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Aberrant DNA methylation patterns of spermatozoa in men with unexplained infertility

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1 Aberrant DNA methylation patterns of spermatozoa in men with 2 unexplained infertility

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Short title: Aberrant epigenetic patterns in male infertility

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28 Abstract

29 **Study question:**

30 Are there DNA methylation alterations in sperm that could explain the reduced 31 biological fertility of male partners from couples with unexplained infertility?

Summary answer: DNA methylation patterns, not only at specific loci but also at Alu
 Yb8 repetitive sequences, are altered in infertile individuals compared to fertile
 controls.

What is known already: Aberrant DNA methylation of sperm has been associated with human male infertility in patients demonstrating either deficiencies in the process of spermatogenesis or low semen quality.

Study design, size, duration: Case and control prospective study. This study compares 46 sperm samples obtained from 17 normospermic fertile men and 29 normospermic infertile patients.

Participants/materials, setting, methods: Illumina Infinium HD Human Methylation 41 42 450K arrays were used to identify genomic regions showing differences in sperm DNA 43 methylation patterns between 5 fertile and 7 infertile individuals. Additionally, global 44 DNA methylation of sperm was measured using the Methylamp Global DNA 45 Methylation Quantification Ultra kit (Epigentek) in 14 samples, and DNA methylation at several repetitive sequences (LINE-1, Alu Yb8, NBL2, D4Z4) measured by bisulfite 46 47 pyrosequencing in 44 sperm samples. A sperm-specific DNA methylation pattern was obtained by comparing the sperm methylomes with the DNA methylomes of 48 49 differentiated somatic cells using data obtained from methylation arrays (Illumina 450K) 50 of blood, neural and glial cells deposited in public databases.

51 Main results and the role of chance: In this study we conduct, for the first time, a genome-wide study to identify alterations of sperm DNA methylation in individuals with 52 53 unexplained infertility that may account for the differences in their biological fertility 54 compared to fertile individuals. We have identified 2,752 CpGs showing aberrant DNA 55 methylation patterns, and more importantly, these differentially methylated CpGs were significantly associated with CpG sites which are specifically methylated in sperm when 56 57 compared to somatic cells. We also found statistically significant (p<0.001) 58 associations between DNA hypomethylation and regions corresponding to those which, 59 in somatic cells, are enriched in the repressive histone mark H3K9me3, and between DNA hypermethylation and regions enriched in H3K4me1 and CTCF, suggesting that 60 61 the relationship between chromatin context and aberrant DNA methylation of sperm in 62 infertile men could be locus-dependent. Finally, we also show that DNA methylation 63 patterns, not only at specific loci but also at several repetitive sequences (LINE-1, Alu

4 Yb8, NBL2, D4Z4), were lower in sperm than in somatic cells. Interestingly, sperm

65 samples at Alu Yb8 repetitive sequences of infertile patients showed significantly lower

66 DNA methylation levels than controls.

Limitations, reasons for caution: Our results are descriptive and further studies
would be needed to elucidate the functional effects of aberrant DNA methylation on
male fertility.

70 Wider implications of the findings: Overall, our data suggest that aberrant sperm

71 DNA methylation might contribute to fertility impairment in couples with unexplained

72 infertility and they provide a promising basis for future research.

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83 Key words: male infertility / DNA methylation / sperm / tissue-specific DNA methylation

- 84 / repetitive sequences
- 85

87 Introduction

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89 Human infertility is a disorder affecting 13-15% of couples worldwide, where in 20% of 90 cases the male factor is fully responsible and in another 30%-40% it is contributory 91 (Jarow, et al., 2002). In the majority of cases, male factor infertility is closely related to 92 decreased semen quality as a consequence of urogenital abnormalities including 93 testicular dysfunction (a large proportion being caused by genetic abnormalities such 94 as karyotype anomalies and Y chromosome microdeletions), varicocele, infections of 95 the genital tract, immunological problems and/or exposure to exogenous chemical or 96 physical agents. However, in some cases the clinical evaluation of the individual is 97 normal, thus the patient is diagnosed with infertility of unknown origin (Hamada, et al., 98 2011, Irvine, 1998).

99 Epigenetics involves the study of heritable changes affecting gene expression that are 100 not caused by any change in DNA sequence (Holliday, 1987). The best-known 101 epigenetic mark is DNA methylation (Esteller, 2008, Fernandez, et al., 2012), a 102 dynamic process that takes place throughout the course of development in multicellular 103 organisms and ensures the maintenance of normal expression patterns. Likewise, DNA 104 methylation alterations related to different human pathologies, developmental 105 processes and aging have been found (Fernandez, et al., 2012, Urdinguio, et al., 106 2009).

In particular, DNA methylation of germ cells is critically involved in many processes,
including paternal genomic imprinting (Feinberg, et al., 2002), the gene-dosage
reduction involved in X-chromosome inactivation in females (Payer and Lee, 2008), the
silencing of transposable elements (Doerfler, 1991), and several aspects of meiosis,
post-meiotic gene silencing and DNA compaction (Oakes, et al., 2007a).

The mammalian germ line undergoes extensive epigenetic reprogramming during germ 112 cell maturation and gametogenesis. In males, widespread erasure of DNA methylation 113 114 takes place in primordial germ cells (Hajkova, et al., 2002, Reik, et al., 2001) and 115 subsequent de novo DNA methylation occurs during the maturation of germ cells and 116 spermatogenesis, prior to meiosis (Oakes, et al., 2007a). As a result, the pattern of sperm DNA methylation is unique and hypomethylated compared with any other 117 118 somatic cell (Eckhardt, et al., 2006, Oakes, et al., 2007b). The main targets of 119 methylation in germ cells are non-CpG island (non-CGI) sequences in both distinct loci 120 and repetitive sequences, but CpG islands (CGIs) can also be methylated (Oakes, et al., 2007a). Interestingly, hypomethylated promoters in the mature sperm are the 121 122 promoters of developmental transcription and signalling factors. In mammals, correct 123 sperm DNA methylation is suggested to be essential for both fertilization and early 4 embryo viability (Anway, et al., 2005, Bourc'his and Bestor, 2004, Carrell and Hammoud, 2010, Dada, et al., 2012, Jenkins and Carrell, 2012, Li, et al., 1992, Okano, et al., 1999, Romero, et al., 2011, Yaman and Grandjean, 2006) and therefore improved knowledge of the epigenetics of sperm is not only necessary to understand these processes, but may also provide clues to the potential causes of male infertility of unknown origin.

130 Early studies of sperm DNA methylation analysis were specifically performed in 131 imprinted genes as an increased risk of congenital imprinting diseases in children 132 conceived through assisted reproductive technologies (ART) had been suggested. 133 These studies showed the aberrant methylation patterns of imprinted genes in poor quality sperm (Kobayashi, et al., 2007, Margues, et al., 2004, Margues, et al., 2008, 134 135 Poplinski, et al., 2010). Altered sperm DNA methylation patterns have also been found 136 in non-imprinted genes associated with spermatogenic impairment, such as 137 Methylenetetrahydrofolate Reductase (MTHFR) (associated with folate metabolism and methylation reactions) (Wu, et al., 2010b), the cAMP Responsive Element Modulator 138 139 (CREM), involved in spermatogenesis, (Nanassy and Carrell, 2011) and the Deleted in 140 Azoospermia-like (DAZL) gene which is involved in germline establishment and 141 gametogenesis (Navarro-Costa, et al., 2010).

The emergence of new technologies to analyse DNA methylation has allowed the study 142 143 of alterations at the whole-genome level. In this manner, aberrant sperm DNA methylation of both imprinted and non-imprinted genes has been identified in infertile 144 145 individuals with poor quality semen (Houshdaran, et al., 2007, Pacheco, et al., 2011). 146 Furthermore, nearly 600 genes were found differentially methylated in the testes of 147 humans with spermatogenic disorders, of which two are worth noting; Piwi-like RNA-148 mediated gene silencing 2 (PIWIL2) and Tudor domain containing 1 (TDRD1), two 149 germline-specific genes involved in PIWI-interacting RNA (piRNA) processing 150 machinery (Heyn, et al., 2012). The results of all these studies suggest that alterations 151 of DNA methylation patterns of the germ cell could affect reproductive success.

Although defective germ cell-DNA methylation patterns have been associated with 152 153 alterations in semen quality, there is a lack of such epigenetic studies in infertile men 154 with normal sperm parameters. In this project we aim for the first time to conduct a 155 genome-wide analysis of DNA methylation in sperm samples from normozoospermic fertile and infertile men. To address this issue, we used high-throughput 450K 156 157 methylation arrays, covering the whole genome, to determine whether epigenetic 158 changes in male germ cells could explain differences in reproductive success related to 159 the functional quality of spermatozoa.

160

161 Materials and methods

162 Ethical Approval

- 163 Our study recruited semen samples from 49 selected individuals of Caucasian origin.
- 164 All the participants signed an informed consent form and the project was approved by
- 165 the Ethical Committee of the Puigvert Foundation.

166 Subjects of study

Clinical assessment of fertile and infertile individuals was conducted at the Andrology 167 168 Service of the Fundació Puigvert, and included taking a full personal and family 169 medical history to rule out heritable conditions, physical examination -with special 170 emphasis on sexual characters, gonads and genitalia- and a minimum of two semen analyses [performed in accordance with the World Health Organization guidelines 171 172 (Cooper, et al., 2010, WHO, 2010) except for motility assessments, which were done at 173 room temperature using the WHO 1999 four-grade classification of movement]. 174 Spermiograms included volume, pH, sperm concentration, four-category motility assessment, vitality, morphology and antisperm antibodies. Motility and sperm count 175 176 were done in duplicate aliquots of ≥200 cells, and measures were adopted to control 177 for acceptable differences between duplicates. Sperm concentration was performed on 178 diluted, immobilized samples using haemocytometer chambers. Computer assisted 179 sperm analysis (CASA) was performed on fresh ejaculates with the Integrated Semen 180 Analysis System (ISAS®, version 1.01), Proiser R+D (Valencia, Spain) to obtain objective measurements of sperm kinematics (Pedigo, et al., 1989). 181

Semen samples from 17 fertile men (2 of whom were anonymous donors used in >10 182 183 insemination cycles per sperm donor for at least 6 female recipients; the other 15 being 184 volunteers of proven fertility who were going to undergo vasectomy; aged 22-49 years) 185 with normal seminal quality, were studied as methylation controls of fertile spermatozoa. In addition, semen samples were obtained from 29 male patients (aged 186 187 30-55 years) consulting for couple infertility with no known risk factors and normal or 188 mild defects of semen quality values that were used in husband ART (IVF-ICSI: in vitro 189 fertilization- intracytoplasmic sperm injection technique) (Table I). The reference values of fertility were those most recently defined by the WHO (Cooper, et al., 2010, WHO, 190 191 2010).

Semen volume, count, motility, and morphology, including the teratozoospermia index (TZI), as well as the results of the gynecological assessment of the female partner, for the samples used for the epigenetic studies are summarized in **Table I**. TZI is defined as the number of abnormalities present per abnormal spermatozoon, these being

- 196 defects of the head, neck/mid piece and tail defects or presence of cytoplasmic
- droplets, thus indicating the severity of the morphology alteration (from 1 to 4 value).
- Pregnancy outcome from IVF-ICSI treatment of infertile couples is also described for patients (**Table I**).

200 Isolation of mature germ cells and DNA extraction

201 Semen samples were liquefacted and homogenized with a mechanical mixer at 37°C 202 (30-60 min) and subsequently processed with a differential centrifugation technique 203 using density gradients (65-90% Puresperm®, Nidacon International AB, Mölndal, 204 Sweden) to remove somatic contaminants and to enrich the sample in terms of 205 spermatozoa. The isolated germ cells were normalized to a concentration of 1x10⁶/mL 206 and processed to obtain sperm DNA (Wizard Genomic Purification kit, Promega, USA) 207 following the manufacturer's instructions for this specific cell type. The DNA extraction 208 included RNAse A treatment of DNA samples.

209

210 Genome-wide DNA methylation analysis with high-density arrays

211 Microarray-based DNA methylation profiling was performed with the Illumina Infinium[®] 212 Human Methylation450 BeadChip (Illumina Inc., USA) (Bibikova, et al., 2011). Bisulfite 213 conversion of DNA was carried out using the EZ DNA Methylation Kit (Zymo Research, 214 Orange, CA) following the manufacturer's procedure, but with the modifications 215 described in the Infinium Assay Methylation Protocol Guide. Processed DNA samples 216 were then hybridized to the BeadChip (Illumina) following the Illumina Infinium HD 217 Methylation Protocol. Genotyping services were provided by the Spanish "Centro 218 Nacional de Genotipado" (CEGEN-ISCIII)" (www.cegen.org).

219 IDAT files from the microarray were further processed using the R/Bioconductor 220 (version 3.0; open source) package minfi (Hansen and Aryee). In order to adjust for the 221 different probe design types present in the 450k architecture, red and green signals 222 from the IDAT files were corrected using the SWAN algorithm (Makismovic, et al., 223 2012). Probes with detection p-values over 0.01 in at least two samples were filtered 224 out. In accordance with Du (Du, et al., 2010), both beta values and M-values were 225 computed and employed across the analysis pipeline. M-values were used for all the 226 statistical analyses, assuming homoscedasticity, while beta values were mostly used 227 for the intuitive interpretation and visualization of results.

228 Probes that were found to co-hybridate with probes in the sexual chromosomes 229 (Lemire, et al., 2013) were removed. 230

231 Detection of differentially methylated probes

232 In order to identify CpG sites which were differentially methylated (dmCpGs) between the sperm samples of fertile and infertile men, a robust moderated t-test implemented 233 234 in the R/Bioconductor package limma (Smyth, 2005) was performed. False Discovery 235 Rate (FDR) was controlled using the Benjamini-Hochberg procedure, and a 236 significance level of 0.05 employed. An additional threshold of effect size was applied, 237 meaning that only those probes with the strongest differences between groups (the top 238 70%) were selected. The application of this threshold is essential to remove 239 differences deriving from technical artefacts and consequently ensure a more biologically sound statistical data analysis (Pan et al. 2005). dmCpGs were defined as 240 241 hypermethylated or hypomethylated when methylation values were respectively higher 242 or lower in infertile samples compared with fertile controls.

243

244 Genomic region analysis

245 The probes in the microarray were assigned to a genomic region according to their 246 position relative to the transcript information extracted from the R/Bioconductor 247 package TxDb.Hsapiens.UCSC.hg19.knownGene (Carlson). A probe was said to be in a Promoter region when it was located inside the first exon, the 5'-UTR or a region up 248 249 to 2kbp upstream of the transcription start site (TSS) of any given transcript. Similarly, 250 a probe found inside any intron or any exon other than the first was labelled as 251 Intragenic. Intergenic probes were determined as those which did not fall into either of 252 the two previous categories. According to this definition, a probe could be in both a 253 Promoter and an Intragenic region at the same time, for different transcripts. A 254 contingency table was built for each selected subset of probes and a given genomic 255 region, with one variable indicating whether a given probe belonged or not to the 256 subset, and the other indicating whether a given probe was labelled with the selected 257 region. Significance of the association was determined by a Chi-squared test. A significance level of 0.05 was used to determine if a subset was dependent with 258 259 respect to a given genomic region. Odds Ratio was used as a measure of effect size.

260

261 CGI status analysis

The CGI locations used in the analyses were obtained from the R/Bioconductor package *FDb.InfiniumMethylation.hg19* (Triche). This dataset contains all the CGIs distributed along the whole genome. The generation procedure for these CGIs is described by Wu and colleagues (Wu, et al., 2010a). *CpG shores* were defined as the

2kbp regions flanking a CGI. CpG shelves were defined as the 2kbp region, either 266 267 upstream or downstream, of each CpG shore. Probes not belonging to any of the 268 regions thus far mentioned were assigned to the special category Non-CGI. Each 269 probe was assigned to only one category. A 4x2 contingency table was constructed for 270 every subset of probes in order to study the association between the given subset and 271 the different CGI categories. A Chi-squared test was used to determine if any of the 272 categories had a significant association with the given subset. For each of the CGI 273 status levels, a 2x2 contingency table was defined and another Chi-squared test was 274 independently used to evaluate the association of the given subset with each status 275 level, a significance level of 0.05 being employed for all tests. Effect size was reported 276 as the Odds Ratio for each of the individual tests.

277

278 Histone enrichment analysis

279 In order to analyse the enrichment of a histone mark on a given subset of probes, we 280 used the information contained in the UCSC Browser Broad Histone track from the 281 ENCODE project (Bernstein, et al., 2005, Bernstein, et al., 2006, Ernst, et al., 2011, 282 Guttman, et al., 2010, Mikkelsen, et al., 2007). Histone peak data for every cell line and 283 mark present in the ENCODE project were downloaded from the UCSC Browser (Supplementary Table 1). Small peaks were discarded when they were completely 284 285 contained within wider peaks. For each combination of cell line and mark, a 2x2 286 contingency table was built to determine its association with the input subset of probes. 287 Probes in the array were classified according to whether they belonged to the subset or 288 not, and whether they intersected with a significant broad peak for the given 289 combination of cell line and mark. A Fisher exact test was used to determine if the 290 given subset of probes was significantly enriched for each combination of cell line and 291 mark. P-values were corrected for multiple testing using FDR (using the Benjamini-292 Hochberg method) and a significance level of 0.05 was used to determine which 293 probes had significant enrichment. The base-2 logarithm of the Odds Ratio was used 294 as a measure of effect size.

295

296 Global DNA methylation analysis

Global DNA methylation status was quantified using the Methylamp global DNA methylation quantification ultra kit (Epigentek, Catalog # P-1014B, USA) following the manufacturer's instructions. Briefly, 100 or 200 ng of genomic DNA is used for a 5methylcytosine (5-mC) quantification. The methylated fraction of DNA is recognized by a 5-methylcytosine antibody and colorimetrically quantified through an ELISA-like 302 reaction.

303

304 Bisulfite pyrosequencing

305 DNA methylation patterns of the repetitive sequences were analysed by bisulfite 306 pyrosequencing. Bisulfite modification of DNA was performed with the EZ DNA 307 Methylation-Gold kit (Zymo Research) following the manufacturer's instructions. Each 308 sequence was amplified with previously described forward and reverse primers 309 (Supplementary Table 2) (Bollati, et al., 2007, Choi, et al., 2009, Martinez, et al., 310 2012). After PCR amplification of the region of interest with the specific primers, pyrosequencing was performed using PyroMark Q24 reagents, vacuum prep 311 workstation, equipment and software (Qiagen, Netherlands). 312

313

314 Identification of specific DNA methylation patterns in spermatozoa

315 DNA methylation data of blood (Hannum, et al., 2013) and brain (neuron and glia) (Guintivano, et al., 2013) samples produced with the Illumina Infinium Human 316 317 Methylation 450 were used for comparison with the sperm data in order to identify DNA 318 methylation patterns specific to mature germ cells. DNA methylation beta value data 319 was downloaded from GEO accession numbers GSE40279 and GSE41826. Methylation data for the blood dataset was adjusted for white blood cell heterogeneity 320 321 using the method described in Houseman et al. 2012 (Houseman, et al., 2012). In 322 order to feed this method, we used the original 27k database of purified white blood cell subtypes included in the authors' original implementation of the algorithm. 323

To identify tissue-specific methylated CpG sites in a given tissue, we looked for CpGs showing mean methylation > 60% in the target tissue and < 40% in the other tissues. Similarly, to identify tissue-specific unmethylated CpG sites we looked for CpGs with methylation <40% in the target tissue and > 60% in the other tissues.

328

329 Circos data track smoothing

In order to plot the CpG information on Circos genome-wide graphs, smoothing was applied to our data. Broad Histone peak information from UCSC was averaged by partitioning the genome into intervals of 200kbp and assigning to each peak a score that corresponded to the average of the broad peak scores found within it. CpG locations were not smoothed but rather stacked on several lines. This does not mean that any CpG has a higher score than other, but simply that the higher the stack of markers, the higher the density of CpGs in the region.

338 Statistical Analyses

339 Statistical analyses were performed using R/Bioconductor (version 3.0; open source).

- 340 To identify CpG sites showing differential methylation values between the sperm
- 341 samples of fertile and infertile men, a robust moderated t-test implemented in the
- R/Bioconductor package *limma* was performed. FDR was controlled using theBenjamini-Hochberg procedure.
- 344 Significant associations between dmCpGs and specific genomic locations was 345 determined by a Chi-squared test. Odds Ratio was used as a measure of effect size.
- 346 A Fisher exact test was used to analyse the enrichment of dmCpGs on an specific
- 347 chromatin mark. P-values were corrected for multiple testing using FDR, and the base-
- 2 logarithm of the Odds Ratio was used as a measure of effect size.
- 349 The non-parametric Kruskal-Wallis and Wilcox tests were used to analyze differences
- in methylation levels (global and repetitive regions) in sperm groups compared with
- 351 somatic cells. A value of p<0.05 was considered significant.

353 Results

354

355 Alterations of sperm DNA methylation are found in infertile individuals

356 To identify genomic regions showing differences in sperm DNA methylation patterns 357 between fertile and infertile individuals, we performed methylation arrays (methylation assay 1 in Table I) of 12 sperm samples and analysed the site-specific methylation 358 359 status of 485,577 CpG sites across the human genome (Bibikova, et al., 2011, 360 Sandoval, et al., 2011). In order to analyse differential methylation patterns, we divided 361 the samples into two groups; one composed of 5 fertile individuals (samples Control-1 362 to 5) and the other, 7 infertile patients (samples Patient-1 to 7). Only one of the female 363 partners (Patient-7 partner) had a potential factor (dysovulation, corrected with medication) that may influence the fertility of the couple. The rest of the women 364 365 presented no known risk factors. It is worth taking into account that we decided to 366 establish semen diagnosis based exclusively on the first semen analysis, since fertile controls only delivered a single sample. Nevertheless, some of the subsequent semen 367 samples collected for this study in the infertile group showed some deviation from initial 368 369 values with respect to sperm morphology. It is of note, however, that abnormal sperm 370 from infertile individuals showed a similar low severity of morphological alteration (TZI 371 values < 1.7) as those from fertile individuals (Table I).

372 The first observation indicated that, although methylation patterns are well preserved, 373 some CpG sites exhibited higher interindividual variability (5% showed M-values 374 SD>0.6), irrespective of the group of samples analysed (Fig. 1A), which confirms 375 variation in DNA methylation of the male germline across unrelated individuals 376 (Flanagan, et al., 2006). Statistical analysis showed 2,752 dmCpGs between fertile and infertile men. Of these, 1,447 CpG sites were hypermethylated while 1,305 were 377 378 hypomethylated in infertile patients (Supplementary Fig. 1 and Supplementary Table 379 **3**). Hierarchical clustering of DNA methylation data for the most variable CpG sites highlights the differences between the fertile controls and infertile patients (Fig. 1B). 380

To study, from a functional genomics point of view, the characteristics of the dmCpG sites we first determined their distribution in CGI and non-CGI regions (Wu, et al., 2010a). Interestingly, while hypermethylated CpG sites were preferentially enriched in CGI-shores (p<0.001; OR=1.50), hypomethylated CpG sites were enriched in CGIs (p<0.001, OR=1.27) (**Fig. 1C**). Intergenic regions showed a significantly increased proportion of hypomethylated CpG sites (p<0.001, OR=1.83) while promoter regions presented a decreased proportion of both hypermethylated (p= 0.039, OR=0.89) and hypomethylated (p<0.001, OR=0.53) CpGs in infertile patients (**Fig. 1D**). Gene Ontology (GO) analysis of the dmCpGs, using DAVID gene ontology annotation groups, showed that genes around the hypermethylated CpG sites were enriched for a cell adhesion related term (GO term: homophilic cell adhesion; FDR <0.01), while genes around the hypomethylated CpG sites did not show any significant term enrichment for functional (GO) categories.

394 Given that the establishment of germ cell DNA methylation marks involved in paternal 395 genomic imprinting is critical during spermatogenesis, we next compared these 396 dmCpGs with those associated with imprinted genes (Pacheco, et al., 2011). A total of 397 8746 CpG sites belonging to 183 imprinted genes were present in the 450K array. We 398 found that 54 CpG sites associated with 48 imprinted genes were aberrantly methylated in infertile patients. Specifically, 33 CpG sites (related to 28 genes) were 399 400 hypermethylated and 21 CpG sites (related to 28 genes) were hypomethylated; 8 401 genes showed both hyper- and hypomethylation (Supplementary Tables 4 and 5). In 402 addition we compared our results with those obtained by Pacheco and collaborators, 403 who analysed 619 CpGs associated with imprinted genes from samples of sperm with 404 low motility using 27K Illumina arrays, and found two common CpGs aberrantly 405 methylated (associated to insulin-like growth factor 2 (IGF2) and heat shock 70kDa 406 protein 6 (HSPA6) genes) in both studies.

407 To study other genomic features which may provide clues about the mechanisms 408 underlying the aberrant methylation changes in infertile men, we investigated whether the differentially methylated regions were among those targeted by any specific histone 409 410 mark in somatic cells. We compared our methylation data with previously published 411 data on a range of histone modifications and chromatin modifiers in 10 differentiated 412 somatic cells obtained from healthy individuals (see Materials and Methods). We 413 found statistically significant (p<0.001) associations between DNA hypomethylation 414 and the repressive histone mark H3K9me3 in most differentiated ENCODE cell lines 415 (Fig. 2A-B). However, DNA hypermethylation was associated with H3K4me1 and the CCCTC-binding factor (CTCF) (p<0.001) (Fig. 2A-B). We also investigated whether the 416 417 hyper- and hypomethylated CpGs in the sperm of infertile patients were associated with the genomic regions that are known to be enriched for nucleosomes, H2AZ or the 418 419 post-translational histone marks H3K4me3 and H3K27me3 in human sperm 420 (Hammoud, et al., 2009), and we found a significant association between hypermethylated CpGs in sperm of infertile patients and those genomic regions 421 422 enriched for H3K4me3 (p= 0.036; OR:1.40).

423

424 Differentially methylated regions are associated with sperm-specific DNA 425 methylation sites in infertile individuals

426 For the further characterization of the regions associated with the dmCpG sites found 427 in our study we performed a comparative analysis between dmCpG sites and regions 428 with sperm-specific DNA methylation (see Materials and Methods). To identify regions with tissue-specific DNA methylation we first compared the above mentioned 429 430 sperm methylomes of the fertile subjects (5 samples) with the DNA methylomes of 431 differentiated somatic cells. We used data obtained from methylation analysis of blood 432 (8 samples) and neural and glial cells (8 samples of each) from the same type of methylation arrays (Illumina 450K) deposited in public databases (Guintivano, et al., 433 434 2013, Hannum, et al., 2013). To reduce confounding factors in the blood dataset, we 435 first corrected for cellular heterogeneity (Houseman, et al., 2012).

436 The results of these comparisons showed that, as expected, the levels of DNA 437 methylation of the germ cells were lower than those of somatic cells (average Mvalues: sperm= -0.31, blood= -0.08, neuron= 0.02, glia= 0.02) (Supplementary Fig. 2 438 439 and Supplementary Fig. 3A), whilst inter-individual variability of sperm was higher 440 than observed in differentiated somatic cells (mean of log (SD): sperm= -1.41; blood= -441 1.66; glia= -1.80; neuron= -1.77) (Supplementary Fig. 3A). Furthermore, we observed that sperm have a large number of CpG sites showing extreme values (89.5%), both 442 443 unmethylated (<40 methylation %) and methylated (> 60 methylation %), while the 444 differentiated somatic cells showed a large number of probes with intermediate methylation values (~33%) (Supplementary Fig. 3A). In addition, in sperm cells a 445 larger number of probes showed specific DNA methylation patterns (unmethylated 446 447 21,139; methylated 1,842) than in any of the somatic cell types (see Materials and 448 Methods) (Supplementary Fig. 3B and Supplementary Table 6). Intriguingly, tissue-449 specific unmethylated CpGs were enriched in non-CGIs in all somatic cell types, whilst in sperm they were enriched in CGI-shores, and, conversely, tissue-specific methylated 450 451 CpGs were enriched in CGI-shores in all the somatic cells whilst being enriched in non-452 CGIs in sperm (**Supplementary Fig. 4**), highlighting the peculiarity of this cell type in 453 terms of DNA methylation patterns.

454 Most importantly though, we found a significant association between those CpG sites 455 with specific DNA methylation in sperm and the dmCpG sites (hyper- and 456 hypomethylated) identified in infertile men (p<0.001; Fisher's exact test, OR= 1.43), which suggests that the alterations of sperm-specific DNA methylation patterns could be associated with male infertility. A more detailed analysis showed that only hypomethylated CpGs were significantly associated with both sperm-specific methylated (p=0.038, OR: 2.00) or unmethylated (p<0.001; OR: 2.08) CpGs.

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462 Global DNA methylation patterns: comparative analysis between fertile and 463 infertile individuals

To evaluate changes in global 5-mC levels (methylation assay 2 in **Table I**) that might be associated with male infertility we analysed a different set of samples from 7 fertile individuals (samples Control-6 to 12) and 7 normospermic infertile patients (samples Patient-8 to 14). Only two of the female partners (those of Patient-9 and 11) had a potential factor (tubal obstruction) that could influence the fertility of the couple. We found no significant differences in global 5-mC levels between fertile and infertile sperm samples (**Fig. 3A**).

471 In addition, since an association between DNA methylation of repetitive elements and 472 total genomic 5-methylcytosine has been described (Ehrlich, 2002, Weisenberger, et al., 2005, Yang, et al., 2004), we analysed the methylation patterns of several repetitive 473 474 sequences (methylation assay 3 in **Table I**), both at whole genome level and at four 475 specific repetitive loci, in sperm from 17 fertile (samples Control-1 to 17) and 27 infertile 476 subjects (samples Patient-3 to 29) and compared them with differentiated somatic cells 477 (blood and brain). Successful outcome in IVF-ICSI treatment was also taken into 478 account (12 resulted in no pregnancy and 15 resulted in pregnancy) (Table I) as 479 success in IVF-ICSI would provide extra indications for the lack of a phenotype 480 associated with the female for the selected couples.

481 Specifically, we determined the methylation status of four repetitive sequences, 482 namely: LINE-1, an interspersed repeat found throughout the human genome and used as an estimate of global methylation levels (Yang, et al., 2004); Alu Yb8, a relatively 483 young subfamily of the Alu short interspersed elements (SINEs) (Carroll, et al., 2001); 484 D4Z4, a macrosatellite found in the subtelomeric regions (Chadwick, 2009); and NBL-485 486 2, a complex tandem repeat found in the centromeric regions of acrocentric chromosomes (Nishiyama, et al., 2005). Our results showed no differences between 487 fertile and infertile subjects in any of the repetitive sequences analysed, with the 488 489 exception of Alu Yb8, where sperm of infertile individuals showed significantly lower Alu methylation levels (p= 0.0011) (Fig. 3B). Furthermore, the comparative analysis of
DNA methylation of repetitive sequences (LINE-1, Alu Yb8, NBL2, D4Z4) showed no
statistical differences between the patient subgroups with respect to IVF-ICSI outcome.

493 However, we did find huge DNA methylation differences between germ and somatic 494 cells (blood, brain) in most of the repetitive sequences analysed, and in all cases sperm samples showed lower average methylation values (Fig. 3B). NBL-2 showed 495 the largest differences (average methylation: sperm= 3.2%, blood= 80.2, and brain= 496 497 76.3; p<0.001). Alu (average methylation: sperm= 47.5%, blood= 90.6, and brain= 498 89.3; p<0.001) and D4Z4 (average methylation: sperm= 7.9%, blood= 55.6, and brain= 53.6; p<0.001) also showed great differences, and LINE-1 displayed the lowest 499 difference, with only the comparison with blood cells being statistically significant 500 501 (average methylation: sperm= 69.8%, blood= 74.6, and brain= 72.6) (Fig. 3B). These 502 results agree with the DNA methylation patterns of different repetitive regions found in 503 human sperm and human embryonic stem cells (hESCs) (Molaro, et al., 2011) as well as in human sperm and B cells (Krausz, et al., 2012). 504

506 Discussion

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508 Sperm and testicular DNA methylation profiles of specific genes or genomic regions 509 from fertile and infertile human males have been compared in several studies to date 510 (Heyn, et al., 2012, Houshdaran, et al., 2007, Kobayashi, et al., 2007, Margues, et al., 2004, Marques, et al., 2008, Pacheco, et al., 2011, Poplinski, et al., 2010). These 511 512 analyses were, however, either restricted to a small number of genes or imprinted 513 regions, or considered a larger number of genes but focused only on promoter regions. 514 What is more, only infertile patients presenting alterations associated with either the process of spermatogenesis or semen quality were studied. In contrast, in this work we 515 compare, for the first time, and at genome-wide level, the DNA methylation patterns of 516 517 sperm from fertile individuals with the sperm of patients with unexplained infertility. 518 Furthermore, the confounding role of the significant proportion of female causes that 519 contribute to reproductive failure was controlled since sperm was selected from couples with no known significant female risk factor. 520

We analysed gene promoters and intragenic and intergenic regions, and identified 521 522 alterations in the methylation of DNA in 2,752 CpGs. It is of particular note that a high 523 level of variation in DNA methylation was observed in mature germ cells across unrelated individuals, even among fertile individuals, and may reflect differing levels of 524 525 sperm function. Specifically, we found no alterations in the DNA methylation patterns of 526 genes of the PIWI pathway, previously found to be associated with severe defects of 527 sperm production (Heyn, et al., 2012). Neither did we find evidence for the previously 528 described alterations in imprinted genes such as imprinted maternally expressed 529 transcript (H19) or mesoderm specific transcript (MEST) (Kobayashi, et al., 2007, 530 Marques, et al., 2004, Marques, et al., 2008, Pacheco, et al., 2011, Poplinski, et al., 531 2010) or non-imprinted genes such as MTHFR (Houshdaran, et al., 2007, Pacheco, et 532 al., 2011, Wu, et al., 2010b) which have been associated with male infertility due to 533 poor semen quality. However, we extended our study on imprinted genes and found a 534 small number of CpGs showing aberrant DNA methylation associated with 48 imprinted 535 genes in infertile patients. Subsequently, we compared our results with data obtained in a previous study (Pacheco, et al., 2011) where 619 CpGs associated with imprinted 536 genes were analysed in samples from patients with low sperm motility, and, we only 537 538 found two common CpG sites aberrantly methylated. Interestingly, one of the genes 539 associated with these CpGs (IGF2) has been found also aberrantly methylated in abnormal sperm (Boissonnas, et al., 2010, Pacheco, et al., 2011, Poplinski, et al., 540

541 2010). Unlike in other studies to date, here we analysed patients with normal or mild 542 defects of semen quality, and our results show previously unidentified alterations in 543 DNA methylation of CpG sites located at specific genes and genomic regions. This 544 suggests that the mechanistic origins of these alterations in DNA methylation in 545 individuals with unexplained infertility may be different from those associated with the 546 onset of alterations in patients with low semen quality.

547 We used several genomic approaches to further study the peculiarities of these 548 dmCpGs that might give some clue to their contribution to male infertility. In the case of 549 hypomethylated CpGs, besides being preferentially located in CGI, they are more 550 abundant in intergenic regions and depleted in promoters, all of which suggests that 551 these CpGs are located in the clusters of CGI II and III recently described by Zeng and collaborators, which have been associated with tissue-specific DNA methylation (Zeng, 552 553 et al., 2014). Intriguingly, hypermethylated related genes were also enriched for a cell 554 adhesion ontology term, opening new avenues for investigating the functional role that 555 aberrant DNA hypermethylation may have in cases of unexplained male infertility. This could be at least partly related to defects in functional capacity of sperm to bind the 556 557 oocyte in infertile patients. It could also give evidence that some of these defects in 558 methylation are shared with sperm morphology deficiencies, from results of other studies in which associations between teratozoospermia and deficiency in adhesion 559 560 molecules were found (Glander and Schaller, 1993).

561 Since the aberrant DNA methylation appeared to be related to changes in tissue-562 specific methylation, we aimed to identify CpGs which were specifically methylated in 563 sperm when compared with somatic cells (brain and blood). These sperm-specific 564 methylated regions were subsequently compared with the dmCpGs in infertile 565 individuals. In addition to showing different DNA methylation patterns between somatic 566 and germ cells, as previously described (Eckhardt, et al., 2006, Krausz, et al., 2012, 567 Oakes, et al., 2007b), we found a statistically significant association between sperm 568 dmCpGs, mainly hypomethylated CpGs in individuals with unexplained infertility and 569 CpGs that showed sperm-specific DNA methylation, which suggests that the alterations 570 of the mechanisms that establish the sperm-specific epigenetic program could be 571 involved in the fertilizing quality of sperm in unexplained human male infertility.

In addition, we analysed the genomic location of these dmCpGs in the context of chromatin and found associations between aberrant DNA methylation and specific histone marks previously identified in somatic and sperm cells. Interestingly, our results

showed a significant association between hypomethylated CpGs in sperm and regions 575 strongly enriched in repressive histone marks such as H3K9me3 in somatic cells, 576 577 whereas hypermethylated regions were associated with H3K4me1 and CTCF. Since 578 there is no reason why these chromatin marks should necessarily be the same in 579 somatic cells and sperm cells, these associations may merely indicate that during germ cell development these dmCpGs are associated with regions with some distinct feature 580 581 that leads to a differential "vulnerability" to hypo- or hyper methylation in association 582 with infertility. On the other hand, if the chromatin marks in somatic cells associated 583 with aberrant DNA methylation in sperm were the same in the germ cell, DNA 584 hypermethylation of CTCF binding sites could be indicative of alterations in the architecture and function of the sperm genome of infertile patients, since CTCF binds 585 586 to DNA sequences in a methylation-sensitive manner (Wang, et al., 2012), and it has 587 been shown that CTCF appears to play a significant role in chromatin organization, as 588 well as in the regulation of gene expression (Ong and Corces, 2014, Phillips and Corces, 2009, Wang, et al., 2012), which is especially relevant in mammalian sperm 589 (Arpanahi, et al., 2009, Carone, et al., 2014). 590

591 In addition, we analysed associations between aberrant DNA methylation with the 592 histone marks identified in human sperm and available in public data bases 593 (Hammoud, et al., 2009), and found a significant association between hypermethylated 594 CpGs in the sperm of infertile patients and genomic regions enriched for H3K4me3. 595 Taken all together, our findings suggest that the relationship between chromatin 596 context and the aberrant DNA methylation of sperm in infertile men could be locus-597 dependent. Future studies analysing the complete maps of histone posttranslational 598 marks of sperm chromatin in normospermic infertile patients and fertile individuals will 599 elucidate whether these alterations in DNA methylation are also associated with 600 alterations of other specific histone marks, and whether they could affect chromatin 601 compaction, as suggested in other studies analysing subfertile individuals (La Spina, et 602 al., 2014, Steilmann, et al., 2010)

Apart from locus-specific DNA methylation differences, we analysed for the first time global DNA methylation changes between normospermic fertile and infertile patients. Our results showed no differences in global methylation between the groups, in contrast to the results previously found in infertile patients with poor quality of sperm (Tunc and Tremellen, 2009), suggesting that global DNA methylation changes are related to spermatogenic efficiency and the semen quality of infertile patients. 609 We also analysed DNA methylation changes between groups in several repetitive 610 elements across the genome, including LINE-1, considered to represent global DNA 611 methylation (Yang, et al., 2004). The dynamics of the DNA methylation of repetitive 612 DNA elements during epigenetic reprogramming of primordial germ cells are gender 613 specific (Lees-Murdock and Walsh, 2008, Sasaki and Matsui, 2008), and the functional role of the DNA methylation of retrotransposons, particularly in male germ cells, has 614 615 been described (Bourc'his and Bestor, 2004). Our results related to the DNA 616 methylation of LINE-1 retrotransposon showed no differences between groups, and 617 agree with previous results analysing differences in infertile men exhibiting low sperm concentrations (Kobayashi, et al., 2007, Margues, et al., 2008). In contrast, LINE-1 618 repetitive sequences have been found to be hypomethylated in infertile patients with 619 severe spermatogenic disorders (Heyn, et al., 2012) associated with the epigenetic 620 621 inactivation of piRNA-processing genes: PIWIL2 and TDRD1. Our results, however, not 622 only failed to show differences in the DNA methylation patterns of *PIWIL2* and *TDRD1* between groups (data not shown), but neither did we find differences in methylation of 623 LINE-1 between normospermic fertile and infertile patients. 624

625 Interestingly, we did find a significant DNA methylation decrease in another 626 retrotransposon, AluYb8, in infertile patients. The results from previous works focused 627 on infertile individuals showing low seminal quality had been unable to clarify the 628 associations between male infertility and the methylation of Alu sequences (El Hajj, et 629 al., 2011, Kobayashi, et al., 2007); Kobayashi and collaborators did not find differences 630 between healthy controls and infertile patients (Kobayashi, et al., 2007), whereas El Hajj and collaborators, in line with the results of our study, showed that average 631 632 methylation values in Alu sequences were lower in infertile men with abnormal semen 633 parameters (El Hajj, et al., 2011). The differences between these two studies could be 634 attributed to several causes. First different methodologies were used to measure 635 methylation; one case used combined bisulfite restriction analysis (COBRA) assay and the other, bisulfite pyrosequencing. Secondly the difference could be the consequence 636 637 of the specific Alu sequence analysed. In our work we specifically analysed the Alu Yb8 638 subfamily, which is relatively young and more susceptible to retrotransposon activity, thus requiring stricter control by epigenetic silencing mechanisms. The role of SINE 639 640 elements in the regulation of gene expression has recently been investigated in murine 641 models and been shown to play a role in the activity of downstream gene promoters 642 (Estecio, et al., 2012). Methylation of SINEs in the transcriptional regulation of genes 643 specifically expressed in testis has also been suggested to have a role (Ichiyanagi, et al., 2011). Thus, future studies are needed to elucidate the functional effects ofaberrant methylation of Alu sequences in sperm from infertile individuals.

We also analysed and compared, for the first time, the DNA methylation patterns of pericentromeric (NBL2) and subtelomeric (D4Z4) repetitive elements in both control and infertile patients, and found low methylation values in these regions, but no significant differences between groups. That said, the results of the analysis of DNA methylation in both global and repetitive sequences should be considered carefully, since the presence of mild reproductive risk factors in some females might be masking potentially fertile individuals.

653 Together, these results suggest that alterations of DNA methylation, both globally and 654 at locus-specific level, and therefore of the mechanisms that produce them, are 655 different in normospermic infertile patients compared to infertile individuals with spermatogenic impairment. As in the case of DNA methylation at specific loci, we also 656 657 performed a comparative analysis of DNA methylation of the repetitive regions 658 mentioned above in order to analyse differences between germ and somatic cells, and 659 to ascertain the peculiarities of the former. It has previously been shown that 660 mammalian testes have more hypomethylated loci than somatic cells (Oakes, et al., 2007b). In addition, the DNA methylation of repetitive sequences has been found to be 661 662 particularly low in sperm compared to undifferentiated somatic cells (hESC) (Molaro, et 663 al., 2011). To further characterize the methylation patterns of these repetitive sequences in sperm, we also performed methylation analysis of some of these regions 664 in differentiated somatic cells (blood and brain). The greatest difference in methylation 665 666 levels between sperm and somatic cells was observed for NBL-2. This is also the case 667 when looking at other centromeric repeats (Molaro, et al., 2011), suggesting therefore 668 that an overall hypomethylation of the centromeric region is characteristic of sperm. 669 Indeed, Yamagata and collaborators have previously proposed using methylation 670 levels of the centromeric region in order to discriminate between germ and somatic cell 671 lineages (Yamagata, et al., 2007). Moreover, although pericentromeric regions are usually regarded as transcriptionally poor (Copenhaver, et al., 1999, Nagaki, et al., 672 673 2004), the expression of a variety of genes has been shown in the testis, with almost 674 half the cases being unique to the tissue (She, et al., 2004). In the case of D4Z4, 675 although to date no studies have concentrated on its methylation in sperm, Jian Li and 676 collaborators have reported enrichment in "methylation deserts" in telomeric regions (Li, et al., 2012). Thus, the low methylation values found here for D4Z4 are probably, 677 678 as in the case of NBL-2, reflective of overall hypomethylation occurring in that region,

and highlights the increased risk of structural mutations in germ cells due to thesemethylation deserts (Li, et al., 2012).

681 Although Alu Yb8 methylation values in sperm were higher than those found for the other repetitive elements studied, sperm and somatic cells showed large differences, 682 683 confirming the findings of previous studies using other analysis techniques (Hellmann-684 Blumberg, et al., 1993, Kochanek, et al., 1993). Finally, unlike the other repetitive 685 sequences, LINE-1 showed high levels of methylation, with significant differences only being found between sperm and blood cells. When comparing studies based on the 686 687 same technique (El Hajj, et al., 2011, Heyn, et al., 2012), the methylation values of this sequence in sperm were similar. This finding is partially supported by the results of 688 689 Molaro and collaborators (Molaro, et al., 2011), who have studied methylation along the full length of LINE-1 and discovered a higher percentage of hypomethylated regions in 690 691 sperm compared to hESCs. Although there are major differences between the results 692 of Molaro and collaborators and our own, these could be explained because the former analysed undifferentiated somatic cells while differentiated somatic cells were 693 694 considered in this work, and because we only studied 3 CpGs, thereby only reflecting 695 methylation for specific locations on LINE-1.

696 In conclusion, DNA methylation patterns of spermatozoa are significantly different to 697 those found in other somatic cells such as blood or brain. In this work we have 698 analysed for the first time, at genome-wide resolution, the DNA methylation profiles of 699 the sperm of patients with unexplained infertility versus that of fertile individuals, and we have identified almost 3,000 CpGs which display aberrant methylation. Our data 700 701 show that these changes are precisely associated with regions of sperm-specific 702 methylation, thereby suggesting that DNA methylation is involved in the control of the 703 functional capacity of germ cells. Further studies are necessary to elucidate the mechanisms relating to the origin of these alterations, and to determine their 704 705 significance and functional consequences for male infertility.

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711 Authors' roles

L.B., S.L. and A.F.F. participated in the planning and design of the study. R.G.U., M.D.,
E.G.T. and C.B. performed the experiments and collected data. Data analysis and
interpretation was performed by M.F.F., R.G.U., G.F.B. and A.F.F.. L.B., S.L. and
A.F.F. wrote the manuscript. All authors revised the article and gave final approval to
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728 Conflict of interest

The authors confirm that they have no conflict of interest to declare.

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985 Figure legends

987 Figure 1. DNA methylation patterns in fertile individuals and infertile patients. (A) 988 Deviation plot for all the CpG sites studied in sperm samples showing the variability of 989 methylation values (grey area). Probes are ranked on the x-axis with respect to their 990 median methylation, as visualized by a curve. Probe values represented by grey lines 991 depicting the 5th and 95th percentile range. On the right, the distribution of standard 992 deviation (SD) across all the probes analysed is shown and the 95th percentile is 993 indicated. (B) Unsupervised hierarchical clustering and heatmap including the 193 most 994 variable CpG sites (absolute M-value differences >0.2) between fertile and infertile 995 individuals. Average methylation values are displayed from 0 (blue) to 1 (yellow). On 996 the right, bar plot displaying the number of hyper- and hypomethylated CpG sites in 997 infertile patients. (C) Distribution of dmCpGs relative to CGIs. (D) Relative distribution 998 of dmCpGs across different genomic regions.

999 dmCpGs: differentially methylated CpGs; CGI: CpG islands

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1001 Figure 2. Chromatin signatures associated with aberrant DNA methylation in infertile 1002 patients. (A) Heatmaps showing significant enrichment of hyper- and hypomethylated 1003 CpG sites identified in infertile individuals, with different histone marks and chromatin 1004 modifiers contained in the UCSC Browser Broad Histone track from the ENCODE 1005 project. Colour code indicates significant enrichment based on log2 odds ratio (OR). 1006 (B) Circular representation of genome-wide DNA methylation changes in the infertile 1007 patients indicating whether the CpGs were hypermethylated (red) or hypomethylated 1008 (blue). Inner tracks display chromatin marks (Ctcf, H3K4me1 and H3K9me3) generated 1009 for osteoblast cells, and associated with differentially methylated regions. Broad 1010 Histone peak information is averaged in 200 kbp genomic windows and represented as 1011 histogram tracks. Two regions of chromosomes 6 and 11 are magnified (grey area) in 1012 order to detail the associations between hypo- or hypermethylated DNA regions with 1013 specific chromatin signatures.

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Figure 3. Global DNA methylation patterns in sperm. (A) Global DNA methylation levels of sperm from fertile individuals and normospermic infertile patients obtained in a colorimetric assay. (B) DNA methylation values of several repetitive regions (LINE-1, Alu Yb8, NBL-2, and D4Z4) measured by bisulfite pyrosequencing in sperm (controls and patients) and somatic cells (blood and brain). ***: p<0.001; **: p<0.01.

Supplementary Fig. 1. Unsupervised hierarchical clustering and heatmap including
 CpG sites with differential DNA methylation between fertile and infertile individuals.
 Average methylation values are displayed from 0 (blue) to 1 (yellow).

1024 **Supplementary Fig. 2**. Quantile–quantile (QQ) plot displaying the relationship 1025 between the average beta methylation values in blood, glia and neuron (vertical axis) 1026 with the average beta methylation values in sperm (horizontal axis).

1027 Supplementary Fig. 3. Sperm-specific DNA methylation patterns. (A) The first column 1028 depicts deviation plots for all the CpG sites in the respective cell type, showing the variability of methylation values (coloured area). The middle column shows the 1029 1030 relationship between means and standard deviations (log) of methylation levels 1031 between samples (M-values). The red line represents the average standard deviation. The right column depicts kernel density plots showing the distribution of methylation 1032 levels for each cell type across all CpG sites analysed. The Y-axis represents M 1033 1034 methylation values. (B) Unsupervised hierarchical clustering and heatmap including 1035 CpG sites with tissue-specific DNA methylation in sperm, blood, neuron and glial cells.

Supplementary Fig. 4. Distribution of tissue-specific (Blood, glia, neuron, and sperm)
 methylated and unmethylated CpGs relative to CpG Island (CGI).



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Table 1. Clinical characteristics of semen samples from fertile controls and infertile patients included in the study

Code ID	Methylation assav	Clinical intervention	IVF-ICSI outcome	Age (years)	Semen volume (ml)	Sperm count (x10 ⁶ /ml)	Total Sperm	Progressive motility (%)	Normal morphology (%)	Teratozoosperm ia index (TZI)	Age female partner (vears)	Female gynecological assesment
Control-1	1,3	Vasectomy	-	41	4.5	174	783.0	46	11	1.69		N (by default)
Control-2	1,3	Vasectomy	-	49	4.5	122	549.0	46	11	1.78	-	N (by default)
Control-3	1,3	Vasectomy	-	35	6.0	32	192.0	23	6	1.64	-	N (by default)
Control-4	1,3	Vasectomy	-	39	1.5	96	144.0	58	10	1.21	-	N (by default)
Control-5	1,3	Vasectomy	-	36	3.5	42	147.0	42	6	1.49	-	N (by default)
Control-6	2,3	Vasectomy	-	45	2.8	89	244.8	67	10	1.52	-	N (by default)
Control-7	2,3	Vasectomy	-	39	3.3	81	267.3	32	6	1.50	-	N (by default)
Control-8	2,3	Vasectomy	-	48	5.5	89	489.5	67	10	1.56	-	N (by default)
Control-9	2,3	Vasectomy	-	39	4.0	65	260.0	69	5	1.45	-	N (by default)
Control-10	2,3	Vasectomy	-	42	5.8	29	168.2	71	5	1.56	-	N (by default)
Control-11	2,3	Vasectomy	-	44	3.0	250	750.0	60	8	1.65	-	N (by default)
Control-12	2,3	Vasectomy	-	38	4.6	70	322.0	54	16	1.33	-	N (by default)
Control-13	3	Vasectomy	-	34	2.0	29	58.0	24	0	1.44	-	N (by default)
Control-14	3	Vasectomy	-	35	4.0	75	300.0	46	8	1.39	-	N (by default)
Control-15	3	Vasectomy	-	44	1.0	120	120.0	68	9	1.45	-	N (by default)
Control-16	3	Semen donor	-	25	3.3	80	264.0	58	24	1.30	35,2 ^a	-
Control-17	3	Semen donor	-	22	4.8	78	370.5	39	14	1.32	34,1 ^a	-
Patient-1	1	IVF-ICSI	No pregnancy	42	2.0	36	72.0	50	1	1.58	41	N
Patient-2	1	IVF-ICSI	regnancy-birth (twir	37	4.8	43	204.3	42	9	1.51	37	N
Patient-3	1,3	IVF-ICSI	No pregnancy	40	6.1	10	61.0	37	2	1.49	39	N
Patient-4	1,3	IVF-ICSI	No pregnancy	36	6.6	18	118.8	52	1	1.63	35	N
Patient-5	1,3	IVF-ICSI	No pregnancy	36	5.5	91	500.5	48	5	1.67	37	N
Patient-6	1,3	IVF-ICSI	Pregnancy-birth	54	3.7	25	92.5	18	1	1.57	38	N
Patient-7	1,3	IVF-ICSI	egnancy-miscarria	39	3.9	17	66.3	46	1	1.59	35	Treated disovulation
Patient-8	2,3	IVF-ICSI	No pregnancy	45	5.0	95	475.0	40	7	1.52	40	N
Patient-9	2,3	IVF-ICSI	No pregnancy	31	2.5	98	245.0	62	7	1.43	26	Tubal obstruction
Patient-10	2,3	IVF-ICSI	No pregnancy	33	3.0	123	369.0	69	7	1.48	35	N
Patient-11	2,3	IVF-ICSI	No pregnancy	37	2.5	171	427.5	71	8	1.61	36	Tubal obstruction
Patient-12	2,3	IVF-ICSI	No pregnancy	55	2.8	92	257.6	36	6	1.52	38	N
Patient-13	2,3	IVF-ICSI	No pregnancy	34	3.6	203	722.7	55	6	1.46	34	N
Patient-14	2,3	IVF-ICSI	No pregnancy	36	4.5	61	274.5	53	8	1.57	37	N
Patient-15	3	IVF-ICSI	Pregnancy-birth	45	2.5	56	140.0	50	6	1.46	39	Mild endometriosis
Patient-16	3	IVF-ICSI	regnancy-birth (twir	39	4.0	90	360.0	60	4	1.60	37	N
Patient-17	3	IVF-ICSI	Pregnancy-birth	39	2.8	206	576.8	40	15	1.32	35	N
Patient-18	3	IVF-ICSI	regnancy-birth (twir	36	2.8	105	288.8	58	15	1.63	33	N
Patient-19	3	IVF-ICSI	egnancy-miscarria	40	1.8	75	131.3	51	12	1.33	35	Mild endometriosis
Patient-20	3	IVF-ICSI	egnancy-miscarria	37	3.5	202	707.0	61	12	1.44	38	Mild endometriosis
Patient-21	3	IVF-ICSI	egnancy-miscarria	36	1.8	42	75.6	59	6	1.34	40	N
Patient-22	3	IVF-ICSI	Pregnancy-birth	32	4.8	196	931.0	48	14	1.35	27	Tubal obstruction
Patient-23	3	IVF-ICSI	No pregnancy	30	5.3	75	393.8	50	9	1.45	38	Tubal obstruction
Patient-24	3	IVF-ICSI	regnancy-birth (twir	37	2.5	87	217.5	54	11	1.54	38	Mild endometriosis
Patient-25	3	IVF-ICSI	egnancy-miscarria	44	4.9	119	583.1	60	12	1.42	39	Disovulation
Patient-26	3	IVF-ICSI	egnancy-miscarria	48	1.8	164	287.0	55	7	1.62	39	Mild endometriosis
Patient-27	3	IVF-ICSI	Pregnancy-birth	35	1.7	206	342.0	58	12	1.49	32	Disovulation
Patient-28	3	IVF-ICSI	No pregnancy	41	3.6	71	255.6	47	6	1.46	38	Disovulation
Patient-29	3	IVF-ICSI	Pregnancy-birth	36	7.3	92	671.6	46	8	1.52	35	Tubal obstruction
Average Controls	1			40.0	4 0	93.2	363	43.0	8.8	1.56		
Average Patients	1			40.6	4 7	34.3	159.3	41.9	2.9	1.00		
P-value	1			0.872	0.514	0 088	0 205	0.877	0.005	0.874		
Average Controls	2			42 1	4 1	96.1	357.4	60.0	8.6	1.5		
Average Patients	2			38.7	3.4	120.4	395.9	55 1	7.0	1.5		
P-value	2			0.354	0 244	0 474	0 704	0.516	0.335	0.956		
Average Controls	3			38 5	3.8	89 5	319.4	51 2	9.4	15		
Average Patients	3			38.9	3.7	103.3	354.5	51.3	77	1.5		
P-value	3			0.853	0.925	0.445	0.606	0.985	0.284	0.753		

N: normal; a: age average of female recipients is indicated

IVF-ICSI: in vitro fertilization-intracytoplasmic sperm injection

Methylation assay 1: Methylation array Methylation assay 2: Global DNA methylation Methylation assay 3: Pyrosequencing of repetitive sequences



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