



OPEN

Protein signatures of seminal plasma from bulls with contrasting frozen-thawed sperm viability

Fabio P. Gomes¹, Robin Park¹, Arabela G. Viana², Carolina Fernandez-Costa¹, Einko Topper³, Abdullah Kaya⁴, Erdogan Memili⁵, John R. Yates III¹✉ & Arlindo A. Moura⁶✉

The present study investigated the seminal plasma proteome of Holstein bulls with low (LF; $n = 6$) and high (HF; $n = 8$) sperm freezability. The percentage of viable frozen-thawed sperm (%ViableSperm) determined by flow cytometry varied from -2.2 in LF to $+7.8$ in HF bulls, as compared to the average %ViableSperm (54.7%) measured in an 860-sire population. Seminal proteins were analyzed by label free mass spectrometry, with the support of statistical and bioinformatics analyses. This approach identified 1,445 proteins, associated with protein folding, cell–cell adhesion, NADH dehydrogenase activity, ATP-binding, proteasome complex, among other processes. There were 338 seminal proteins differentially expressed ($p < 0.05$) in LF and HF bulls. Based on multivariate analysis, BSP5 and seminal ribonuclease defined the HF phenotype, while spermadhesin-1, gelsolin, tubulins, glyceraldehyde-3-phosphate dehydrogenase, calmodulin, ATP synthase, sperm equatorial segment protein 1, peroxiredoxin-5, secretoglobin family 1D and glucose-6-phosphate isomerase characterized the LF phenotype. Regression models indicated that %ViableSperm of bulls was related to seminal plasma peroxiredoxin-5, spermadhesin-1 and the spermadhesin-1 \times BSP5 interaction ($R^2 = 0.84$ and 0.79 ; $p < 0.05$). This report is the largest dataset of bovine seminal plasma proteins. Specific proteins of the non-cellular microenvironment of semen are potential markers of sperm cryotolerance.

Sperm cryopreservation, artificial insemination (AI) and in vitro fertilization followed by embryo transfer are among the most used assisted reproductive technologies (ARTs), allowing genetic selection of farm animals¹, conservation of wild and endangered species², successful pregnancies for infertile couples³ and preservation of fertility in cancer patients⁴. Successful implementation of ARTs depends on cost-effective and efficient cryopreservation of sperm cells. Cryopreservation protocols include the dilution of fresh semen with extender containing cryoprotectants, buffers and antibiotics, followed by freezing in liquid nitrogen. Freezing and thawing semen interferes with the structure of the sperm membranes, alters functions of membrane proteins and ion channels, causes premature capacitation and acrosome reaction and yields excessive reactive oxygen species⁵. Additionally, cryopreservation reduces both sperm metabolism and mitochondrial activity and alters sperm chromatin structure⁶. All these effects result in lower motility and fertilizing capacity of frozen-thawed sperm when compared to untreated cells.

Despite substantial improvements of protocols for cryopreservation of sperm and development of new extenders, it is currently accepted that 40 to 50% of sperm are incapable of proper fertilization after freezing and thawing¹. Studies indicate that certain males with nearly identical sperm parameters measured in fresh ejaculates present contrasting sperm viability after cryopreservation⁷ and some bulls with high reproductive performance in natural mating have poor semen freezability⁸. Ejaculates have subpopulations of spermatozoa that differ in motility and fertilizing capacity, and these attributes are unique to each sire⁹. Aspects of sperm morphology and physiology are defined during spermatogenesis, epididymal maturation and during post-ejaculation events, influencing fertility of each male. Thus, it is not surprising that pronounced differences exist among individuals regarding sperm's ability to survive the stress of cryopreservation.

In mammalian species, seminal plasma is mainly composed of secretions of the testes, epididymides and accessory sex glands. The fluid bathing sperm cells in semen contains proteins that participate in sperm metabolism and motility, membrane remodeling and function, protection against reactive oxygen species and immune

¹The Scripps Research Institute, La Jolla, CA, USA. ²Federal University of Viçosa, Viçosa, MG, Brazil. ³Alta Genetics Inc., Madison, WI, USA. ⁴Selcuk University, Konya, Turkey. ⁵Mississippi State University, Starkville, MS, USA. ⁶Federal University of Ceará, Fortaleza, CE, Brazil. ✉email: jyates@scripps.edu; arlindo.moura@gmail.com

actions, capacitation and acrosome reaction^{10,11}. Many proteins of the seminal plasma bind to sperm, affecting the structure of membranes and sperm function. This is the case with Binder of Sperm proteins (BSPs), a major component of seminal plasma from ruminants and also conserved among several other mammalian species¹². Studies indicate that BSPs protect ram spermatozoa subjected to cryopreservation¹³ and empirically relate to fertility of dairy bulls evaluated both *in vitro*¹⁴ and *in vivo*¹⁵. Treatment of sperm with diluted seminal plasma and sperm-rich fraction of seminal plasma is beneficial to frozen-thawed sperm from boars^{16,17} and cryotolerance of boar sperm can be estimated based on phosphorylation patterns of HSP70¹⁸, indicating that seminal components are important for viability of cryopreserved sperm. In addition to direct effects on sperm physiology, seminal proteins also appear to influence post-fertilization events as well. For instance, one of the members of the bovine BSP family, BSP1, affects cleavage and early *in vitro* growth of embryos¹⁹ and osteopontin has significant effects on cleavage rates and *in vitro* development of bovine²⁰, swine²¹ and buffalo embryos²². Studies showing that ablation of accessory sex glands in hamsters negatively affects both embryo implantation and development^{23,24} reinforce the notion that paternal factors do play a major role in post-fertilization events. Components of semen also affect the physiology of the female reproductive tract, influencing reproduction success. In humans, seminal plasma stimulates the expression of pro-inflammatory genes in the cervix and vaginal epithelia and transcripts associated with cell proliferation, vascularization and angiogenesis in the endometrium^{25,26}. Moreover, a seminal molecule, β -nerve growth factor, acts on the female reproductive tract to help trigger hormonal responses that cause ovulation in species of induced ovulation, such as rabbits and alpacas^{27,28}. The attributes of seminal fluid molecules make them suitable targets of studies to elucidate factors controlling specific aspects of sperm function and male fertility. Thus, the present study was aimed at uncovering the protein signatures of seminal plasma from bulls with contrasting phenotypes associated with frozen-thawed sperm viability.

Results

The proteome of bovine seminal plasma. Using MudPIT, we identified 1,445 proteins in samples of bovine seminal plasma. BSP1 and spermadhesin-1 were the most abundant proteins of the bull seminal plasma, respectively, making 14.11 and 12.96% of all proteins presently identified. The three BSPs (BSP1, BS3 and BSP5) accounted for 22.57% and spermadhesins (spermadhesin-1 and spermadhesin Z13) made 14.08% of the bovine seminal plasma proteome deciphered by MudPIT. Clusterin, osteopontin and metalloproteinase inhibitor 2 were the next most abundant proteins, making 4.53, 4.47 and 3.33% of the bull seminal plasma protein amount (Table 1). The 25 most abundant proteins accounted for nearly 70% of the seminal plasma proteome of the bulls (Supplemental Table 1).

Based on gene ontology terms defined in the IP2 platform, predominant biological processes associated with the bull seminal proteins were metabolic process, single-organellar metabolic process, small molecule metabolic process, cellular protein metabolic process, organonitrogen compound metabolic process, regulation of catabolic process and catalytic activity, among others (Fig. 1A). Molecular function of those seminal plasma proteins mainly related to catalytic activity, protein binding, anion binding, nucleoside phosphate binding, and electron carrier activity, among others (Fig. 1B).

We uploaded 1,445 Uniprot accession codes through the DAVID platform which matched to 1,407 genes, distributed in 186 clusters. Each of these functional clusters included substantial numbers of biological mechanisms, pathways, molecules and cell structures (Supplemental Table 2). Functional annotation of the 15 highest cluster enrichment scores based on gene ontology and KEGG pathway database included biological processes such as protein folding and cell–cell adhesion, molecular functions linked to NADH dehydrogenase activity, unfolded protein binding and cadherin and ATP-binding, and cellular components related to lysosome, cell–cell adherens junction and proteasome accessory complex, among others (Table 2).

Proteins differentially expressed in the seminal plasma of bulls with high and low sperm freezability.

Label free quantitative analysis showed that there were 338 proteins with different abundances ($p < 0.05$) in the group of bulls with low and high semen freezability. A clear separation of seminal plasma proteomes from LF and HF bulls was also detected by partial least square discriminant analysis (Fig. 2A). Moreover, multivariate analysis identified 15 proteins with the highest VIP scores, which indicates their significant contributions to the definition of sperm freezability phenotypes. Among those 15 proteins, seminal plasma BSP-30 kDa (BSP5) and seminal ribonuclease contributed to characterization of the high freezability phenotype. On the other hand, spermadhesin-1, gelsolin, tubulin beta-4B chain, tubulin beta-4A chain, tubulin beta-5 chain, glyceraldehyde-3-phosphate dehydrogenase, calmodulin, tubulin beta-2B chain, ATP synthase, sperm equatorial segment protein 1, peroxiredoxin-5, secretoglobin family 1D member and glucose-6-phosphate isomerase formed the group of proteins characterizing the low freezability phenotype (Fig. 2B).

Regression analyses using abundances of proteins with the 15 highest VIP scores as independent variables generated equations for prediction of sperm freezability scores of bulls. According to one model, these scores were related to the amount of spermadhesin-1, peroxiredoxin-5 and BSP5 in seminal plasma ($R^2 = 0.80$, $p < 0.05$; Table 3). In another regression equation, parameters explaining the variation in sperm freezability scores were spermadhesin-1, peroxiredoxin-5 and the spermadhesin-1 \times BSP5 interaction ($R^2 = 0.79$, $p < 0.05$; Table 3; Supplemental Table 3). There were significant ($p < 0.05$) correlations among several of those 15 high-VIP score proteins. For instance, the amount of PRDX5 correlated with that of ATP synthase ($r = 0.59$), which in turn showed correlations with glyceraldehyde-3-phosphate dehydrogenase ($r = 0.95$), sperm equatorial segment protein 1 ($r = 0.95$) and glucose-6-phosphate isomerase ($r = 0.89$) in the seminal plasma. Quantity of GPI in seminal plasma had association with the amount of GAPDHS ($r = 0.87$), sperm equatorial protein 1 ($r = 0.83$) and secretoglobin ($r = 0.72$). GAPDHS levels were correlated with those of spermadhesin-1 ($r = 0.74$) and calmodulin ($r = 0.56$),

Accession #	Gene	Protein description	Abund. (%) [*]	Fold-change [§]	Functional attributes	Ref
P02784 P81019 P04557		Seminal plasma protein PDC-109 (BSP1) Seminal plasma protein BSP-30 kDa (BSP5) Seminal plasma protein A3 (BSP3)	14.11 6.53 1.93	1.53 ^{LF} 1.22 ^{HF} 1.20 ^{HF}	Bind do phospholipids of sperm membrane; sperm capacitation; sperm-oviduct interaction; in vitro fertilization and early embryo development. Protection of sperm against damage caused by cryopreservation	12, 13, 14, 15, 19, 40, 57, 76
P29392 P82292	SPADH1	Spermadhesin-1 Spermadhesin Z13	12.96 1.12	1.85 ^{LF} 1.43 ^{HF}	Exhibit carbohydrate-binding activity and interact with phospholipids. Sperm capacitation; sperm interaction with the oviduct epithelium; sperm-egg binding; sperm membrane stability and motility. Anti-oxidative effects	46, 47, 48, 81, 82, 83, 84
P17697	CLU	Clusterin	4.53	1.42 ^{LF}	Sperm maturation, lipid transport, sperm membrane remodeling; chaperone effects; inhibits cell lysis by complement-mediated mechanisms. Binds to damaged sperm	49, 50, 51, 53
P31096 P31098	SPP1	Osteopontin Osteopontin-K	2.63 1.84	1.58 ^{LF} 1.48 ^{LF}	Involved in cell adhesion, tissue and extracellular remodeling, inflammation and immune-mediated events; Promotes acrosome reaction, in vitro fertilization and early embryo development	20, 21, 21, 55, 56, 57, 58, 59
P16368	TIMP2	Metalloproteinase inhibitor 2	3.33	1.50 ^{LF}	Controls the activity of ADAMs (a disintegrin and metalloproteinase), proteins that function in cell adhesion, proteolysis of cell surface components and ECM. ADAMs participate in sperm-egg interactions	61, 62, 63
P00669	SRN	Seminal ribonuclease	2.89	2.58 ^{HF}	Sperm capacitation; antioxidant function; catalytic activity; immunosuppression	77, 78, 78
Q3SX14	GSN	<i>Gelsolin</i>	1.02	4.63 ^{LF}	Actin-binding molecule; maintains actin polymerization; regulated by calcium; triggers acrosome reaction	105
Q2KJE5	GAPDHS	<i>Glyceraldehyde-3-phosphate dehydrogenase, testis specific</i>	0.71	2.39 ^{LF}	Glycolytic enzyme; essential for generation of ATP; play roles in sperm motility and male fertility; binds to sperm fibrous sheath	99, 100
Q3MHM5 Q3ZBU7 Q2KJD0 Q2KJD0	TUBB4B TUBB4A TUBB5 TUBB2B	<i>Tubulin beta-4B chain</i> <i>Tubulin beta-4A</i> <i>Tubulin beta-5 chain</i> <i>Tubulin beta-2B chain</i>	1.31 1.18 0.79 0.57	2.37 ^{LF} 2.38 ^{LF} 2.43 ^{LF} 2.39 ^{LF}	Major components of sperm microtubules; binds to GTP; involved in the mechanism of sperm motility	93, 94
P00829	ATP5F1B	<i>ATP synthase subunit beta</i>	0.38	2.68 ^{LF}	Sperm ATP production; may play a role in germ cell differentiation	95, 96
Q9BG11	PRDX5	<i>Peroxiredoxin-5</i>	0.32	2.68 ^{LF}	An antioxidant effect; increased expression during immune response and inflammation; modulators of redox signaling; overexpressed in certain types of carcinogenic processes	85, 86, 87, 88, 89, 90, 91, 92
P62157	CALM	<i>Calmodulin</i>	0.29	2.89 ^{LF}	Binds to sperm, controls Ca ²⁺ -mediated events; participates in sperm capacitation and acrosome reaction; sperm motility	103, 104
Q32KL7	SPESP1	<i>Sperm equatorial segment protein 1</i>	0.25	4.05 ^{LF}	Mediates sperm-egg fusion and fertilization	101, 102
A0JNP2	SCGB1D	<i>Secretoglobin family 1D member</i>	0.23	4.27 ^{LF}	Steroid binding protein; anti-inflammatory effect; inactivates phospholipase A2; decreases proinflammatory cytokine production; alters phagocyte function. May regulate sperm antigenicity	106, 107
Q3ZBD7	GPI	<i>Glucose-6-phosphate isomerase</i>	0.22	2.50 ^{LF}	Converts glucose-6-phosphate to fructose-6-phosphate; important for glycolysis and ATP yield for sperm motility; regulates tumor cell growth; prevents apoptosis and oxidative stress-induced cellular events	97, 98

Table 1. Functional attributes of proteins identified by multidimensional protein identification technology (MudPIT) in the bovine seminal plasma. The list includes proteins with the highest relative quantity in seminal plasma and those proteins identified with the 15 highest VIP scores, as shown in Fig. 2. Highlighted proteins are those that made significant contributions for the definition of the high (bold) and low (italics) sperm freezability phenotypes. *Refers to how much the abundance of a specific protein represents, in percentage, of the total abundance of all proteins detected in the study.

which were linked to the amounts of secretoglobin ($r = 0.75$) and GPI ($r = 0.70$) as well. Quantities of spermadhesin-1 were correlated with those of gelsolin ($r = 0.64$) in the seminal plasma of bulls (Supplemental Table 4).

Based on in silico analysis, peroxiredoxin-5 shows potential interactions with peroxiredoxin-1, 2, 3 and 4, three types of thioredoxin, catalasem, superoxide dismutase and protein/nucleic acid deglycase DJ-1 (Fig. 3A). Spermadhesin-1, in turn, has links with BSP5 and other two members of the BSP protein family (BSP1 and BSP3), ubiquitin-40S ribosomal protein S27a, dolichol-phosphate mannosyltransferase subunit 3; alpha-1B-glycoprotein and quiescin Q6 sulfhydryl oxidase 1 (Fig. 3B). BSP5 interacts with tissue inhibitor of metalloproteinase-2, spermadhesin Z13 (in addition to spermadhesin-1), a solute carrier family 22 member 16 and a postacrosomal sheath WW domain-binding protein (Fig. 3C).

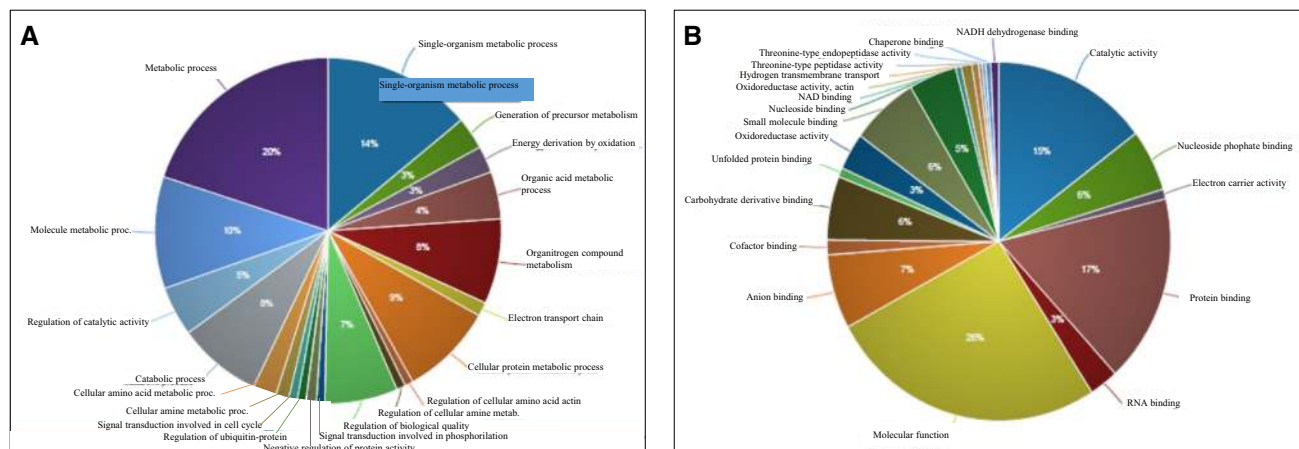


Figure 1. Gene ontology terms of proteins from bovine seminal plasma associated with biological processes (A) and molecular function (B). Protein data and identification were analyzed by the Integrated Proteomics Pipeline version 6.5.4. (IP2, <https://www.integratedproteomics.com/>) and based on UniprotKB database.

Discussion

The analysis of bovine seminal plasma conducted in the present study relied on multidimensional protein identification technology and tools of bioinformatics. This approach allowed the identification of 1,445 proteins, which currently represents the largest dataset of proteins in seminal plasma from bulls or any ruminant species. In a previous study, we identified 1,159 proteins in seminal plasma of Holstein bulls using a conventional bottom-up proteomics approach¹⁵. While our current work brings a valuable contribution to the field of male reproductive biology, it probably does not represent the entire proteome of the bovine seminal plasma. Advanced studies estimate that human seminal plasma contains up to 10,000 proteins²⁹, and we believe that the bovine seminal plasma likely has a comparable number of proteins. Binder of sperm proteins and spermadhesins were expressed in high levels in the bovine seminal plasma and it is possible that these dominant proteins suppressed the signal of other proteins with lower abundance. Since identifying low abundance proteins is a common drawback of conventional bottom-up proteomics, we utilized the MudPIT approach to analyze our samples in order to increase the proteome coverage³⁰. MudPIT is based on multidimensional separation where two stationary phases are used online to increase the separation efficiency of the chromatographic method, which in turn, improves mass spectrometry detection of the peptides. In fact, our strategy improved the overall view of the bovine seminal plasma proteome but it is still far from the results described in humans. Thus, new analytical and separation methods are needed to decipher the complete proteomic atlas of the bovine seminal plasma.

As expected, BSPs (BSP1, BSP5 and BSP3) and spermadhesins were the most abundant proteins detected in the present study, along with other typical components of bovine seminal plasma, such as clusterin, osteopontin and metalloproteinase inhibitor 2^{7,15,31–33}. In addition to the bovine, BSPs and their isoforms are present in the seminal plasma of other ruminants such as buffalos³⁴, rams^{35,36} and goats³⁷. Horses³⁸, rabbits³⁹ and humans¹² also express BSPs in semen, but in lower amounts than ruminants. Most studies about BSPs have been conducted in bulls and it is believed that BSPs interact with sperm at the moment of ejaculation, participate in capacitation¹², mediate the interaction between spermatozoa and oviduct epithelia⁴⁰ and affect fertilization as well¹⁹.

Spermadhesins were the second most abundant protein family detected in the bull seminal fluid, appearing in our list as spermadhesin-1 and spermadhesin Z13. Like BSPs, spermadhesins are present not only in bulls^{7,33,41}, but also in rams³⁶, buffalos⁴², goats⁴³, boars⁴⁴ and peccaries⁴⁵, among other species. Spermadhesins exhibit carbohydrate-binding activity and interact with certain types of phospholipids⁴⁶. Roles played by spermadhesins vary among species but studies conducted in boars indicate that they affect sperm capacitation, sperm-oviduct interaction, sperm membrane stability and sperm-egg binding^{47,48}. Clusterin was the third most abundant protein of the bovine seminal plasma, affecting sperm function in many ways. Clusterin play roles in sperm maturation, lipid transport and membrane remodeling, acts as chaperone^{49,50} and inhibits cell lysis by complement-mediated mechanisms, mitigating female immune reactions to male factors⁵¹. Seminal plasma clusterin is inversely related to the population of morphologically normal sperm in bulls⁵² and seems to selectively bind sperm with morphologic defects⁵³. We have reported that clusterin is consistently expressed in the seminal plasma of several species, such as bulls^{7,14,33}, rams³⁶, boars⁴⁴, peccaries⁴⁵ and dogs⁵⁴, among others. It seems therefore that males have a selected group of components which we define as “seminal plasma sperm-protecting molecules”. Clusterin belongs to this group, as well as peroxiredoxins, albumin, catalase, glutathione peroxidase, glutathione S-transferase, tioredoxin peroxidase, superoxide dismutase, catalase and lactoferrin, among others. They all contribute to protection of sperm against oxidative stress, protein precipitation and immune reactions of the female reproductive tract.

Osteopontin (OPN) and metalloproteinase inhibitor 2 were other typical proteins of the bull seminal fluid, although expressed in much less quantity than BSPs and spermadhesins. OPN is involved in cell adhesion, tissue and extracellular remodeling, inflammation and immune-mediated events^{55,56}. OPN binds to sperm integrin and CD44 receptors^{57,58} and promotes acrosome reaction, fertilization and early embryo development in the bovine^{20,59} and swine²¹. Seminal plasma OPN has been regarded as a marker of fertility in dairy bulls^{41,60}.

Functional annotation clusters	Enrichment scores	Number of genes
Biological processes		
Protein folding	17.48	37
Cell–cell adhesion	15.03	31
Tricarboxylic acid cycle	13.12	21
Glycolytic process	9.86	15
Negative regulation of endopeptidase activity	8.61	32
ATP hydrolysis coupled proton transport	7.52	15
ATP synthesis coupled proton transport	7.01	14
Molecular functions		
NADH dehydrogenase (ubiquinone) activity	33.93	22
Unfolded protein binding	17.48	26
Cadherin binding involved in cell–cell adhesion	15.03	34
ATP-binding	14.25	149
Serine-type endopeptidase inhibitor activity	8.61	25
Threonine-type endopeptidase activity	8.52	14
Proton-transporting ATPase activity, rotational mechanism	7.52	14
Hydrogen ion transmembrane transporter activity	7.01	9
GTP binding	6.51	72
GTPase activity	6.51	46
GDP binding	6.51	16
Cellular components		
Mitochondrial respiratory chain complex I	33.93	34
Lysosome	17.21	46
Cell–cell adherens junction	15.03	36
Proteasome accessory complex	10.4	13
Chromaffin granule	8.61	9
Proteasome core complex	8.52	15
Cytoplasmic mRNA processing body	8.52	4
Mitochondrial proton-transporting ATP synthase complex	7.01	15
Pathways (based on KEGG pathway database)		
Oxidative phosphorylation	33.93	83
Lysosome	17.21	42
Citrate cycle (TCA cycle)	13.12	22
Oxocarboxylic acid metabolism	13.12	10
Proteasome	10.4	31
Glycolysis/gluconeogenesis	9.86	28
Proteasome	8.52	31
Collecting duct acid secretion	7.52	12

Table 2. Functional annotations of the clusters with the 15 highest enrichment scores, associated with bovine seminal plasma proteins. Clusters were based on Gene Ontology and KEGG pathways. The current list is part of the 186 clusters identified by DAVID platform, as defined in Supplemental Table 2.

Metalloproteinase inhibitor 2, in turn, controls the activity of ADAMs (a disintegrin and metalloproteinase), proteins that modulate cell adhesion and act during proteolysis of extracellular matrix and cell surface components⁶¹. ADAMs participate in sperm-egg interaction and seminal plasma tissue inhibitor of metalloproteinase 2 has been associated with bull fertility⁶² and with the degree of sperm DNA fragmentation in men⁶³. Functional attributes of the major bovine seminal plasma proteins as well as those proteins defining the sperm freezability phenotypes of the bulls are summarized in Table 1.

Major biological processes (metabolic process, small molecule metabolic process, regulation of catalytic activity and catabolic process) and molecular functions (catalytic activity, nucleoside phosphate binding, electron carrier activity and protein binding) of the bull seminal proteins detected in the present study appear as common events of mammalian sperm physiology. As expected, functional clusters associated with 1,407 genes identified in the DAVID platform were extremely diverse. Yield of viable sperm by an individual and successful fertilization depend on mitosis, meiosis and differentiation of germ cells in the seminiferous tubules, Sertoli and Leydig cell functionality, epididymal maturation and post-ejaculation events, such as capacitation and acrosome reaction. As seminal plasma molecules are usually in close contact with sperm and affect their structure and metabolism starting in the testes, it is not surprising that terms of functional clusters described in our study are so diverse.

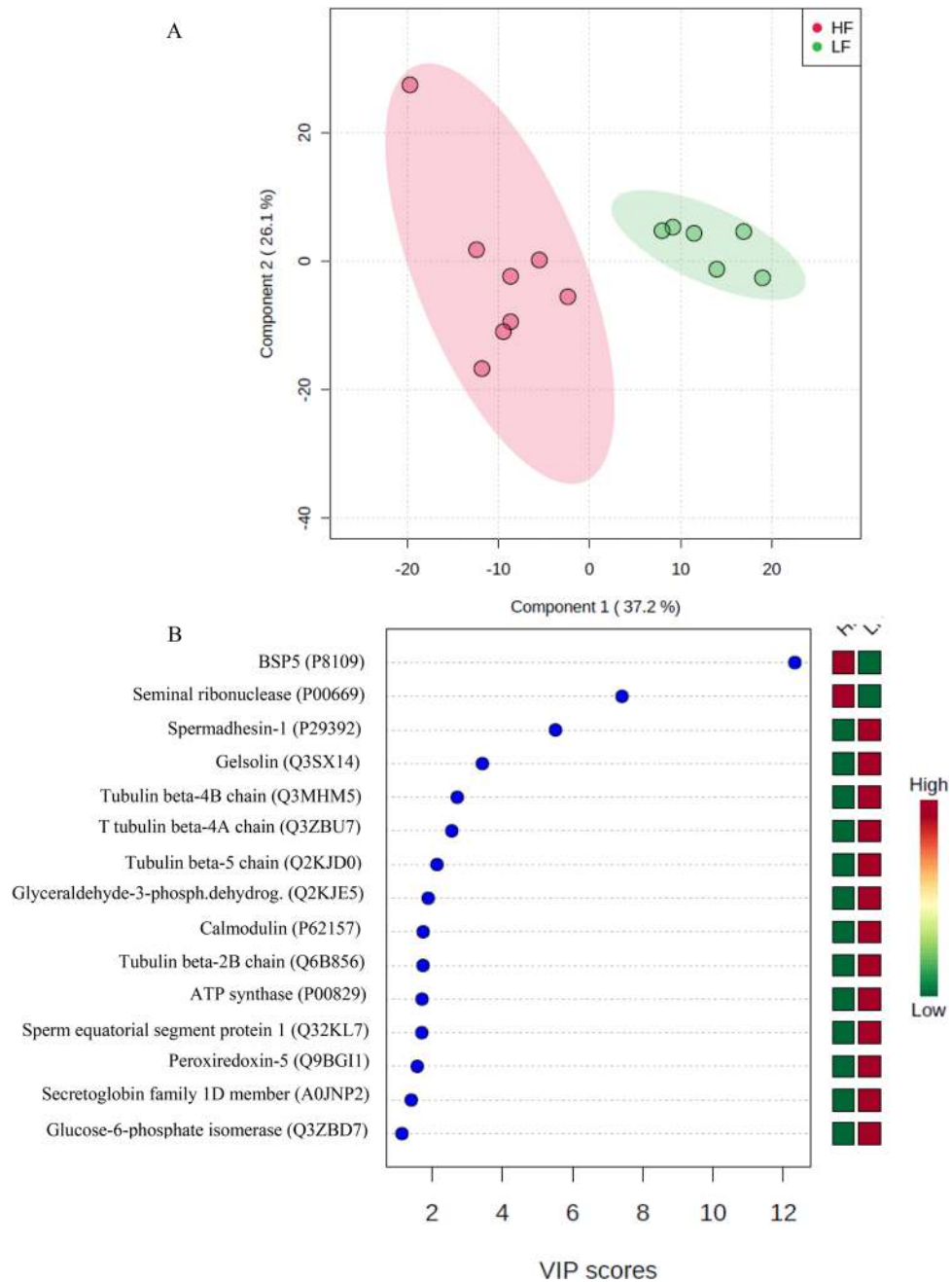


Figure 2. Partial least square discriminant analysis (PLS-DA) of protein abundances in the seminal plasma of dairy bulls with low (LF) and high (HF) sperm freezability phenotypes. Explained variances of components are shown in brackets (**A**). Variable Importance in Projection (VIP) scores associated with seminal proteins, as identified by PLS-DA (**B**). Colored boxes on the right indicate the relative abundances of proteins in each phenotype group.

Functional clusters with the 15 highest enrichment scores related to protein folding, cell–cell interaction, energy yield, cell metabolism, protease activity and mitochondrial reactions. Our analysis of seminal plasma indicates 83 genes related to oxidative phosphorylation and 28 to glycolysis, which consist of metabolic pathways used by spermatozoa to generate ATP⁶⁴. Also, lysosome activity was linked to 42 genes, including proteases (such as cathepsins), glycosidases, sulfatases, prosaposin, among others. Previous studies indicate that cathepsin D, an epididymal enzyme, is involved in membrane protein remodeling and is empirically related to fertility scores of dairy bulls⁶⁵. Prosaposin is a glycoprotein found in reproductive tract secretions of several species, including humans⁶⁶. Prosaposin has important functional attributes in male reproduction, as knock-out mouse for this protein has deficient spermatogenesis⁶⁷. Also, prosaposin apparently improves sperm-oocyte interaction and fertilization in bulls and humans^{68,69}. The acrosome is formed during spermiogenesis and it consists of a vesicle capping the sperm head, containing proteolytic enzymes that are released prior to fertilization⁷⁰. Because of its

	Pr> t	R ²	Pr>F
Model 1			
$Y = 212.062253 - a.(\text{LogPRDX5}) + b.(\text{BSP5}) - c.(\text{LogSPADH1})$		0.80	0.0008
a = 8.614414	0.0164		
b = 2.2628731E-9	0.0207		
c = 15.033786	0.0087		
Model 2			
$Y = 221.301878 - a.(\text{LogSPADH1}) - b.(\text{LogPRDX5}) + c.(\text{Log SPADH1} \times \text{LogBSP5})$		0.79	0.001
a = 30.270225	0.0068		
b = 7.814084	0.0333		
c = 1.515310	0.0288		

Table 3. Regression models showing the percent deviation of frozen-thawed sperm viability (Y) as a function of seminal plasma proteins from dairy bulls. Analyses of variation, parameter estimates and fit diagnostics are available in Supplemental Table 3. SPADH1: spermadhesin-1 (accession # P29392); PRDX5: peroxiredoxin 5 (accession # Q9BG11); BSP5: seminal plasma protein BSP-30 kDa (accession # P81019). PRDX5 peroxiredoxin, BSP5 seminal plasma protein BSP-30 kDa, SPADH1 spermadhesin-1.

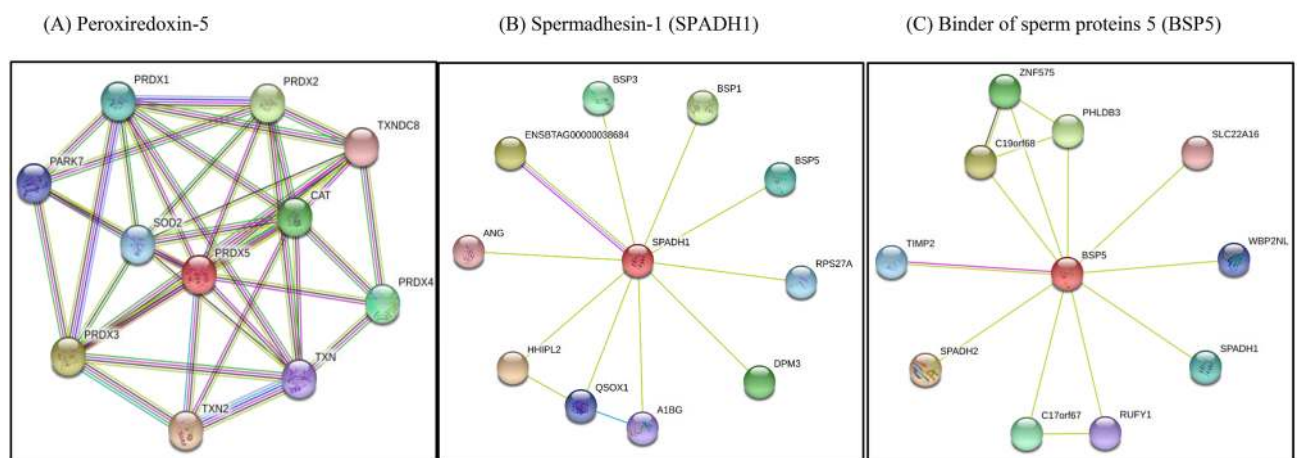


Figure 3. In silico networks of seminal plasma spermadhesin-1 (SPADH1), peroxiredoxin 5 (Prdx5) and Binder of sperm protein 5 (BSP5), based on String platform (<https://string-db>). SPADH1, PRDX5 and BSP5 were significantly related to freezability scores of dairy bulls, according to the regression model presented in Table 2.

nature, types of enzymes and physiology, the acrosome reaction is understood to have a lysosome-like mechanism and our study indicates that a significant number of proteins of the seminal plasma potentially participate in that event.

Pathways with high enrichment scores were also associated with the proteasome, with a pronounced number of seminal plasma components. The proteasome is a protein complex designed to degrade proteins specifically marked by ubiquitination. This conserved cellular proteolytic activity takes place during several biological events, such as cell cycle growth, apoptosis, cell signaling, metabolic reactions and immune-related processes⁷¹. Ubiquitin–proteasome components are present in the somatic and germ cells of the testis and play a role in the replacement of histones for protamines at the final stages of spermatogenesis⁷². Proteasomes can also be secreted and they are found in human seminal plasma⁷³ and epididymal fluid of bulls⁷⁴. Sperm are ubiquitinated during their transit through the epididymis⁷² and it has been postulated that this ubiquitination labels defective sperm, signaling for their degradation mediated by proteasome^{72,74}. With the description of several components of the proteasome in the bull seminal plasma, there is an expectation that proteolytic-mediated removal of defective sperm also happens after ejaculation, in the female reproductive tract. Because IFN γ was detected in the seminal plasma samples of the present study, we hypothesize that immunoproteasomes are formed in the male reproductive tract and/or after ejaculation. However, more research is needed to determine the precise roles of these immunoproteasomes in the fertilization process.

Through this innovative study, we report a selected group of proteins with significant associations with the ability of spermatozoa to survive cryopreservation. Considerable differences exist among bulls as regard to how gametes survive freezing and thawing^{1,7,8}. Despite the importance of gamete survival to assisted reproduction, there is no definitive explanation of why sperm from some animals “freeze” better than from others. Because semen from dairy bulls are extensively used for commercial AI, these animals are excellent models for studies designed to understand the molecular basis of sperm freezability and male fertility. Also, dairy bulls have been subjected to extensive selection for the last decades so animals with poor semen quality are culled, and those

currently used for artificial insemination are routinely evaluated. This workflow of semen evaluation and cryopreservation in the AI industry generates a remarkable database about sperm parameters and fertility of bulls, leading to reliable characterization of phenotypes of the animals⁷.

We presently show that bulls with contrasting sperm freezability phenotypes have distinct seminal plasma protein signatures. Freezability scores used in the current research were very reliable because they were based on evaluations of at least 50 semen samples per animal and compared to data from a large population of sires. However, the proteome analyses were carried out in a single seminal plasma sample per bull. Conditions in which bulls of AI centers are raised are well controlled, from nutrition, health and management to frequency of semen collections. This minimizes inter-ejaculate variations in semen composition. However, despite all standard protocols for raising the animals at AI facilities, between-ejaculate variations do occur, of course. Even when all management conditions are perfectly controlled, subtle physiological changes may happen from day to day in any living organism. Thus, associations presently reported between viability of frozen-thawed sperm and seminal plasma proteins need to be validated with different group of animals. Effects of selected proteins on sperm cryotolerance and function could also be tested in *in vitro* assays.

Based on VIP scores, proper sperm survival to cryopreservation was mostly defined by BSP5 and seminal ribonuclease. BSPs interact with the bovine sperm when epididymal sperm come in contact with secretions of accessory sex glands and participate in capacitation, sperm-oviduct binding and fertilization, as previously mentioned. In rams, seminal plasma from individuals with good sperm freezability improve motility when mixed with frozen-thawed sperm from animals with poor freezability⁷⁵. A positive cause and effect relationship exists between BSP1 and BSP5 and both motility and membrane integrity of frozen-thawed sperm of rams¹³, indicating that BSPs protect spermatozoa against the damages of cryopreservation. In the bovine, sperm become damaged when they are exposed to high concentrations of BSPs and when they are exposed to BSPs *in vitro* for long periods of time¹². Such deleterious effect occurs because excess of BSP exposure leads to removal of too much cholesterol and phospholipids from the sperm membrane. In physiological conditions, contact of sperm with seminal plasma after ejaculation is transient and it happens while semen is diluted in the secretions of the female reproductive tract. *In vitro*, however, this dilution of semen does not seem to happen and thus, BSP effects may be different *in vivo* and *in vitro*. Nevertheless, positive associations exist between seminal BSPs and fertility indexes of dairy bulls^{14,15,41} but it is also true that too much BSP in seminal fluid is detrimental to sire fertility⁴¹. Also, BSP coating to bovine sperm⁵⁷ contributes to stability of sperm membrane structure⁷⁶, supporting the notion that BSPs can protect cryopreserved sperm. Seminal ribonuclease (SRN) is another protein associated with the high freezability phenotype. SRN participates in sperm capacitation and has catalytic activity, acting as antioxidant and suppressor of immune reactions⁷⁷. These last two attributes make SRN a “seminal plasma sperm-protecting molecule”. SRN positively relates to motility of buffalo spermatozoa⁷⁸ while a ribonuclease 4 isoform was inversely associated with cryotolerance of ram sperm⁷⁹. Studies clearly indicate that both BSPs and SRN contribute to proper sperm function but more investigation is needed to characterize the specific mechanisms by which such proteins affect sperm resistance to cryopreservation.

Seminal proteins defining the low sperm freezability phenotype were identified as spermadhesin-1, gelsolin, tubulins, glyceraldehyde-3-phosphate dehydrogenase, calmodulin, ATP synthase, sperm equatorial segment protein 1, peroxiredoxin-5, secretoglobin and glucose-6-phosphate isomerase. Regression analysis indicated that sperm freezability scores of bulls were inversely related to spermadhesin-1 and peroxiredoxin-5. Spermadhesin-1 is also known as acidic seminal fluid protein (aSFP) and secreted by accessory sex glands³¹ and cauda epididymis of bulls⁸⁰. The reason why spermadhesin-1/aSFP has an inverse association with frozen-thawed sperm survival is not well understood. aSFP has protective actions against oxidative stress in semen^{81,82} but effects of aSFP on sperm motility and mitochondrial activity can be either beneficial, when aSFP is at average levels, or detrimental, when at high concentrations⁸¹. Spermadhesins also share amino acid homology with seminal plasma motility inhibitor, a molecule that interferes with ATPase and reduces sperm motility in humans and boars⁸³. However, studies demonstrate that phospholipid binding attributes of AWN, a porcine spermadhesin, promote stability of the sperm membrane⁸⁴. It seems possible, then, that spermadhesins can have either beneficial or damaging effects on sperm, depending on the concentration. Moreover, *in silico* analyses indicate that spermadhesin-1 interacts with BSPs and other components of the male reproductive tract such as ubiquitin, alpha-1B-glycoprotein, quiescin Q6 sulfhydryl oxidase 1 and angiogenin-1, suggesting that in addition to their isolated effects, the form by which proteins interact in the seminal plasma environment also affects sperm physiology. In accordance with this analysis, one of the regression models presented in the current study indicates that the spermadhesin-1 × BSP5 interaction was significant to determine the variation in sperm freezability scores of bulls.

Peroxiredoxin-5 was another seminal plasma protein defining the low sperm freezability phenotype of the animals and significantly included in the regression models. Peroxiredoxins (PRDX) are thiol-dependent peroxidases capable of protecting cells from reactive oxygen species (ROS) and other damaging molecules⁸⁵. PRDXs induce redox signaling for macrophage actions and are released in response to high yield of peroxides during inflammation processes^{85,86}. Certain types of PRDX, such as PRDX5, relate to progression of carcinogenic tumors and are overexpressed in cases of endometrial and ovarian cancer. These associations are certainly linked to intense oxidative stress-related events that characterize cancer pathobiology⁸⁷. As well known, oxidative stress is harmful to sperm's fertilizing capacity⁸⁸ and seminal plasma PRDX expression is one of the strategies for sperm protection, as discussed above. Peroxiredoxins are present in human sperm and seminal plasma⁸⁸ and both PRDX1 and PRDX6 are altered in sperm of men with seminal oxidative stress and pathological conditions such as varicocele^{89,90}. PRDX4 and PRDX5 have been described in the testis⁹¹ and cauda epididymal sperm⁹² of bulls, respectively. However, no information exists about the expression of PRDXs in the bovine seminal plasma and ejaculated sperm and what controls their synthesis either. The reason PRDX5 had an inverse association with viability of frozen-thawed sperm in the present study is not known at this point. High levels of PRDXs5 in seminal fluid could possibly happen as the response of some animals to increased release of ROS in the epididymis and/

or semen. This would significantly damage sperm membrane integrity, decreasing sperm's freezability. Based on *in silico* analysis, PRDX5 interacts with other types of peroxiredoxins and enzymes involved in the control of redox reactions, such as thioredoxins, catalase and superoxide dismutase. Moreover, PRDX5 networks with ATP synthase, which in turn, connects with tubulins, glucose-6-phosphate isomerase (GPI) and glyceraldehyde-3-phosphate dehydrogenase (GAPDH; data not shown), proteins that also contributed to definition of the low sperm freezability phenotype of bulls. In agreement with *in silico* assays, the quantity of PRDX5 in seminal plasma correlated with that of ATP synthase, which in turn was related to the amount of spermadhesin-1, tubulins, GAPDH, sperm equatorial protein 1 and GPI. Tubulins are constituents of the sperm motility apparatus^{93,94}, while ATP synthase^{95,96}, GPI^{97,98} and GAPDH^{99,100} take part in the process of energy production for sperm cells. Sperm equatorial protein 1 participates in sperm-egg binding and in the process of fertilization^{101,102}. As mentioned above, several protein interactions possibly occur in the non-cellular microenvironment of semen, affecting crucial aspects of sperm function. In fact, we detected intricate associations among seminal proteins involved in sperm-egg fusion and fertilization (sperm equatorial segment protein 1, SPADH1); sperm protection (SPADH1 and PRDX5); energy metabolism and sperm motility (tubulins, ATP synthase, GPI, GAPDH); Ca²⁺-mediated events, capacitation and acrosome reaction (calmodulin^{103,104}, gelsolin¹⁰⁵); steroid binding and inflammation-related events (secretoglobin^{106,107}) and actin polymerization (gelsolin¹⁰⁵).

In summary, we report the use of multidimensional protein identification technology, mass spectrometry and bioinformatics to study the bovine seminal plasma proteome. This approach allowed the identification of 1,445 proteins, to date the largest database of seminal proteins from bulls and any ruminant species. The present research broadens our view about the complexity and functional attributes of the milieu in which sperm cells subsist after leaving the male reproductive tract. Associations between selected seminal proteins (peroxiredoxin 5, spermadhesin-1 and BSP5) and well-defined phenotypes of sperm freezability are encouraging and set the basis for future identification of potential markers of male fertility.

Materials and methods

Experimental design. In the present study, we used the well-established multidimensional protein identification technology (MudPIT)¹⁰⁸, tools of bioinformatics and statistical analysis to decipher the proteome of seminal plasma in dairy bulls with low and high sperm freezability. Phenotypes of sperm freezability were based on frozen-thawed sperm viability measured by flow cytometry and compared with the viability of samples in a large population of sires maintained at an artificial insemination company in the USA (Alta Genetics, Inc.).

Semen collection and seminal plasma samples. Seminal plasma was obtained by centrifugation of semen samples from 14 healthy Holstein bulls. There was one semen sample per bull. As previously described¹⁵, semen was collected using artificial vagina and a protease inhibitor was immediately added to all samples. Then, semen was centrifuged at 800 × *g* for 15 min (4 °C) and the supernatant (seminal plasma) was transferred into sterile tubes. Seminal plasma was centrifuged again at 10,000 × *g* for 30 min (4 °C) and the resulting fluid was pipetted into new tubes, frozen in liquid nitrogen and stored at – 80 °C until further use. Seminal plasma samples used in the current research were obtained from a commercial source, collected according to established and approved protocols (Alta Genetics, Inc.).

Determination of semen freezability. Semen samples and phenotypic characterization of the Holstein dairy sires were provided by Alta Genetics Inc. (Watertown, WI, USA), one of the largest breeding companies of the world, with semen collection and processing laboratories in six countries that provide frozen semen to over 90 countries.

Freezability scores of the bulls were based on viability of frozen-thawed sperm (%ViableSperm). In summary, fresh ejaculates were extended with commercial, one-step Egg-Yolk-Tris based extender, and then frozen using standard protocols at Alta Genetics Inc.¹⁰⁹. Post-thaw sperm viability was assessed by flow cytometry using fluorescent stain SYBR-14 with propidium iodide (SYBR-14/PI, Live/Dead Sperm Viability Kit L-7011; Thermo Fisher Scientific, USA), as previously described¹¹⁰. Membrane integrity of 10,000 frozen-thawed sperm cells from each ejaculate allowed the calculation of the percentage of viable frozen-thawed sperm. Then a unique freezability phenotype was generated to characterize post-thaw sperm viability for each bull. For the current research, we used post-thaw viability data generated over 8 years (between 2008 and 2016). The database included 100,448 ejaculates from 860 Holstein bulls, each collected at least 20 different times within approximately 3-month periods. The average post-thaw sperm viability for individual bulls was calculated, and then bulls were ranked relative to %ViableSperm of the population. Post-thaw viability of all bulls ranged from 33.03 to 67.3%, reaching an average of 54.7 ± 5.4%. For the present study, %ViableSperm of bulls with low sperm freezability (LF; *n* = 6) ranged from – 5.8 to + 0.3 and %ViableSperm of bulls with high sperm freezability (HF; *n* = 8) varied from + 4.6 to + 11.5 relative to the average %ViableSperm of the population. There were at least 50 frozen-thawed semen samples evaluated per animal (Table 4). The ejaculate from which seminal plasma was used for the proteomic analysis (described below) was not analyzed for calculation of freezability scores of the bulls. This ejaculate was obtained in 2016, right after the analyses of the database for estimation of the LF and HF phenotypes. All bulls were kept under the same housing conditions and nutritional management during semen collections at Alta Genetics facilities.

Sample preparation for mass spectrometry. Seminal plasma samples (30 µl/tube) were thawed at room temperature and subjected to protein precipitation. Briefly, cold acetone (– 20 °C) was added to seminal plasma (four times the sample volume), vortexed and placed at – 20 °C overnight. Afterwards, this mix (sample + acetone) was subjected to three sequential centrifugations at 14,000 × *g* (at 4 °C for 10 min.), always discard-

Bull #	Number of frozen-thawed semen samples	Frozen-thaw sperm viability (%)		Phenotype
		Average	Difference from population average (freezability score)	
1	79	48.9	− 5.8	LF
2	107	49.2	− 5.5	LF
3	194	52.7	− 2.0	LF
4	264	54.8	− 0.1	LF
5	71	54.9	0.2	LF
6	229	55.0	0.3	LF
Avg ± SE	157 ± 30.7	52.6 ± 1.1	− 2.2 ± 1.1	
7	138	59.3	4.6	HF
8	81	59.9	5.2	HF
9	113	61.9	7.3	HF
10	153	62.3	7.7	HF
11	207	62.8	8.1	HF
12	266	63.0	8.3	HF
13	50	64.4	9.7	HF
14	116	66.2	11.5	HF
Avg ± SE	141 ± 22.9	64.5 ± 0.5	7.8 ± 0.7*	

Table 4. Viability of frozen-thawed sperm from dairy bulls, as determined by flow cytometry. Bulls had low (LF) or high (HF) sperm freezability phenotypes based on the percentage deviation of the average post-thaw viability of sperm measured in the population of all bulls. Population average of frozen-thaw sperm viability was 54.7%. * $p < 0.001$.

ing the supernatant and resuspending the protein pellet. Following the last spin, the pellet was left on the bench for air dry and then frozen at -80°C . An aliquot of the precipitated protein samples was used to determine the protein concentration using the Pierce BCA Protein Assay Kit (Thermo Scientific, USA).

Precipitated proteins (50 μg) were dissolved in 8 M urea, 100 mM Tris pH 8.5 (60 μl), mixed with 0.3 μl 1 M TCEP—tris(2-carboxyethyl) phosphine and incubated at room temperature (RT) for 20 min. Then, 6.6 μl 500 mM 2-chloro-acetamide was added to the solution and incubated for 15 min in the dark (at RT). Samples diluted with 100 mM Tris pH 8.5 were mixed with 100 mM CaCl_2 to a final conc. of 1 mM. Then, trypsin (0.5 $\mu\text{g}/\mu\text{l}$; Promega, USA) was added at 1:20 ratio, followed by incubation at 37°C in the dark for 14 h. Trypsin reaction was stopped by adding 13.5 μl 90% formic acid. Samples were finally centrifuged at $14,000 \times g$ for 15 min, transferred to a new tube and kept at -80°C .

Liquid chromatography-mass spectrometry (LC-MS) analysis. Seminal plasma samples were subjected to MudPIT¹⁰⁸. This analysis was carried out as two technical replicates in which each run used 25 μg of protein digest from the same animal samples. An HPLC (Agilent 1100 series) was coupled to an LTQ Velos Orbitrap (Thermo Fisher, USA) mass spectrometer equipped with a nano-electrospray ionization (ESI) source. A fused-silica microcapillary column (100 μm i.d.) was pulled with a Model P-2000 laser puller (Sutter Instrument Co., Novato, CA). A trap column was packed in-house with 3 cm of strong cation exchange resin (Partisphere SCX; Whatman, Clifton, NJ, USA) and 3 cm of 5- μm Aqua C18 resin (Phenomenex, USA). The trap was connected to an analytical C18 column (~15 cm fused silica; i.d. 100 μm) packed with a 3- μm Aqua C18 resin (Phenomenex, USA) and then installed on the LC-MS platform.

A fully automated 18-h, 10-step gradient (0, 10, 20, 30, 40, 50, 70, 80, 90, and 100%) was carried out on each sample. The three buffer solutions used for the chromatography were buffer A (95:5:0.1 water/acetonitrile/formic acid, v/v/v), buffer B (20:80:0.1 water/acetonitrile/formic acid, v/v/v), and buffer C (95:5:0.1 water/acetonitrile/formic acid, v/v/v with 500 mM ammonium acetate). The flow-rate was set to 400 nL/min. The mass spectrometer was operated in data-dependent mode. Each MS full scan was acquired in the orbitrap with a resolving power of 60,000 at 400 m/z. The 20 most abundant ions were selected for fragmentation via collision induced dissociation. Normalized collision energy was set to 35% and product ion scans were acquired in the ion trap.

Data analysis

Protein identification was performed with Integrated Proteomics Pipeline (IP2—<https://www.integratedproteomics.com>). Raw files were extracted from Thermo raw files using RawConverter. Tandem spectra were searched with ProLuCID¹¹¹ against a *Bos Taurus* database that was combined with a list of contaminant proteins (Uniprot release date 2018–10), and a target decoy strategy was used. Data set was searched with 50 ppm (precursor and fragment mass tolerances) and carbamidomethylation was selected as static modification. Search results were filtered with DTASelect^{112,113} where a minimum of two peptides per protein and protein false discovery rate (FDR) < 1% were required for successful protein identification. Census¹¹⁴ used protein identification results from DTASelect and generated chromatogram for each identified peptide. To increase accuracy for finding peptide

precursors, we calculated person Pearson product-moment correlation coefficient comparing theoretical and experimental isotope distributions to minimize false peak detection.

Statistical analysis. Protein intensity data generated by label free analysis were evaluated using SAS University Edition¹¹⁵. Following normality check, protein intensities in bulls of low and high sperm freezability were compared by two-tailed t test. Proteins with different abundances ($p < 0.05$) in the two groups of bulls were subjected to multivariate analysis using MetaboAnalyst 4.0 (<https://www.metaboanalyst.ca>). For this type of analysis, protein data were normalized by the sum and subjected to pareto scaling (mean-centered and divided by the square root of the standard deviation of each variable). Partial-Least Squares Discriminant Analysis (PLS-DA) was applied to differentiate classes in the complex protein datasets¹⁵ and Variable Importance in Projection (VIP) to identify seminal proteins for meaningful characterization of bulls with low and high sperm freezability phenotypes. For regression analysis, the freezability score of bulls (%ViableSperm) was used as the dependent variable and log-transformed abundances of proteins with the 15 highest VIP scores, as independent ones. The regression model was evaluated using a stepwise strategy of SAS package¹¹⁵. Independent variables were kept in the model if $p < 0.05$. Pearson's correlations were also analyzed among abundances of seminal plasma proteins with the highest VIP scores¹¹⁵.

Gene ontology, analysis of functional clusters and in silico protein–protein interactions. Proteins identified in bovine seminal plasma using Integrated Proteomics Pipeline (IP2) were also evaluated according to gene ontology terms for biological process and molecular function, based on UniProtKB and EBI databases. Moreover, functional clusters associated with seminal plasma proteins were analyzed through DAVID platform (DAVID Functional Annotation Bioinformatics Analysis—<https://david.ncifcrf.gov>)¹¹⁶. For this analysis, 1,445 Uniprot accession numbers were uploaded in the DAVID platform and clusters were defined according to enrichment scores and p-values. The STRING (<https://string-db.org>) version 11.0 database¹⁵ was used for in silico analyses of networks for seminal plasma proteins significantly associated with sperm freezability scores of the bulls.

Received: 1 March 2020; Accepted: 22 July 2020

Published online: 04 September 2020

References

- Grötter, L. G., Cattaneo, L., Marini, P. E., Kjelland, M. E. & Ferré, L. B. Recent advances in bovine sperm cryopreservation techniques with a focus on sperm post-thaw quality optimization. *Reprod. Domest. Anim.* **54**, 655–665 (2019).
- Pukazhenthil, B. S. Saving wild ungulate diversity through enhanced management and sperm cryopreservation. *Fertil. Dev.* **28**, 1133–1144 (2016).
- Rozati, H., Handley, T. & Jayasena, C. N. Process and pitfalls of sperm cryopreservation. *J. Clin. Med.* **6**, pii: E89 (2017).
- Tournaye, H., Dohle, G. R. & Barratt, C. L. Fertility preservation in men with cancer. *Lancet* **384**, 1295–1301 (2014).
- Hezavehei, M. *et al.* Sperm cryopreservation: A review on current molecular cryobiology and advanced approaches. *Reprod. Biomed. Online* **37**, 327–339 (2018).
- Amidi, F., Pazhohan, A., Shabani Nashtaei, M., Khodarahmian, M. & Nekoonam, S. The role of antioxidants in sperm freezing: A review. *Cell Tissue Bank* **17**, 745–756 (2016).
- Rego, J. P. *et al.* Proteomic analysis of seminal plasma and sperm cells and their associations with semen freezability in Guzerat bulls. *J. Anim. Sci.* **94**, 5308–5320 (2016).
- Kumar, A., Prasad, J. K., Srivastava, N. & Ghosh, S. K. Strategies to minimize various stress-related freeze-thaw damages during conventional cryopreservation of mammalian spermatozoa. *Biopreserv. Biobank* **17**, 603–612 (2019).
- Thurston, L. M., Watson, P. E., Mileham, A. J. & Hol, W. V. Morphologically distinct sperm subpopulations defined by Fourier shape descriptors in fresh ejaculates correlate with variation in boar semen quality following cryopreservation. *J. Androl.* **22**, 382–394 (2001).
- Moura, A. A. *et al.* Seminal plasma proteins and metabolites: Effects on sperm function and potential as fertility markers. *Anim. Reprod.* **15**, 691–702 (2018).
- Camargo, M., Intasqui, P. & Bertolla, R. P. Understanding the seminal plasma proteome and its role in male fertility. *Basic Clin. Androl.* **28**, 6 (2018).
- Plante, G., Prud'homme, B., Fan, J., Lafleur, M. & Manjunath, P. Evolution and function of mammalian binder of sperm proteins. *Cell Tissue Res.* **363**, 105–127 (2016).
- Pini, T. *et al.* Binder of sperm proteins protect ram spermatozoa from freeze-thaw damage. *Cryobiology* **82**, 78–87 (2018).
- Moura, A. A., Chapman, D. A. & Killian, G. J. Proteins of the accessory sex glands associated with the oocyte-penetrating capacity of cauda epididymal sperm from holstein bulls of documented fertility. *Mol. Reprod. Dev.* **74**, 214–222 (2007).
- Viana, A. G. A. *et al.* Proteomic landscape of seminal plasma associated with dairy bull fertility. *Sci. Rep.* **8**, 16323 (2018).
- Fernández-Gago, R., Domínguez, J. C. & Martínez-Pastor, F. Seminal plasma applied post-thawing affects boar sperm physiology: A flow cytometry study. *Theriogenology* **80**, 400–410 (2013).
- Torres, M. A. *et al.* Seminal plasma arising from the whole boar sperm-rich fraction increases the stability of sperm membrane after thawing. *J. Anim. Sci.* **94**, 1906–1912 (2016).
- Yeste, M. *et al.* The increase in phosphorylation levels of serine residues of protein HSP70 during holding time at 176C is concomitant with a higher cryotolerance of boar spermatozoa. *PLoS ONE* **9**, e90887 (2014).
- Rodríguez-Villamil, P. *et al.* Purification of binder of sperm protein 1 (BSP1) and its effects on bovine in vitro embryo development after fertilization with ejaculated and epididymal sperm. *Theriogenology* **85**, 540–554 (2016).
- Gonçalves, R. F., Chapman, D. A., Bertolla, R. P., Eder, I. & Killian, G. J. Pre-treatment of cattle semen or oocytes with purified milk osteopontin affects in vitro fertilization and embryo development. *Anim. Reprod. Sci.* **108**, 375–383 (2008).
- Hao, Y. *et al.* Osteopontin improves in vitro development of porcine embryos and decreases apoptosis. *Mol. Reprod. Dev.* **75**, 291–298 (2008).
- Boccia, L. *et al.* Osteopontin improves sperm capacitation and in vitro fertilization efficiency in buffalo (*Bubalus bubalis*). *Theriogenology* **80**, 212–217 (2013).

23. Jiang, H. Y. *et al.* The growth arrest specific gene (*gas6*) protein is expressed in abnormal embryos sired by male golden hamsters with accessory sex glands removed. *Anat. Embryol. (Berl)*. **203**, 343–355 (2001).
24. Chan, O. C., Chow, P. H., O, W. S. Total ablation of paternal accessory sex glands curtails developmental potential in preimplantation embryos in the golden hamster. *Anat. Embryol. (Berl)*. **204**, 117–122 (2001).
25. Sharkey, D. J., Macpherson, A. M., Tremellen, K. P. & Robertson, S. A. Seminal plasma differentially regulates inflammatory cytokine gene expression in human cervical and vaginal epithelial cells. *Mol. Hum. Reprod.* **13**, 491–501 (2007).
26. Chen, J. C. *et al.* Seminal plasma induces global transcriptomic changes associated with cell migration, proliferation and viability in endometrial epithelial cells and stromal fibroblasts. *Hum. Reprod.* **29**, 1255–1270 (2014).
27. Maranesi, M. *et al.* New insights on a NGF-mediated pathway to induce ovulation in rabbits (*Oryctolagus cuniculus*). *Biol. Reprod.* **98**, 634–643 (2018).
28. Ratto, M. H., Berland, M. A., Silva, M. E. & Adams, G. New insights of the role of β -NGF in the ovulation mechanism of induced ovulating species. *Reproduction* **157**, R199–R207 (2019).
29. Gilany, K., Minaei-Tehrani, A., Savadi-Shiraz, E., Rezaadoost, H. & Lakpour, N. Exploring the human seminal plasma proteome: An unexplored gold mine of biomarker for male infertility and male reproduction disorder. *J. Reprod. Infertil.* **16**, 61–71 (2015).
30. Schirmer, E. C., Yates, J. R. 3rd. & L, Gerace. MudPIT: A powerful proteomics tool for discovery. *Discov. Med.* **3**, 38–39 (2003).
31. Moura, A. A., Chapman, D. A., Koc, H. & Killian, G. J. A comprehensive proteomic analysis of the accessory sex gland fluid from mature Holstein bulls. *Anim. Reprod. Sci.* **98**, 169–188 (2007).
32. Kelly, V. C. *et al.* Characterization of bovine seminal plasma by proteomics. *Proteomics* **6**, 5826–5833 (2006).
33. Rego, J. P. *et al.* Seminal plasma proteome of electroejaculated *Bos indicus* bulls. *Anim. Reprod. Sci.* **148**, 1–17 (2014).
34. Harshan, H. M. *et al.* Identification of PDC-109-like protein(s) in buffalo seminal plasma. *Anim. Reprod. Sci.* **115**, 306–311 (2009).
35. Bergeron, A., Villemure, M., Lazure, C. & Manjunath, P. Isolation and characterization of the major proteins of ram seminal plasma. *Mol. Reprod. Dev.* **71**, 461–470 (2005).
36. Souza, C. E. *et al.* Proteomic analysis of the reproductive tract fluids from tropically-adapted Santa Ines rams. *J. Proteomics*. **75**, 4436–4456 (2012).
37. Villemure, M., Lazure, C. & Manjunath, P. Isolation and characterization of gelatin-binding proteins from goat seminal plasma. *Reprod. Biol. Endocrinol.* **1**, 39 (2003).
38. Calvete, J. J., Reinert, M., Sanz, L. & Topfer-Petersen, E. Effect of glycosylation on the heparin-binding capability of boar and stallion seminal plasma proteins. *J. Chromatogr. A*. **711**, 167–173 (1995).
39. Bezerra, M. M. *et al.* Major seminal plasma proteome of rabbits and associations with sperm quality. *Theriogenology* **128**, 156–166 (2019).
40. Suarez, S. S. Mammalian sperm interactions with the female reproductive tract. *Cell Tissue Res.* **363**, 185–194 (2016).
41. Moura, A. A., Koc, H., Chapman, D. A. & Killian, G. J. Identification of accessory sex gland fluid proteins as related to fertility indexes of dairy bulls: A proteomic approach. *J. Androl.* **27**, 201–211 (2006).
42. Brito, M. F. *et al.* Label-free proteome of water buffalo (*Bubalus bubalis*) seminal plasma. *Reprod. Domest. Anim.* **53**, 1243–1246 (2018).
43. Melo, L. M. *et al.* Buck (*Capra hircus*) genes encode new members of the spermadhesin family. *Mol. Reprod. Dev.* **75**, 8–16 (2008).
44. González-Cadavid, V. *et al.* Seminal plasma proteins of adult boars and correlations with sperm parameters. *Theriogenology* **82**, 697–707 (2014).
45. Santos, E. A. *et al.* Protein profile of the seminal plasma of collared peccaries (*Pecari tajacu* Linnaeus, 1758). *Reproduction* **147**, 753–764 (2014).
46. Töpfer-Petersen, E. *et al.* Spermadhesins: A new protein family. Facts, hypotheses and perspectives. *Andrologia*. **30**, 217–24 (1998).
47. Ekhlasi-Hundrieser, M. *et al.* Spermadhesin AQN1 is a candidate receptor molecule involved in the formation of the oviductal sperm reservoir in the pig. *Biol. Reprod.* **73**, 536–545 (2005).
48. Zigo, M., Jonakova, V., Manaskova-Postlerova, P., Kerns, K. & Sutovsky, P. Ubiquitin-proteasome system participates in the de-aggregation of spermadhesin and DQH protein during boar sperm capacitation. *Reproduction*. **157**, 283–295 (2019).
49. Janiszewska, E. & Kratz, E. M. Could the glycosylation analysis of seminal plasma clusterin become a novel male infertility biomarker?. *Mol. Reprod. Dev.* **87**, 515–524 (2020).
50. Humphreys, D. T., Carver, J. A., Easterbrook-Smith, S. B. & Wilson, M. R. Clusterin has chaperone-like activity similar to that of small heat shock proteins. *J. Biol. Chem.* **274**, 6875–6881 (1999).
51. Merlotti, A. *et al.* Fucosylated clusterin in semen promotes the uptake of stress-damaged proteins by dendritic cells via DC-SIGN. *Hum. Reprod.* **30**, 1545–1556 (2015).
52. Boe-Hansen, G. B. *et al.* Seminal plasma proteins and their relationship with percentage of morphologically normal sperm in 2-year-old Brahman (*Bos indicus*) bulls. *Anim. Reprod. Sci.* **162**, 20–30 (2015).
53. Bailey, R. & Griswold, M. D. Clusterin in the male reproductive system: localization and possible function. *Mol. Cell Endocrinol.* **151**, 17–23 (1999).
54. Aquino-Cortez, A. *et al.* Proteomic characterization of canine seminal plasma. *Theriogenology* **95**, 178–186 (2017).
55. Denhardt, D. T. The third international conference on osteopontin and related proteins, San Antonio, Texas. *Calcif Tissue Int.* **74**, 213–219 (2002).
56. Boulefour, W. *et al.* The role of the SIBLING, Bone Sialoprotein in skeletal biology: Contribution of mouse experimental genetics. *Matrix Biol.* **52**(54), 60–77 (2016).
57. Souza, C. E., Moura, A. A., Monaco, E. & Killian, G. J. Binding patterns of bovine seminal plasma proteins A1/A2, 30 kDa and osteopontin on ejaculated sperm before and after incubation with isthmic and ampullary oviductal fluid. *Anim. Reprod. Sci.* **105**, 72–89 (2008).
58. Erikson, D. W., Way, A. L., Chapman, D. A. & Killian, G. J. Detection of osteopontin on Holstein bull spermatozoa, in cauda epididymal fluid and testis homogenates, and its potential role in bovine fertilization. *Reproduction* **133**, 909–917 (2008).
59. Monaco, E. *et al.* Effect of osteopontin (OPN) on in vitro embryo development in cattle. *Theriogenology* **71**, 450–457 (2009).
60. Cancel, A. M., Chapman, D. A. & Killian, G. J. Osteopontin is the 55-kilodalton fertility-associated protein in Holstein bull seminal plasma. *Biol. Reprod.* **57**, 1293–1301 (1997).
61. Edwards, D. R., Handsley, M. M. & Pennington, C. J. The ADAM metalloproteinases. *Mol. Aspects Med.* **29**, 258–289 (2008).
62. McCauley, T. C., Zhang, H. M., Bellin, M. E. & Ax, R. L. Identification of a heparin-binding protein in bovine seminal fluid as tissue inhibitor of metalloproteinases-2. *Mol. Reprod. Dev.* **58**, 336–341 (2001).
63. Belardin, L. B. *et al.* Semen levels of matrix metalloproteinase (MMP) and tissue inhibitor of metalloproteinases (TIMP) protein families members in men with high and low sperm DNA fragmentation. *Sci. Rep.* **9**, 10234 (2019).
64. du Plessis, S. S., Agarwal, A., Mohanty, G. & van der Linde, M. Oxidative phosphorylation versus glycolysis: What fuel do spermatozoa use?. *Asian J. Androl.* **17**, 230–235 (2015).
65. Moura, A. A., Chapman, D. A., Koc, H. & Killian, G. J. Proteins of the cauda epididymal fluid associated with fertility of mature dairy bulls. *J. Androl.* **27**, 534–541 (2006).
66. Kishimoto, Y., Hiraiwa, M. & O'Brien, J. S. Saposins: Structure, function, distribution, and molecular genetics. *J. Lipid Res.* **33**, 1255–1267 (1992).

67. Morales, C. R., Zhao, Q., El-Alfy, M. & Suzuki, K. Targeted disruption of the mouse prosaposin gene affects the development of the prostate gland and other male reproductive organs. *J. Androl.* **21**, 765–775 (2000).
68. Amann, R. P., Seidel, G. E. Jr. & Brink, Z. A. Exposure of thawed frozen bull sperm to a synthetic peptide before artificial insemination increases fertility. *J. Androl.* **20**, 42–46 (1999).
69. Amann, R. P., Shabanowitz, R. B., Huszar, G. & Broder, S. J. Increased in vitro binding of fresh and frozen-thawed human sperm exposed to a synthetic peptide. *J. Androl.* **20**, 655–660 (1999).
70. Hirohashi, N. & Yanagimachi, R. Sperm acrosome reaction: Its site and role in fertilization. *Biol. Reprod.* **99**, 127–133 (2018).
71. Tanaka, K. The proteasome: Overview of structure and functions. *Proc. Jpn. Acad. Ser. B Phys. Biol. Sci.* **85**, 12–36 (2009).
72. Sutovsky, P. Ubiquitin-dependent proteolysis in mammalian spermatogenesis, fertilization, and sperm quality control: Killing three birds with one stone. *Microsc. Res. Tech.* **61**, 88–102 (2003).
73. Lippert, T. H., Seeger, H., Schieferstein, G. & Voelter, W. Immunoreactive ubiquitin in human seminal plasma. *J. Androl.* **14**, 130–131 (1993).
74. Baska, K. M. *et al.* Mechanism of extracellular ubiquitination in the mammalian epididymis. *J. Cell Physiol.* **215**, 684–696 (2008).
75. Rickard, J. P. *et al.* Variation in seminal plasma alters the ability of ram spermatozoa to survive cryopreservation. *Reprod. Fertil. Dev.* **28**, 516–523 (2016).
76. Greube, A., Müller, K., Töpfer-Petersen, E., Herrmann, A. & Müller, P. Influence of the bovine seminal plasma protein PDC-109 on the physical state of membranes. *Biochemistry* **40**, 8326–8334 (2001).
77. Kim, J. S., Soucek, J., Matousek, J. & Raines, R. T. Catalytic activity of bovine seminal ribonuclease is essential for its immunosuppressive and other biological activities. *Biochem. J.* **308**, 547–550 (1995).
78. Codognoto, V. M. *et al.* Functional insights into the role of seminal plasma proteins on sperm motility of buffalo. *Anim. Reprod. Sci.* **195**, 251–258 (2018).
79. Rickard, J. P. *et al.* The identification of proteomic markers of sperm freezing resilience in ram seminal plasma. *J. Proteomics*. **126**, 303–311 (2015).
80. Moura, A. A., Souza, C. E., Stanley, B. A., Chapman, D. A. & Killian, G. J. Proteomics of cauda epididymal fluid from mature Holstein bulls. *J. Proteomics*. **73**, 2006–2020 (2010).
81. Einspanier, R. *et al.* Localization and concentration of a new bioactive acetic seminal fluid protein (aSFP) in bulls (*Bos taurus*). *J. Reprod. Fertil.* **98**, 241–244 (1993).
82. Schöneck, C., Braun, J. & Einspanier, R. Sperm viability is influenced in vitro by the bovine seminal protein aSFP: Effects on motility, mitochondrial activity and lipid peroxidation. *Theriogenology* **45**, 633–642 (1996).
83. Robert, M. & Gagnon, C. Purification and characterization of the active precursor of a human sperm motility inhibitor secreted by the seminal vesicles: Identity with semenogelin. *Biol. Reprod.* **55**, 813–821 (1996).
84. Schröter, F., Müller, K., Müller, P., Krause, E. & Braun, B. C. Recombinant expression of porcine spermadhesin AWN and its phospholipid interaction: Indication for a novel lipid binding property. *Reprod. Domest. Anim.* **52**, 585–595 (2017).
85. Rhee, S. G. Overview on peroxiredoxin. *Mol. Cells*. **39**, 1–5 (2016).
86. Knoops, B., Argyropoulou, V., Becker, S., Ferté, L. & Kuznetsova, O. Multiple roles of peroxiredoxins in inflammation. *Mol. Cells*. **39**, 60–64 (2016).
87. Ismail, T., Kim, Y., Lee, H., Lee, D. S. & Lee, H. S. Interplay between mitochondrial peroxiredoxins and ROS in cancer development and progression. *Int. J. Mol. Sci.* **20**, 4407 (2019).
88. Agarwal, A., Durairajanayagam, D., Halabi, J., Peng, J. & Vazquez-Levin, M. Proteomics, oxidative stress and male infertility. *Rev. Reprod. Biomed. Online*. **29**, 32–58 (2014).
89. Hamada, A. *et al.* Two-dimensional differential in-gel electrophoresis-based proteomics of male gametes in relation to oxidative stress. *Fertil. Steril.* **99**, 1216–1226, e2 (2013).
90. Sharma, R. *et al.* Proteomic analysis of human spermatozoa proteins with oxidative stress. *Reprod. Biol. Endocrinol.* **11**, 48 (2013).
91. Matsuki, S., Sasagawa, I., Iuchi, Y. & Fujii, J. Impaired expression of peroxiredoxin 4 in damaged testes by artificial cryptorchidism. *Redox Rep.* **7**, 276–278 (2002).
92. Nagdas, S. K., Buchanan, T. & Raychoudhury, S. Identification of peroxiredoxin-5 in bovine cauda epididymal sperm. *Mol. Cell Biochem.* **387**, 113–121 (2014).
93. Kierszenbaum, A. L. Sperm axoneme: A tale of tubulin posttranslational diversity. *Mol. Reprod. Dev.* **62**, 1–3 (2002).
94. Inaba, K. Sperm flagella: Comparative and phylogenetic perspectives of protein components. *Mol. Hum. Reprod.* **17**, 524–538 (2011).
95. Teixeira, F. K. *et al.* ATP synthase promotes germ cell differentiation independent of oxidative phosphorylation. *Nat. Cell Biol.* **17**, 689–696 (2015).
96. Collins, C. M., Malacrida, B., Burke, C., Kiely, P. A. & Dunleavy, E. M. ATP synthase F1 subunits recruited to centromeres by CENP-A are required for male meiosis. *Nat. Commun.* **9**, 2702 (2018).
97. Guo, Y. *et al.* Proteomics analysis of asthenozoospermia and identification of glucose-6-phosphate isomerase as an important enzyme for sperm motility. *J. Proteomics*. **208**, 103478 (2019).
98. Zong, M. *et al.* Glucose-6-phosphate isomerase promotes the proliferation and inhibits the apoptosis in fibroblast-like synovocytes in rheumatoid arthritis. *Art. Res. Ther.* **17**, 100 (2015).
99. Miki, K. *et al.* Glyceraldehyde 3-phosphate dehydrogenase-S, a sperm-specific glycolytic enzyme, is required for sperm motility and male fertility. *PNAS* **101**, 16501–16506 (2004).
100. Westhoff, D. & Kamp, G. Glyceraldehyde 3-phosphate dehydrogenase is bound to the fibrous sheath of mammalian spermatozoa. *J. Cell Sci.* **110**, 1821–1829 (1997).
101. Herrero, M. B. *et al.* Mouse SLLP1, a sperm lysozyme-like protein involved in sperm-egg binding and fertilization. *Dev. Biol.* **284**, 126–142 (2005).
102. Fujihara, Y. *et al.* Sperm equatorial segment protein 1, SPESP1, is required for fully fertile sperm in mouse. *J. Cell Sci.* **123**, 1531–1536 (2010).
103. Marin-Briggiler, C. I. *et al.* Evidence of the presence of calcium/calmodulin-dependent protein kinase IV in human sperm and its involvement in motility regulation. *J. Cell Sci.* **118**, 2013–2022 (2005).
104. Zeng, H.-T. & Tulsiani, D. R. P. Calmodulin antagonists differentially affect capacitation-associated protein tyrosine phosphorylation of mouse sperm components. *J. Cell Sci.* **116**, 1981–1989 (2003).
105. Finkelstein, M., Etkovitz, N. & Breitbart, H. Role and regulation of sperm gelsolin prior to fertilization. *J. Biol. Chem.* **285**, 39702–39709 (2010).
106. Luconi, M. *et al.* Uteroglobin and transglutaminase modulate human sperm functions. *J. Androl.* **21**, 676–688 (2000).
107. Jackson, B. C. *et al.* Update of the human secretoglobin (SCGB) gene superfamily and an example of ‘evolutionary bloom’ of androgenbinding protein genes within the mouse Scgb gene superfamily. *Hum. Genom.* **6**, 691–702 (2000).
108. Washburn, M. P., Wolters, D. & Yates, J. R. 3rd. Large-scale analysis of the yeast proteome by multidimensional protein identification technology. *Nat. Biotechnol.* **19**, 242–247 (2001).
109. Pace, M. M., Sullivan, J. J., Elliott, F. I., Graham, E. F. & Coulter, G. H. Effects of thawing temperature, number of spermatozoa and spermatozoal quality on fertility of bovine spermatozoa packaged in 5-ml French straws. *J. Anim. Sci.* **53**, 693–701 (1981).

110. Nagy, S., Jansen, J., Topper, E. K. & Gadella, B. M. A triple-stain flow cytometric method to assess plasma and acrosome-membrane integrity of cryopreserved bovine sperm immediately after thawing in presence of egg-yolk particles. *Biol. Reprod.* **68**, 1828–1835 (2003).
111. Xu, T. *et al.* ProLuCID: An improved SEQUEST-like algorithm with enhanced sensitivity and specificity. *J. Proteomics.* **129**, 16–24 (2015).
112. Cociorva, D., L. Tabb D. & Yates, J. R. *Validation of Tandem Mass Spectrometry Database Search Results Using DTASelect in Current Protocols in Bioinformatics.* Unit 13.4 (Baxevanis, A. D. *et al.* 2007).
113. Tabb, D. L., McDonald, W. H. & Yates, J. R. III. DTASelect and contrast: Tools for assembling and comparing protein identifications from shotgun proteomics. *J Proteome Res.* **1**, 21–26 (2002).
114. Park, S. K., Venable, J. D., Xu, T. & Yates, J. R. 3rd. A quantitative analysis software tool for mass spectrometry-based proteomics. *Nat. Methods.* **5**, 319–322 (2008).
115. SAS Institute Inc. SAS/IML[®] 14.1 User's Guide. (SAS Institute Inc, Cary, 2015).
116. Huang, D. W., Sherman, B. T. & Lempicki, R. A. Systematic and integrative analysis of large gene lists using DAVID bioinformatics resources. *Nat. Protoc.* **4**, 44–57 (2009).

Author contributions

F.P. Gomes, A.A. Moura, E. Memili, A. Kaya and J.R. Yates contributed to the study design. Gomes, C.F. Costa and Moura performed sample preparations and mass spectrometry analyses. R. Park, A.G. Viana and Moura analyzed the protein data, conducted bioinformatics and statistical analyses. A. Kaya, E. Topper and Memili planned the analysis of sperm freezability scores and bull phenotypes and provided the seminal plasma samples for the study. All authors contributed to data interpretation and article preparation.

Funding

Funding for this work was provided by the National Institute of Health (P41 GM103533). Partial funding was also provided by The Brazilian Council for the Development of Research and Technology (CNPq; grant # 31160/2017-1), Mississippi Agricultural and Forestry Experiment Station, and by Alta Genetics, Inc., Madison, WI, USA. Authors also thank the Fulbright Foundation for supporting A. A. Moura as visiting investigator at the Scripps Research Institute, CA, USA. The authors thank Dr. Claire Delahunty for helpful discussions.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information is available for this paper at <https://doi.org/10.1038/s41598-020-71015-9>.

Correspondence and requests for materials should be addressed to J.R.Y. or A.A.M.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2020