

# Relationships between the abundance of 29 proteins and several meat or carcass quality traits in two bovine muscles revealed by a combination of univariate and multivariate analyses

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#### 16 ABSTRACT

17 We aimed to evaluate the relationships between meat or carcass properties and the abundance of 29 18 proteins quantified in two muscles, Longissimus thoracis and Rectus abdominis, of Rouge des Prés 19 cows. The relative abundance of the proteins was evaluated using a high throughput immunological 20 method: the Reverse Phase Protein array. A combination of univariate and multivariate analyses has 21 shown that small HSPs (CRYAB, HSPB6), fast glycolytic metabolic and structural proteins (MYH1, 22 ENO3, ENO1, TPI1) when assayed both in RA and LT, were related to meat tenderness, marbling, 23 ultimate pH, as well as carcass fat-to-lean ratio or conformation score. In addition to some small HSP, 24 ALDH1A1 and TRIM72 contributed to the molecular signature of muscular and carcass adiposity. MYH1 25 and HSPA1A were among the top proteins related to carcass traits. We thus shortened the list to 10 26 putative biomarkers to be considered in future tools to manage both meat and carcass properties. 27 28 Key words: proteomics, beef, marbling, tenderness, ultimate pH, color, carcass properties 29 30 31 32

#### 34 **1. Introduction**

35 Since several years, genomics and especially proteomics has been used internationally to propose biomarkers of different meat quality traits [1-5]. Most of the studies compared extreme groups of 36 37 bovines divergent for a guality trait (generally low number of samples, between 5 and 20 per extreme 38 groups according to the studies). These studies have contributed to feed the first step of the 39 biomarker discovery pipeline set up for human medicine purposes [6, 7]. Thus putative biomarkers 40 of tenderness [8], marbling [9-13], ultimate pH (pHu) [14] and of color [15] have been proposed. 41 Most of the results have been obtained on Longissimus thoracis muscle that is the muscle with the 42 highest economic value for the beef industry, while few data are also available on *semitendinosus*. 43 Rectus abdominis, Psoas major, Triceps brachii, Semimembranosus or Masseter muscles [16-22].

In order to identify proteins able to discriminate or to predict not only one but at least two meat or 44 45 carcass traits, we aimed to analyse the relationships between the abundance of 29 proteins and several meat quality and carcass traits, namely tenderness, marbling, pHu, color parameters (L\*, 46 47 a\*, b\*), the carcass fat-to-lean ratio, the carcass weight and the carcass conformation. The 29 48 proteins were chosen among a compendium of proteins proposed as biomarkers of several meat 49 quality traits such as tenderness [8, 14], marbling [13], pHu and color parameters (L\*, a\*, b\*) [14, 23] or carcass traits [13], thanks to a combination of approaches, namely meta-analyses, gel-based 50 51 or gel-free proteomics and immunological detection and guantification of the proteins. To select a limited number of proteins, we have focused on proteins whose abundance were previously related 52 53 to at least two of these traits. The abundance of the 29 proteins was assayed by reverse phase 54 protein arrays (RPPA) on two muscles: Longissimus thoracis (LT) and Rectus abdominis (RA) from 48 cows from the Rouge des Prés breed (Protected Designation Origin Maine Anjou). The 55 immunological method RPPA was chosen to quantify the abundance of the 29 proteins on 48 56 muscles because this method was shown to reach a sensitivity in the ng/mg to µg/mg range of 57 58 protein abundance compatible with the expected abundances of the 29 selected candidate proteins [24]. The metabolic and contractile properties of the two muscles as well as the rearing practices of 59 60 the cows [25] and the relationship between the pHu or color traits and the abundance of 18 proteins assayed by a less automated an high throughput immunological methods [14] were first published. 61 62 From these previous results we selected 48 cows among a larger experiment in order to cover the biological variability of the meat and carcass traits known in European lean breeds. In the current 63 64 study, targeted proteomics was thus applied to LT and RA muscles in order to consider the 65 contractile and metabolic diversity of the muscles, and the relationships between the abundance of 29 proteins and both meat and carcass traits were considered. To the best of our knowledge this is 66 67 the first targeted proteomics report considering both several meat and carcass traits in order to understand the shared molecular basis and indicators of these traits of economic importance. As 68 examples of the economic impacts, meat purchasing decisions are influenced by color and 69 70 tenderness. As a result, nearly 15% of retail beef is discounted in price due to surface discoloration, 71 which was evaluated to annual revenue losses of \$1 billion in US [26]. Inconsistency in tenderness

- was repeatedly shown to affect consumers' willingness to pay for beef, with an acceptance to pay
   an average premium of \$ 1.84/lb for a tender relative to a tough steak in US [27].
- 74

# 75 2. Material and method

#### 76 2.1. Animals, muscles sampling and carcass traits

This study was conducted on 48 Rouge des Prés cows from the French PDO (Protected Designation Origin) chosen from a larger experiment previously described [25] to cover the biological variability of meat and carcass traits as illustrated by the range of values reported for each trait (Table 1). The subsets of the 48 Rouge des Prés cows [14] and the methods used to assay carcass and meat traits [25] were previously reported, and are briefly described in the current paper.

Surveys made it possible to establish the finishing practices of the cows. They were fattened for an average of 108 days (+/- 31), with a minimum of 60 days required by the PDO Maine-Anjou specifications. The finishing period was carried out indoor for all cows with a basic ration composed of hay, haylage or a mixture of both. Concentrate supplementation was on average 7.6 kg per day (+/- 2).

86 The cows were slaughtered in the industrial abattoir of ELIVIA, Le Lyon d'Angers (France). They were 87 food deprived from the day before slaughter and had free access to water. All the animals were 88 slaughtered in the same conditions, in compliance with French welfare regulations and respecting EU regulations (Council Regulation (EC) No. 1099/2009). They were stunned using captive-bolt pistol prior 89 90 to exsanguination and dressed according to standard commercial practices. The carcasses were not 91 electrically stimulated. After slaughter, carcasses were chilled and stored at 4°C until 24 h post-mortem. 92 At 24H post-mortem, the Longissimus thoracis from the sixth and seventh ribs and a Rectus abdominis were excised from the right-hand side of the carcass of each animal 24 h post-mortem and cut, 93 94 processed or sampled as explained thereafter and in [28].

95 After slaughter, the hot carcasses were weighted, and the cold carcass weight was automatically calculated by incorporating a loss of 2% on chilling according to the legislation. They were graded by a 96 97 trained classifier according to the European beef grading system (CE 1249/2008). The carcass 98 conformation was ranked according to the EUROP classification with three levels per class (+, =, -) and 99 was converted into a score value according to a conversion table (Fig. 1). The thickness of the back fat 100 was ranked according to the European classification grid: scores from 1 to 5 with three levels per class (+, =, -). All carcasses were scored between 3= and 3+. The carcass composition in fat, muscle and 101 102 bone was calculated from the dissection of the fifth rib of the carcass according to the equations 103 developed for Salers breed [29] and detailed by Couvreur et al. [25].

104 The ultimate pH (pHu) of the two muscles *Longissimus thoracis* (LT, mixed fast oxido-glycolytic muscle) 105 and the *Rectus abdominis* (RA, slow oxidative) were measured on all cows 24h post-mortem using a 106 pH meter (HI9025, Hanna Instruments Inc., Woonsocket, RI, USA) equipped with a glass electrode 107 suitable for meat penetration. The measure was realized between the sixth and seventh ribs for the LT muscle and at the center of the dorsal part of the RA muscle. The average value used for analysis wasobtained from five measurements for each cow.

110 Twenty-four hours after slaughter the two muscles were collected from the right-hand side of the carcass 111 of each animal. LT was excised between the sixth and seventh ribs and from the dorsal part. Muscle 112 samples were frozen in liquid nitrogen and stored at -80°C for the quantification of proteins and measure 113 of intramuscular fat content (IMF). Other muscle samples of LT and RA were collected 72h after 114 slaughter, were vacuum-packaged and aged for 14 days at +4 °C. Then they were frozen and stored at 115 -20 °C until analysis. These samples were used for Warner-Bratzler shear force (WBSF) measurement.

#### 116 2.2. Physico-chemical measurements on muscles

117 The WBSF was measured using a Warner-Bratzler shear device (Synergie200 texturometer) on muscle cut into steaks (20 mm thick) and placed in sealed plastic bags with a porosity of 90 µm (ROBET 118 Matériel, Champagné, France) under vacuum and kept at 4 °C for aging (14 days) before to be frozen 119 120 at -20°C. Briefly, after thawing 48h at + 4 °C, the steaks of RA and LT were placed 4h in a thermostated bath at + 18 ° C. They were then cooked using an Infragrill E (Sofraca, France) set at + 320 ° C until the 121 122 temperature at the heart of the steak reached 55 ° C. From 3 to 5 test pieces (1 \* 1 \* 4 cm) were taken 123 from the heart of the steak in the direction of the fibers and 3 to 4 repetitions per test tube were carried 124 out. A 1kN load cell and a 60mm/min crosshead speed were used (universal testing machine, MTS, 125 Synergie 200H). Peak load (N) and energy to rupture (J) of the muscle sample were determined.

126 Intra-muscular fat (IMF) content was measured using an Accelerated Solvent Extractor 200 (Dionex 127 Corporation, Sunnyvale, CA, USA) on 3 repetitions per muscle that were at 24h post-mortem, cut into 128 pieces (1-2 cm cross-section), vacuum packed, and stored at -20 °C until analysis. Briefly 1 ± 0.001 g 129 of meat powder was weighted and placed in a 22 mL extraction cell previously prepared with a cellulose 130 filter and silicon balls. The IMF was extracted with petroleum ether at a temperature of 125 °C and a 131 pressure of 103 bar. The petroleum ether containing IMF was collected and transferred in an evaporation vial previously weighted (± 0.001 g). After 15 min of evaporation, the vial was placed in a drying oven at 132 133  $105^{\circ}$ C for 17h and then weighted (± 0.001 g) to determine the amount of IMF in the meat sample.

Meat color was measured at nine locations on each muscle using a portable spectrocolorimeter (Minolta 508i, Minolta Konica, Japan) on LT and RA after a 30 min of blooming period (24h post-mortem, the day of cutting) at +4 °C [14]. The spectrocolorimeter was calibrated before measurement using its standard white calibration tile (Y = 93.58, x = 0.3150, y = 0.3217). Color coordinates were calculated in the CIELAB system: L\* (lightness), a\* (green to red color components) and b\* (blue to yellow color components). An average value of meat color was calculated from three consecutive measurements per muscle.

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142 2.3. Proteins extraction and quantification using Reverse Phase Protein Array Assay

143 All the reagents were purchased from Sigma-Aldrich, Saint Louis, USA (MO), except when 144 specified. Both sarcoplasmic and myofibrillar proteins were extracted from frozen muscle samples by crushing the samples in the "Precellys 24" tissue homogenizer (Bertin technologies, Saint Quentin-en-145 Yvelines, France) according to a method previously described [24]. Briefly, 80 mg of frozen muscle for 146 each animal sample was mixed in a buffer containing 50 mM Tris (pH 6.8), 2% SDS, 5% glycerol, 2 mM 147 148 DTT, 2.5 mM EDTA, 2.5 mM EGTA, 1x HALT Phosphatase inhibitor (Perbio 78420, Perbio Science, 149 Villebon-sur-Yvette, France), Protease inhibitor cocktail complete MINI EDTA-free (Roche, Meylan Cedex France, 1 tablet/10 mL), 2 mM Na3VO4 and 10 mM NaF. The extracts were then boiled for 10 150 151 min at 100 °C, sonicated to reduce viscosity and centrifuged 10 min at 15,000 rpm. The supernatants 152 were collected and stored at-80 °C until analysis. Protein concentrations were determined with a 153 commercial protein assay (Pierce BCA reducing agent compatible kit, Thermo Scientific, Waltham, Massachusetts, United State, ref 23252) with BSA as standard. 154

155 The RPPA technique used was adapted from Akbani et al. [30]. Extracted muscle proteins were immobilized on a solid phase with high protein binding capacity per unit area, and revealed with specific 156 157 antibodies. The antibodies used are described in Table 2. Their conditions of used and their specificity 158 in cattle muscles have been previously tested by western blot as described in Guillemin et al. [31] and in Gagaoua et al. [14]. Briefly an antibody was considered specific against a targeted protein when only 159 160 one band at the expected molecular weight was detected by western blot, and when any band were 161 observed when the first antibody was removed. Optimal dilution ratios for the first and second antibodies and according to the protein concentration were searched during routine procedures of validation and 162 163 are reported in Table 2.

164 Briefly, the extracted samples were coated onto nitrocellulose covered slides (Pierce BCA reducing agent compatible kit, Thermo Scientific, Waltham, Massachusetts, United State) using a dedicated 165 166 arrayer (Quanterix Corp., Billerica, Massachusetts, United States). Four serial dilutions, from 2000 to 250 µg/ml, and two technical replicates per dilution, were used for each sample. Arrays were labelled 167 168 with 29 specific antibodies (Table 2) or without primary antibody (negative control), using a Dako Autostainer Plus (Agilent, Santa Clara, United States). The slides were incubated with avidin, biotin and 169 peroxydase blocking reagents (Agilent, Santa Clara, United States) before saturation with TBS 170 171 containing 0.1% Tween-20 and 5% BSA (TBST-BSA). Slides were then probed overnight at 4 °C with primary antibodies diluted in TBST-BSA. After washes with TBST, slides were probed with horseradish 172 173 peroxidase-coupled secondary antibody (Jackson Immuno Research Laboratories, Newmarket, UK) diluted in TBST-BSA for 1 h at room temperature. To amplify the signal, slides were incubated with Bio-174 175 Rad Amplification Reagent for 15 min at room temperature. After washing in TBST, the slides were 176 incubated with Alexa 647-Streptavidin (Invitrogen Molecular Probes, Thermo Fisher Scientific, Waltham, Massachusetts, United States) diluted in TBST-BSA for 1 hour and washed again in TBST. For staining 177 178 of total protein, slides were incubated 15 min in 7% acetic acid and 10% methanol, rinsed twice in water, 179 incubated 10 min in Sypro Ruby (Thermo Fisher Scientific, Waltham, Massachusetts, United States) 180 and rinsed again. The processed slides were dried by centrifugation and scanned using aGenePix 181 4000B microarray scanner (Molecular Devices, San José, California, United States). Spot intensity was

182 determined with MicroVigene software (VigeneTech Inc, Carlisle, Massachusetts, Unites States). The 183 relative abundances of proteins were determined using NormaCurve [32], a SuperCurve-based method that simultaneously quantifies and normalizes RPPA data for fluorescent background per spot, a total 184 185 protein stain and potential spatial bias on the slide. Next, each RPPA slide was median centered and 186 scaled (divided by median absolute deviation). Remaining sample loading effects were corrected 187 individually for each array by correcting the dependency of the data for individual arrays on the median 188 value of each sample over all the arrays using a linear regression. The quantitative values for proteins 189 abundances in the present study ranges from -6.4 to 2 arbitrary units, and the real abundance of some of these proteins was estimated between 0.2 to 2500 ng/mg of proteins thanks to an absolute 190 191 quantification using parallel reaction monitoring (PRM) proteomics in similar samples [24].

192

#### 193 2.4. Statistical analysis

The statistical analyses were conducted using R version 4.0.2 (R Core Team, 2020). The data were examined for entry errors and outliers. Normality of data was verified with Shapiro-Wilk tests and visualized with plots. For each muscle, the abundance of the 29 proteins was described with the mean and standard deviation. Differences in protein abundance between muscles were compared with paired Student's t tests with an alpha risk of 5%.

199 To assess the potential of each biomarker of meat or carcass traits both correlation and Partial Least 200 Squares regressions were realized either for the LT or the RA muscle. The relationships between the 201 29 proteins assayed in one muscle (either LT or RA) and the quality traits (WBSF, IMF, pHu, L\*, a\*, b\*, 202 fat-to-lean ratio, carcass weight and carcass conformation score) were measured with Pearson's correlation coefficients. Carcass conformation was converted into a score value according to a 203 204 conversion table (Fig. 1, part B). Carcass conformation was thus treated as quantitative score but also 205 as qualitative levels to confirm the results: the variability between different levels of carcass conformation 206 explained by proteins were measured by ANOVA tests. The relationships were considered significant for P-value <0.05. Partial Least Squares regressions (PLS-R) were performed by quality trait to generate 207 208 explanatory models using the R package ropls [33]. The PLS model overcomes multicollinearity 209 problems and can handle a high number of variables. The components are constructed to maximize the 210 covariance between the trait and the proteins. The choice of the number of components was based on 211 the Q<sup>2</sup> criterion and permutation tests to avoid overfitting and assess the statistical significance of the models. The Variable Importance in Projection (VIP) was computed to estimate the variability of the 212 213 response explained by each protein. The mean of squared VIP values being equal to 1, the proteins 214 with a VIP >1 are usually considered as the most influential variables of the model. In this study, all the proteins for which the VIP scores were above a threshold of 1 were considered and then compared to 215 216 those selected from correlation analyses.

To illustrate global pattern, a multiple factor analysis (MFA) was performed using the R package FactoMineR [34]. MFA is an extension of PCA for data structured by groups. In the current paper, the five groups of variables analysed were: carcass characteristics, meat quality traits of both muscles, pHu and color of both muscles, LT proteins and RA proteins. This method gives equal weight to each group of variables in the construction of the components so that all groups are represented effectively in the projection. The most relevant proteins based on correlations and PLS analyses were selected to represent the groups of muscle proteins. The result is a projection of each variable onto the compromise to analyze communalities and discrepancies.

225

# 226 **3. Results**

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# 3.1. Muscle effect on the abundances of the 29 proteins

229 A muscle type effect was observed for 19 proteins among the 29 (Table 3). The most significantly 230 differentially abundant protein between the two muscles were: ENO1, ENO3, CRYAB, TNNT1, ACTA1, 231 MYH1, ALDH1A1, TRIM72, TTN, HSPA1A, PGK1, TUBA4A. Glycolytic enzymes α-enolase 1 (ENO1), 232 β-enolase 3 (ENO3) and Phosphoglycerate kinase 1 (PGK1), as well as Tripartite motif protein 72 233 (TRIM72), Myosin light chain 1/3 (MYL1), Heat Shock Protein A8 (HSPA8), Four and a half LIM domains 1 (FHL1), Superoxide dismutase (SOD1) and Titin (TTN) were the most abundant in LT (a mixed fast 234 235 oxido-glycolytic muscle), all others were the most abundant in the slow oxidative RA muscle from Rouge 236 des Prés cows.

# 3.2. Correlations and prediction of the different meat and carcass quality traits with the 29 proteins

The Variable Importance in Projection (VIP) within the PLS are shown in Fig. 2, 3 and 4 for each meat or carcass trait. The coefficient and P-Value of Pearson correlations are reported in Supplementary Tables S1 to S6. The Table 4 summarizes all the results of Pearson correlations and PLS VIPs for the 29 proteins and the different meat quality traits and carcass properties analyzed in the current paper.

243 3.2.1. Shear Force (WBSF)

Among the proteins quantified in LT, 11 proteins with a VIP value >1 were selected by the PLS 244 analysis for the prediction of WBSF values of LT muscle (Fig.2). Among these 11 proteins, ten proteins, 245 246 were also the most significantly correlated to WBSF (Supplementary Table S1). The proteins the most 247 associated (both highly correlated and with high VIP in the PLS prediction) with WBSF of LT (Table 4) were proteins involved in the glycolytic metabolism (negatively linked), mainly ENO1, but also ENO3, 248 249 PYGB and PGK1; proteins related to the fast contractile type (negatively) MYH1 and MYL1 or the slow 250 oxidative type (positively) TNNT1. Small HSPs (CRYAB and HSPB6, positively) and structural proteins 251 such as α-actinin 3 (ACTN3, negatively) were also related to WBSF of LT.

Among the proteins quantified in RA, 8 proteins were involved in the PLS prediction of the shear force (Fig.2) but 7 were not correlated to this traits. Of these, Peroxiredoxin 6 (PRDX6), was the only protein that was also positively correlated with RA WBSF (Table 4, Supplementary Table S2), and had the highest VIP, followed by glycolytic enzymes, mainly ALDOA, ENO3 and TPI1 that were positively related
to WBSF, while PYGB, the proteolytic protein µcalpain (CAPN1); the oxidative enzyme Retinal
dehydrogenase 1 (ALDH1A1) and the structural protein Tubulin alpha (TUBA4A) were negatively related
to RA WBSF.

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# 260 3.2.2. Intramuscular fat content (IMF)

Among the proteins quantified in LT, as summarized in Table 4, 8 proteins were correlated to IMF and they also had VIP > 1 (see also Supplementary Table S1, Fig.2). The proteins the most positively related to IMF were the small HSP family (CRYAB, HSPB6, DNAJA1), the oxidative enzyme ALDH1A1 and PRDX6. The proteins that were negatively related to IMF were the lipogenic enzyme malate dehydrogenase (MDH1), the structural protein ACTA1 as well as, the cell signalling Tripartite motif protein 72 (TRIM72). So, the fattest LT muscles have high cellular oxidative metabolism and consequently high abundance of small HSP and antioxidant enzymes.

Among the proteins quantified in RA, 6 proteins had a VIP value > 1 for the prediction of IMF values (Fig.2) and were also correlated with the IMF values (Table 4). The proteins the most negatively related to RA IMF were the glycolytic enzymes (ALDOA, TPI1, ENO3); while CRYAB, the lipogenic MDH1 and the slow skeletal muscle troponin T (TNNT1) were positively related to IMF values (Table 4, Supplementary Table S2). So the fattest RA, have slow oxidative properties with high abundance of small HSPs as observed for LT muscle, but also high abundance of lipogenic enzyme and low abundance of glycolytic enzyme that does not occurred in LT muscle.

275

# 276 3.2.3. Ultimate pH, pHu

Among the proteins quantified in LT, 9 proteins had a VIP >1 (Fig. 3) and were also correlated with the pHu of LT (Table 4, Supplementary Table S3). The proteins of a fast and glycolytic metabolism (MYH1, ENO3, TPI1, PGK1 and ENO3) were negatively, while protein of a slow and oxidative metabolism (TNNT1, CRYAB) were positively, related to pHu with VIP value highest than 1.5. Additionally HSPB1 and CAPN1 were also negatively related to pHu of LT (Fig. 3 and Table 4).

Ultimate pH of RA muscle was significantly correlated with 8 proteins (supplementary Table S4) which also had VIP values higher than 1 (Fig. 3 and Table 4). The proteins with the highest scores were the structural protein TTN (positively), the cell signalling protein PARK7 (negatively) and the small HSPB6 protein (positively). Other related proteins were TUBA4A, PRDX6, CRYAB (positively), ACTN3 and SOD1 (negatively) which reveals a link between oxidative stresses, slow and structural properties of the RA muscle and the pHu. We can note that CRYAB was the unique protein positively related to pHu in the 2 muscles.

289 3.2.4. Color parameters (L\*, a\*, b\*)

The Table 4 shows that few proteins are related to color parameters of LT, since 4 proteins were both correlated (Supplementary Table S3) and with a VIP value higher than 1 (Fig.3, Table 4). HSPB6 was the most associated with L\* parameter followed by CAPN1, and they were negatively related to the lightness. HSPA8 and TPI1 were positively associated to L\* parameter of LT. Only CAPN1 and TTN were significantly correlated (negatively, Supplementary Table S3) and having VIP >1 (Fig.3, Table 4) with a\* parameter of LT. For the b\* parameter, the most related proteins were HSPA8 and SOD1 (positively, Fig.3, Table 4, Supplementary Table S3).

297 Among the proteins quantified in RA, 7 proteins were both correlated (Supplementary Table S4) and with a VIP value higher than 1 (Fig.3, Table 4) when the L\* parameter was considered. Glycolytic 298 299 enzymes such as TPI1, ENO3, PYGB, PGK1 and fast glycolytic MYH1, as well as structural proteins, namely ACTA1 and ACTN2 were positively associated with L\* parameter of RA. Parameters a\* and b\* 300 of RA were globally associated (both correlated and with VIP values higher than 1) with the same 301 proteins: mainly TTN, TUBA4A and PYGB that were positively, while HSPB1, DNAJA1 and MYL1 were 302 303 negatively, linked with these parameters (Fig.3, Table 4, Supplementary Table S4). In RA muscle, 304 interestingly PYGB was related positively with the 3 color parameters. When the 2 muscles were 305 considered, TPI1 was positively linked to the L\* parameters in both the LT and RA, while TTN was the 306 unique protein linked to a \*and b\* parameters, however in an opposite direction; negatively in RA and 307 positively in LT.

308 3.2.5. Carcass fat-to-lean ratio

Of the 29 proteins quantified, 13 proteins assayed in the LT or RA were both correlated to the 309 310 carcass fat-to-muscle and had a VIP value higher than 1 (Fig.4, Table 4, Supplementary Table S5). Of 311 these, 4 proteins quantified in LT and RA were related to the carcass fat-to-muscle: CRYAB and 312 ALDH1A1 were positively, while MYH1 and TRIM72 were negatively linked to this carcass trait. In 313 addition, of the proteins guantified in the LT muscle, HSPA8 and MDH1 were negatively, while HSPB6 314 PRDX6 and ACTN2 were positively, associated with the carcass fat-to-muscle ratio. When assayed in 315 RA muscle, HSPA1A and TNNT1 were positively, while glycolytic enzymes ENO3 and PGK1, were 316 negatively associated with the fat-to-muscle ratio (Fig.4, Table 4, Supplementary Table S6).

317

# 318 3.2.6. Carcass weight

HSPA1A was the only protein positively related (both significantly correlated and with a VIP value >1)
to the carcass weight when assayed both in LT and RA (Fig.4, Table 4, Supplementary Tables S5 and
S6). In addition, when assayed in LT, PARK7 was positively, while CAPN1 was negatively, linked to the
carcass weight.

323

324 3.2.7. Carcass conformation

MYH1 assayed both in LT and RA was the only protein positively related (both correlated and with 325 326 a VIP >1) to carcass conformation (Fig.4, Table 4, Supplementary Tables S5 and S6). So, the Rouge 327 des Prés cows with the highest abundance of MYH1 in LT and RA, also have the highest conformation 328 score within this population. Measured in RA muscle, this protein explained alone 24% of the variability 329 of carcass conformation (P-Value = 0.001, Fig. 1). Moreover, when assayed in LT, the structural proteins 330 ACTN2 and HSPB6 were positively and negatively related to the carcass conformation. In RA muscle, 331 the abundance of ACTN3 and ENO3, a glycolytic metabolic and structural protein, were positively linked 332 to carcass conformation of Rouge des Prés cows.

#### 333

#### 3.3. Integrative views of proteins the most frequently associated with meat or carcass traits

The principal relationships were evaluated by a MFA method (Fig. 5), that was complemented by 334 335 summing the number of occurrences linking a protein to a trait (Table 4). Cows that are characterized 336 by high abundances of proteins related to fast and glycolytic metabolic and contractile properties, 337 namely ENO1, ENO3, TPI1, PGK1, MYH1 measured in the two muscles also have a high carcass conformation and weight, low WBSF and pHu of LT, and low IMF values in RA and LT. These cows 338 339 were also characterized by low abundances of ALDH1A1, HSPB6 and CRYAB in the two muscles. So, 340 this indicates that the Rouge des Prés cows with the highest muscular glycolytic metabolism are 341 characterized by the highest carcass conformation scores and weight as well as tenderness (lowest 342 toughness/WBSF) at least in LT, which is particularly interesting for the economical value of the 343 carcasses. They have also the lowest pHu, fat-to-muscle ratio of the carcass, muscular IMF, and the 344 highest L\* color values for the two muscles. All these carcass and meat properties are strongly related to a molecular signature composed of 7 proteins with 2 abundances profiles : MYH1, ENO1, ENO3, 345 346 TIP1 with the highest abundances and ALDH1A1, HSBP6, CRYAB with the lowest abundances when 347 the tenderness of LT and the carcass weight and conformation are high. High values of WBSF and phU of LT are mainly associated with high abundance of CRYAB, HSPB6, ALDH1A1 assayed both in RA 348 349 and LT muscle. The proteins the most positively related to adiposity of muscles and carcass were 350 CRYAB and HSPB6 of the two muscles. The present results thus illustrated that, both multivariate (MFA, 351 PLS) and univariate (correlation) analyses suggest that HSPB6, CRYAB, ALDH1A1, MYH1, ENO3, 352 ENO1, TPI1 are the most strongly related to both carcass and muscle traits. Moreover, the projection of 353 these proteins on the MFA plot confirms their central role (Fig. 5).

354

# 355 **4. Discussion**

One of the final objectives of this work was to gain insight the genericity of biomarkers, i.e. proteins able to discriminate, or to predict, several meat and carcass traits, which could be integrated into a phenotyping tool for the beef industry. The current study is one of the first depicting the relationships between the abundance of muscular proteins and traits related both to meat and carcass qualities. As expected and as a certificate of the reliability of protein quantification, the protein abundances reported in the current study signed the metabolic and contractile properties of the two muscles. Indeed, the lower abundance of MYH1 in LT than in RA, is in accordance with the two times less IIX fibres in LT than RA

in Rouge des Prés cows [25]. Moreover, oxidative activity such as isocitrate dehydrogenase was 363 364 previously reported higher in RA comparatively to LT [25], in accordance with the present results showing higher abundance of proteins from slow oxidative type such as TNNT1, CRYAB, ALDH1A1 in 365 RA than in LT. Structural proteins such as TUB4A4, ACTA1, ACTN2, were significantly more abundant 366 367 in RA than in LT, which is coherent with the higher cross sectional area of this muscle comparatively to LT (3599 µm2 in RA versus 2910 in LT; [25]). Lastly, 7 of the 29 investigated proteins were related to 368 369 the meat and carcass trait which will be discussed with an emphasis on small HSP (HSP20, CRYAB) and glycolytic proteins (MYH1, ENO3, ENO1, PYGB, TPI1) that are the top proteins as ranked in Table 370 371 4. Additionnally, ALDH1A1 and TRIM72 were more mainly related to the muscular and carcass 372 adiposities, and HSP1A1 to the carcass traits.

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# 4.1. Opposite relationships of small HSPs and glycolytic proteins are a molecular signature of both meat and carcass traits

In the current study, positive relationships between the abundances of HSPB6 or CRYAB assayed in RA or LT, and toughness of LT, IMF or pH of these two muscles or the fat-to-lean ratio of the carcass, were concomitant to negative relationships between these traits and the abundances of proteins related to fast glycolytic fibres and glycolytic metabolisms, namely MYH1, ENO3, ENO1, PYGB and TPI1. The current results are in agreement with several studies related to meat tenderness or marbling, however few results are available regarding the fat-to-lean ratio of the carcass, which illustrates the originality of the present work.

383 The current relationships between HSPB6 or CRYAB and meat gualities are consistent with previous 384 studies on tenderness [8], marbling [13], pHu [23, 35] and color [36]. Indeed, CRYAB and HSP20 385 abundances assayed either by non-targeted and targeted proteomics were already linked to the LT 386 toughness/tenderness, pHu, lightness of muscle [14-16, 23] of several breeds. Small Heat Shock Proteins (sHSP) belonging to a large group of chaperone proteins, are abundant in skeletal muscle, and 387 388 were proposed as implicated in the apoptotic processes in post mortem muscle that consequently affect 389 meat quality [35, 37, 38]. They are synthesised to prevent unnecessary apoptosis, to preserve cellular 390 proteins against proteolytic degradation, and thus attempt to maintain cell homeostasis. Recently, 391 Malheiros et al. [39] showed that CRYAB and HSPB6 oxidative damage assayed as the carbonylation 392 of CRYAB and HSPB6, are increased in tender LT from Angus (while the opposite was observed for the 393 glycolytic proteins ENO3 and TPI1). These authors proposed that a lower oxidative damage of HSPs in 394 tough meat could protect myofibrillar protein against the proteolysis, which contributes negatively to the 395 beef tenderness. All these results thus suggest a functional role of CRYAB and HSPB6 to the process 396 of meat tenderisation.

397 Elsewhere, HSPB6 and CRYAB concentrations were reported to be modified during *post mortem* ageing 398 of LD from bull sampled in a New Zealand commercial abattoir [35] or in Angus cross bulls [37], with 399 either positive and negative relationships observed. However, such relationships were not observed in 400 Charolais [40] or Blonde d'Aquitaine [23] young bulls. HSPB6 and CRYAB, were also among the HSP that were identified to be negatively associated with lightness (L\*) in LT of several breeds as previously
 reviewed [36], and as in the present study.

403 In Rouge des Prés cows, higher abundance of CRYAB and HSPB6 were recorded in the highest 404 marbled LT when gel-based and gel-free proteomic analyses were done [13], which is thus confirmed 405 by targeted quantitative proteomics in the current study. We previously proposed [13] that high abundance of CRYAB may sustain the high oxidative metabolism of highly marbled muscles, as it is 406 407 suggested by higher abundance of CRYAB in oxidative compared to glycolytic muscles [41] and with 408 the role of CRYAB in mitochondrial homeostasis and mitoprotection [42]. Moreover, the current study 409 also confirms that high muscular (both in LT and RA) abundance of CRYAB is found in Rouge des Prés 410 cows with high level of fat in the carcass, as previously shown by semi-quantitative proteomics methods 411 [13]. These results are original in bovine, and are consistent with a positive association reported in 412 human models between CRYAB expression in adipose tissue, body mass index and increased levels 413 during adipogenesis [43]. Conversely, we are the first to report a positive relationship between HSPB6 414 and the fat proportion of bovine carcass. However, a role of HSPB6 in mediating adipocyte function by 415 linking β-adrenergic signalling to PPARγ activity as a negative regulator of adipocyte function was 416 reported in KO mice [44]. Our present results, together with a differential abundance of small HSP, 417 namely HSPB1 and CRYAB in LT from various Canada Beef Grade categories, suggest an involvement 418 of these proteins within the overall meat qualities [45].

The HSPB6 and CRYAB molecular signature of meat WBSF, IMF and carcass adiposity is complemented by a negative relationships between proteins related to glycolytic metabolism and these traits. The myosin heavy chain isoform MYH1 (MyHC IIX protein) is expressed in fast glycolytic fibres, and its abundance in RA or LT muscle of Rouge des Prés cows, was positively associated with carcass conformation score, negatively with carcass fat-to-lean ratio, negatively with shear force (positively with tenderness) of LT muscle, negatively with pHu of LT, positively with lightness of RA.

425 MYH1 has been found associated with tenderness in many studies, but with different direction according 426 to the muscle [46], the animal type, the gender and breed [8]. The results of the present study confirm 427 a positive relationship between the abundance MYH1 and tenderness (negative when WBSF is considered) in the LT of Rouge des Prés cows as already showed by Couvreur et al. [25] using 428 429 electrophoresis, and Gagaoua et al. [14] using dot-blot, for MYH1 quantification. The direction of this relation, is similar to that observed in Angus breed characterized as Rouge des Prés, by muscles with 430 431 more slow oxidative fibres than other French beef breeds, in which the relation between MYH1 and 432 tenderness was negative [46]. The LT muscle of Rouge des Prés has a specific composition of muscle 433 fibres, as it contains few or no IIX fibres [25]. So, our results indicate that when the LT muscle from a 434 breed with slow oxidative muscles contains high proportion of IIX fibres and high intramuscular fat 435 content as observed in Rouge des Prés cows, its tenderness would be higher as already suggested by 436 Picard et al [46]. The negative relationships of MYH1 with IMF is consistent with the literature, clearly 437 identifying MYH1 as a negative biomarker of IMF and fat carcass in different breeds [4]. The relationships 438 with pHu and with color parameters are also consistent with other studies [15, 23, 40]. A relationship 439 between MYH1 proportion and muscle mass has been described in the literature [16, 47] in coherence

with the higher carcass conformation and with the negative relation with fat-to-muscle ratio of thecarcass observed in the current study.

442 Of the proteins related to the glycolytic metabolism, 3 proteins involved in the glycolysis were found to 443 be among the top proteins linked with both meat and carcass traits: ENO3, ENO1 and TPI1. ENO3 and 444 ENO1 are two isoforms of the enolase catalysing the reversible conversion of 2-phosphoglycerate to phosphoenolpyruvate in glycolysis, and their abundances are positively correlated with the abundance 445 446 of MYH1 [48]. The abundance of ENO3 in RA was positively associated with carcass conformation 447 score, negatively with carcass fat-to-lean ratio, negatively with IMF of RA, and positively with lightness 448 of RA. When assayed in LT, ENO3 was associated negatively with shear force (positively with 449 tenderness) and with pHu of LT. In coherence with our results, this glycolytic enzyme was found associated with meat quality and carcass traits namely, tenderness in 11 studies listed in a meta-450 451 analysis [8]; color in 8 [36] to 10 [2] studies reviewed recently, pHu [23], marbling and carcass adiposity 452 [13]. ENO3 was proposed as a robust biomarker of color parameters whatever the muscle, probably 453 due to its role in glucose metabolism and cellular protection under hypoxic conditions [36]. Indeed, ENO3 454 is mainly expressed in adult skeletal muscle cells and was described to have an important role in glucose 455 metabolism and cell protection under hypoxic conditions [49, 50]. Lastly, in the present study, the abundance of ENO3 but also of TPI1 and PGK1 were related to color parameters of RA and LT muscle, 456 457 in agreement with the glycolytic pathway proposed to be a top pathways involved in bovine meat color [2]. These data are coherent with a high involvement of ENO3 during post-mortem modification of 458 459 muscle into meat under hypoxic conditions.

460 Comparatively to ENO3 and MYH1, ENO1 was weakly related to carcass properties, and could be rather 461 considered as a biomarker of meat qualities: tenderness and pHu in LT muscle and color in RA. ENO1 462 appeared particularly important for LT quality as the VIP value was the highest in the prediction of LT 463 WBSF. This result is coherent with previous data indicating a high role of ENO1 in LT tenderness [31] 464 and its association with tenderness in a meta-analysis [8]. Thus the relationships of ENO3 and ENO1 465 with meat quality or carcass traits could be explained by the fact that ENO1 has the particularity to be involved in more than one function depending on its cellular and extracellular localization [51]. In addition 466 467 to its glycolytic activity, ENO1 displays non-glycolytic functions such as cell surface plasminogen 468 binding, maintenance of the mitochondrial membrane stability, transcriptional repressor activity in the nucleus, as well as chaperon and vacuole fusion activity in the cytoplasm [51]. It was described in the 469 470 literature to be involved in adaptive response of cells to hypoxia. Consequently, its expression should be highly modified post-mortem during the transformation of muscle into meat under hypoxic conditions. 471 472 Thus, the current results highlight that glycolytic proteins are positively related to the carcass 473 conformation and thus logically negatively related to the fat-to-lean ratio of the carcass, as well as to the 474 marbling of the oxidative RA, and the WBSF mainly of LT.

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- 476 477

4.2. In addition to small HSPs and glycolytic enzymes, ALDH1A1 and TRIM 72 signed both muscular and carcass adiposities

478 The current results confirm the links that we previously hypothesized between CRYAB or 479 ALDH1A1 assayed in LT, and both muscular and carcass adiposities in groups of bovine extreme for 480 these traits [13]. Indeed, in the current study ALDH1A1 assayed both in RA and LT was positively linked 481 to the fat-to-lean ratio of the carcass as well as to the IMF in LT, mainly as CRYAB. ALDH1A1 is a retinal 482 dehydrogenase that irreversibly oxidizes retinaldehyde to retinoic acid [52]. Retinoic acid stimulates, 483 whereas retinaldehyde inhibits lipid deposition in human adipose-derived stem cells [52], which is 484 consistent with the positive relationship between the abundance of ALDH1A1 and lipid deposition both 485 at the muscular and body level. We may also speculate that an ALDH1A1-mediated increase in retinoic 486 acid content has contributed to the increase in the abundance of CRYAB, which is a retinoic acid-487 responsive gene [52]. The higher abundance of CRYAB may sustain the higher oxidative metabolism 488 of highly marbled muscle, which agrees with the higher abundance of both ALDH1A1 and CRYAB in 489 oxidative compared to glycolytic muscles [41]. As an original result, we report for the first time a negative 490 link between TRIM 72 assayed both in RA and LT and the fat-to-lean ratio of the carcass as well as to 491 the IMF content of LT. TRIM 72 is a muscle-specific mitsugumin 53 that mediates the ubiquitin-492 dependent degradation of the insulin receptor and insulin receptor substrate 1, comprising a central 493 mechanism controlling insulin signal strength in skeletal muscle [53]. The scarce results linking TRIM72 494 and adiposity were obtained in mice models of metabolic syndrome, showing a central role of TRIM72 495 in alleviating insulin resistance [54, 55]. More specifically, low abundances of TRIM72 were concomitant 496 to high level of the muscular glucose transporters GLUT4, which suggested an increase in glucose 497 utilisation in the skeletal muscle, an improvement in systemic insulin sensitivity and a therefore driving 498 less postprandial glucose into hepatic lipogenesis in mice [54]. Whether low abundance of TRIM72 in 499 bovine muscle contributes to maintain high muscle insulin signaling promoting glucose uptake in muscle 500 rather than adipose tissue warrants further investigation. However such TRIM72-mediated insulin 501 sensitivity may be consistent with the higher use of glucose rather than acetate for triglycerides synthesis 502 when intramuscular and body fats are compared [56, 57]. However, this putative pathway may explain the positive link between fast/glycolytic proteins, mainly MYH1 but also ENO3, ENO1 and TPI and the 503 504 carcass conformation score that grades the muscle mass, while these proteins have a negative link with the fat proportion in the carcass. All these results provide a new evidence for developmental and 505 506 functional links between muscle and adipose tissue repeatedly reviewed [58-60] and that highlights the 507 balance in nutrient partitioning and thus a priority in the growth and deposition of these two tissues.

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# 4.3. HSP1A1 is positively related to all the carcass traits

510 Interestingly, HSP1A1 measured in RA and LT muscles was related positively with carcass weight, 511 but also to the fat-to-lean ratio when assayed in RA. Relationships between HSP1A1 and carcass 512 properties were also reported in Blonde d'Aquitaine, Limousine and Angus bulls [61]. Moreover, within 513 a larger population of Rouge des Prés cows, negative and positive correlations between the abundance 514 of HSP1A1 in LT and the carcass conformation score or the fat carcass weight were reported [28], which 515 points out the relation between HSP1A1 abundance in muscle and the carcass adiposity. In humans, 516 there are at least 13 different genes that encode for distinct Hsp70 proteins, but which share a common 517 domain structure. Of these are the stress-inducible Hsp70 family members encoded for by the HSPA1A 518 and HSPA1B genes and whose protein products differ by only two amino acids. Due to inconsistencies in nomenclature, the proteins produced by these genes are referred to several different names as simply 519 HSP70, or more commonly in the muscle literature, as HSP72 [62]. Several evidences in models of 520 521 muscle damage and regeneration demonstrate that the inducible HSP70 is a critical skeletal muscle 522 protein that positively regulates muscle size [62]. Even in non-stressed mice, the increase in muscle 523 hypertrophy was paralleled by an increase in HSP72 abundance in the muscle [63], which is consistent 524 with the current positive relationship with the carcass weight strongly dependent of the muscle mass. Moreover, HSP70 was also shown to play a role in osteogenesis by upregulating the expression of 525 526 osteogenic genes [64]. Consequently, HSP70 could be associated with carcass traits through an 527 involvement in muscle and skeletal development.

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# 529 **5. Conclusion**

530 With the final aim of developing a molecular test to phenotype meat and carcass traits of economics importance for the beef industry, two main questions must be answered: the muscle to be sampled and 531 532 a short list of molecules to assay. The current study provides answers to these questions. Compare to 533 the LT, proteins measured in RA are poorly related to shear force of this muscle suggesting that in this 534 muscle the tenderness is related to other characteristics, while the current assayed proteins are strongly 535 related to color parameters. Consequently, we can exclude the use of RA muscle in the future to predict 536 the whole quality of meat and carcass. However, LT muscle has the highest economic value in the 537 carcass, therefore the sampling of this muscle to assess the overall quality of the carcass would lead to 538 economic loss. Secondly, we have shortened the list from 29 to 10 proteins that remain to be quantified 539 in a large population in order to assess the relationship between their abundance and the meat and 540 carcass traits, in a perspective of prediction model establishment. So, future works should focus on the 541 choice of one muscle which can be sampled at slaughter without too much economic loss to quantify the proteins associated with the qualities of meat and carcass. They will also be focused on a tools that 542 543 quantify protein in a reliable, cost-effective and non-destructive way, as well as in reducing the hands-544 on steps. Several quantitative methods based on immunoassays or mass spectrometry have been 545 already implemented for human medicine [7], existing biosensors were recently reviewed [1], and the 546 remaining step is to simplify the muscular protein extraction, probably using devices as those produced 547 for plasma proteins [65].

#### 548 Author contributions

- 549 **Brigitte Picard:** Conceptualization, Funding acquisition, Project administration, Writing original draft.
- 550 **Arnaud Cougoul**: Data curation; Formal analysis, Visualization, Writing review & Editing.
- 551 **Sébastien Couvreur**: Funding acquisition, Project administration, Writing review & Editing.

552 Muriel Bonnet: Conceptualization, Investigation, Methodology, Validation, Visualization, Writing -

553 original draft.

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### 555 Declaration of Competing Interest

556 Authors declare no conflict of interests.

557

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An Innovative Microfluidic Device for Bedside Whole Blood Processing before Plasma ProteomicsAnalyses, Anal. Chem. 93(2) (2021) 683-690.

# 749 **Table 1**

750	Means, standard deviation	(SD)	)) as well as minimal and maximal values for the carcass and meat t	traits
150	wicans, standard deviation	(JD)		lanco

751

Traits	Mean	SD	Minimal	Maximal				
			value	value				
LT muscle traits								
WBSF, N/cm2	46.93	13.85	24.58	82.51				
IMF, g/100g DM	4.73	2.42	1.60	13.82				
Ultimate pH	5.60	0.11	5.34	5.89				
Lightness, L*	39.85	2.20	34.36	43.99				
Redness a*	8.96	1.26	6.64	11.77				
Yellowness, b*	6.88	1.39	4.02	10.61				
RA muscle traits								
WBSF, N/cm2	53.43	13.65	38.60	125.48				
IMF, g/100g DM	5.33	2.67	1.28	12.31				
Ultimate pH	5.73	0.14	5.46	6.08				
Lightness, L*	39.56	1.93	33.60	43.06				
Redness a*	6.07	1.03	3.95	8.95				
Yellowness, b*	4.49	0.91	2.45	6.50				
Carcass traits								
Fat-to-lean ratio, %	0.31	0.10	0.17	0.55				
Carcass weight, kg	434.40	29.54	381	553				
Conformation score	4.79	0.77	4	6				

752

753 LT: Longissimus thoracis, RA: Rectus abdominis, WBSF: Warner Bratzler Shear Force that is the toughness of the

754 meat, IMF: Intramuscular fat content that is the marbling of the meat, color parameters **a**\* (green to red color

components) and **b**\* (blue to yellow color components). Color was assayed after 30 min of blooming period

756 (24h post-mortem, the day of cutting). Conformation Scores (E.U.R.O.P.) are ordinal data which have been

treated as quantitative data, the table of conversion used is indicated in the Fig. 1.

# 758 Table 2

List of the antibodies (reference and dilution) used to quantify the 29 protein biomarkers using theReverse Phase Protein Array (RPPA) method.

Protein biomarkers name (gene)	Uniprot ID	Monoclonal (Mo) or Polyclonal (Po) antibodies references	Antibody dilutions		
Metabolic enzymes					
Malate dehydrogenase (MDH1)	P40925	Mo. anti-pig Rockland 100-601-145	1/1000		
α-enolase 1 (ENO1)	Q9XSJ4	Po. anti-humanAcris BP07	1/20 000		
β-enolase 3 ( <i>ENO3</i> )	P13929	Mo. anti-human Abnova Eno3 (M01), clone 5D1	1/30 000		
Retinal dehydrogenase 1 (ALDH1A1)	P48644	Po. anti-bovine Abcam ab23375	1/500		
Triosephosphate isomerase (TPI1)	Q5E956	Po. anti-human Novus NBP1-31470	1/50 000		
Phosphoglycerate kinase 1 (PGK1)	Q3T0P6	Po. anti-human Abcam ab90787	1/5000		
Fructose-bisphosphate aldolase (ALDOA)	A6QLL8	Po. anti-human Sigma AV48130	1/4000		
Glycogen phosphorylase (PYGB)	Q3B7M9	Po. anti-human Santa Cruz SC-46347	1/250		
Heat shock proteins					
αB-crystallin ( <i>CRYAB</i> )	P02511	Mo. anti-bovine Assay Designs SPA-222	1/1000		
Hsp20 ( <i>HSPB6</i> )	014558	Mo. anti-human Santa Cruz HSP20-11:SC51955	1/500		
Hsp27 ( <i>HSPB1</i> )	P04792	Mo. anti-human Santa Cruz HSP27 (F-4):SC13132	1/3000		
Hsp40 ( <i>DNAJA1</i> )	P31689	Mo. anti-human Santa Cruz HSP40-4 (SPM251):SC-56400	1/250		
Hsp70-1A ( <i>HSPA1A</i> )	Q27975	Mo. anti-human RD Systems MAB1663	1/1000		
Hsp70-8 ( <i>HSPA8</i> )	P11142	Mo. anti-bovine Santa Cruz HSC70 (BRM22):SC- 59572	1/250		
Oxidative proteins					
Peroxiredoxin 6 ( <i>PRDX6</i> )	P30041	Mo. anti-human Abnova PRDX6 (M01), clone 3A10-2A11	1/500		
Protein deglycase DJ-1(PARK7)	Q99497	Po. anti-human Santa Cruz DJ-1 (FL-189):SC-32874	1/4000		
Superoxide dismutase [Cu-Zn](SOD1)	P00441	Po. anti-rat Acris SOD1 APO3021PU-N	1/1000		
Structural proteins					
α-actin ( <i>ACTA1</i> )	P68133	Mo. anti-Rabbit Santa Cruz α-actin (5C5):SC- 58670	1/1000		
α-actinin 2 ( <i>ACTN2</i> )	P35609	Po. anti-human Sigma SAB2100039	1/10 000		

α-actinin 3 (ACTN3)	Q01119	Po. anti-human Sigma SAB2100040	1/10 000
Myosin light chain 1/3, MLC-1F (MYL1)	P05976	Po. anti-human Abnova MYL1 (A01)	1/1000
Myosin heavy chain-I (MYH7)	P12883	Mo anti-bovine Biocytex 5B9	1/1000
Myosin heavy chain-IIx (MYH1)	P12882	Mo anti-bovine Biocytex 8F4	1/500
Troponin T, slow skeletal muscle ( <i>TNNT1</i> )	Q8MKH6	Po. anti-human Sigma SAB2102501	1/4000
Titin ( <i>TTN</i> )	Q8WZ42	Mo. anti-human Novocastra NCL-TITIN	1/100
Tubulin alpha-4A chain (TUBA4A)	P81948	Mo anti-human Sigma T6074	1/1000
Cell death, protein binding and proteo	olysis		
Tripartite motif protein 72 (TRIM72)	E1BE77	Po. anti-human Sigma SAB2102571	1/2000
Four and a half LIM domains 1 (FHL1)	Q3T173	Po. anti-human Sigma AV34378	1/5000
μ-calpain ( <i>CAPN1</i> )	P07384	Mo. anti-bovine Alexis $\mu$ -calpain 9A4H8D3	1/500

# 767 Table 3

768 Muscle effect on the abundance of the 29 proteins. Means and standard deviations (SD) were 769 reported. Differences between the two muscles were measured by paired Student t-tests. The 770 intensity of the gray color is decreasing according to the level of significance.

	LT		R/	4	Differenc	e RA - LT	Student test
protein	mean	sd	mean	sd	estimated	standard error	p-value
TTN	0.00089	0.4	-1.6	0.57	-1.6	0.092	< .001
TNNT1	0.24	0.51	0.87	0.44	0.64	0.093	< .001
ENO3	0.11	0.67	-0.4	0.56	-0.52	0.1	< .001
ALDH1A1	0.28	0.67	0.77	0.56	0.49	0.1	< .001
ACTA1	0.18	0.5	0.58	0.37	0.4	0.084	< .001
ENO1	0.022	0.6	-0.36	0.41	-0.38	0.082	< .001
TRIM72	-0.25	0.52	-0.63	0.44	-0.37	0.091	< .001
MYH1	-0.56	0.72	-0.15	0.48	0.41	0.1	< .001
CRYAB	0.44	0.67	0.77	0.69	0.33	0.087	< .001
HSPA1A	0.015	1.4	0.29	1.1	0.28	0.094	.005
PGK1	-0.24	0.62	-0.53	0.5	-0.29	0.1	.006
TUBA4A	-0.26	1.4	0.33	0.41	0.58	0.21	.008
HSPB1	0.61	0.4	0.8	0.42	0.19	0.074	.013
MYL1	0.029	0.58	-0.26	0.66	-0.29	0.11	.016
HSPA8	0.11	0.49	-0.12	0.43	-0.23	0.092	.016
FHL1	0.12	0.58	-0.13	0.53	-0.25	0.11	.023
SOD1	0.26	0.52	0.045	0.51	-0.22	0.094	.027
PRDX6	0.023	0.51	0.25	0.7	0.23	0.1	.029
ACTIN2	0.076	0.78	0.46	1	0.38	0.18	.042
DNAJA1	-0.0078	0.61	0.18	0.62	0.19	0.1	.072
MYH7	-0.031	0.67	-0.21	0.64	-0.17	0.096	.075
TPI1	-0.087	0.48	-0.21	0.54	-0.13	0.088	.159
PYGB	-0.47	0.58	-0.33	0.61	0.15	0.11	.191
ALDOA	-0.12	0.53	-0.27	0.55	-0.15	0.11	.207
CAPN1	0.095	0.47	0.2	0.45	0.1	0.091	.259
MDH1	-0.24	0.43	-0.15	0.53	0.095	0.092	.311
ACTIN3	0.15	0.61	0.23	0.62	0.08	0.12	.494
HSPB6	0.64	0.7	0.7	0.58	0.059	0.092	.523
PARK7	-0.22	0.57	-0.2	0.57	0.018	0.11	.867

#### 773 **Table 4**

772

# 574 Synthesis of the results of Pearson correlation and PLS VIP for the 30 proteins measured in LT and RA, and all the meat quality traits and carcass

**properties analysed.** The positive relationships are in blue, and the negative in orange. The intensity of the color is proportional to the level of the

relationship. The stars indicate the level of significance for the correlations: \*\*\* <.001, \*\* <.01, \* <.05, . <.1 and level of VIP for the PLS: \*\*\* VIP >2, \*\* VIP

777 >1.6, \* VIP >1.2, . VIP >1. #Σp: highlights the sum of correlations, p-values <.1 or VIP values >1 between between a protein and the trait analyzed in order to

rank the top proteins.

		WB	SF			IN	ИF			pl	Hu			L	*			a	<b>1</b> *			b	)*		Fat	t-to-le	ean ra	atio	Ca	rcass	weig	ht	t Conformation score				
Protein	L	.T	R	A	L	T	F	RA	L	T	R	A	I	Т	F	RA	L	Т	R	A	L	LT	R	A	L	T	R	A	Ľ	Т	R	A	Ľ	Т	R	A	.#Σn
1 rotein	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	corr	PLS	
MDH1					- *	- **	+**	+ ***	:	1								+ *		1		+ *			- ***	- **											8
ENO1	- **	- **							- **	- **						+.		+ *	- *	- *		+ *		- *												+*	13
ENO3				+ **				- *	- *	- *					+ *	+ *		+ *										- *							+.	+*	15
ALDH1A1				- *	+ **	+ **																		+.	+ **	+ *	+ *	+ **									9
TPI1				+ **				- *	- **	- **			+.	+ **	+ **	+ ***																				+*	12
PGK1	- *	- *						- *	- *	- *					+.	+ *																					9
ALDOA				+ **			- *	- **																													4
PYGB		- *						+.				+.			+.	+.			+ *	+ *			+ *	+ **						- *		+ *					13
CRYAB	+ **	+ **			+ **	+ ***	+.	+ *	+ **	+ **	+.	+ *		- *											+ ***	+ **	+ ***	+ ***									15
HSPB6	+*	+ *			+*	+ *		+.			+ *	+ *	- **	- ***											+ *	+ *		+.				+ **		- **			17
HSPB1								+.	+ *	+ *		+.											- *	- *						- *							10
DNAJA1					+ **	+ **																	- *	- *	+.					+ *		+ *				+.	10
HSPA1A																								- *			+.	+ *	+ *	+ ***	+ *	+ ***		+ *			9
HSPA8													+.	+ **							+.	+ **															6
PRDX6			+.	+ ***	+.	+ *		- *			+.	+ *								+.		- *			+ *	+.				+.							12
PARK7											- *	- **						+ *				+ *							+ *	+ **				+ *			10
SOD1												- *						+ **			+ *	+ ***								+ *							7
ACTA1															+ **	+ ***		- *															+ *	+ ***		+*	9
ACTIN2															+ *	+ *									+*	+.								- *		+.	8
ACTIN3	- *	- *										- *		+ *		+.						+ *												+ **	+.	+*	10
MYL1	- *	- *																		- *				- *													6
MYH7																		+.												- *							3
MYH1	- **	- **							- **	- **					+ *	+ **								+.	- *		- *	- **				+.	+.	+ **	+ ***	+ ***	16
TNNT1	+ *	+ *					+.	+ *	+ **	+ **		+ *															+ **	+ ***				+ **					10
TTN								+.			+ **	+ ***		- *				- **	+ ***	+ ***		- *	+ **	+ ***												+.	12
TUBA4A				- *							+.	+ *							+ *	+ **			+.	+ *				+.				+ **					10
TRIM72					- *	- *																			- ***	- **								+ *			7
FHL1																		- *	+*	+ **		- *		+.													5
CAPN1				+ **					+ *	+ *				- **			- *	- ***				- *							- *	- ***							11

Fig. 1. A. MYH1 abundance assayed in the RA muscle of Rouge des Prés cows according to three grades of carcass conformation. B. The carcass conformation
 was ranked according to the EUROP classification with three levels per class (+, =, -) and was converted into a score value according to a conversion table in
 fifteen grades. A conformation score of 4, 5 and 6 corresponds to a EUROP conformation of O-, O = and O + respectively. C. Differences in MYH1 abundance
 between two grades of carcass conformation.



С

Conformation grades	MYH1 abundance difference	P- value
5 - 4	0.32	0.056
6 - 4	0.62	0.001
6 - 5	0.30	0.184

Fig. 2. Proteins Variable Importance in Projection (VIP) in PLS regressions of Warner-Bratzler shear force (WBSF) and intramuscular fat (IMF) for the two
 muscles *Longissimus thoracis* (LT) and *Rectus abdominis* (RA). The protein VIP have been ranked in descending order of VIP. Proteins with a positive effect
 on the meat traits are shown in blue and those with negative effect in red.



Fig. 3. Proteins Variable Importance in Projection (VIP) in PLS regressions of pHu, L\*, a, b color parameters for the two muscles *Longissimus thoracis* (LT) and
 *Rectus abdominis* (RA). The protein VIP have been ranked in descending order of VIP. Proteins with a positive effect on the meat traits are shown in blue and

those with negative effect in red



Fig. 4. Proteins Variable Importance in Projection (VIP) in PLS regressions of carcass fat-to-lean ratio, weight and conformation score for the two muscles 796

Longissimus thoracis (LT) and Rectus abdominis (RA). The protein VIP have been ranked in descending order of VIP. Proteins with a positive effect on the 797

meat traits are shown in blue and those with negative effect in red 798



**Fig. 5.** Multifactorial analysis (MFA) reporting the projection of the proteins the most associated with meat quality and carcass traits when measured in RA or LT muscle, together with the projection of the muscle and carcass traits.

