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Quantitative Magnetic Resonance Imaging assessment of the Quadriceps changes during an extreme mountain ultramarathon

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25 **ABSTRACT**

26 **Introduction/Purpose**

27 Extreme ultra-endurance races are growing in popularity but their effects on skeletal
28 muscles remain mostly unexplored. This longitudinal study explores physiological
29 changes in mountain ultramarathon (MUM) athletes' quadriceps using quantitative
30 magnetic resonance imaging (qMRI) coupled with serological biomarkers.

31 The study aimed to monitor the longitudinal effect of the race and recovery, and to
32 identify local inflammatory and metabolic muscle responses by codetection of biological
33 markers.

34 **Methods**

35 An automatic image processing framework was designed to extract imaging-based
36 biomarkers from qMRI acquisitions of the upper legs of 20 finishers at three time points.
37 The longitudinal impact of the race was demonstrated by analyzing the image markers
38 with dedicated biostatistical analysis.

39 **Results**

40 Our framework allows a reliable calculation of statistical data not only inside the whole
41 quadriceps volume but also within each individual muscle heads. Local changes in MRI
42 parameters extracted from quantitative maps were described and found significantly
43 correlated with principal serological biomarkers of interest. A decrease in the PDFF after
44 the race and a stable paramagnetic susceptibility value were found. Pairwise post hoc
45 tests suggested that the recovery process differs among the muscle heads.

46 **Conclusion**

47 This longitudinal study conducted during a prolonged and extreme mechanical stress,
48 showed that quantitative MRI-based markers of inflammation and metabolic response
49 can detect local changes related to the prolonged exercise, with differentiated
50 involvement of each head of the quadriceps muscle as expected in such eccentric load.
51 Consistent and efficient extraction of the local biomarkers enables to highlight
52 interplay/interactions between blood and MRI biomarkers. This work indeed proposes
53 an automatized analytic framework to tackle the time consuming and mentally
54 exhausting segmentation task of muscle heads in large multi-time-points cohorts.

55 **KEYWORDS**

56 Musculoskeletal; statistical analysis; image processing; functional variation

INTRODUCTION

Mountain ultra-endurance running consists of running/walking outdoors over a distance longer than the traditional marathon on mountain trails with significant upward and downward slopes. This sport has become increasingly popular over the last decade.

Because of the inherent challenge for the body, the mountain ultramarathon (MUM) is considered an outstanding model to investigate the adaptive responses to extreme load and mechanical stress(1) in skeletal muscles. Studies have been carried out to explore the impact of these prolonged cardiovascular and muscle efforts, demonstrating, for instance, multiple visceral changes with inflammatory effects(2–4) or an impairment of neuromuscular function(5). Among all muscles, the quadriceps are particularly targeted because extensive downhill running causes repeated eccentric contractions and high mechanical stress, ultimately leading to muscle damage(6,7).

Magnetic Resonance Imaging (MRI) is a reliable, non-irradiating and non-invasive imaging method for tissue characterization and quantitative assessment of tissue integrity through its magnetic properties. Indeed T2 MR relaxation times, and its corresponding rates $R2 (=1/T2)$ denote the characteristic time constants of the recovery back toward equilibrium of the xy (transverse) components of the magnetization. After being disturbed, the MR signal source, i.e. nuclear magnetization, does not spontaneously recover very fast, but relies almost entirely on interactions of hydrogen nuclei with the surrounding material to re-equilibrate(8). Because T2 is sensitive to low-frequency components, in tenth of ms, water molecules diffuse and sample many different environments on the cellular level within the timescale of relaxation. In many (although by no means all) situations, very rapid exchange may occur between bulk water and bound and interfacial water in biological systems. This is believed to be the origin for many T2 changes in various pathologies, such as edematous changes following insults to tissue. Changes in tissue water and protein content have been shown to affect relaxation. The measure of

average water proton relaxation rate will depend on how effectively, and at what rate, these effects are spread through the rest of the water population. Moreover, the existence of water in separate compartments that are only slowly exchanging gives rise to more complex behavior(9). Many studies witness that edematous areas in the muscle appear bright in T2-weighted images because the T2 relaxation time becomes longer, and T2 maps show elevated quantitative values in the matching area(10,11). T2 maps have, therefore, been used to monitor inflammation in muscle diseases, before and after medical interventions or treatment(12–14), or to predict return to play(15). T2* is the "effective" T2 resulting from inhomogeneities in the main magnetic field or susceptibility-induced field distortions produced in the tissue, related to the presence of chemical or paramagnetic substances such as fat or hemorrhage(16). However, the first step in decoding the various effects of prolonged exercise stress on the body using qMRI markers is to develop systematic and comprehensive noninvasive exploration strategies to consistently extract the biomarkers reflecting the physiological consequences of such challenges.

From that perspective, magnetic resonance imaging (MRI) appears to be a unique imaging modality for extracting anatomical and structural features of muscle tissue(17,18). Recently, quantitative imaging methods such as chemical shift-encoded MRI(19,20) and MR relaxometry mapping(21,22) have allowed users to understand chemical alterations noninvasively at the imaged pixel size.

Several postprocessing methods need to be sequentially applied to extract a quantitative index from MRI data. These methods include the segmentation of muscle heads on multiple large 3D images, the extraction of image features in each area of interest, and statistical analysis. Each of these steps is an area of research in its own right. Although various alternatives have been proposed to target each of these challenges(17,18), they are rarely applied to cohorts or longitudinal studies.

The aim of the study was to quantify the response of the quadriceps muscle to a MUM's extreme loading conditions with quantitative MRI (qMRI) and to monitor the longitudinal effect of race and recovery. To do so, we propose an automatized and integrated analysis pipeline that enables the extraction of local quantitative imaging markers. Hence, the relation of these new markers with standard blood biomarkers was investigated to provide further insight into the local inflammatory and metabolic muscle responses.

MATERIALS AND METHODS

Subjects and experimental study design

We performed a longitudinal study on the athletes who participated in the "Tor des Géants" MUM in 2014, including three MRI sessions carried out just before the start and, for those who finished the race, immediately upon arrival and after 48 hours of recovery. Biological samples were also drawn at four time points with an additional sample obtained at half-race. The flowchart of the study is shown in Figure 1.

This study was approved by the local ethical committee (Aosta Valley, Azienda USL 101/946), and the experimental plan was conducted in accordance with the Helsinki Declaration (2001). Subjects were recruited through mailing and public announcements to registered runners by race organizers. Exclusion criteria were smoking, substance abuse, regular intake of medications, medical or psychiatric illness, and any contraindication to MRI (e.g., claustrophobia, nonremovable metal devices) or abnormalities detected upon laboratory screening. There were 50 experienced runners who volunteered and provided informed written consent to participate in this study.

The Tor des Géants is a 330 km long ultradistance trail running, with considerable positive/negative elevation changes (+24,000 m) in the Valley of Aosta (Italy). It is considered

one of the most difficult mountain marathon races in the world since the ultra-endurance activity is associated with high altitude exposure and sleep deprivation. The altitude along the course ranges between 322 and 3,300 m, with 25 mountain passes over 2,000 m. The maximum time allowed to complete the race is 150 h, and in 2014, the best performance was 71 h 49 min among 740 starters and 446 (60%) finishers (<http://www.tordesgeants.it/>).

The present experimental design was thus a longitudinal study with repeated assessments at four checkpoints:

- The first point (prerace: Pre) was at the start location. The data collection was performed within 4 days before the race and consisted of MRI acquisition and biological sampling.
- The second point was located halfway through the race (middle: Mid). Only biological sampling was performed.
- The third one was at the arrival of the race (arrival: Post): athletes who finished the race were transported by car to the laboratory and were evaluated (MRI and biological sampling) within 1 h after finishing the race.
- The last point (recovery: Post+3) was 48-72 h after arrival time. Both MRI and biological sampling were acquired.

MRI acquisitions

At Pre, Post and Post+3 time points, MRI acquisitions were performed on site using a mobile 1.5 T MR scanner system (MAGNETOM Avanto, Siemens Healthcare, Erlangen, Germany, located within a truck from Alliance Medical, England). A standard coil configuration was used: a flexible 4-channel array surface coil, combined with 4 elements of the spine coil embedded in the bed, resulting in an 8-channel coil in total.

Three MRI acquisitions of the legs were sequentially performed:

- A three-dimensional (3D) isotropic gradient dual-echo sequence was used. The coronal acquisition included the entire upper leg (from the tibial tuberosity to the anterior superior iliac spine). The reconstruction of the water and fat images from the acquired dual-echo data sets was performed inline (Syngo software, Siemens healthcare, Erlangen, Germany) using a Dixon approach enabling four 3D isotropic in-phase, out-phase, fat and water coronal images to be calculated inline on the MR scanner, hereafter denoted water (W), fat (F), in-phase (IN) and out-phase (OUT) images, respectively.
- A 3D spoiled gradient echo sequence (3D GRE) was used for simultaneous estimation of proton density fat fraction (PDFF), $T2^*$, and internal magnetic susceptibility (χ) quantification. Eight echoes were acquired in the transverse plane with a flyback readout gradient (first echo: 1.58 ms and echo spacing: 2.52 ms). TR and flip angle were adjusted to minimize the T1-related bias. Phase and magnitude images were systematically reconstructed. Prescription of localization was performed using anatomic images from an isotropic 3D gradient echo acquisition. For standardization purposes, the central partition in the z-direction was planned at a 15 cm distance from the upper part of the patella using the sagittal multiplanar reconstruction of the first acquired 3D gradient isotropic sequence.
- A 2D multiecho T2 weighted spin-echo sequence (meSE) with 16 echo times (TEs) ranging from 10 to 178 ms, with its central slice was also planned at the same location as previously described.

Each individual sequence was individually optimized. Anatomical regions explored by each technique are summarized in Figure 2a, and the main MR parameters are listed in Supplemental Digital Content 1, MR imaging acquisition parameters.

MR Image postprocessing

PDFF, χ , and T_2^* were calculated from 3D-GRE acquisition using the reconstruction method described in (19–22) which encompassed two main steps: fat-water separation (provided parametric T_2^* and PDFF maps) and magnetic susceptibility quantification. Meanwhile, T_2 parametric maps were calculated from the meSE sequences.

An automatic segmentation based on external-force-driven deformable registration was performed on the T1-W images (23) to obtain the quadriceps heads of interest.

Briefly, dedicated in-house postprocessing pipelines were required 1) to simultaneously compute the main parametric maps (fat fraction – PDFF, internal magnetic susceptibility (χ) and T_2^* from the 3D GRE sequence, T_2 parametric map from the meSE sequence) and 2) to correct the results of the automatic muscle segmentation and to adjust their resolutions to different image sequences (Figure 2). These steps allowed us to extract metrics from the four parametric maps: PDFF, χ , T_2^* and T_2 . All details about parametric map reconstruction and muscle segmentation are provided in Supplemental Digital Contents 2, quantitative maps computation, and 3, muscle segmentation procedure.

Biological sampling and analysis

Blood and urinary samples were collected at each of the four sessions (Pre, Mid, Post, Post+3) within 10 min after arrival at each key point. Blood samples were drawn from an antecubital vein into a dry, heparinized, or EDTA tube according to the analysis to be performed and immediately centrifuged. Since it was not possible to carry out all the investigations on the same day by point-of-care technologies, plasma and serum were frozen at -80°C within 20 min after blood collection for later analysis of muscle injury markers and biochemical variables.

The hematology parameters (hemoglobin, red blood cells, white blood cells) were directly analyzed by a pocH-100i™ automated hematology analyzer (Sysmex, Villepinte, France).

Cobas 8000 (RocheDiagnostics, Mannheim, Germany) was used to perform serial

determinations for C-reactive protein (CRP), urinary creatinine, creatinine, calcium, chlorine, potassium, sodium, and cholesterol. The osmolality and urinary osmolality were measured on an Arkray Osmo Station OM-6050 (Menarini, Florence, Italy).

All blood biomarkers analyzed in this study are listed in Supplemental Digital Content 4, complete list of 58 biological markers analyzed in the study.

Statistical analysis

Missing values in biological datasets were estimated (see Supplemental Digital Contents 5, biological data preprocessing for missing data) to employ paired statistical tests and for subsequent correlation analysis between MRI and biological markers. The significance level was set at $P < .05$ for all statistical tests.

Longitudinal statistical analysis

For the qMRI longitudinal data, we used a statistical analysis of repeated measures with adaptation to the data normality, as the normal distribution could not be assumed. For each qMRI calculated index of each of the 9 muscle volumes (4 quadriceps muscle heads per leg and the total quadriceps volume), we tested the normality of the data at 3 time points with the Shapiro-Wilk test. For the global effect test, one-way ANOVA designed for repeated measures was conducted for all data normally distributed at all the time points; otherwise, the Friedman test was employed.

While performing ANOVA, the sphericity of the data was verified by using Mauchly's test. If the sphericity assumption was violated, the Greenhouse-Geisser correction method was used on the P-value of ANOVA. After the global effect test, a post hoc test was performed to compare each pair of time points. The type of post hoc test depended on the normality of differences between two time points: dependent t-test for normally distributed differences and

229 Wilcoxon signed rank test otherwise. The obtained P-values were adjusted with the Bonferroni
230 adjustment method for multiple comparisons.

231 A similar strategy was applied to the biological marker data with 58 variables at 4 time points.
232 Relative variations of a biomarker X at each time point ($RV(X_n), n \in \{Mid, Post, Post + 3\}$)
233 compared to time point Pre were also computed with:

$$234 \quad RV(X_n) = \frac{\overline{X_n} - \overline{X_{Pre}}}{\overline{X_{Pre}}} \times 100\%$$

235 where $\overline{X_n}$ is the average value of biomarker X at time point n .

236 *Associations between image markers and biological markers*

237 The potential associations between image markers and biological markers were evaluated by
238 calculating the repeated measure correlation coefficient(24) between each image marker and
239 each biological marker.

240

RESULTS

MR markers: parametric mapping analysis

Of the 50 athletes that were included in the study, 31 finishers completed the race (62%) in an average time of 124 ± 13 h. Among them, only those with quadriceps muscle MRI datasets available at all the time points ($n=24$) and with quantitative maps free of artifacts at all three time points were retained for final analysis ($n=20$). Artifacts leading to data exclusions were mostly motion-related. They were specifically due to uncontrolled motion of the legs typically observed immediately after long races potentially combined with those related to sudden sleep attacks during MR acquisitions. Demographic data and global qMRI metrics collected at each time point are reported in Supplemental Digital Content 6, demographic data and qMRI metrics of the subject population.

The first step was to explore differences among all quadriceps muscle heads. Figure 3 shows a matrix of the t-test results when comparing qMRI metrics (χ , PDFF, T2, T2*) between all muscle heads at the three MR acquisition time points (Pre, Post, Post+3). When focusing only on right/left differences of the corresponding muscle heads, χ , T2* and PDFF showed similar tendency. At the same time, there was no significant difference between right and left muscle heads for χ and T2* at any time point, and PDFF exhibited a significant difference between vastus lateralis (VL) heads only at a single time point (Post+3). On the other hand, the T2 metric showed a different pattern with a significant difference between the rectus femoris (RF) heads of the two legs at the three time points (Pre, Post, Post+3) and a significant difference between the left and right vastus medialis (VM) at time point Pre. Different muscle heads also had different qMRI values, especially the RF, which showed significant differences compared to all the other muscle heads most of the time. These results highlight the need to consider

individual muscle behavior separately and that pooling quadriceps muscle heads may result in a loss of information.

When analyzing temporal changes on the repeated measures of qMRI metrics, we observed a significant time effect (i.e., race effect) on T2* and T2 mean values. This is shown in Figures 4 and 5 with typical source images (see also Supplemental Digital Content 6 - Demographic data and qMRI metrics of the subject population, for summary values and Supplemental Digital Content 7 - Specific longitudinal T2* analysis, for a local analysis of right VI in T2* for an example subject). Both T2* and T2 were significantly longer at arrival for most of the muscle heads. They significantly decreased after recovery for the VM and the vastus intermedius (VI) while not returning to baseline values at that time of measurement.

PDFF and χ showed only a small time effect (Figure 6-7). Pooling all muscles, PDFF had a tendency to decrease after the race (2.88 ± 0.53) compared to baseline (3.16 ± 0.45) while increased to higher values than baseline (3.17 ± 0.46) after 48 h of recovery. When considering each muscle, the time effect reached significance for both VI, right VM and left VL muscle heads (Figure 6). Despite a similar trend as the PDFF, time-effect changes in χ did not reach significance for most muscle heads, except for left VL and left VM (L).

When focusing on T2* and T2 findings, the vastus group exhibited stronger variations than the RF muscle group. The VM and VI had larger changes than the VL or the average of all muscles. T2* values appeared less sensitive to muscle changes than T2, as illustrated in Figure 3, but most of the statistical tests were significant except for some muscle heads on both legs between time points Post and Post+3.

Biological marker analysis

The longitudinal variations in biological markers throughout the race are shown in Supplemental Digital Content 8, Values of urinary and blood biomarkers at 4 time points. As

main blood biomarkers of muscle damage, serum creatine kinase (CK) and myoglobin levels peaked at +6598% and +4159% at Mid, while serum lactate dehydrogenase (LDH) levels peaked at +240% at Post and were elevated at Mid at +197% (all P-values of post hoc test against Pre are less than 0.01, see Figure 8). For most of the biomarkers, the biomarker values at Pre were significantly different from those at the other time points (Mid, Post, Post+3), while the difference between Mid and Post was nonsignificant.

Correlation between qMRI features and main blood biomarkers

We presented our results with a heatmap produced within R software (Supplemental Digital Content 9, Correlation between biological markers and image features extracted from quadriceps muscles in each qMRI quantitative map). An interactive version of this heatmap can be found online (http://amp.pharm.mssm.edu/clustergrammer/viz_sim_mats/5bed953490fbf7585f5680c2/Correlation_Mean.txt) thanks to Clustergrammer(25). Significant correlations between qMRI features and biological markers were found:

- The T2 mean extracted from the whole quadriceps showed a significant time effect at all time points of the race and a relatively strong correlation with blood/urine biomarkers such as myoglobin (0.69), CK (0.78) and LDH (0.72). At the level of individual muscles, the correlation coefficient is higher for VI and VM muscles.

- T2* exhibited similar results but with lower correlation coefficients: 0.54 for myoglobin, 0.57 for CK and 0.61 for LDH.

- Meanwhile, neither the mean global PDFFF nor χ showed any significant correlation coefficients with biological markers in this study.

DISCUSSION

While ultraloading events such as MUMs are recognized to endanger the musculoskeletal system, little is known about the exact consequences of the acute biomechanical burden on musculoskeletal tissues. Although (26) recommends the use of MRI as the method of choice for studying endurance-related damage, to date, there has been only one longitudinal observational field cohort study, focusing primarily on changes in overall body composition (27) or morphological tissue damage(28).

The challenge and novelty of this work are two-fold: 1) first, to provide a technological approach specifically developed enabling the extraction of qMRI parameters for longitudinal skeletal muscle studies; 2) then, to demonstrate that qMRI brings unique insights into the response of quadriceps muscle exposed to prolonged mechanical stress of a 330 km ultra-endurance event.

To do so, we built a standardizing and automatic analysis pipeline that segments, calculates, and extracts all qMRI markers in each quadriceps muscle's heads that can be robustly propagated to the different follow-up time points, thus enabling longitudinal monitoring.

Beyond the scope of this work, our first contribution is to empower a comprehensive and multiparametric quantification of MRI biomarkers in thigh skeletal muscle, including T2 and T2* relaxation times, together with fat content (PDFF) and internal magnetic susceptibility χ . Secondly, the analysis framework enabled analysis of each quadriceps muscle head over different time points (see Supplemental Digital Content 6, Demographic data and qMRI metrics of the subject population, and Figures 4-7).

Our main findings are that the cumulative biomechanical stress of a 330 km MUM onto quadriceps muscles translated in our subjects to a clear inflammatory burden with an increase in T2 and T2* relaxation times. On the other hand, muscular metabolic and energy storage

status probed fat content (PDFF) remained relatively stable with a small decrease in PDFF, contrasting with the high energy expenditure that mainly relies on lipids. Below is a detailed discussion of each qMRI finding.

T2 and T2 changes: MR markers of the muscular inflammatory burden*

T2 and T2* changes (Supplemental Digital Content 6, Demographic data and qMRI metrics of the subject population, and Figures 4, 5) are an expression of the well-known sensitivity of qMRI T2 and T2* relaxation time parameters to overall water content variations and water redistribution between intracellular and extracellular space(18,22,29–32). Our findings confirm previous studies that reported with other approaches a significant inflammatory response after MUM(5,33), mainly related to repetitive eccentric muscle contractions resulting in microscopic muscle damage and subsequent edema (5,6,34). In our study, T2 and T2* remained elevated even after a few days of recovery, suggesting that 48-72 h is not sufficient for a full recovery in most subjects and confirming previous findings by Robach *et al*(35).

Relaxometry changes demonstrated at the muscular level were corroborated by a large increase in skeletal myocyte injury-related biomarkers (CK, myoglobin and LDH) that was also measured in our subjects. These blood biomarkers are known to witness microlesions and early signs of cellular inflammatory processes preceding water redistribution from intracellular to extracellular compartments and have also been shown to reflect the extent of cellular damage(33,36). Among the other findings in the biological profiles, WBC activation, particularly neutrophil activation, is known to trigger cellular and humoral inflammatory responses(37) characterized by elevated CRP levels and the presence of leucocytes in the extracellular and extravascular spaces in response to long-term exercise(33,38). The intrinsic strength of MR imaging relies on its capacity to precisely reveal the local changes, while the evident correlation of quantified T2 and T2* parameters with biological markers most likely

could reflect a difference in the temporal response of the compared biomarkers. If the tendency are similar, the amplitude of the correlation could only be due to a difference in the temporal occurrence of the inflammation signature at the blood and tissue level, hence also during the tissue recovery process.

The development of peripheral and muscular edema together with a total body water increase have been reported in the context of ultramarathon running(27), with a 6% increase in total body water after a 1,200 km run over 17 consecutive days and an increase in total body water associated with tissue edema(39). Our measures of the total quadriceps muscle volume (excluding superficial tissues) illustrated the same trend but with a small increase in quadriceps muscle volume (+3.3% at the end of the race and +3.4% after 48-72 h recovery relative to baseline; see Supplemental Digital Content 6, Demographic data and qMRI metrics of the subject population): number of voxels from the 3D GRE sequence, expressing muscle volume). This observation suggests that among the potential mechanisms involved, the T2 and T2* changes are more likely related to water redistribution than to a net muscular tissue water content increase.

An interesting finding is the observable difference in T2 and T2* response among the different quadriceps muscle heads. Indeed, while the VI and VL exhibited both higher T2 and T2* increases, the RF showed almost no variations. These findings confirm previous studies exploring MUM and long-distance running adaptation strategies. Sloniger *et al.*(40) For instance, uphill running requires considerably greater activation of the vastus group and less activation of the RF than horizontal running(40). Ultrarunners are also known to modify their running pattern by increasing their stride frequency and by reducing the vertical oscillations to minimize the load and the associated pain occurring in lower limbs mainly during the eccentric phases(41). Impact forces when running downhill can be moderated by increasing knee flexion at initial contact and reducing stride length(42). This shock attenuation strategy is also

associated with a less pronounced heel strike and a forward leaning trunk. Altogether, these protective mechanical adaptations are likely to be specific to MUM and to differentially impact the quadriceps muscles, inducing less stimulation of the RF compared to the vastus muscles, which is clearly illustrated here.

From a mechanistic point of view, T2 and T2* MR relaxation measures are well established and sensitive markers of exercise response. For instance, Le Rumeur *et al.*(32) have shown that T2 relaxation times can detect different effects of dynamic exercise in trained and untrained subjects and that there was a correlation between T2 increase and work intensity in healthy volunteers. Beyond the observed mean variations already discussed, individual variations observed in T2 and T2* values (Figure 4 for T2* and Figure 5 for T2) along such long-distance running are also probably determined by a complex system of regulatory mechanisms including individual response to inflammatory processes at each compartment level, and the intrinsic differences between T2 and T2* mechanisms can probably provide further insights. Indeed, T2* mapping differentiates from T2 mapping by its ability to characterize the relaxation of the transverse magnetization that is influenced by macroscopic (inhomogeneities of the magnetic field) and mesoscopic (structure of the tissue) magnetic field inhomogeneities(43–47). For example, reduced T2* values have already shown the potential to describe structural alterations suggestive of ischemic alterations, collagen areas or hemorrhage, for instance, in myocardium and extracardiac tissues(48,49). According to this, histopathologic substrates of T2* and a correlation of T2* to flow analyses have been demonstrated(44–47,50). Recently, reduced T2* values have been described in a group of hypertrophic cardiomyopathy patients potentially triggered through relative ischemia(51). In our case, explanation for the observed increased T2* values could be related to increased perfusion and/or local variation of oxymyoglobin and oxyhemoglobin as oxygen suppliers are increased while deoxymyoglobin is decreased. Note

also that increased $T2^*$ contrast will be associated with oxygenated proteins, while deoxygenated proteins that are paramagnetic would reduce local $T2^*$ values.

Contrary to $T2^*$, $T2$ in muscle is known to have three components: ~18% of the signal had a very short $T2$ (10 ms), 67% of the signal had an intermediate $T2$ (~40 ms), and the remaining 15% of the signal had a long $T2$ (~170 ms)(52). The short $T2$ component is the water bound to macromolecules, and the intermediate and long components represent intracellular and interstitial water, respectively. The literature also clearly describes a unidirectional flow of water from the “innermost” to “outermost” of three compartments connected in series (intracellularly bound water -> free intracellular water -> interstitial water -> lymphatic vessels). The latter three are subject to considerable variations as a result of normal physiological changes in the muscle. In our study and due to MR acquisition technical constraints, the relaxation in the tissue could be modeled only as a unique compartment. Using a single exponential to describe $T2$ decay in muscle limits our understanding of the exact contributions of different physiological and biochemical responses to exercise.

PDFF and muscular lipid storage

Our study analyzed noninvasively the local variations in fat content in skeletal muscles during an ultra-endurance running event. With PDFF mapping, MRI is indeed the only noninvasive method that can enable simultaneous, reliable, and repeatable fat fraction estimates within each muscle’s heads not achievable by alternative methods such as MR spectroscopy(53).

Overall, muscular fat content showed a small decrease at the end of the race, but the changes were not statistically significant except in the most solicited muscle heads (vastus group) (see Figure 3).

431 Exploring muscular fat content variations during an MUM was of special interest since lipids
432 are the main source of energy in low- to moderate-intensity exercises, such as long-distance
433 events. Additionally, the highest rates of fat oxidation are observed in endurance athletes below
434 65%(54,55) which is in accordance with what has been measured on the Tor des Géants MUM
435 by Maufrais et al., who reported an average exercise intensity below 50% of VO_{2max} (56).

436 Muscle fat content is mainly represented by small quantities of triglycerides (TG) that are
437 present as lipid droplets located between or inside muscle fibers (intramyocellular TG, or
438 IMTG), while most fat storage is mainly located in subcutaneous and deep visceral adipose
439 tissue(57). There is now clear evidence that the IMTG pool acts as a buffer regulating fatty
440 acid (FA) flux in skeletal muscle both during exercise to maintain intracellular FA (metabolite)
441 concentrations and in conditions of increased plasma FA provision(58,59). Our findings are in
442 line with other studies that also reported no or minimal reduction of IMTG using biopsies
443 before and after exercise(60–62). Using 1H -MR spectroscopy, other authors reported larger
444 changes with an ~25% IMTG decrease after 2-3 h of exhaustive running at 50-65%
445 VO_{2max} (63,64). Both approaches have been challenged as suffering from intrinsic bias: the
446 direct biopsy approach is subject to between-biopsy variability (reported up to 23%), while 1H -
447 MR spectroscopy modeling accuracy may be biased by water content changes and assumptions
448 of FA compositions in IMTG(65). All existing studies have explored fat content changes in
449 short-duration (up to 3 h) and high-intensity (up to 80% VO_{2max}) exercises that profoundly
450 differ from MUM, which intrinsically limits comparison.

451 While the IMTG pool appeared to behave as a buffer to facilitate mitochondrial oxidation and
452 skeletal muscle energy supply, our blood lipid profiles showed a marked reduction in
453 circulating TG and low-density lipoprotein (LDL), since the lipoprotein lipase released by
454 endothelial cells during exercise has been shown to increase FA availability(66). At the same
455 time, we observed an increase in high-density lipoprotein (HDL) cholesterol that coincides

with significant increases in lipoprotein lipase activity(67) as already reported in long-distance exercise(68).

Paramagnetic susceptibility χ

Magnetic susceptibility χ is a physical property that describes the response of a medium being placed within a magnetic field(69). A positive susceptibility value characterizes a paramagnetic medium (O₂, salts) with a magnetic field increase, while most biological tissues, including water and fat, are diamagnetic with negative values inducing a local decrease of the initial magnetic field.

All magnetic susceptibility measured in our subjects and all time points were paramagnetic coherently with the metabolic consumption of oxygen in tissues: the weakly diamagnetic oxyhemoglobin releases strongly paramagnetic O₂ and deoxyhemoglobin molecules(70). The magnetic susceptibility χ remained very stable with only a minimal increase at arrival of 1.75±0.43 ppm vs. 1.49±0.34 ppm at baseline (see Supplemental Digital Content 8, Values of urinary and blood biomarkers at 4 time points), as expected in low-intensity aerobic exercise where the average intensity remains below 50% of VO₂max(56), explaining the lack of significant variations over time. Indeed, measurable changes in magnetic susceptibility-related measures in skeletal muscles reported in the literature occurred only in critical conditions such as cuff compression tests or ischemia(71). Our differences among muscle heads and groups are, however, in line with findings by others(71). This finding is explained by the differences among muscles in slow-twitch oxidative muscle fibers, different capillary density, and myoglobin content.

From a broader perspective, the proposed approach could also serve in diseases for longitudinal monitoring of muscular disorder progression or improvement due to various treatments.

Indeed, the motivation for both athletes and physicians during this study was also to serve and encourage technological developments that could, beyond a deeper understanding of muscle physiology during extreme exercise, also help, in turn, be a crucial adjunct to improve patient diagnosis, follow-up, and care, evaluate the effects of personalized-designed therapies, a highly critical objective not in clinical routine. Indeed, there are several clinical scenarios in which pathologies lead to inflammation or muscle wasting. Moreover, such an approach could be coupled to the other strengths of MRI, including in vivo dynamic imaging of muscle function and kinematics(72–75), muscle microstructure using diffusion MRI or measures of chemical changes associated with metabolic states and glycogen consumption using MR spectroscopy(76).

Limitations

While we have studied the average response for all the subjects, there is an interindividual response heterogeneity which is likely influenced by factors such as age(77), training status(78), performance level, experience, and many others that likely modulated the inflammatory response but could not be taken into account due to our limited sample size.

In this paper, we used simple statistical descriptors to analyze the quantitative indexes extracted at each time point and within each muscle head, while radiomic features could have been explored for each quantitative index.

While considering the results on PDFF, it should be kept in mind that the PDFF values in our study are especially low since our subjects are professional athletes and there are estimation errors in PDFF map computation.

Recently, more specific acquisition methods and modeling, combining ultrashort-TE acquisition(79) and muscle-specific models of diffusion, might enable short-term distinguishing the T2 of each muscle compartment (T2 intracellular, T2 in the membrane, T2 extracellular) and thus elucidating the different causes of changes in the parameters.

Conclusion

Using a model of prolonged and extreme mechanical stress, we showed that a dedicated analysis pipeline enables the extraction of local quantitative imaging markers of inflammation and metabolic response and the detection of local changes related to exercise. Our study confirms that prolonged MUMs induce singular muscle damages compared to other sporting events, while the extreme eccentric load (due to the 24000 m of downhill running) is likely the main trigger. When applied with proposed segmentation and analysis pipeline, qMRI can monitor these changes while differentiating the involvement of the heads of the quadriceps muscle.

There are many potential applications; for example, in sports science, our approach could be used to explore the impact of other exercise challenges or to quantify the effects of training strategies or training programs on specific individuals. Considering that MRI can also provide high-spatial-resolution anatomical images of muscle injuries and trauma, as well as information on muscle microstructure and metabolic variables such as glycogen consumption, qMRI would be a highly relevant noninvasive modality for investigating the relationship among force loss, muscle microstructure, performance and recovery in athletes as well as muscle wasting and disability in patients.

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532 **CONFLICT OF INTEREST**

533 The authors declare that there is no conflict of interest. The results of the present study do not
534 constitute endorsement by ACSM and are presented clearly, honestly, and without fabrication,
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FIGURE LEGENDS

Figure 1: Flowchart summarizing the main steps of our study. MRI was performed at three time points: before (Pre), and participants who finished the race, immediately after (Post) and ~48-72 h after the race (Post+3). Meanwhile, biological sampling was performed at four time points (an additional sample was performed at half-race (Mid)).

Figure 2: MRI input sequences superposed on the isotropic water image (a), the coronal view of the automatic segmentation displayed with the isotropic water image as a background (b) and its 3D volume (c) rendered with 3DSlicer(80).

Figure 3: t-test matrix with color-coded P-values for multiple comparisons of qMRI metrics (χ , PDFF, T2, T2*) between muscle heads at all three acquisition time points (Pre, Post, Post+3). Abbreviations: VL – Vastus Lateralis, RF – Rectus Femoris, VM – Vastus Medialis, VI – Vastus Intermedius, r – right, l – left. For easy viewing, dotted diagonals highlight inter-leg (right/left) comparisons of the same muscle heads at each time point, while all other boxes are intra-leg and/or inter-head comparisons.

Figure 4: Variation of T2* mean in the individual muscle heads of all finishers with an example of T2* maps at the three MR acquisition time points relative to the race of the same subject. A P-value less than .05 indicates a significant change between two time points. Abbreviations: VL – Vastus Lateralis, RF – Rectus Femoris, VM – Vastus Medialis, VI – Vastus Intermedius.

Figure 5: Variation of T2 mean in the individual muscle heads of all finishers with an example of T2 maps at the three MR acquisition time points relative to the race of the same subject. A P-value less than .05 indicates a significant change between two time points. Abbreviations: VL – Vastus Lateralis, RF – Rectus Femoris, VM – Vastus Medialis, VI – Vastus Intermedius.

Figure 6: Variation of PDFF mean in the individual muscle heads of all finishers with an example of PDFF maps at the three acquisition time points relative to the race of the same

subject. A P-value less than .05 indicates significant changes between two time points.

Abbreviations: VL – Vastus Lateralis, RF – Rectus Femoris, VM – Vastus Medialis, VI –

Vastus Intermedius.

Figure 7: Variation of χ mean in the individual muscle heads of all finishers with an example

of χ maps at the three acquisition time points relative to the race of the same subject. A P-value

less than .05 indicates a significant change between two time points. Abbreviations: VL –

Vastus Lateralis, RF – Rectus Femoris, VM – Vastus Medialis, VI – Vastus Intermedius.

Figure 8: P-values of statistical tests in our longitudinal analysis on the blood and urinary

biomarker datasets. A P-value less than .05 indicates a significant change between two time

points.

793 **Supplemental Digital Contents**

794 SDC1.docx MR imaging acquisition parameters

795 SDC2.docx Quantitative maps computation

796 SDC3.docx Muscle segmentation

797 SDC4.docx List of 58 biological markers

798 SDC5.docx Biological data preprocessing for missing data

799 SDC6.docx Demographic data and qMRI metrics of the subject population

800 SDC7.docx Specific longitudinal T2* analysis

801 SDC8.docx Values of urinary and blood biomarkers at 4 time points

802 SDC9.docx Correlation between biological markers and image features extracted from
803 quadriceps muscles in each qMRI quantitative map