mL/cm	23.3 [4.0–184.2]
Supraclavicular PDFF, %	82.5 [69.7–88.1]
Gluteal PDFF, %	91.1 [82.3–93.5]
Delta PDFF, %	8.8 [3.9–21.9]

BF%, body fat percentage; BMI, body mass index; CIT, cold induced thermogenesis; n, number of participants; PDFF, proton density fat fraction; SAT, subcutaneous adipose tissue; TF%, trunk fat percentage; VAT, visceral adipose tissue; SD, standard deviation.

subcutaneous PDFF as confounding factors.

We present the following article in accordance with the STROBE reporting checklist (available at <https://qims.amegroups.com/article/view/10.21037/qims-21-986/rc>).

## Methods

### Study design

For this bicentric prospective cross-sectional study conducted at the Technical University Munich, adult volunteers were recruited from a cross-sectional study implemented by the Institute for Nutritional Medicine, School of Medicine, Technical University of Munich (42), which investigated the impact of cold exposure on REE. All procedures performed in this study were conducted in accordance with the Declaration of Helsinki (as revised in

2013). Study protocols and procedures were approved by the Ethics Committee of the Faculty of Medicine of the Technical University of Munich, Germany. And informed consent was taken from all individual participants. The study was registered at the German Clinical Register DRKS (accession number: DRKS00016629).

### Participants

Inclusion criteria were defined as healthy, non-smoking, less than 10 h of vigorous exercise per week, Caucasian descent, and stable body weight within the last three months (<3 kg change in body weight). Pregnant and breast-feeding women were excluded. REE measurements were conducted from October 2016 to February 2020. From January 2019 to January 2020, 174 participants of the first study part received an invitation for additional MRI examination. Forty-one participants accepted invitation, were screened for standard contraindications for MRI and an appointment for MRI examination was set for the next possible date. One participant was excluded due to MRI contraindications. Thus, MRI data was gathered for 40 participants. One of whom showed outlying CIT values in the Grubb's test was excluded from the current analysis, leaving 39 participants (24 female, 15 male) for statistical analysis. Characteristics of the final cohort are presented in *Table 1*. Due to the study design, time periods in between both appointments show a wide variation with a median of 411 days (–7 to 928 days) and a flow chart illustrating the recruitment process can be found in the supplementary material (*Figure S1*).

### Anthropometric measurements

Body height was measured with a stadiometer (Seca, Hamburg, Germany). Body weight and body composition were measured by bioelectrical impedance analysis (BIA) on a TANITA Body Composition Analyzer Type BC-418 MA (Tanita Europe GmbH, Sindelfingen, Germany). Measurements were performed barefoot and in underwear, on the same day as the CIT examination. BMI was calculated based on weight and height. Body fat percentage (BF%) was calculated as the ratio of body fat mass in kilograms to body weight in kilograms.

### CIT measurements

REE was assessed by indirect calorimetry, under thermoneutral conditions (REE<sub>TN</sub>) and under cold exposure

( $REE_{CE}$ ). For indirect calorimetry, measuring consumption of oxygen ( $VO_2$ ) and production of carbon dioxide ( $VCO_2$ ), a ventilated canopy hood system by Cosmed (COSMED Quark RMR, Fridolfing, Germany) was used. Under both thermal conditions, measurements were performed over a time frame of 30 min, during which individuals should reach steady state. Steady state was defined as stable period of at least 4 min with less than 10% variance in  $VO_2$  and  $VCO_2$ . The respiratory quotient (RQ) was calculated as the ratio of  $VCO_2$  and  $VO_2$ . Energy expenditure was calculated according to the shortened Weir equation (43).

Controlled thermal environment was achieved utilizing a combination of a water perfused blanket and mattress, allowing a precise regulation of water temperature. First  $REE_{TN}$  was assessed with water temperature set to 32 °C. Afterwards cold exposure was conducted by an individualized cooling protocol, guaranteeing participants were kept above their individual shivering threshold. Water temperature was reduced gradually until when shivering occurred water temperature was raised by 2 °C. Thus, determined individual exposure temperature was maintained for 120 min, before  $REE_{CE}$  was assessed. The approach was described in detail elsewhere (42). For the calculation of CIT,  $REE_{TN}$  was used as baseline and was set in relation to the difference of  $REE_{TN}$  and  $REE_{CE}$ , generating CIT values expressed in %.

### MRI measurements

Participants underwent an MRI of the neck and abdomen/pelvis on a 3T-system (Elition, Philips Healthcare, Best, Netherlands) in an air-conditioning-controlled scanner room with a steady ambient temperature of 21 °C, using a head-neck-coil and a combination of anterior and posterior coil arrays, respectively. Time for adequate acclimatization was given before the scan while the procedure was explained, and final consent was collected.

### Supraclavicular and gluteal PDFF mapping

An axial six-echo multi-echo 3D-spoiled gradient echo sequence with bipolar readouts was acquired, of both the neck and pelvic region. A six-echo acquisition was employed to correct for  $T_2^*$  decay effects and extract the PDFF (instead of a signal-weighted fat fraction) in the supraclavicular and gluteal regions (14,44,45). Based on localizer sequences, scans were carefully planned. The neck sequence covered the supraclavicular fat depot including the coracoid process and vocal cords. The pelvic sequence was

positioned in the upper pelvic region, for detailed imaging of subcutaneous adipose tissue (SAT) posterior of the iliac bone, corresponding to the gluteal region. Pelvic scans were performed during free breathing, whereas the neck region required respiratory triggering to reduce motion artifacts. The respiratory motion was monitored constantly by breathing belt measurements. Acquisitions only took place in expiration. Imaging parameters are listed in *Table 2*. After phase error correction, the multi-echo data was processed using a complex-based water-fat separation algorithm accounting for known confounding factors (multi-peak fat spectrum and single  $T_2^*$  decay correction) using the online vendor's algorithms, resulting in PDFF maps of neck and upper pelvis (46). The multi-peak fat spectrum from (47) was employed.

Two stacks of axial two-echo Dixon 3D spoiled gradient echo images were acquired to cater information about abdominal SAT and visceral adipose tissue (VAT) volumes. The sequence covered the trunk at least from liver dome to femoral head. Data was acquired while participants performed breath-holds (10.6 s for each stack).

### Imaging data analysis

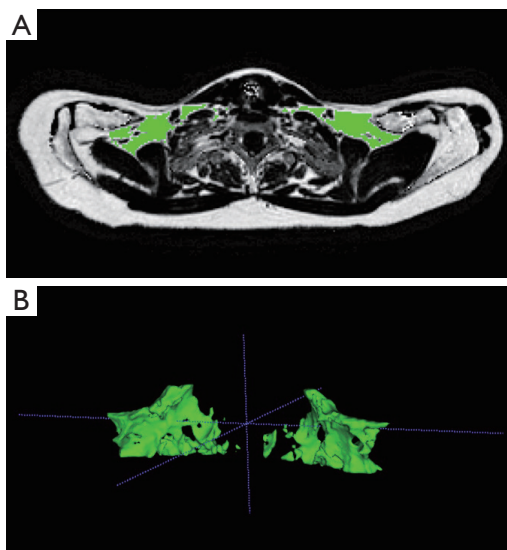
#### Supraclavicular and gluteal PDFF maps segmentation

Manual segmentation work was conducted using ITK-SNAP 3.8.0 ([www.itksnap.org](http://www.itksnap.org)) (48), by an experienced researcher (fifth year of medical training). Supraclavicular PDFF was assessed segmenting the supraclavicular fat depot bilaterally. First, the ROI was manually outlined on every second slice in axial plane, starting from the coracoid process, which was defined as the caudal border and ending at the vocal cords, representing the cranial border. With interpolation a 3D-mask was created, generating the volume of interest (VOI). Non-adipose tissue was excluded applying a PDFF- and  $T_2^*$ -threshold (Python language version 2.7; Python Software Foundation, <https://www.python.org/>). PDFF values below 50% were excluded, ruling out muscle, vessels and lymph nodes typically exhibiting lower PDFF values. Bone was excluded by excluding  $T_2^*$  values lower than 5 ms. The here assessed  $T_2^*$ -values are derived from a water-fat signal model assuming a common  $T_2^*$  decay for both the water and fat components, which is sufficient for  $T_2^*$  decay correction and segmentation. Finalizing the segmentation mask, an erosion step (using a spherical kernel and one iteration) was executed in MATLAB (MathWorks, Natick, MA, USA) to reduce partial volume effects. An example is shown in *Figure 1*.

**Table 2** Technical parameters of different MR sequences

Parameters	Two-echo Dixon, SAT/VAT volume	Six-echo Dixon, supraclavicular PDFF	Six-echo Dixon, gluteal PDFF
TR, ms	4.0	7.8	8.3
TE1/TE2/ $\Delta$ TE, ms	TE1 =1.32 TE2 =2.60	TE1 =1.24 $\Delta$ TE =1.00	TE1 =1.34 $\Delta$ TE =1.10
Flip angle	10°	5°	5°
Bandwidth, Hz/pixel	1,004	1,413	1,437
Acquisition matrix size	332×219×44	268×201×93	200×267×40
Reconstruction matrix size	512×512	288×288	320×320
Field of view (FOV), mm <sup>3</sup>	500×445×220	400×300×140	400×400×60
Acquisition voxel	1.5×2.03×5.0	1.5×1.5×1.5	1.5×1.5×1.5
Reconstructed voxel, mm <sup>3</sup>	0.98×0.98×5.00	1.389×1.389×1.500	1.25×1.25×1.50
Slices	44	93	40
SENSE reduction factor	2.5×1.0 (AP 2.5)	2.5×1.0 (AP 2.5)	2.5×1.0 (LR 2.5)
Partial Fourier	075×0.80	No	No
Respiratory triggering	No	Yes	No
Scan time	10 s	2 min 30 s	46 s

TE1, first echo time; TE2, second echo time;  $\Delta$ TE, difference between echo times. AP, anterior posterior; FOV, field of view; LR, left right; MR, magnetic resonance; PDFF, proton density fat fraction; SAT, subcutaneous adipose tissue; TR, repetition time; TE, echo time; SENSE, sensitivity encoding; VAT, visceral adipose tissue.



**Figure 1** Exemplary segmentation mask (green) of the supraclavicular fat depot. (A) PDFF map with the bilateral segmentation mask in axial plane. (B) Three-dimensional reconstruction of the whole segmentation mask presented from frontal oblique. PDFF, proton density fat fraction.

The approach was examined by the means of inter-rater reliability in a subgroup of five participants. Manual segmentation was performed independently by three different raters: two researchers (fifth year of medical training) and one board-certified radiologist (6 years of experience in whole-body imaging), achieving high agreement and reproducibility with an intraclass correlation coefficient of 0.97 (95% confidence interval: 0.73 to 1.0).

Deep gluteal subcutaneous fat was segmented semi-automatically similar to the supraclavicular fossa. Bilateral manual crude delineation of deep subcutaneous fat tissue was performed on every second slice outlined a ROI posterior of the iliac bone but deep to the great body fascia—Scarpa's fascia, to solely include deep gluteal SAT. Deep gluteal SAT is characterized by large white adipocytes and widely spaced fascial septa (49) and considered a reliable WAT depot for adipose tissue imaging without partial voluming even in lean individuals. Upper and lower border were defined by the first and last cut through the fifth lumbar vertebra. Interpolation generated the VOI. The automated post processing was performed according



to the supraclavicular segmentation work, adding a PDFF- (PDFF >50%) and  $T_2^*$ -threshold ( $T_2^* >5$  ms) and erosion step (sphere, one iteration).

Mean supraclavicular PDFF (PDFF<sub>SUPRACLAVICULAR</sub>) and mean gluteal PDFF (PDFF<sub>GLUTEAL</sub>) were extracted, and delta PDFF ( $\Delta$ PDFF) was calculated as the difference of both mean values (PDFF<sub>GLUTEAL</sub> - PDFF<sub>SUPRACLAVICULAR</sub>).

### SAT and VAT volumes segmentation

SAT and VAT volumes were extracted from the water- and fat-separated images of the two-echo Dixon scans, using a custom-built semi-automatic post-processing algorithm (<https://github.com/BMRRgroup/vatsatseg>). The segmentation was performed as described in earlier studies (34,50,51). The upper border of the segmentation was represented by the liver dome and the lower border by the center of the femoral head. In order to control for height differences, adapted SAT and VAT volumes were calculated taking body height into account (34,52). SAT and VAT volumes in ml were divided by lower trunk length (from liver dome to femoral head) in cm, resulting in adapted values in mL/cm. As a substitute for BF% assessed by whole body MRI, an approximation the lower trunk fat percentage (TF%) was calculated as the sum of VAT and SAT volumes divided by total lower trunk volume.

### Subgroup definition and statistical analysis

According to WHO guidelines subgroups were defined by BMI: non-overweight (BMI <25 kg/m<sup>2</sup>), overweight (BMI  $\geq$ 25 kg/m<sup>2</sup>) (53). Further subgroups were built by gender adapted BF%-cutoffs according to several publications (54-56): normal BF% (male BF% <25%, female BF% <30%), high BF% (male BF%  $\geq$ 25%, female BF%  $\geq$ 30%).

Statistical analysis was conducted using IBM SPSS Statistics for MacOS, version 26 (IBM Corp., Armonk, NY, USA). Testing was performed on a significance level of 0.05 (two-sided). Due to the explorative study design no correction for multiple testing was executed. Measured parameters were non-normally distributed, except for weight, height, CIT, BF% and TF%. Therefore, the majority of the data was expressed as median and range in parentheses. Normally distributed parameters were expressed as mean  $\pm$  standard deviation and range in parentheses. Non-parametric testing (Wilcoxon) was used for comparison of PDFF<sub>SUPRACLAVICULAR</sub> to PDFF<sub>GLUTEAL</sub>. All correlation analyses were conducted with the help of Spearman's rho correlation coefficient. Partial correlation

analysis was performed as partial rank correlation based on Spearman's rho.

## Results

Median age was 27 years (20–53 years). Participants showed a broad range of BMI with a median of 23.2 kg/m<sup>2</sup> (19.0–38.5 kg/m<sup>2</sup>). Mean BF% was 25.2%  $\pm$  11.6% (4.6–45.3%). PDFF<sub>SUPRACLAVICULAR</sub> with 82.5% (69.7–88.1%) was significantly lower than PDFF<sub>GLUTEAL</sub> with 91.1% (82.3–93.5%) ( $P < 0.0001$ ). The PDFF difference of the two compartments is illustrated in the PDFF maps of a single person in *Figure 2*. For  $\Delta$ PDFF the median was 8.8% (3.9–21.9%). Mean CIT for the whole cohort was 4.7%  $\pm$  9.0% (–10.6% to 24.3%). Descriptive statistics of the cohort are presented in *Table 1* and for the different subgroups as supplementary material (*Tables S1,S2*).

### Correlation analysis

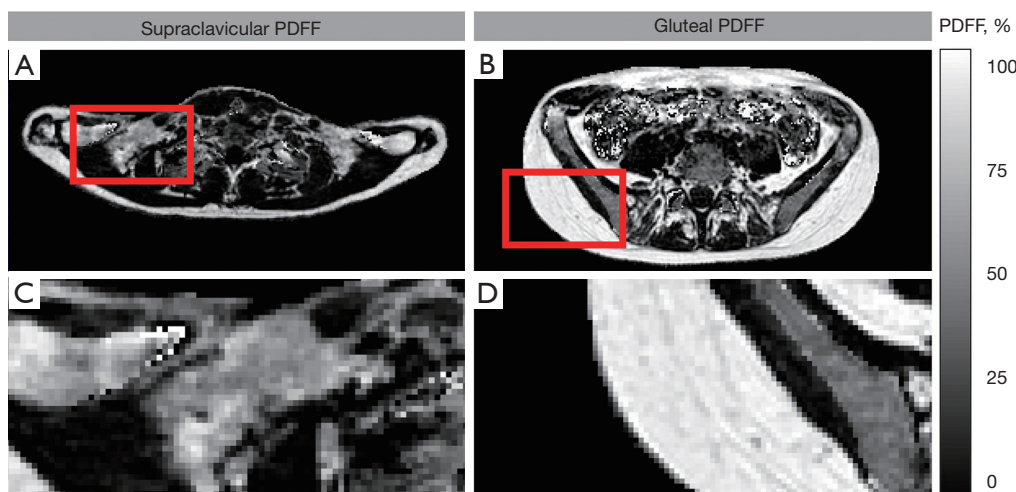
Correlation analysis revealed a statistically significant correlation between BMI and BF% ( $\rho = 0.44$ ,  $P = 0.005$ ). In addition, the BIA-based BF% correlated significantly with the MRI-measured TF% ( $\rho = 0.86$ ,  $P < 0.001$ ). Regarding the associations of the PDFF measurements, a significant relation of both PDFF<sub>SUPRACLAVICULAR</sub> and PDFF<sub>GLUTEAL</sub> to SAT and VAT volumes was found. Moreover, correlations of PDFF measurements with body composition, characterized by BF% and to some degree characterized by BMI, were detected. PDFF measurements in association to anthropometric traits, as well as to adipose tissue volumes are displayed in *Table 3*.

### Correlation of PDFF and CIT in the whole cohort

In the whole cohort ( $n = 39$ ), correlation analysis of CIT and PDFF<sub>SUPRACLAVICULAR</sub> showed no significant association ( $\rho = -0.17$ ,  $P = 0.302$ ).

### Correlation of PDFF and CIT in different subgroups

Similar non-significant findings have been observed for most subgroups. Results of the subgroup analysis are presented in *Table 4*. For the non-overweight cohort ( $n = 25$ )—according to BMI—an enhanced Spearman's rho, but a still non-significant correlation of PDFF<sub>SUPRACLAVICULAR</sub> and CIT ( $\rho = -0.34$ ;  $P = 0.099$ ) was found. Only the subgroup consisting of participants with normal BF% ( $n = 24$ ) revealed a statistically significant correlation of PDFF<sub>SUPRACLAVICULAR</sub> and CIT with  $\rho = -0.59$  ( $P = 0.003$ ). Scatterplots for the relationship between PDFF<sub>SUPRACLAVICULAR</sub> and CIT of



**Figure 2** Comparison of supraclavicular and gluteal PDFF maps in the same participant. (A) Supraclavicular region in axial plane with the region of interest marked by a red box. (B) Gluteal region in axial plane with the region of interest marked by a red box. (C) Enlarged PDFF map of the supraclavicular region of interest. (D) Enlarged PDFF map of the gluteal region of interest. Note the intraindividual PDFF difference, by the means of lower PDFF values in the supraclavicular fossa compared to gluteal subcutaneous adipose tissue. PDFF, proton density fat fraction.

**Table 3** Correlation of supraclavicular and gluteal PDFF to anthropometric measurements and adipose tissue volumes

Variables	BMI, kg/m <sup>2</sup>	BF%, %	SAT, mL/cm	VAT, mL/cm
Supraclavicular PDFF, %	rho =0.39; P=0.014	rho =0.37; P=0.019	rho =0.55; P<0.001	rho =0.59; P<0.001
Gluteal PDFF, %	rho =0.30; P=0.067	rho =0.49; P=0.002	rho =0.64; P<0.001	rho =0.55; P<0.001

BF%, body fat percentage; BMI, body mass index; PDFF, proton density fat fraction; SAT, subcutaneous adipose tissue; VAT, visceral adipose tissue.

**Table 4** Correlations of supraclavicular PDFF to CIT displayed for different subgroups

Subgroups	N	Correlation of supraclavicular PDFF (%) and CIT (%)
Normal weight (BMI <25 kg/m <sup>2</sup> )	25	rho =-0.34; P=0.099
Overweight/obese (BMI ≥25 kg/m <sup>2</sup> )	14	rho =0.23; P=0.427
Normal BF% (male BF% <25%, female BF% <30%)	24	rho =-0.59; P=0.003
High BF% (male BF% ≥25%, female BF% ≥30%)	15	rho =0.25; P=0.369

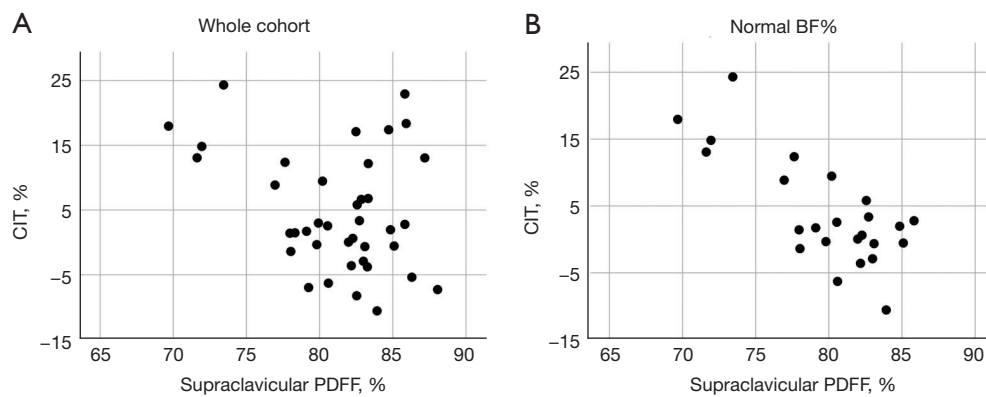
BF%, body fat percentage; BMI, body mass index; CIT, cold induced thermogenesis; n, number of participants; PDFF, proton density fat fraction.

the whole cohort (n=39) and the subgroup with normal BF% (n=24) are presented in *Figure 3*. An example of supraclavicular PDFF in a person with a low CIT compared to one with a high CIT is shown in *Figure 4*.

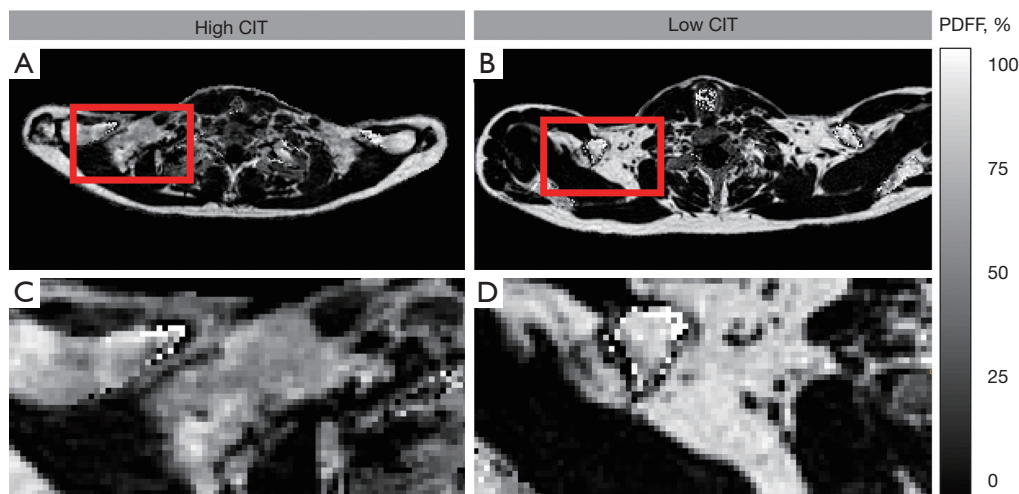
#### Confounders in the whole cohort

A partial rank correlation for PDFF<sub>SUPRACLAVICULAR</sub> and CIT

adjusted for sex, BMI, BF% or PDFF<sub>GLUTEAL</sub> was conducted for the whole cohort. When controlled by sex and BF% the correlation improved slightly, but only adjustment for PDFF<sub>GLUTEAL</sub> returned a significant correlation (rho =-0.34; P=0.037). Results of the partial rank correlation can be found in *Table 5*. The calculation of ΔPDFF using PDFF<sub>GLUTEAL</sub> as an intraindividual reference resulted in a



**Figure 3** Scatterplots of CIT to supraclavicular PDFF in comparison for the whole cohort (A) and the subgroup with normal BF% (male BF% <25%, female BF% <30%) (B). BF%, body fat percentage; CIT, cold induced thermogenesis; PDFF, proton density fat fraction.



**Figure 4** Comparison of supraclavicular adipose tissue PDFF maps in two different individuals. (A) Supraclavicular region in axial plane of a participant with high CIT =17.95% and with the region of interest marked by a red box. (B) Supraclavicular region in axial plane of a participant with low CIT =1.96% and with the region of interest marked by a red box. (C) Enlarged supraclavicular region of interest of the high CIT participant. (D) Enlarged supraclavicular region of interest of the low CIT participant. Note the lower supraclavicular PDFF of the participant with high CIT results. CIT, cold induced thermogenesis; PDFF, proton density fat fraction.

**Table 5** Partial rank correlation of supraclavicular PDFF to CIT controlled by possible confounders

Controlled by	Correlation of supraclavicular PDFF (%) and CIT (%)
Sex	$\rho = -0.18$ ; $P = 0.275$
BMI	$\rho = -0.11$ ; $P = 0.533$
BF%	$\rho = -0.20$ ; $P = 0.240$
Gluteal PDFF	$\rho = -0.34$ ; $P = 0.037$

BF%, body fat percentage; BMI, body mass index; CIT, cold induced thermogenesis; PDFF, proton density fat fraction.

significant correlation to CIT ( $\rho = 0.36$ ;  $P = 0.026$ ).

## Discussion

The present study provides evidence for an association between supraclavicular PDFF, as an estimate for brown fat cell presence in the supraclavicular fat depot, and a cold-induced increase in REE. This association was not seen in the whole cohort, comprising healthy participants over a wide BMI range, but only in the subgroup with normal body fat mass shown as BF% and representing



normal-weight participants. Using BMI as a crude marker of body fat mass resulted only in a borderline significant correlation between supraclavicular PDFF and CIT in those categorized as normal-weight by BMI (18.5–24.9 kg/m<sup>2</sup>). The latter is not surprising, as BMI is a poor indicator of body fat mass (57). Therefore, measurement of BF%, e.g., by bioimpedance analysis may be more accurate and useful in this context.

The lack of a significant correlation between absolute supraclavicular PDFF and CIT for the whole study cohort is in line with studies reporting supraclavicular PDFF (39) or rather supraclavicular fat fraction (58) in relation to quantitatively assessed non-shivering thermogenesis. Both studies addressed the potentially confounding role of body composition only briefly, by excluding participants with BMI >30 in advance (39), or simply correcting for body weight in kg (58). Under these conditions, associations may be masked in a similar manner as in the present study and a more precise analysis of body composition may be needed.

In addition, we also observed a positive association between supraclavicular PDFF and BMI, as already reported in a previous study from our group (34) and others (18,35), suggesting that there is less browning capacity and CIT with increasing BMI. Likewise, we found a significantly positive correlation between supraclavicular PDFF and BF% as well as the volumes of VAT and SAT, other parameters of total and regional body fat mass. Deng *et al.* reported those associations of PDFF, and markers of adiposity, remain unchanged under different thermal conditions and across all weight groups (18).

Furthermore, our results showed a statistically significant difference in PDFF between the supraclavicular adipose tissue depot and the gluteal SAT depot, reflecting differences in morphology and cellular composition of both compartments and is in line with many other studies (22,28,34–36,59,60). Differentiation, without any stimulatory conditions and BAT in a metabolically inactive state, was demonstrated several times before (19,25,28), underlining the value of PDFF measurements for BAT detection.

Using gluteal PDFF as a WAT reference, it turned out as a novel finding that the difference between gluteal PDFF and supraclavicular PDFF was positively associated with CIT, suggesting that the latter may be explained by the presence of brown/beige fat cells in the supraclavicular fat depot and supporting the concept that BAT may contribute to energy expenditure (1,61,62), at least under cold exposure (4,5).

Therefore, in the current study, a model for BAT

imaging independent of body composition was developed by merging the first main finding, adiposity influencing PDFF measurements, to the targeted correlation of supraclavicular PDFF and CIT. Partial correlation controlled for gluteal PDFF, firstly demasked the correlation of supraclavicular PDFF and CIT in the whole cohort. By means of this intra-individual referencing, using a region of pure WAT, the individual morphological difference of supraclavicular PDFF to gluteal PDFF was quantified as delta PDFF, supposedly reflecting the respective likelihood of BAT presence for every individual. The delta PDFF correlated positively with CIT, which indicates delta PDFF as a better approach to indirectly assess BAT. Franssens *et al.* showed accordingly, that BAT presence, as suggested by a large difference in supraclavicular fat fraction compared to fat fraction of WAT inversely correlates with the number of cardiovascular risk factors (35).

The association of supraclavicular PDFF and CIT in cohorts with a wide BMI range is hard to detect. While in subgroups with low BF% the relation with CIT was clear and significant, adiposity makes BAT detection increasingly difficult as brown/beige fat cells may be replaced by white adipocytes.

Women naturally display higher BF% than men and when grouping by BF% is performed a critical investigation of sex difference is needed. Although grouping by BF% was performed by sex adapted cut offs, the great majority in the high BF% group were female (86.7%), compared to 45.8% females in the normal BF% group. Consequentially, the stronger correlation of supraclavicular PDFF to CIT in the normal BF% group could be interpreted as BAT predominance in men—unlike many other studies suggest. Even though data regarding sex differences in BAT activity is ambiguous, with studies reporting an existing difference (63,64) as well as no existing difference (65,66), the large retrospective PET-CT study of Brendle *et al.* (64) revealed that BAT positive individuals are predominantly young, lean, and female. In contrast our related investigation detected no significant difference in CIT between men and woman but found more pronounced hormonal changes in women—also indicating a stronger response to cold exposure. Granted, that women display more active BAT compared to men, their higher BF% could obscure results in heterogenous and predominantly female cohorts, like the present.

A strength of the current study is the analysis of subgroups not only by BMI but also by BF%, hence the poor diagnostic assessment of obesity via BMI is a possible

origin for inaccuracy. At least widely used BMI cutoffs show high specificity, but very low sensitivity missing nearly half the patients who should be considered obese due to high BF% (57,67). Concerning data quality, one of the major strengths was the applied breathing trigger for supraclavicular PDFF mapping, distinguishing this study from others in the field (39) and rendering the data more precise with less partial volume effects and less image blurring. Furthermore, verifying the BIA-scale measurements with the aid of quantitative MRI ensured robust grouping into different cohorts. Another strength of our study is the combination of imaging data with metabolic quantification under cold exposure, by CIT measurements—a rather complex and time-consuming technique.

The present study has several limitations. A first limitation of this study is the lacking comparison of histological biopsies in this analysis. It is still the gold standard for adipose tissue characterization and without histological tissue analysis the presence of BAT cannot be indubitably proven. However, histology even with immunohistochemical staining using uncoupling protein 1 (UCP1) antibodies, would only provide information about BAT presence, not give a quantitative result regarding the metabolic activity of the tissue. Especially since UCP1-independent thermogenesis is known to play a significant role in human thermogenesis (68,69). No cold activation was applied for the PDFF measurements and given that the PDFF mapping method is not dependent on BAT function, histology for validation could have been beneficial. Furthermore, with the isotropic voxel size being 1.5 mm in each dimension, partial volume effects from very small vessels and lymph nodes must be considered. Due to the complicated anatomy of the supraclavicular fossa, partial volume effects carry probably even more weight when measuring supraclavicular PDFF compared to gluteal PDFF. However, the applied methods minimized those effects with the help of breathing triggered scans and erosion algorithms in the segmentations. Furthermore, average PDFF values over the VOI will always include a mixture of BAT and WAT, thus only delivering indications of crude BAT presence in this region.

Due to the discussed confounding factors (adiposity, individual adipose tissue morphology) and high variability of both PDFF and CIT measurements, the predictive value of supraclavicular PDFF for CIT is low. Even though the calculation of delta PDFF seems to address the confounding effect of adiposity at least partially, delta PDFF as predictive parameter must be interpreted with caution

and larger prospective studies for validation are needed. Consequentially the rather small sample size limits the interpretation of predictive power and is smaller compared to related studies in the field.

In the study design simultaneous CIT and MRI measurements were not intended, as no cold exposure is needed to assess supraclavicular morphology with MRI. However, in some individuals both measurements were conducted with a long-time separation, which could lead to potentially not captured individual adaptation in supraclavicular composition. This is definitely a limitation based in the applied study design and subsequent studies should aim for a consistent and short time period between both measurements.

Limitations finally apply to the employed water-fat model. The employed multi-peak fat spectrum model from (47) is constant and could not account for differences between subjects and adipose tissue depots. Recent magnetic resonance spectroscopy (MRS) results have showed that the amount of unsaturated fatty acids is lower in BAT compared to WAT (70) and such variations in the fat spectrum model might need to be considered in future PDFF studies in BAT. Another limitation is the inability to report  $T_2^*$  values over the supraclavicular fossa. A water-fat model accounting for a single common  $T_2^*$  decay for the water and fat components was presently adopted. Since only 6-echo data were evaluated, which was found to be insufficient for reliable  $T_2^*$  measurements in an earlier publication (71),  $T_2^*$  values were only used for segmentation purposes to assure exclusion of bone. Moreover, reporting  $T_2^*$  would depict a different aspect of adipose tissue characterization (increased field inhomogeneity in BAT due to iron containing mitochondria, perfusion, and oxygenation), then the here highlighted compositional differentiation of BAT and WAT.

## Conclusions

MRI-based PDFF measurements of the supraclavicular fossa could correlate with CIT, if body adiposity is considered, as adipose tissue PDFF is highly dependent on adiposity. This dependence was reflected in the strong association of gluteal and supraclavicular PDFF to anthropometric markers and adipose tissue volumes. Still, this study demonstrated an association between delta PDFF and CIT in a heterogeneous cohort. It is noteworthy that a high interindividual variation seems to exist, both for delta PDFF and CIT. To further validate the functional relevance of delta PDFF for energy metabolism and obesity risk large prospective observational studies are needed.

## Acknowledgments

The authors are grateful to all volunteers participating in the study as well as to the students assisting in the study execution.

*Funding:* The present work was supported by the European Research Council (grant agreement No. 677661, ProFatMRI), the German Research Foundation (No. DFG-SFB824/A9), Philips Healthcare, the Else Kroener-Fresenius-Foundation, Bad Homburg, Germany, and the Helmholtz cross-program topic “Metabolic Dysfunction”. This work reflects only the authors’ view and the funders are not responsible for any use that may be made of the information it contains.

## Footnote

*Reporting Checklist:* The authors have completed the STROBE reporting checklist. Available at <https://qims.amegroups.com/article/view/10.21037/qims-21-986/rc>

*Conflicts of Interest:* All authors have completed the ICMJE uniform disclosure form (available at <https://qims.amegroups.com/article/view/10.21037/qims-21-986/coif>). DCK receives grant support from Philips Healthcare. The other authors have no conflicts of interest to declare.

*Ethical Statement:* The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. All procedures performed were conducted in accordance with the Declaration of Helsinki (as revised in 2013). Study protocols and procedures were approved by the Ethics Committee of the Faculty of Medicine of the Technical University of Munich, Germany. And informed consent was taken from all individual participants.

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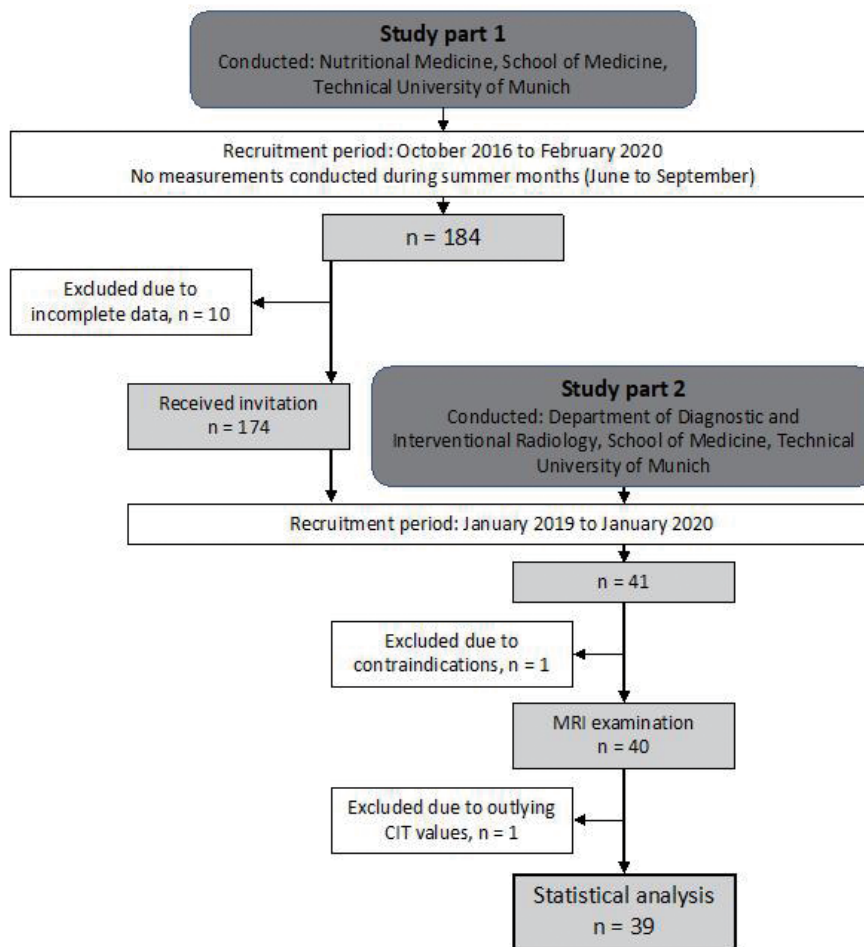
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**Cite this article as:** Held C, Junker D, Wu M, Patzelt L, Mengel LA, Holzapfel C, Diefenbach MN, Makowski MR, Hauner H, Karampinos DC. Intraindividual difference between supraclavicular and subcutaneous proton density fat fraction is associated with cold-induced thermogenesis. *Quant Imaging Med Surg* 2022;12(5):2877-2890. doi: 10.21037/qims-21-986



**Figure S1** Flow chart illustrating numbers of participants at different study stages as well as recruitment periods. n, number of participants. CIT, cold-induced thermogenesis.

**Table S1** Descriptive statistics of subgroups by BMI

Variables	Value
Normal weight (BMI <25 kg/m <sup>2</sup> )	
N	25
Female, n (%)	14 (56.0)
Normally distributed, mean ± SD [range]	
Weight, kg	68.2±12.0 [50.0–92.5]
Height, cm	175.1±11.2 [157.6–195.2]
BF%, %	19.8±8.5 [4.6–32.7]
TF%, %	24.3±8.7 [10.6–41.4]
CIT, %	5.6±8.5 [–10.6 to 24.3]
Not normally distributed, mean ± SD [range]	
Age, years	26 [20–37]
BMI, kg/m <sup>2</sup>	22.1 [19.0–24.3]
SAT volume (normalized to trunk length), mL/cm	90.3 [28.6–192.8]
VAT volume (normalized to trunk length), mL/cm	19.2 [4.0–90.4]
Supraclavicular PDFF, %	80.6 [69.7–85.9]
Gluteal PDFF, %	89.8 [82.3–93.5]
Delta PDFF, %	8.9 [5.4–21.8]
Overweight/obese (BMI ≥25 kg/m <sup>2</sup> )	
N	14
Female, n (%)	10 (71.4)
Normally distributed, mean ± SD [range]	
Weight, kg	93.5±12.3 [72.8–121.4]
Height, cm	172.8±9.0 [157.2–190.1]
BF%, %	34.8±10.2 [10.2–45.3]
TF%, %	45.6±10.1 [21.1–56.4]
CIT, %	3.0±10.0 [–8.2 to 22.9]
Not normally distributed, mean ± SD [range]	
Age, years	29.5 [23–53]
BMI, kg/m <sup>2</sup>	31.7 [25.6–38.5]
SAT volume (normalized to trunk length), mL/cm	334.4 [87.8–447.9]
VAT volume (normalized to trunk length), mL/cm	45.9 [22.2–184.2]
Supraclavicular PDFF, %	83.3 [78.3–88.1]
Gluteal PDFF, %	92.0 [88.0–93.2]
Delta PDFF, %	8.1 [3.9–14.5]

Characteristics of subgroups sorted by BMI are presented for normal weight subgroup (BMI <25 kg/m<sup>2</sup>) and for overweight (BMI ≥25 kg/m<sup>2</sup>) subgroup. BF%, body fat percentage; BMI, body mass index; CIT, cold induced thermogenesis; n, numbers of participants; PDFF, proton density fat fraction; SAT, subcutaneous adipose tissue; TF%, trunk fat percentage; VAT, visceral adipose tissue; SD, standard deviation.



**Table S2** Descriptive statistics of subgroups by BF%

Variables	Value
Normal BF% (male BF% <25%, female BF% <30%)	
N	24
Female, n (%)	11 (45.8)
Normally distributed, mean ± SD [range]	
Weight, kg	70.8±14.3 [50.1–97.5]
Height, cm	176.8±11.7 [157.6–195.2]
BF%, %	17.9±7.6 [4.6–29.8]
TF%, %	22.6±7.0 [10.6–37.3]
CIT, %	3.9±8.0 [–10.6 to 24.3]
Not normally distributed, mean ± SD [range]	
Age, years	26 [20–33]
BMI, kg/m <sup>2</sup>	22.3 [19.0–30.4]
SAT volume (normalized to trunk length), mL/cm	88.2 [28.6–153.3]
VAT volume (normalized to trunk length), mL/cm	17.5 [4.4–90.3]
Supraclavicular PDFF, %	80.6 [69.7–85.8]
Gluteal PDFF, %	89.7 [82.3–92.8]
Delta PDFF, %	8.8 [5.4–21.8]
High BF% (male BF% ≥25%, female BF% ≥30%)	
N	15
Female, n (%)	13 (86.7)
Normally distributed, mean ± SD [range]	
Weight, kg	87.7±16.4 [62.7–121.4]
Height, cm	170.2±6.7 [157.2–182.5]
BF%, %	36.8±5.9 [26.2–45.3]
TF%, %	46.8±6.9 [37.4–56.4]
CIT, %	5.8±10.6 [–8.2 to 22.9]
Not normally distributed, mean ± SD [range]	
Age, years	30 [23–53]
BMI, kg/m <sup>2</sup>	30.6 [21.4–38.5]
SAT volume (normalized to trunk length), mL/cm	306.0 [165.4–447.8]
VAT volume (normalized to trunk length), mL/cm	39.3 [19.7–184.2]
Supraclavicular PDFF, %	83.6 [78.3–88.1]
Gluteal PDFF, %	92.4 [88.0–93.5]
Delta PDFF, %	8.8 [3.9–14.5]

Characteristics of subgroups sorted by gender adapted BF% are presented for normal BF% (male BF% <25%, female BF% <30%) and high BF% (male BF% ≥25%, female BF% ≥30%). BF%, body fat percentage; BMI, body mass index; CIT, cold induced thermogenesis; n, numbers of participants; PDFF, proton density fat fraction; SAT, subcutaneous adipose tissue; TF%, trunk fat percentage; VAT, visceral adipose tissue; SD, standard deviation.