TECHNICAL ADVANCE

Half-body MRI volumetry of abdominal adipose tissue in patients with obesity

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Abstract

Background: The purpose of this study was to determine to what extent the whole volumes of abdominal subcutaneous (ASAT) and visceral adipose tissue (VAT) of patients with obesity can be predicted by using data of one body half only. Such a workaround has already been reported for dual-energy x-ray absorption (DEXA) scans and becomes feasible whenever the field of view of an imaging technique is not large enough.

Methods: Full-body abdominal MRI data of 26 patients from an obesity treatment center (13 females and 13 males, BMI range $30.8-41.2 \text{ kg/m}^2$, 32.6-61.5 years old) were used as reference (REF). MRI was performed with IRB approval on a clinical 1.5 T MRI (Achieva dStream, Philips Healthcare, Best, Netherlands). Segmentation of adipose tissue was performed with a custom-made Matlab software tool. Statistical measures of agreement were the coefficient of determination R^2 of a linear fit.

Results: Mean ASAT_{REF} was 12,976 (7812–24,161) cm³ and mean VAT_{REF} was 4068 (1137–7518) cm³. Mean half-body volumes relative to the whole-body values were 50.8% (48.2–53.7%) for ASAT_L and 49.2% (46.3–51.8%) for ASAT_R. Corresponding volume fractions were 56.4% (51.4–65.9%) for VAT_L and 43.6% (34.1–48.6%) for VAT_R. Correlations of ASAT_{REF} with ASAT_L as well as with ASAT_R were both excellent ($R^2 > 0.99$, p < 0.01). Corresponding correlations of VAT_{REF} were marginally lower ($R^2 = 0.98$ for VAT_L, p < 0.01, and $R^2 = 0.97$ for VAT_R, p < 0.01).

Conclusions: In conclusion, abdominal fat volumes can be reliably assessed by half-body MRI data, in particular the subcutaneous fat compartment.

Keywords: Magnetic resonance imaging, Adipose tissue, Quantification, Segmentation, Volumetry, Obesity

Background

The increasing worldwide prevalence of obesity poses serious health and economic problems [1]. Obesity is characterized by the abundance of ectopic adipose tissue, which can be divided into visceral and subcutaneous fat with specific metabolic functions [2]. Visceral obesity is generally considered to have a negative impact on health resulting in an increased risk for cardiometabolic diseases such as diabetes mellitus type 2 or atherosclerosis, whereas excess subcutaneous fat is still discussed controversially [3, 4]. Various clinical trials have already used magnetic resonance imaging (MRI) to noninvasively characterize obesity [5]. Visceral and other

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ectopic fat volumes are usually quantified by segmentation of multiplanar images derived from computed tomography or magnetic resonance imaging. Quantitative measures of body composition can be essential for the monitoring of therapeutic approaches of patients with obesity such as sport interventions [6], pharmacological trials [7] or bariatric surgery [8–11].

For larger patients, the imaging field of view (FOV) of an MRI system (typically 50–55 cm) may be too small to cover the whole body laterally. Moreover, field distortions, spatial inhomogeneities of the applied electromagnetic pulses and imaging artefacts at the edges of the FOV may preclude proper image analysis. Dual energy X-ray absorptiometry (DEXA) measurements are also subject to weight and scan area restrictions for patients with obesity [12].

Surrogate DEXA measurements of one body half only have already been proposed in the mid-1990s to overcome

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these limitations [12, 13]. Considering the approximate mirror symmetry of the human body (with respect to the median plane), we hypothesized that the total abdominal subcutaneous adipose tissue volume can be predicted by half-body data only. The goal of this work was to test this hypothesis for patients with obesity where the available MRI data still covers the entire lateral body.

Methods

Study population

MRI data at 1.5 T were available from a total of 224 patients (60 male) from an interventional clinical trial on obesity at a single institutional research center. Subjects with a BMI above 30 kg/m² (inclusion criterion) underwent MRI as part of a clinical characterization for the local obesity biobank. No additional imaging was performed for this retrospective analysis. Thirty-six of the male patients (60%) were excluded because subcutaneous fat amounts on any of the abdominal MR images (slice thickness 10 mm) were not fully contained within the field of view or showed image artifacts that prevented precise segmentation. Another 11 male patients were excluded because the upper landmark for the segmentation of abdominal subcutaneous fat (vertrebra T9, see below) was not included in the trial dataset. The remaining 13 male patients were matched for age to 13 female patients. The mean BMI was 34.3 (range 30.8-41.2) kg/m².

Magnetic resonance imaging

Data were acquired on a standard clinical system that was upgraded from 1.5 to 3 Tesla throughout the original clinical trial (Achieva XR and dSTREAM, Philips, Best, Netherlands). For this analysis, however, we only considered one field strength (1.5 T) to reduce variability. Patients were examined in supine position with arms on the side and images were acquired in breath-hold technique (expiration) using the whole-body coil for signal reception. Fat-sensitive transverse MR images (twopoint Dixon sequence, slice thickness 10 mm, interslice gap 0.5 mm) were acquired to minimally include the abdominal region between diaphragm and pelvic floor using two contiguous stacks of 25 images each. Our measurement of abdominal subcutaneous adipose tissue (ASAT) volume, however, relied on a fixed landmark (vertebra T9) rather the more variable position of the diaphragm as recommended by Ulrich et al. [14]. Further technical details, including all relevant MR parameters, can be found in a previous report [15, 16].

Image analysis

A custom-made software tool was used to semiautomatically segment the half-body adipose tissue areas after proper marking of the median line. This tool was developed under the Matlab-based Dicomflex framework [17] and is available in the Github software repository (https://github.com/Stangeroll/Dicomflex). Validation against a reference software was reported earlier [18]. The abdominal adipose tissue areas were identified by a trained experienced reader (A.H.) on all transverse slices (see above). Figure 1 shows an example of such a segmentation.

The fully segmented abdominal subcutaneous and visceral adipose tissue served as reference standard (ASA- T_{REF} and VAT_{REF}). At the level of lumbar vertebra 4 or 5 between the dorsal aspect of the processus spinosus and the center of the corresponding vertebra, a reference median line dividing total ASAT into proper left and right portions (ASAT_L and ASAT_R) was drawn manually. This line was digitally pasted into all slices but could be modified in each slice to correct for potential scoliotic deformations.

Statistical analysis

Left and right half-body volumes were then plotted against the reference volumes. A linear fit yielded specific slopes and intercepts that can be regarded as conversion parameters between half and full measures:

$$ASAT_{EST-[L/R]} = ASAT_{[L/R]} \cdot 1/f_{ASAT-[L/R]} + b_{ASAT-[L/R]}$$
(1)

$$VAT_{EST-[L/R]} = VAT_{[L/R]} \cdot 1/f_{VAT-[L/R]} + b_{VAT-[L/R]}$$
(2)

where the index [L/R] denotes either the left or the right body side, ASAT_{EST-[L/R]} and VAT_{EST-[L/R]} are the estimated total fat volumes, ASAT_[L/R] and VAT_[L/R] are the partially measured volumes and $f_{ASAT-[L/R]}$ and $b_{ASAT-[L/R]}$ are the slope [no unit] and intercept [unit of volume] parameters of the corresponding linear fits.

Statistical measures of agreement were the coefficient of determination R^2 of a linear fit, and Bland-Altman analyses between measured and predicted values. A Shapiro-Wilk statistic was considered to test for a normal distribution of the respective differences. A twosided T-test was used to compare both genders in regards to BMI and age. All statistical analyses were performed with SPSS 24 (IBM, Armonk, NY) and *p*-values below 0.05 were considered to be significant.

Results

Data of 13 female and 13 male individuals were included. Mean BMI was 34.3 (range 30.8-41.2) kg/m² and mean age was 50.0 (range 32.6-61.5) years. Genderspecific patient characteristics are provided in Table 1. There was no statistical difference in age (p = 0.571) or BMI (p = 0.525) between genders. Image segmentation

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Screenshot of the segmentation software (Matlab). The manually drawn median line is meant to separate the two body halves. Colored lines mark the outer (yellow) and inner (blue) ASAT boundaries and a contour (red) encompassing the VAT components. The tool is available from an online repository (https://github.com/Stangeroll/Dicomflex). **b** Distribution of partial ASAT volumes for left and right body halves as a function of relative (axial) slice number for all subjects (slice spacing: 10.5 mm). Outer, middle and inner vertical marks represent maximum, median and minimum values. Slice position 0 corresponds to the level of the umbilicus

and determination of VAT_{REF} , VAT_L , VAT_R , $ASAT_{REF}$, ASAT_L and ASAT_R could be successfully performed for all patients. Definition of the median line took about 2 min and total segmentation time was about 12 min per patient. Mean volumes of abdominal subcutaneous $(ASAT_{REF})$ and visceral adipose tissue (VAT_{REF}) were 12,976 (range 7812 - 24,161) cm³ and 4068 (1137 -7518) cm³, respectively. Mean volumes of $ASAT_L$ and $ASAT_R$ were 6605 (3799 – 12,579) cm³ and 6370 (4013 – 11,582) cm⁻³. Mean volumes of VAT_L and VAT_R were 2272 (611–3859) cm³ and 1795 (526–3654) cm³. Figure 2 illustrates the linear correlation between $ASAT_L$ and ASAT_{REF}. Coefficients of determination were $R^2 > 0.99$ over all patients. Values of ASAT_{EST-L} were significantly higher in females compared to males (15,020 vs. 10,932 cm³). Coefficients R^2 between either ASAT_L or ASAT_R with ASAT_{REF} were very high (0.99) and did not differ significantly between genders. In contrast, correlations between ASAT_L and BMI were poor for both females ($R^2 = 0.26$, p < 0.01) and males ($R^2 = 0.35$, p < 0.01).

Considering VAT, females had a significantly (p < 0.01) lower mean volume (2787 cm³) than males (5350 cm³). Coefficients of determination between VAT_L or VAT_R with VAT_{REF} were both very good ($R^2 = 0.98$ and 0.97, respectively, both p < 0.01). For VAT_R, R^2 was slightly better for males ($R^2 = 0.95$) than for females ($R^2 = 0.90$). Correlation with BMI was moderate in males ($R^2 = 0.46$) and practically not given in females ($R^2 = 0.05$).

Conversion parameter sets were { $f_{ASAT-L} = 0.5253$, $b_{ASAT-L} = -211.1 \text{ cm}^3$ }, { $f_{ASAT-R} = 0.4747$, $b_{ASAT-R} = 211.1 \text{ cm}^3$ }, { $f_{VAT-L} = 0.5207$, $b_{VAT-L} = 154.1 \text{ cm}^3$ } and { $f_{VAT-R} = 0.4793$, $b_{VAT-R} = -154.1 \text{ cm}^3$ }. Mean values of the derived estimates were VAT_{EST-L} = 4069.2, VAT_{EST-R} = 4068.4, ASAT_{EST-L} = 12,976.4 and ASAT_{EST-R} 12,976,2. As a prerequisite for Bland-Altman analysis, the null hypothesis of volume differences coming from a normally distributed population could not be rejected (*p*-values between 0.051 and 0.931). The Bland-Altman plots for the left side (Fig. 2c and d) reveal a balanced distribution over the whole range of fat values with standard deviations of 361 cm³ and 267 cm³ for ASAT and VAT, respectively.

Discussion

Quantification of abdominal subcutaneous adipose tissue (ASAT) in patients with obesity is typically compromised by imaging limitations. Earlier reports of partial coverage of abdominal adipose tissue focused on either single slice or partial volume quantification and where mainly concentrating on visceral adipose tissue [15, 16, 19–21]. Therefore, the main objective of this study was to implement and evaluate a technique that estimates the ASAT volume of a patient from half-body data only. Here, validation was only performed for MRI datasets where the lateral body parts were fully contained in the FOV. Larger patients, in which these parts would normally be cut off, could then be placed with a lateral offset on the MRI table (see Fig. 3) to fully include one body half instead, preferentially the left one.

Our results revealed an excellent correlation between $ASAT_{REF}$ volumes and estimates from $ASAT_L$ or $ASAT_R$ with a slightly better agreement on the left side. This finding agrees with results from dual-energy X-ray absorptiometry [12] and also supports the assumption of a nearly symmetric ASAT distribution. Despite the pronounced lateral asymmetry of abdominal organs like the liver or spleen, VAT may still be predicted by half-body data. This may be explained by the observation that VAT is predominantly found in the lower two thirds of the abdomen where intestinal and pelvic structures show



no distinct lateral preference. VAT volumes next to the liver and spleen are rather asymmetric but make up a small amount of total VAT only. In males, VAT_R should be preferred for VAT prediction; in females, differences between VAT_L and VAT_R were only marginal.

Our pilot study has some limitations. Like in other studies involving MRI segmentation of adipose tissue areas [18, 22], our sample size is relative small. Although the original trial data included patients with a maximum BMI of 57 kg/m², the strict inclusion criteria applied for validation here (all ASAT boundaries within FOV, no artifacts, available MRI data at position T9) resulted in an effective BMI range of $30-41 \text{ kg/m}^2$ only. The good agreement may therefore not hold for subjects with higher degrees of obesity. Our semi-automatic segmentation tool has been used for all clinical analyses as well

Table 1 Patient characteristics

	Females	Males
Count	13	13
Age [years]	49.0 (3.9–61.0)	50.9 (32.6–61.5)
BMI [kg/m²]	34.9 (31.4–37.3)	33.7 (30.8–41.2)
ASAT _{REF} [cm ³]	15,020 (10,672 – 24,161)	10,932 (7812 –16,349)
VAT _{REF} [cm ³]	2786 (1137 – 4174)	5350 (3282 –7513)

Data of age and BMI are presented as mean and corresponding range Presented p values are derived from a t-Test on equality of variances BMI body mass index, ASAT_{REF} reference abdominal subcutaneous adipose tissue (volume), VAT_{REF} reference visceral adipose tissue (volume) and requires more processing time than the latest fullyautomated approaches [23, 24]. Data were deliberately analyzed by one operator only to exclude variations during interactive segmentation and median-line definition. Results of our retrospective analysis were not validated against an independent method. Also, DEXA scans had been excluded from the clinical study protocol to avoid application of ionizing radiation. Ultrasound was not considered either because the underlying accuracy is also low [25]. Despite the limited availability and higher complexity, MRI is used increasingly and even referred to as a gold standard for the quantification of adipose tissue. Furthermore, the presented results should be transferable to computed tomography, which comprises an almost identical imaging geometry.

Conclusion

In conclusion, we have presented a unique workaround method to reliably quantify abdominal adipose tissue in patients with higher grades of obesity using MRI. It is of particular value for ASAT but may also be used to estimate VAT with slightly lower accuracy. We believe that this simple half-body MRI volumetry has a high practical value for characterization of obesity, both in research and treatment.

Future work should be directed towards an independent validation, a more standardized image segmentation and a potential definition of normative values like the ones the MR table. Full-body fat amounts can be estimated from halfbody measures (here: right) using reference/ conversion parameters derived here. MRI acquisition with (obese) patient in central (normal) position is prone to image artifacts or (anatomical) cutoffs on both sides which would prevent proper prediction

patients with higher degrees of obesity. Sample transverse MR

image after patient has been positioned non-centrally (laterally) on

recently reported for a normal-weight Swiss population [14]. Our Matlab tool, the source code and the corresponding framework are therefore available from a Github repository (https://github.com/Stangeroll/Dicomflex) to facilitate further efforts along that line [17].

Abbreviations

$$\label{eq:starter} \begin{split} \mathsf{ASAT}_{\mathsf{EST-L}}: & \mathsf{Abdominal subcutaneous adipose tissue estimated from the left side of the body; \mathsf{ASAT}_{\mathsf{EST-R}}: & \mathsf{Abdominal subcutaneous adipose tissue estimated from the right side of the body; \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous adipose tissue on the left side of the body; \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous adipose tissue on the right side of the body; \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous adipose tissue on the right side of the body; \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous adipose tissue on both sides of the body; & \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous adipose tissue on both sides of the body; & \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous adipose tissue on both sides of the body; & \mathsf{ASAT}_{\mathsf{R}}: & \mathsf{Abdominal subcutaneous} \\ \mathsf{AMT}_{\mathsf{L}}: & \mathsf{Visceral adipose tissue on the left side of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on the right side of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{AST}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{R}}: & \mathsf{Visceral adipose tissue on both sides of the body; & \mathsf{VAT}_{\mathsf{$$

Acknowledgments

Not applicable.

Authors' contributions

NL, KS and HB designed the study. MB provided patient data. TE and RS designed the software for image analysis. KS and AH collected patient data. NL and AH performed analysis of images and data. NL wrote the manuscript. HB and MB revised the manuscript. NL was in charge of the final version. All authors reviewed the article and approved the submitted publication. All authors declare that there is no conflict of interest regarding the publication of this article.

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Availability of data and materials

Data is available upon request from the corresponding author (nicolas. linder@medizin.uni-leipzig.de).

Ethics approval and consent to participate

Data collection, analysis and publication were approved by the Ethical Review Board (#159-12-21052012 and #017-12-23012012) of the Faculty of Medicine, Leipzig University, Germany (#284/10).

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

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