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2	A technical assessment of the porcine ejaculated spermatozoa for a sperm specific RNA-
3	seq analysis
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- 28 Keywords:
- boar sperm purification; sperm recovery rate; semen quality; RNA yield; RNA-seq.
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31 Abbreviations

- 32 FPKM Fragments Per Kilobase of transcript per Million mapped reads
- 33 KRT1 Keratin 1
- 34 miRNA micro RNA
- 35 miscRNA miscellaneous RNA
- 36 Mt rRNA mitochondrial ribosomal RNA
- 37 Mt tRNA mitochondrial transference RNA
- 38 OAZ3 Ornithine Decarboxylase Antizyme 3
- 39 ORT Osmotic Resistance Test
- 40 piRNA Piwi-interacting RNA
- 41 PRM1 Protamine 1
- 42 PTPRC Protein tyrosine phosphatase receptor type C
- 43 rRNA ribosomal RNA.
- 44 snoRNA small nucleolar RNA

45	snRNA - small nuclear RNA
46	SRR – Sperm Recovery Rate
47	tRNA - transfer RNA
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### 70 Abstract

The study of the boar sperm transcriptome by RNA-seq can provide relevant information on 71 sperm quality and fertility and might contribute to animal breeding strategies. However, the 72 73 analysis of the spermatozoa RNA is challenging as these cells harbor very low amounts of highly fragmented RNA, and ejaculates also contain other cell types with larger amounts of 74 non-fragmented RNA. Here we describe a strategy for a successful boar sperm purification, 75 76 RNA extraction and RNA-seq library preparation. Using these approaches our objectives were: (i) to evaluate the sperm recovery rate (SRR) after boar spermatozoa purification by 77 density centrifugation using the non-porcine-specific commercial reagent BoviPure<sup>TM</sup>; (ii) to 78 assess the correlation between SRR and sperm quality characters; (iii) to evaluate the 79 relationship between sperm cell RNA load and sperm quality traits and (iv) to compare 80 81 different library preparation kits for both total RNA-seq (SMARTer Universal Low Input RNA and TruSeq RNA Library Prep kit) and small RNA-seq (NEBNext Small RNA and 82 TailorMix miRNA Sample Prep v2) for high throughput sequencing. Our results show that 83 pig SRR ( $\sim 22$  %) is lower than in other mammalian species and that it is not significantly 84 dependent of the sperm quality parameters analyzed in our study. Moreover, no relationship 85 between the RNA yield per sperm cell and sperm phenotypes was found. We compared a 86 RNA-seq library preparation kit optimized for low amounts of fragmented RNA with a 87 88 standard kit designed for high amount and quality of input RNA and found that for sperm, a 89 protocol designed to work on low quality RNA is essential. We also compared two small RNA-seq kits and found not substantial differences in their performance. We propose the 90 methodological workflow described here for the RNA-seq screening of the boar spermatozoa 91 92 transcriptome.

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### 94 Introduction

RNA-seq is the current gold-standard technology for the high-throughput analysis of transcriptome 95 96 profiles, which is essential to understand the molecular basis of phenotypes (Wang et al. 2009). Thus, if studied in livestock species, this information could contribute to designing animal breeding 97 strategies. This method has been applied to map the transcriptome of multiple species and tissues 98 including spermatozoa from human (Sendler et al. 2013), mouse (Fang et al. 2014), bovine (Card et 99 100 al. 2013; Selvaraju et al. 2017) and horse (Das et al. 2013). Although these cells are considered transcriptionally and translationally inactive, they contain a wide population of coding and non-101 102 coding RNA molecules (Jodar et al. 2013), which functions have been related to spermatogenesis (Ostermeier et al. 2002), sperm chromatin reorganization (Martins and Krawetz 2005; Hamatani 103 2012), fertility potential (Jodar et al. 2015), early embryo development (Sendler et al. 2013) and 104 105 trans-generational epigenetic inheritance (Rando 2016). Hence, the study of the sperm transcriptome is crucial for understanding its biology and its role in fertility, and can be thus of interest when 106 applied to livestock research. 107

One of the main challenges for the study of the spermatozoa transcriptome is the extremely low RNA 108 yield and high fragmentation of the transcripts typically present in these cells, as the standard RNA-109 seq chemistry normally requires a large amount (1 µg) of good quality RNA. To overcome this 110 problem, new protocols to prepare high quality RNA-seq libraries from samples containing only tiny 111 amounts (200 pg) of highly degraded RNA (e.g., paraffin embedded tissues) have been developed 112 113 and already tested and compared in human sperm (Mao et al. 2014). A human mature sperm cell is estimated to contain a 600-fold lower amount of RNA than a somatic cell (Zhao et al. 2006). As a 114 typical ejaculate contains somatic cells - mainly leukocytes, keratinocytes and other type of 115 epithelial cells - as well as germ-line cells from different stages of spermatogenesis (Patil et al. 116 2013), the study of the spermatozoa transcriptome requires removing these RNA-rich cells for an 117 unbiased analysis. 118

Somatic cells can be removed from sperm by the swim-up method (Jameel 2008), somatic cell lysis 119 or by gradient centrifugation (Mao et al. 2013). Cell lysis approaches are efficient in eliminating 120 121 somatic cells, but they also cause cell membrane damage and loss of mitochondrial sequences, thus risking to lose the sperm transcripts present in the cell's midpiece (Mao et al. 2013). Gradient 122 centrifugation has been employed in the purification of sperm cells from several mammalian species 123 using different commercial solutions, such as Percoll® (Ostermeier et al. 2002), PureSperm® (Sendler 124 et al. 2013), EquiPure<sup>TM</sup> (Das et al. 2013) and BoviPure<sup>TM</sup> (Samardzija et al. 2006; Selvaraju et al. 125 2017). These gradients allow the motile mature spermatozoa to separate from somatic cells along 126 127 with immature sperm cells (Mao et al. 2013). Typically, these commercial reagents are primarily used to improve sperm quality for artificial insemination, since they select progressive motile and 128 morphologically normal spermatozoa (Samardzija et al. 2006). Although gradient centrifugation is 129 130 convenient for these purposes, it significantly decreases the final number of recovered spermatozoa (Samardzija et al. 2006), adding yet another layer of complexity for the experimental analysis of the 131 spermatozoa transcriptome. The sperm recovery rate (SRR) in gradient-based methods is mainly 132 related to sperm motility (Samardzija et al. 2006), even though additional factors are likely to be 133 involved since the number of recovered cells is lower than the expected based solely on initial 134 motility values. The boar sperm is particularly sensitive to a wide spectrum of manipulations 135 (Feugang 2017) and the use of a reagent not optimized for the porcine sperm may have detrimental 136 effects on the SRR. Taking all this information into account, one of the main aims of this work was 137 138 to evaluate the influence of different boar sperm quality traits on SRR after gradient density purification. 139

The levels of several RNA transcripts in sperm have been associated to semen quality traits and male fertility in many mammalian species including human (Jodar et al. 2012), cattle (Bissonnette et al. 2009) and pigs (Curry et al. 2011), among others. Likewise, abnormal levels of histone or protamine chromatin proteins in sperm have also been linked to spermatozoa defects (Carrell et al. 2007;

144	Hammoud et al. 2011) and it has been suggested that it could be related to spermatogenesis defects
145	and alterations in RNA amounts in sperm cells (Carrell et al. 2007) and even sperm quality (Aoki et
146	al. 2005). Thus, we searched for statistical relationship between RNA yield extracted per sperm cell
147	and semen quality traits in swine. To determine the purity (lack of DNA or somatic RNA) of this
148	sperm RNA, we developed three real-time quantitative PCRs (qPCRs) and tested its efficiency.
149	Finally, we performed high throughput sequencing of a selection of these RNAs using two library
150	preparation kits for total RNA-seq analysis ( $N = 6$ ) and two kits for small RNA-seq analysis ( $N = 3$ )
151	to compare their performances.
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## 166 **Results**

## 167 Spermatozoa Recovery Rate

SRR was calculated in 285 samples and was in general low and with high variability between 168 samples. The average SRR was 21.76 % with a standard deviation of 15.07 %. To shed light into the 169 170 biological causes of this variance, we tested the dependence between SRR and sperm phenotypes. Significant covariates were adjusted for the given parameters: head abnormalities, tail abnormalities 171 172 and distal droplets were adjusted for farm; motility 90 min for age; viability 0 min, viability 90 min, acrosomes 0 min and ORT for batch; acrosomes 90 min and neck abnormalities for farm and batch, 173 174 and distal droplets for farm, age and batch. SRR and the sperm quality characters did not present normal distribution nor a linear relationship. Thus, a multivariate nonparametric test of independence 175 was applied (Székely and Rizzo 2009). When considering the Bonferroni corrected P-value, SRR 176 177 was found independent of all the sperm quality parameters (Table 1).

178 [Table 1 near here].

# 179 **RNA yield**

Total RNA was extracted from 190 samples. The RNA yields averaged 1.6 fg per sperm cell, with ranges from 0.4 to 4.8 fg. The RNA Integrity Number (RIN) values, measured on 70 samples, was low (RIN < 2.6) and with undetectable ribosomal RNA profiles, which indicates the absence of RNA of somatic cell origin. The amount of RNA extracted per sperm cell was not significantly associated to the covariates farm, age or batch. The test of independence indicated null relationship between the total RNA extracted per sperm cell and the sperm quality phenotypes studied (Table 2).

186 [Table 2 near here].

#### 187 *qPCR controls*

The standard curves of the qPCR assays showed a good efficiency (97-97.9%). The three qPCR control assays displayed single peaks after the dissociation curve analysis, thus confirming that a single amplicon was generated in each reaction. The minus reverse transcription controls showed no amplification of *PRM1* and *PTPRC*. 70 RNA samples were subjected to qPCR, and all presented quantification cycles (Cq) ranging between 14.6 and 21.3 for the sperm-specific gene *PRM1*. In contrast, the average Cq for *PTPRC* was 35.4 in 49 sperm samples and undetectable in the other 21 samples. The  $\Delta$ Cq <sub>PTPRC-PRM1</sub>, calculated as the Cq for *PTPRC* minus the Cq for *PRM1* in the sperm samples, ranged from 14.3 to 21.3. The intergenic region was undetectable in 66 samples and had Cqs > 36 in the other 4 and the  $\Delta$ Cq <sub>Genomic-PRM1</sub> ranged from 18.4 to 21. As a comparison, the liver RNA showed a *PRM1* and *PTPRC* Cqs of 38 and 24, respectively.

# 198 RNA-seq library preparation, sequencing and mapping statistics

Four of the six samples that were chosen for total RNA-seq analysis (Sample\_1 to Sample\_6) presented  $\Delta Cq_{PTPRC-PRM1}$  ranging from 17.4 to 19.1 and undetectable levels of *PTPRC* in the other two samples. Likewise, the  $\Delta Cq_{Genomic-PRM1}$  ranged from 19.4 to 21 in three of the six samples and was undetectable in the other three.

The SMARTer and the TruSeq kits produced libraries with significantly different concentrations, 203 which ranged between 53 and 120.7 nM (total RNA yield between 0.8 and 1.8 pmol) and between 204 0.5 and 2.9 nM (0.01 – 0.09 pmol), respectively (P-value = 0.03) (Table 3). All the libraries 205 generated a similar percentage of high quality RNA-seq reads which mapped unambiguously to the 206 swine reference genome, (SMARTer : 74.9 - 85.8 % and TruSeq: 70.8 - 82.3 %) (*P*-value = 0.13) 207 (Table 3). Likewise, SMARTer yielded a higher percentage of reads uniquely mapping to annotated 208 genes (37.8 - 48.4 %) when compared to the TruSeq libraries (28.8 - 38.5 %) (*P*-value = 0.02) (Table 209 210 3). The proportion of PCR duplicates was significantly higher for the TruSeq (89.3 - 97.9%) than for the SMARTer samples (75.9 - 80.3 %) (*P*-value = 0.03) (Table 3). We identified on average, 8,562 211 and 2,522 transcripts for the SMARTer and the TruSeq, respectively (*P*-value =  $1.89 \times 10^{-4}$ ). The 212 213 SMARTer datasets presented a mean FPKM of 363 and median FPKM of 4.8, whereas the TruSeq libraries showed a mean FPKM of 3,410 and median FPKM of 12.6. 32.5% and 46.1% of the genes 214

were identified at intermediate or high abundance levels (FPKM  $\ge 10$ ) for both the SMARTer and the TruSeq, respectively.

217 [Table 3 near here].

Short RNA samples (Sample\_7 to Sample\_9) presented undetectable RNA levels for *PTPRC* and for 218 the intergenic region with the qPCR assay. Sequencing and mapping of short RNAs with the 219 NEBNext and the TailorMix displayed similar results. The proportion of reads mapping to annotated 220 features was similar for both protocols (77.4 - 82.9 %) (Table 4). Most of these reads mapped to 221 miRNAs (27.0 - 32.4 %) (Table 4), followed by mitochondrial tRNAs (22.1 - 27.3 %) and protein 222 223 coding genes (12.6 - 15.5 %) (Table 4). The remaining mapped reads corresponded to snRNAs, piRNAs and tRNAs, among others (Table 4). Some of the most abundant miRNAs have been already 224 identified in swine sperm or in other mammalian species and include miR10b and miR34c, among 225 226 others (Capra et al. 2017; Chen et al. 2017; Jodar et al. 2013).

[Table 4 near here].

Further analysis of the transcriptome profile was carried with the SMARTer datasets using the 228 totality of the reads generated in each library (between 18.5 and 26.9 million reads per sample). 229 Genes related to somatic cell contamination, PTPRC and KRT1 were absent (mean FPKM = 0.3 and 230 0, respectively) in these samples (Supplementary Table 1). On the contrary, the sperm specific PRM1 231 and OAZ3 were among the most abundant transcripts with mean FPKMs of 15,368 and 22,670, 232 respectively (Supplementary Table 1). The pattern of relative expression of these four genes in 233 234 porcine white blood cells and in ear tissue was inverted when compared to sperm. Whilst PRM1 and OAZ3 were absent, PTPRC and KRT1 were abundant in the white blood cells and in the ear RNA-seq 235 datasets, respectively (Figure 1). We also quantified the amount of other previously reported somatic 236 237 and sperm specific gene biomarkers (Jodar et al. 2016). The abundance of the epithelial CDH1, keratinocyte KRT10, leukocyte IL8, whole blood HBB and prostate KLK3 genes ranged between 0 238

- and 9 FPKM. On the contrary, the sperm-specific genes *PRM2*, *TNP1*, *ODF1* and *SMCP* showed
  average FPKMs ranging between 779 and 7,742 (Supplementary Table 1).
- 241 [Figure 1 near here].
- 242
- 243 Discussion

Although spermatozoa are considered transcriptionally inactive, there is growing evidence that the sperm RNA populations are related to spermatogenesis, fertility potential, chromatin reorganization, embryo development and transgenerational epigenetic inheritance (Bohacek and Mansuy 2015; Jodar et al. 2013). Since RNA load in spermatozoa is considerably lower than in somatic cells, an adequate separation of these populations is imperative to study the spermatozoa transcriptome. The application of purification methods decreases the final number of recovered sperm cells, and consequently the cell availability for RNA extraction.

The present study is the first to analyze the performance of porcine SRR. The purification of the boar 251 sperm using gradient centrifugation with the non-porcine-specific reagent BoviPure<sup>TM</sup> yielded highly 252 purified spermatozoa as demonstrated by qPCR ( $\Delta Cq_{PTPRC-PRM1} > 16$ ) for the vast majority (97 %) of 253 254 the 70 samples. Nonetheless, the SRR was not only much lower but also more variable (21.76  $\pm$ 15.07 %) than that described in other species such as cattle (mean SRR = 31 %), human (69 %) and 255 horse (63 %) (Allamaneni et al. 2005; Samardzija et al. 2006; Das et al. 2010). These differences 256 257 may be due to the unique characteristics of the boar sperm. For example, the motility of the pig 258 sperm after ejaculation is slower than in other species, (e.g., horse and cattle), while it is also very prone to be altered by a myriad of environmental incidences (Rodríguez-Gil and Bonet 2015). In 259 light of these singularities, we addressed the question of which sperm quality factors are influencing 260 261 SRR. The multivariate non-parametric test of independence revealed that none of the studied sperm traits were related to SRR. This is somehow unexpected, particularly for motility and cell viability, 262 263 since a positive effect between these two traits and SRR have been previously described in cattle

(Samardzija et al. 2006). The differences in the physico-chemical properties between the ejaculate 264 and the extender media in which the semen quality phenotypes are measured, and the BoviPure<sup>TM</sup> 265 reagent during centrifugation, may divergently affect semen quality. This would explain the lack of 266 dependency between the semen quality measures and SRR. A complementary hypothesis is that the 267 time and speed of the density gradient centrifugation step enables all the boar's motile sperm, either 268 fast or slow, to end up reaching the bottom of the tube, and be thus recovered. This would imply that 269 the sperm recovery with BoviPure<sup>TM</sup> is not preferentially biased toward specific sperm sub-270 populations and therefore the molecular analysis of the recovered sperm robustly reflects that of the 271 272 whole ejaculated mature sperm. Finally, SRR may be also affected by the composition and the physico-chemical characteristics of the ejaculates, which have been shown to be affected by diet 273 (Byrne et al. 2017), or abstinency in humans (Agarwal et al. 2016), which is related to the frequency 274 275 of ejaculates or the time from prior ejaculate in pigs.

Two determinant parameters for a successful transcriptome analysis are both the RNA quality and 276 yield. The RNA extraction method becomes a critical step when working with spermatozoa, since 277 these cells have low amount of highly fragmented RNA. In the present work, we chose the Trizol 278 method for RNA extraction after having tested other protocols involving commercial kits, which 279 yielded even lower RNA yields (data not shown). The average amount of RNA extracted per sperm 280 cell was 1.6 fg, a similar value to previously reported data in domestic swine (Yang et al. 2009), but 281 282 lower than human (Goodrich et al. 2013; Pessot et al. 1989) and mice (Pessot et al. 1989). The low 283 amount of RNA recovered and low RIN value is in fact an indication that the removal of somatic cells, with their large amount of non-fragmented RNA, during the cell purification steps, was highly 284 efficient. The observed variability in RNA yields between samples could be due to inter-sample 285 286 differences in the epididymosomes secreted by epididymal epithelial cells, which have been involved in post-testicular spermatogenesis and are known to contain a repertoire of RNAs (Belleannée et al. 287 2013), yet this mechanisms remains to be elucidated. 288

Spermatogenesis is a highly regulated process with many genes tightly controlling the different 289 maturation steps (Legrand and Hobbs 2017) and playing a role in the sperm's fertility potential 290 291 (Jodar et al. 2015). Our study in 190 samples suggests that the sperm quality parameters that we assessed are independent of the amount of RNA recovered - as a proxy of RNA load - per sperm cell. 292 qPCR assays were also developed with the aim to determine the presence of RNA from somatic 293 origin and gDNA contamination in our samples. Most of our samples showed at most, only traces of 294 295 *PTPRC* (68 samples displayed  $\Delta Cq_{PTPRC-PRM1} > 16$ ) and gDNA was only detected in 4 samples with  $\Delta Cq_{Genomic-PRM1} > 18.4$ . In qPCR, the amplification curve is exponential and the template doubles at 296 every cycle. This amplification follows this formula:  $X_N = X_I * 2^N$ , where N is the number of 297 amplification cycles,  $X_1$  is the number of molecules prior amplification and  $X_N$  is the number of 298 molecules after N PCR cycles. If we assume similar assay sensitivities, we can conclude that for a 299  $\Delta Cq_{PTPRC-PRM1} = 16$ , the number of molecules of *PRM1* is  $2^{16} = 65,536$  times more abundant than the 300 number of molecules of *PTPRC*. Likewise, when  $\Delta Cq_{Genomic-PRM1} = 19$ , the number of *PRM1* RNA 301 molecules is  $2^{19} = 524,288$  more abundant than the number of gDNA template. Hence, the majority 302 of the RNA samples we processed were considered of sufficient spermatozoa purity. These qPCR 303 assays can be used to determine sperm purity in porcine RNA samples and help selecting the purest 304 RNAs for further analysis to obtain a reliable an accurate spermatozoa transcriptome. We must bear 305 306 in mind that PRM1 is also expressed in round spermatids (Siffroi et al. 1998; Steger et al. 2000) but we did not find any round-shaped cells in our samples following visual inspection of smear tissue 307 308 under the microscope (Supplementary Figure 1). Thus, the presence of these cells is unlikely.

The purification and RNA extraction from boar sperm have proven to be suitable for the sequencing of total and small RNA by RNA-seq. To test the suitability of our samples for total RNA-seq analysis, we prepared sequencing libraries from six purified boar RNAs from different pigs with the SMARTer Universal Low Input RNA kit (Clontech) and with the TruSeq RNA Library Prep (Illumina) in parallel. Despite the fact that both protocols use the preferable amplification with

random primers instead of poly-dT (Mao et al. 2014), the SMARTer libraries still outperformed the 314 TruSeq in several standard RNA-seq quality control parameters. Nevertheless, this is expected as the 315 SMARTer protocol and chemistry is optimized for samples with low amount (10 ng) of highly 316 fragmented RNA as for example, formalin-fixed paraffin embedded tissues. First, although the 317 318 SMARTer protocol required less input RNA and it included a lower number of cycles in the amplification steps, it consistently yielded a much higher amount and concentration of cDNA library 319 320 (Table 3), which is crucial to obtain optimal sequencing results. Second, even though the RNA-seq metrics of the two kits were similar (Table 3), the significantly higher proportion of PCR duplicates 321 322 in the TruSeq datasets indicates a lower library complexity and number of unique transcripts. This was also indicated by the significant difference between the number of uniquely identified transcripts 323 in both kits. The SMARTer datasets yielded twice the number of transcripts than TruSeq (13,233 324 325 versus 6,642). The vast majority of the TruSeq transcripts, 6,452, were also detected in the SMARTer dataset (Figure 2.A). This suggests that a proportion of RNAs were not captured with the 326 TruSeq library preparation protocol. With the SMARTer kit we detected transcripts with lower 327 abundance than with TruSeq and ultimately, a more comprehensive profile of the sperm 328 329 transcriptome. We need to point out that there are other protocols from different providers, including Illumina, that have been designed for the RNA-seq analysis of samples with low amount and quality 330 RNA, which have not been tested in this study. Furthermore, cluster analysis of the transcript levels 331 332 shows a major kit effect, clustering together the libraries generated with the same kit rather than the 333 libraries generated from matched RNAs (Figure 2.B).

To evaluate the adequacy of our samples for the sequencing of small RNAs, we used three samples and two short RNA library prep kits, the NEBNext Small RNA Library Prep Set (New England Biolabs) and the TailorMix miRNA Sample Prep v2 (SeqMatic). Both protocols showed very similar RNA-seq metrics (Table 4) but the analysis of the NEBNext libraries evidenced first, a larger number of detected miRNAs and second, slightly more similar miRNA abundance between samples with a Pearson correlation of expression of 0.95 and 0.90 for the NEBNext and TailorMix,respectively.

341 RNA-seq is the gold standard approach for the genomic analysis of gene expression. This technology has been already applied to ejaculated sperm of different animal species such as human (Sendler et 342 343 al. 2013), mouse (Fang et al. 2014), cattle (Card et al. 2013; Selvaraju et al. 2017) or horse (Das et al. 2013). In pig so far, the spermatozoa transcriptome was explored in 2009, using medium throughput 344 345 sequencing approaches (Yang et al. 2009). The authors generated an Expressed Sequence Tag (EST) library and sequenced circa 5,000 clones using Sanger sequencing chemistry. This resulted in the 346 347 identification of 271 genes with known function or cellular localization. That study, of high quality at that time, yielded a low number of transcripts and did not offer a comprehensive view of the boar 348 sperm transcriptome (Yang et al. 2009). Current RNA-seq technologies, offer higher throughput and 349 350 thousands of transcripts are typically detected. This is clearly illustrated in our study with the SMARTer datasets, whereby 13,233 genes were identified. The small non-coding transcriptome of 351 the porcine sperm has been recently described (Chen et al. 2017). Chen and co-authors found a rich 352 population of miRNAs and lower abundances of other families of small non coding RNAs (e.g., 353 354 rRNAs, tRNAs, snRNAs) but dit not detect Piwi-interacting RNAs (piRNAs), a type of small non coding RNAs with important - yet weakly explored - functions in sperm biology. In contrast, our 355 pipeline allowed us to identify a similar catalogue of small non coding RNAs but also piRNAs 356 357 (Table 4 and Figure 2.C).

358 [Figure 2 near here].

Sperm RNA is likely to be transcriptionally inactive and contain fragmented transcripts that are remnants from spermatogenesis (Ostermeier et al. 2002) and RNA molecules that may function in signaling for embryogenesis after fertilization (Sendler et al. 2013). Hence, the study of the sperm transcriptome and the identification of its alterations could help the scientific community to identify robust, easy and non-invasive markers for sperm defects and male fertility. The purification method and RNA extraction protocol described here, together with control qPCRs to evaluate the sperm
RNA purity warrants high quality RNA-seq experiments in boar sperm.

In conclusion, we have concatenated a series of well-established protocols to first, purify spermatozoa from porcine ejaculates by gradient centrifugation, then extract RNA from the purified sperm cells and finally prepare sequencing libraries from these samples to successfully sequence the boar sperm-specific transcriptome by RNA-seq. We have also developed three qPCR assays to assess the purity of the sperm RNA and compared the quality control metrics of different total and small RNA-seq library preparation protocols. In addition, we have evaluated the boar's SRR with the BoviPure<sup>TM</sup> and found that the boar's SRR is lower than in other mammalian species and not dependent on any of the sperm quality parameters measured in our study. This recovered sperm was thereafter used for RNA extraction. RNA yield per sperm cell was also lower than other species. Moreover, we found no relationship between the quantity of RNA per sperm cell and the sperm quality traits included in the analysis. Despite these caveats of the pig sperm, we obtained sufficient sperm-specific RNA for RNA-seq studies. Thus, we recommend the methodological workflow described here for the high throughput analysis of the boar spermatozoa transcriptome.

#### 389 Material and Methods

## 390 Sperm phenotyping

From March 2015 to January 2017, specialized professionals at the farms obtained fresh ejaculates from 285 Pietrain boars kept in commercial farms. The ages of the animals ranged from 9 months to 5 years old. Sperm was collected with the hand glove method and immediately diluted (1:2) in freshly prepared commercial extender for storage at 16 °C (MR-A extender; Kubus, S.L.; Majadahonda, Spain). No animal experiment has been performed in the scope of this research.

The samples were maintained at 16 °C for a maximum time of 2 h for the phenotypic evaluation and 396 397 a maximum of 4 h for the sperm cell purification. The analysis of sperm motility was performed with the commercial Computer-Aided Sperm Analysis (CASA) system (Integrated Sperm Analysis 398 System V1.0; Proiser, Valencia, Spain) at 5 min and 90 min after incubation of the samples at 37 °C. 399 400 The percentages of sperm cell viability, structurally altered acrosomes and morphological 401 abnormalities were measured after staining the samples with the eosin-nigrosin technique after 5 and 90 min incubation at 37 °C as previously described (Bamba 1988). The osmotic resistance test (ORT) 402 was performed by incubation at 37 °C for 10 min of the sperm samples on iso- and hypo-osmotic 403 404 solutions, as previously described (Rodríguez-Gil and Rigau 1995). Sperm cell count was performed using a Neubauer cell chamber with not less than 200 cells examined. 405

# 406 Spermatozoa purification

The purification of the spermatozoa cells was performed using 3 mL of BoviPure<sup>TM</sup> (Nidacon; Mölndal, Sweden), a commercial suspension of colloidal silica particles coated with silane in an isotonic salt solution, diluted to a final ratio of 60% (v/v) with BoviDilute<sup>TM</sup> (Nidacon; Mölndal, Sweden) in 15 mL RNase-free tubes. The volume of sperm that was layered on top of the cushion varied according to its concentration, with a maximum of 1 billion cells and not exceeding 11 mL. In all cases, the minimum volume ratio of 25 % diluted BoviPure<sup>TM</sup>/semen recommended by the manufacturer was maintained. The purification was made by centrifugation at 300 x g for 20 min at

20 °C with slow acceleration and deceleration rates (Allegra X-15R, Beckman Coulter; Brea, USA). 414 After centrifugation, all the upper phases were removed and the cell pellet was transferred to a new 415 416 RNase-free 15 mL tube, washed with 10 mL of RNase-free PBS and centrifuged at 1,500 x g for 10 min at 20 °C. The supernatant was then removed and the pellet was gently resuspended in 1 mL of 417 418 RNase-free PBS. Optical microscopy was used to confirm somatic cell removal of the purified spermatozoa and sperm cell number was assessed in a Neubauer cell chamber. The resuspended 419 420 pellets were transferred to 1.5 mL RNase-free tubes and centrifuged at 1,500 x g for 10 min at 20 °C. The resulting pellet was stored at -80 °C in 1 mL of Trizol<sup>®</sup> until further use for RNA extraction. 421 422 SRR was calculated as the number of cells obtained after purification divided by the initial number of cells subjected to purification. 423

# 424 **RNA extraction**

425 Total RNA was extracted from 190 purified sperm samples, each from a different boar. The starting number of cells ranged between 48 and 200 million (mean = 143 million) according to availability. 426 First, the cells were pre-lysated using a 5 mL sterile syringe with a 25 G needle for 5 min on ice, 427 followed by 2 min of vigorous vortex. Then, 200 µL of chloroform were added to the samples and 428 429 these were incubated for 3 min at room temperature first, and centrifuged at 12,000 x g for 15 min afterwards. Supernatants were transferred to new RNase-free tubes and 500 µL of isopropanol were 430 added for RNA precipitation. Samples were then centrifuged at 12,000 x g for 10 min and the 431 432 supernatants were carefully removed. To wash the pellet, 500 µL of 75% (v/v) ethanol solution were 433 added and the samples were centrifuged at 13,000 x g for 5 min. The pellets were dried out at room temperature for 10 min and resuspended in 30 µL of ultrapure water. All the centrifugations were 434 performed at 4 °C. 435

All RNA samples were subjected to DNase treatment with the Turbo DNA-free<sup>TM</sup> kit (Life
Technologies, USA) following the manufacturer's instructions. The RNA samples were then
quantified with Qubit<sup>TM</sup> RNA HS Assay kit (Invitrogen; Carlsbad, USA). To analyze overall RNA

fragmentation, RNA integrity number (RIN) was assessed on a 2100 Bioanalyzer using the Agilent RNA 6000 Pico kit (Agilent Technologies; Santa Clara, USA). cDNA was synthesized using 2  $\mu$ L of RNA (1.7 - 38 ng) and the High Capacity cDNA Reverse Transcription kit in a final volume of 20  $\mu$ L (Applied Biosystems; Waltham, USA) following the manufacturer's protocol.

443 *qPCR controls* 

To verify that the purified samples were free of somatic cells and genomic DNA (gDNA), three 444 445 qPCR assays were developed. One assay targets Protamine 1 (PRM1) gene, which transcript is specific to later stages of spermatogenesis and ejaculated mature spermatozoa (Wykes et al. 1997) 446 447 (PRM1 forward primer: 5'-AGTAGCAAGACCACCGCACT-3'; PRM1 reverse: 5'-AGAGGGTCTTGAAGGCTGGT-3'). The second assay targets the Protein tyrosine phosphatase 448 receptor type C (PTPRC) gene, which is used as a marker of somatic cell contamination, since it is 449 450 expressed on most somatic cells and absent in spermatozoa (Das et al. 2013; Shafeeque et al. 2014) (PTPRC forward: 5'-AGAACAAGGTGGATGTCTATGGCTAT-3'; PTPRC reverse: 5'-451 TGTACTGTGCCTCCACCTGAAC-3'). The third assay an intergenic region 452 amplifies (Sscrofa10.2; chr18:25,459,856 - 25,459,926) and was designed to monitor the presence of gDNA 453 454 contamination (Intergenic forward: 5'-ACGCAGTCAGAAGCCTGTGA-3'; Intergenic reverse: 5'-TGGTGTACATGCTCCGAAGGT-3'). 455

To evaluate the performance of our qPCR assays, standard curves with serial dilutions of control 456 457 cDNA were made. For PRM1, PTPRC and gDNA qPCRs, pig cDNA from spermatozoa, liver and 458 gDNA were used as input, respectively. Liver cDNA was generated as indicated for sperm but using 459 1 µg of RNA starting material. The standard curve was generated with five ten-fold serial dilutions of the cDNA templates. The reactions were performed with 10 µL of SYBR<sup>®</sup> Select Master Mix 460 461 (Life Technologies, USA), 0.3 µM of each primer, 5 µL of cDNA (for the serial dilutions 1/5 to 1/50,000 and for the query a dilution 1/5) or DNA (from 2 pg/uL to 20 ng/uL) and ultrapure water to 462 463 a final volume of 20 µL. The thermal profile was: 50 °C for 2 min, 95 °C for 10 min and 40 cycles of 464 95 °C for 15 sec and 60 °C for 1 min. Moreover, to assess the specificity of the qPCR reactions, a 465 melting profile (95 °C for 15 sec, 60 °C for 15 sec and a gradual increase in temperature with a ramp 466 rate of 1% up to 95 °C) was programmed following the thermal cycling protocol. A minus reverse 467 transcription control was also included for the two cDNA assays (*PRM1* and *PTPRC*). The reactions 468 for the standard curves were performed in triplicate. For the queried samples (N = 70), the reactions 469 were performed in triplicate. Moreover, a liver cDNA was also included to monitor the expression of 470 *PRM1* and *PTPRC* in a somatic cell type.

### 471 *Statistical analysis*

472 R v.3.3.0 was utilized for statistical analysis. The Shapiro-Wilk test was used to assess normality of the data. One-way analysis of variance (ANOVA) was used to assess the effects of farm (N = 3), age 473 (N = 3) and batch collection day (N = 59) on SRR, fg per sperm cell and sperm quality parameters. 474 475 Significantly correlated covariates were adjusted with the R package 'limma' (Ritchie et al. 2015), considering age and farm as fixed effects and batch collection day as batch effect. The R package 476 'energy' (Rizzo and Szekely 2016) was applied to assess a multivariate nonparametric test of 477 478 independence covariates between sperm quality phenotypes and SRR and fg of RNA per sperm cell. 479 The nominal significance threshold was set to a *P*-value  $\leq 0.0041$  after Bonferroni correction for multiple testing ( $\alpha = 0.05/12 = 0.0041$ ). To determine whether the RNA-seq quality metrics of the 480 SMARTer Universal Low Input RNA and the TruSeq RNA library prep kits were significantly 481 482 different, we used the t-test for normally distributed data for reads mapped to the genome, number of 483 uniquely mapped reads and the number of detected genes, and the Wilcoxon test for the nonnormally distributed data, i.e. library concentration and proportion of PCR duplicates. The tests were 484 carried with R. 485

## 486 **RNA-seq library preparation**

Purified RNA from six ejaculates from different boars (Sample\_1 to Sample\_6) was subjected to
ribosomal RNA depletion with the Ribo-Zero Gold rRNA Removal Kit (Illumina). Depleted RNA

was then used to prepare long RNA-seq libraries with two different protocols in parallel. On the one hand, SMARTer Universal Low Input RNA library Prep kit (Clontech) was used, following the manufacturer's instructions. On the other hand, TruSeq RNA Library Prep kit (Illumina) was employed, adhering to the manufacturer's protocol with slight modifications adapted to a low amount of starting RNA yield (100 ng). The concentration of the 12 RNA libraries was quantified with the High Sensitivity DNA kit on a 2100 Bioanalizer (Agilent Technologies). The libraries were sequenced in a HiSeq2000 system (Illumina) to generate 75 bp long paired-end reads.

RNA from 3 additional sperm samples (Sample\_7 to Sample\_9) was used to compare two short RNA library Prep kits: NEBNext Small RNA Library Prep Set (New England Biolabs) and TailorMix miRNA Sample Prep v2 (SeqMatic). One sample was prepared with the NEBNext kit, another with the TailorMix, and a third sample with both kits to allow a more direct comparison of results. Libraries were prepared following the company's instructions. The three samples were quantified with the High Sensitivity DNA kit on a 2100 Bioanalizer and sequenced on a HiSeq2000 to generate 50 bp single-end reads.

## 503 Bioinformatics analysis

504 Read quality of the 12 long RNA-seq datasets was checked with FastQC v.0.11.2 (Andrews 2010). Reads were then filtered using Trimmomatic v.0.33 (Bolger et al. 2014) for read quality and adaptor 505 contamination, with a minimum Phred quality score of 20 and length of over 30 bp. Trimmed reads 506 507 were mapped to the pig reference genome (Sscrofa 10.2) with STAR v.2.5.3a (Dobin et al. 2013) 508 using the default parameters and including the Ensembl v.83 pig reference annotation (ftp://ftp.ensembl.org/pub/release-83/gtf/sus\_scrofa). Transcript abundance was quantified as 509 Fragments Per Kilobase of transcript per Million mapped reads (FPKM) with RSem v.1.3.0 (Li and 510 511 Dewey 2011) with default parameters. FPKM is a normalized measure of gene expression based on the number of reads mapping to a given gene corrected by the length of that gene and the sample 512 513 sequencing depth. To compare the performance of the SMARTer and the TruSeq protocols we

evaluated the proportion of PCR duplicates as it is a measure of the complexity of each library. To 514 allow a fair comparison of the two protocols we analyzed the same number of reads in all the 515 samples. More in detail, we randomly sub-selected 2,336,549 reads per sample since this number 516 corresponds to the lowest sequencing depth obtained. The read selection was carried with seqtk v.1.2 517 (Shen et al. 2016). The proportion of PCR duplicates was calculated with Picard Tools v.1.110 518 (http://picard.sourceforge.net) MarkDuplicates. Graphs were performed with R: venn diagram with 519 520 the R package 'VennDiagram' (Chen and Boutros 2011) and cluster dendrogram with the R package 'cluster' (Maechler et al. 2017). 521

522 We also evaluated the absence of RNA from somatic cell origin in our samples. For this we used the SMARTer libraries, which showed better outcomes, and the totality of the reads obtained for each of 523 these libraries (between 18.5 and 26.9 million reads per sample). We also included two publicly 524 525 available (http://www.ncbi.nlm.nih.gov/sra) boar RNA-seq datasets, one from whole blood cells (ERR1898477), which contains a large abundance of leukocytes and a second one from ear biopsy 526 (SRR3437133), which contains a high proportion of keratinocytes, a specialized type of epithelial 527 cells. We screened the presence of the two sperm specific genes, PRM1 and OAZ3 (Ornithine 528 Decarboxylase Antizyme 3) (Jodar et al., 2016), and two genes of somatic cell origin PTPRC 529 (expressed in most somatic cells) and KRT1 (Keratin 1), which is specific from keratinocytes. For 530 data visualization, SMARTer mapped bam files were indexed with SAMtools v.1.3.0 (Li et al. 2009) 531 and uploaded into the IGV viewer (Thorvaldsdóttir et al. 2013). We used a manual script to extract 532 533 RNA levels of tissue-specific genes as described in (Jodar et al. 2016) as an ultimately control for RNA purity. 534

The 3 small RNA-seq datasets were analyzed for read quality with FastQC v.0.11.2 (Andrews 2010) and reads were sub-sampled to 887,406 reads per library with seqtk v.1.2 (Shen et al. 2016). Library adaptors and indexes were trimmed using Cutadapt v.1.0 (Martin 2011) and filtered for read quality, with a minimum quality score of 20, and minimum length of 10 bp with Trimmomatic v.0.33 (Bolger

539	et al. 2014). Trimmed reads were mapped to the pig reference genome (Sscrofa 10.2) with Bowtie 1
540	v.1.2.0 (Langmead 2010) with default parameters but allowing 0 mismatches (-n) in 'seed' region of
541	10 bp (-1). The proportion of PCR duplicates was calculated with SAMtools v.1.3.0 (Li et al. 2009)
542	rmdup for single-end reads. RNA levels of small non-coding RNAs were calculated with Bedtools
543	v.2.17.0 (Quinlan and Hall 2010) intersect against the boar Ensembl v.83 'gtf' annotation, miRBase
544	database (Griffiths-Jones et al. 2006), piRNA database (Rosenkranz 2016), and tRNA v.2.0 database
545	(Chan and Lowe 2016).
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589	Disclosure of interest:
590	The authors report no conflict of interest
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614	Notes on	contributors
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615	ACl, AS, FQM and MG conceived and designed the experiment. FQM and ACa designed the
616	primers and carried out the qPCR analyses. FQM, MG and JN performed sperm purifications and
617	RNA extractions. MG performed statistic and bioinformatics analysis. FQM and MG analyzed the
618	data. JERG carried the phenotypic analysis. FQM, MG and AC drafted the manuscript. All authors
619	read and approved the final manuscript.
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### 796 Figure legends

797 Figure 1. Read mapping depth of sperm and somatic-specific genes in the porcine sperm, whole blood and ear RNA-seq datasets. A) Corresponds to the sperm-specific gene PRM1 (Ensembl 798 799 ID: ENSSSCG00000021337). B) Plot for the sperm-specific gene gene OAZ3 (ENSSSCG00000027091). C) Read depth along the somatic cell specific gene PTPRC 800 801 (ENSSSCG00000010908). D) Depth for the Keratinocyte specific gene KRT1 802 (ENSSSCG0000000251). The number of reads produced for the sperm datasets are between 18.5 and 26.5 million. The white blood cells and the ear RNA-seq libraries include 18.3 and 803 21.7 million reads, respectively. The scale provided on the upper left axis of each graph 804 805 indicates the raw number of reads mapped to the gene.

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Figure 2. Comparison of the RNA-seq results from both the total and the small library preparation kits. A) Venn diagram representing the 13,233 different transcripts detected in the SMARTer datasets and 6,642 for the TruSeq. The majority of the TruSeq transcripts detected (6,452) were detected in both kits. B) Cluster dendrogram of the RNA transcript levels from both kits. S: Sample. C) Size distribution of mapped sequencing reads from small RNAs in both kits.

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