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Paternal diet induces transgenerational epigenetic inheritance of DNA methylation signatures and phenotypes in sheep model

Camila U. Braz, Todd Taylor, Hadjer Namous, Jessica Townsend, Thomas Crenshaw and Hasan Khati[b*](#page-0-0)

Department of Animal and Dairy Sciences, University of Wisconsin-Madison, Madison, WI 53706, USA [∗]To whom correspondence should be addressed: Email: hkhatib@wisc.edu **Edited By:** Karen E. Nelson.

Abstract

Transgenerational epigenetic inheritance (TEI) requires transmission of environmentally induced epigenetic changes and associated phenotypes to subsequent generations without continued exposure to the environmental factor that originated the change. TEI is well-established in plants and *Caenorhabditis elegans*; however, occurrence in mammals is debated and poorly understood. Here, we examined whether paternal diet from weaning to puberty-induced changes in sperm DNA methylation that were transmitted to subsequent generations. Over 100 methylated cytosines, environmentally altered in the F0 generation, were inherited by the F1 and F2 generations. Furthermore, the F0 paternal diet was associated with growth and male fertility phenotypes in subsequent generations. Differentially methylated cytosines were correlated with gene expression. Our results demonstrate that some sperm methylation sites may escape DNA methylation erasure and are transmitted to subsequent generations despite the 2 waves of epigenetic programming: in primordial germ cells and in embryos after fertilization. These results advance our understanding of the complex relationships between nature and nurture.

Keywords: transgenerational epigenetic inheritance, paternal effect, DNA methylation, epigenetic reprogramming

Significance statement:

TEI, well-documented in plants and nematodes, is minimally documented in mammals. To meet the requirements of TEI, environmentally altered epigenetic marks and associated phenotypes must be transmitted at least to the first nonexposed generation. This study investigates the effect of paternal diet on sperm DNA methylation across 3 generations and the phenotypic outcomes of diet exposure. For the first time, our results demonstrate the inheritance of over 100 epigenetic marks and the alteration of reproduction and growth traits by a grandpaternal diet.

Introduction

The interplay between the environment and genes is an old debate that started with the spermism theory of Pythagoras in 530 BCE and continued in the 18th and 19th centuries through Lamarck's and Darwin's theories [\(1\)](#page-7-0). More recently, this debate has been reinvigorated by progress in epigenetic research methodologies. Environmentally induced epigenetic changes, including DNA methylation, histone modification, and noncoding RNAs [\(2,](#page-7-1) [3\)](#page-7-2), can be potentially transmitted to the next generation via the germline [\(4\)](#page-7-3). The transmission of epigenetic marks from parents to offspring when all generations involved are directly exposed to the inducing agent is called intergenerational epigenetic inheritance [\(5\)](#page-7-4). In contrast, transgenerational epigenetic inheritance (TEI) refers to the transmission of epigenetic changes across multiple generations without persistent exposure to the environmental factor that initiated the change [\(5\)](#page-7-4). Despite substantial evidence of TEI in plants, *Caenorhabditis elegans*, and fruit flies, data to support this phenomenon in mammals remain limited and

controversial due to multiple challenges associated with studies of epigenetic reprogramming and the lack of reproducibility across studies [\(6\)](#page-7-5). In mammals, 2 distinct waves of epigenetic reprogramming erase DNA methylation and reset histone modifications: one in the development of primordial germ cells and the second in development of the embryo after fertilization [\(7\)](#page-7-6). However, despite these 2 waves of epigenetic reprogramming, imprinted control regions and transposable elements resist reprogramming. The question of whether other genomic regions show TEI in mammals has not been fully answered.

Indeed, to meet the requirements of TEI, both environmentally induced epimutations in the germline and associated phenotypes must be identified across subsequent generations, at least through the first nonexposed generation [\(8,](#page-7-7) [9\)](#page-7-8). Only partial evidence of TEI has been reported in mammals, as no studies have met both these criteria [\(5,](#page-7-4) [8–11\)](#page-7-7). In some studies [\(12,](#page-8-0) [13\)](#page-8-1), only 1 generation was reported for DNA methylation changes after an environmental intervention. Sadler-Riggleman et al. [\(14\)](#page-8-2) exposed

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gestating rats to endocrine disruptors and studied the effects on DNA methylation, gene expression, and noncoding RNA in Sertoli cells of F1, F2, and F3 generations. Differentially methylated regions (DMRs) between treatment and control samples were identified in only the F3 generation. Other studies reported changes in phenotypes across generations that were not associated with inherited epigenetic changes. Ng et al. [\(15\)](#page-8-3) found that paternal highfat diet consumption was associated with increased insulin sensitivity, body weight, and adiposity in the F1 generation. Epigenetic changes were not reported in this study. A breakthrough study on nutritional effects in the viable yellow agouti mouse showed that supplementing pregnant female mice with methyl donors resulted in DNA methylation changes of the agouti locus associated with coat color and decreased obesity in the offspring [\(16\)](#page-8-4). However, whether the effects reported are truly TEI or are due to different intrauterine exposures is not clear [\(7\)](#page-7-6). Furthermore, no evidence of TEI was reported in the viable yellow agouti mouse model beyond the F2 generation [\(17\)](#page-8-5).

These studies contributed significant advancements in environmental epigenetics research; however, most results represent intergenerational, not transgenerational effects. Furthermore, most of the research on dietary modifications affecting epigenetic inheritance has focused on the maternal diet during pregnancy. We hypothesized that exposure of males from weaning to puberty to the methyl donor, methionine, would alter sperm DNA methylation across multiple generations and impact the phenotypic performance of the offspring.

Results

Transgenerational inheritance of methylated cytosines

To address evidence of TEI, we investigated the effects of paternal diet on phenotypes and DNA methylation changes in sperm of 3 generations of sheep. To reduce genetic variation, male twin pairs (F0 generation) were used; 1 twin was supplemented with the amino acid methionine (a methyl donor) in the diet from weaning to puberty, and the other twin was used as a control. Treated and untreated F0 males were bred to untreated females to produce the F1 generation $(n = 225)$. F1 male progeny of F0 treated and untreated males were bred to untreated females to produce the F2 generation ($n = 188$). All F1 and F2 animals were fed the control diet; only the F0 generation treated males were fed diets supplemented with methionine. To examine whether methionine supplementation alters DNA methylation patterns in sperm, we performed whole-genome bisulfite sequencing (WGBS) for the 10 F0 males used to produce the F1 generation. A total of 5,669 differentially methylated cytosines (DMCs), defined as cytosines with methylation level difference \geq 20% and false discovery rate (FDR) \leq 0.01, in the CG context (dinucleotide where a cytosine is followed by a guanine base), were found between the treatment and the control groups (Fig. [1A](#page-2-0); Dataset S1). We also found DMCs in non-CG contexts, including 1,288 CHHs (trinucleotides where H represents A, C, or T) and 329 CHGs (Fig. [1B](#page-2-0) and C; Dataset S1).

To investigate whether the DMCs of the F0 generation are inherited transgenerationally, we performed WGBS of sperm from 45 F1 animals (5 pooled samples from the progeny of the F0-treated group and 5 pooled samples from the control group) and 20 individual sperm samples of males from the F2 generation (10 grandprogeny from the F0-treated group and 10 grand-progeny from the F0 control group). We detected 2,911 CG, 451 CHH, and 121 CHG

DMCs in the F1 generation (Fig. [1D](#page-2-0)–F) and 2,661 CG, 1,553 CHH, and 416 CHG DMCs in the F2 generation (Fig. [1G](#page-2-0)–I). The distribution and the total number of cytosines and DMCs for CG, CHH, and CHG contexts across the genome for all 3 generations can be accessed in Supplementary Material Appendix, Figures S1–S6. There was a significant overlap of sperm DMCs between the F0 and F1 generations, including 839 CGs, 139 CHHs, and 34 CHGs (Fig. [2A](#page-3-0)–C). This intergenerational inheritance pattern was expected because the germline generating the F1 generation was also exposed to the methionine supplementation prior to puberty of the F0 generation. Similarly, a total of 225 CG, 59 CHH, and 13 CHG DMCs overlapped between the F1 and F2 generations (Fig. [2A](#page-3-0)–C). Common DMCs between only the F0 and F2 generations were also identified, indicating that some epigenetic marks appear to skip generations, as previously reported [\(18\)](#page-8-6).

To meet the requirements of TEI, DNA methylation signatures altered by environmental stimuli in males must be transmitted into the F2 generation [\(9\)](#page-7-8). Other studies have reported generationspecific DNA methylation signatures without an overlap of DMRs across generations [\(3,](#page-7-2) [18\)](#page-8-6). Therefore, we assessed whether sperm DMCs were present across all 3 generations. Surprisingly, we identified 107 transgenerationally inherited modified cytosines; 82, 20, and 5 DMCs were in CG, CHH, and CHG contexts, respectively (Fig. [2;](#page-3-0) Dataset S2). We further investigated whether the hypermethylation and hypomethylation trends of these DMCs were maintained in the treatment groups from the F0 to the F2 generation. Interestingly, 96 of 107 transgenerationally inherited cytosines (89.7%; 72 CGs, 19 CHHs, and 5 CHGs) demonstrated the same trend of hypermethylation or hypomethylation in the treatment groups across 3 generations (Fig. [3A](#page-4-0)*–*C).

Genomic locations of DMCs

To better understand the biological functions of DMCs, we determined the genomic locations of all DMC types, including CGs, CHHs, and CHGs, throughout the sheep genome (Supplementary Material Appendix, Table S1). Regardless of the cytosine context, most DMCs were located in intergenic regions (∼ 65%). About 32% of the DMCs were located in intronic regions, indicating potential involvement in regulating alternative splicing [\(19\)](#page-8-7), while ∼ 4% of DMCs were localized to promoter regions (Supplementary Material Appendix, Table S1; Dataset S1). Only a small proportion of DMCs reside in 3'UTR (untranslated region), 5'UTR, upstream, downstream, exons, or coding regions (Supplementary Material Appendix, Table S1; Dataset S1). Studies have shown that DNA methylation in promoter and gene body regions can affect gene expression through changes in chromatin structure or transcription efficiency [\(20,](#page-8-8) [21\)](#page-8-9). About 67% of the DMCs were mapped to repeat sequences, including the transposable elements LINEs (long interspersed nuclear elements), SINEs (short interspersed nuclear elements), and LTRs (long terminal repeats). These genomic regions constitute half of most mammalian genomes [\(22\)](#page-8-10), and their repression relies on DNA methylation [\(23\)](#page-8-11).

Transgenerational inheritance of phenotypes

The concept of TEI implies that environmentally induced epigenetic changes are transmitted to unexposed subsequent generations and associated with transgenerationally inherited phenotypes. Therefore, we evaluated whether the F0 methioninesupplemented diet affected growth and reproduction phenotypes of the F1 and F2 generations. However, one argument against TEI in mammals is the challenge of ruling out the influence of genetic effects underlying the inherited phenotypes [\(9,](#page-7-8) [10\)](#page-7-9). Thus,

Fig. 1. Volcano plots of DMC analyses. DMCs were defined as those with methylation difference (*x-*axis) greater than 20% between the treatment and control groups and with a FDR of 0.01 (*y-*axis) as threshold values. Red and blue dots represent DMCs hypomethylated and hypermethylated in methionine-treated group compared to control group, respectively. (A) CG context for F0. (B) CHH context for F0. (C) CHG context for F0. (D) CG context for F1. (E) CHH context for F1. (F) CHG context for F1. (G) CG context for F2. (H) CHH context for F2. (I) CHG context for F2.

to avoid confounding effects, our phenotypic association analysis accounted for genetic factors including F0 twin pair and litter and nongenetic factors such as the number of siblings born, maternal age, rearing conditions, and age of the animal at the measurement. Testicular size (measured as scrotal circumference) was significantly associated with the F0 diet in both F1 (*P* = 0.032) and F2 $(P = 0.049)$ generations (Table [1\)](#page-5-0). The males of the methionine F1 and F2 generations that were not themselves fed the methionine diet had, on average, 1.00 and 0.81 cm smaller scrotal circumference (SC), respectively, when compared with the control groups (Table [1\)](#page-5-0). Testicular size is positively correlated with male fertility and is considered an indirect measure of testicular functions and spermatogenesis [\(24\)](#page-8-12). The growth traits of weaning weight (WWT) and postweaning weight (PWT) were significantly affected

by F0 paternal diet only in F2 generation females ($P = 0.020$, *P* = 0.029, respectively). Similarly, loin muscle depth (LMD), a growth-related phenotype, was significant $(P = 0.003)$ in males of the F2 generation (Table [1\)](#page-5-0). Generation and sex-specific phenotypes have also been observed in other transgenerational studies [\(3,](#page-7-2) [18,](#page-8-6) [25\)](#page-8-13), although the underlying mechanisms are not fully understood.

Although there is evidence of transgenerational inheritance of phenotypes such as behavioral and metabolic effects of paternal stress [\(26\)](#page-8-14) or male fertility effects due to exposure of gestating females to toxicants [\(27\)](#page-8-15), defined molecular mechanisms underlying these phenotypes are missing [\(10\)](#page-7-9). Thus, there is a need to identify environmentally altered genes that are inherited across generations and associated with the observed

Fig. 2. Venn diagrams of DMCs that overlapped across generations. DMCs overlap between F0, F1 and F2 generations in (A) CG, (B) CHH, and (C) CHG contexts.

phenotypes [\(5\)](#page-7-4). A total of 35 out of 107 DMCs shared across all 3 generations were mapped to 33 genes (Dataset S2). Many of the transgenerationally marked genes play roles in growth (*DI-RAS3*, *CTNNA3*, *CAP2*, *COL19A1*, *LRRIQ3*, and *CDH12*) and/or male reproduction (*DIRAS3*, *CTNNA3*, *LRRIQ3*, *DLG2*, *LPAR1*, *AXDND1*, *YBX3*, *THOC1*, *GK2*, *CATSPER3*, *ZBTB20*, and *STK32B*; Supplementary Material Appendix*,* Table S2). Interestingly, growth and male fertility phenotypes showed significant associations with the paternal diet in the F1 and F2 generations (Table [1\)](#page-5-0).

Gene expression is partially regulated by epigenetic modifications, including DNA methylation in promoter and enhancer regions. Determining the relationship between DNA methylation and gene expression in the offspring following experimental paternal nutrition in F0 will help us understand the mechanisms underlying the observed phenotypic differences. We performed RNA-Seq in the same F2 generation sperm samples used for WGBS followed by Pearson's correlation (*r*) analysis between the methylation levels of TEI DMCs (with consistent methylation patterns across all 3 generations) located within genes or in promoter regions (10 kb from transcription start sites, TSS) and the normalized expression values of the corresponding genes. The analysis identified 12 genes with expression levels correlated with DMCs ($P \le 0.10$, $r \ge 0.30$; Supplementary Material Appendix, Table S3), of which 5 genes play roles in male fertility (Supplementary Material Appendix, Table S2). Sperm gene expression can also affect embryo development and offspring phenotypes [\(28\)](#page-8-16). Therefore, these correlation results provide additional support for the possible roles of these genes in transgenerationally inherited phenotypes and could be a hypothesis-generating basis for other phenotypes not measured in this study.

Discussion

Previous studies in mammals have provided only partial evidence of TEI for various reasons, including experimental design, sample size, selected loci used to study TEI, animal model, DNA methylation method, dose and duration of environmental exposure, and the lack of a consensus about the definition of TEI. Indeed, most environmental toxicant studies in mammals show intergenerational rather than transgenerational effects [\(5\)](#page-7-4). These factors have led to remarkable skepticism in the scientific community about the occurrence of TEI in mammals [\(5,](#page-7-4) [8–11\)](#page-7-7). To address these valid criticisms about TEI, we used twin pairs for treatment and control subjects and produced a large number of F1 and F2 offspring for DNA methylation and phenotypic analyses. In addition, there is a need to establish a dose level that induces transgenerational response without causing significant toxicity when studying the effects of environmental insults on TEI [\(29\)](#page-8-17). Anway et al. [\(27\)](#page-8-15) exposed gestating females to vinclozolin levels that were greater than expected for environmental exposures. A high dose of bisphenol-A was used to study the impacts of this chemical on male fertility [\(30\)](#page-8-18). The potential toxicological effects of these extreme dosages may confound epigenic affects. Our study showed that a moderate nutritional treatment (3 g of methionine a day for 10–12 weeks) induced significant sperm DNA methylation and phenotypic changes that were inherited by subsequent generations. Another challenge associated with transgenerational studies in mice and rats is the short exposure window to the environmental insult [\(29\)](#page-8-17). The germline of the mouse is susceptible to epigenetic environmental changes between embryonic days E6 and E15, whereas, in our experiment, males were exposed to the methionine supplementation for about 12 weeks, from weaning to puberty.

The use of WGBS allowed us to investigate TEI at the singlenucleotide resolution level and identify a remarkable consistency of paternal diet-induced DMCs across 3 generations compared to previous studies, where low-resolution DNA methylation methods were used. To study the effects of vinclozolin on epigenetic inheritance and male fertility in rats, Anway et al. [\(27\)](#page-8-15) used the methylation-sensitive restriction enzymes method that revealed DNA methylation changes in only 25% of the sperm DNA samples treated with vinclozolin, and only 2 genes were tested for DNA methylation. Rahman et al. [\(30\)](#page-8-18) used the global DNA methylation assay to study the impact of bisphenol-A on male fertility in mice. Although the exposure of F0 males was associated with DNA methylation changes in subsequent generations, specific methylated cytosines were not reported in that study. Carone et al. [\(13\)](#page-8-1) investigated the effects of paternal low-protein diet on gene expression and DNA methylation in liver samples of the F1 generation. Interestingly, the paternal diet was correlated with an elevated expression of many genes involved in lipid and cholesterol biosynthesis. However, the authors used reduced representation bisulfite sequencing (RRBS), which represents only about 1% of the genome compared to the high resolution of WGBS used in our study. WGBS is the gold standard for comprehensive and unbiased whole-genome DNA methylation profiling. To our

Fig. 3. TEI marks that follow the same trend over generations. (A) A total of 72 TEI marks CG context. (B) A total of 19 TEI marks CHH context. (C) A total of 5 TEI marks CHG context. Red and blue bars represent hypomethylated and hypermethylated TEI marks (as methylation percentage difference) in the methionine-treated group compared to the control group, respectively. Top, middle, and low panels indicate F0, F1, and F2 generations, respectively. The *x*-axis represents the location of each TEI cytosine denoted as chromosome and chromosomal position in base-pair.

knowledge, this is the first study to report transgenerational inheritance of differentially methylated CHH and CHG in mammals. Non-CG methylation loci are involved in gene regulation and have been linked to the expression of DNMT3L, a DNA methyltransferase essential for the silencing of retrotransposons within repeat sequences in male germ cells [\(31\)](#page-8-19).

An essential requirement of TEI is the transmission of environmentally induced epimutations at least to the first nonexposed generation [\(8,](#page-7-7) [9\)](#page-7-8). Our results provided evidence of transgenerational inheritance of 96 environmentally modified cytosines

that show the same trend of hypermethylation or hypomethylation in the treatment groups across 3 generations. Conversely, Constantinof et al. [\(25\)](#page-8-13) reported generation-specific DNA methylation levels of 2 genes in guinea pigs that showed decreased methylation in 1 generation and increased methylation in other generations. The authors reported differentially expressed genes in the hippocampus between animals supplemented with synthetic glucocorticoids and controls in all 3 studied generations. However, there was no overlap between these differentially expressed genes across the generations [\(25\)](#page-8-13). The exposure of

WWT, weaning weight; PWT, postweaning weight; SC, scrotal circumference; LMD, loin muscle depth; N, number of animals analyzed; Estimate, estimate of diet
effect on treatment animals compared with control animals; and SE,

gestating female rats to glyphosate resulted in DMRs in the sperm of treated vs. control males in F1, F2, and F3 generations [\(3\)](#page-7-2). However, no overlapping DMRs were identified between the generations [\(3\)](#page-7-2). Similarly, Ben Maamar et al. [\(18\)](#page-8-6) studied the effects of vinclozolin exposure of gestating rats on DNA profiles of subsequent generations. The authors reported 44 DMRs overlapped between F2 and F3 generations, 4 DMRs overlapped between F1 and F3 generations, and 2 DMRs overlapped between F1 and F2 generations [\(18\)](#page-8-6). No DMRs were found in common across all 3 generations. Thus, the consistent hypermethylation and hypomethylation trends of a large number of DMCs across 3 generations identified in our study is a strong indication of TEI and expands our knowledge of genomic loci that escape epigenetic reprogramming.

TEI requires an incomplete erasure of the epigenetic marks during developmental reprogramming, allowing the transfer of these marks from parents to the offspring [\(9\)](#page-7-8). Imprinted control regions and transposable elements are known to resist epigenetic reprogramming. We found a DMC in the promoter region of the imprinted gene *DIRAS3,* also harboring a LINE-1 sequence. Effects of parental diet on the expression and DNA methylation of imprinted genes, including *DIRAS3* [\(27\)](#page-8-15), have been reported in sheep fetal tissues [\(32\)](#page-8-20). In addition, most of the DMCs influenced by the paternal diet in this study were mapped to repeat sequences, including the transposable elements LINEs. Transcriptional silencing of transposable elements is essential for preventing their mobilization, maintaining genomic stability, and germ cell development and integrity [\(23,](#page-8-11) [33,](#page-8-21) [34\)](#page-8-22). Supplementation of methyl donors to gestating mice resulted in increased DNA methylation at a transposable element upstream of the agouti gene leading to altering the coat color of the offspring [\(16\)](#page-8-4). Furthermore, DNA methylation changes in transposable elements have been associated with metabolic phenotypes such as obesity [\(35\)](#page-8-23) and initiation and progression of different cancer types [\(36\)](#page-8-24). Thus, the diet-induced DNA methylation observed in transposable elements is intriguing because it demonstrates the vulnerability of these elements to nutritional effects, which could result in altered phenotypic outcomes across generations. We also detected TEI DMCs outside transposable elements and imprinted control regions, indicating that other genomic regions may escape DNA methylation erasure. Interestingly, 26 and 13 TEI DMCs were located in intergenic and intron regions, respectively (Dataset S2). DNA methylation in intronic regions has been associated with the regulation of alternative splicing [\(19\)](#page-8-7). Previous studies suggested that DNA methylation in intergenic regions regulate miRNA expression [\(37\)](#page-8-25) and contribute to genomic

stability and conservation [\(38\)](#page-8-26). In addition, Schlesinger et al. [\(39\)](#page-8-27) reported that enhancer activation and noncoding transcriptional output are linked to DNA methylation in intergenic regions.

Despite the 2 waves of epigenetic programming in primordial germ cells and embryos immediately after fertilization, we found many sperm methylation sites that appear to escape DNA methylation erasure and are transmitted to subsequent generations. However, a formidable challenge is required to unravel molecular links between sperm DNA methylation changes and phenotypes of somatic tissues [\(40\)](#page-8-28). We can assume a direct link between sperm DNA methylation changes and the testicular size phenotype observed in the F1 and F2 generations. A transgenerationally transmitted testis phenotype induced by an environmental factor indicates epigenetic alteration of the male germline [\(27\)](#page-8-15). Indeed, transgenerationally marked genes detected in this study were associated with sperm motility and concentration, testis development, spermatogenesis, abnormal sperm, and male fertility (Supplementary Material Appendix, Table S2). These factors are correlated with testicular size [\(24\)](#page-8-12). Zhou et al. [\(41\)](#page-8-29) reported a relationship between sperm DNA methylation and germ cell development, male infertility, piRNA pathway, spermatogenesis, and germline integrity. Therefore, the DNA methylation pattern in sperm may guide the expression of genes affecting testicular size. For the growth traits observed in the F2 generation, fetal programming is a possible link between sperm DNA methylation and these phenotypes. Epigenetic modifications in growth-related genes in sperm may contribute to fetal developmental changes, which persist into adult life [\(42\)](#page-8-30).

In summary, here we show, for the first time, that environmentally altered epigenetic marks in sheep are transmitted to subsequent generations that have not been directly exposed to the diet that initiated the epigenetic changes. Over 100 methylated cytosines, environmentally altered in the F0 generation, were inherited by the F1 and F2 generations. These results can improve our understanding of the mechanisms of non-Mendelian inheritance. Furthermore, the F0 paternal diet was associated with growth and male fertility phenotypes in subsequent generations, a finding that could be used to predict phenotypic outcomes of environmental interventions in future generations. Our findings suggest that sperm have the plasticity to reconfigure DNA methylation signatures in response to paternal diet and pass this message to subsequent generations. We believe these results advance our understanding of the relationship between nature and nurture.

Materials and Methods Study design

To study the effect of paternal diet on DNA methylation in the sperm and phenotypes across generations, 2 groups of male Polypay sheep were used [\(43\)](#page-8-31). Briefly, 10 male twin pairs (20 sheep in total) were randomly divided into 2 groups, in which 1 animal from each pair was fed a control diet, and the other twin received the control diet plus an additional, top-dressed encapsulated methionine supplement (0.22% addition, 1.5 g; RPM Smartamine, Adisseo, Alpharetta, GA), from weaning until puberty. Between feedings, rams were group-housed and received forage (orchard grass and alfalfa hay) and water ad libitum. Then, 10 F0 rams (5 from each group) were each housed in individual pens with a group of 8–9 untreated Polypay female sheep each, for 2 breeding cycles. F0 offspring (the F1 generation) comprised 225 animals (115 males and 110 females). A maximum of 2 lambs were raised naturally per ewe; any third or fourth lambs in a litter were removed (after 48 h of colostrum consumption) and fostered to another ewe or raised artificially. All F1 animals were fed control diets for the remainder of the trial. To produce the F2 generation, 10 F1 rams (1 each from the 5 F0 sires from the control group and from the 5 F0 sires from the treatment group) were individually housed with a group of 10 untreated Polypay ewes each, for 2 breeding cycles. The F2 generation consisted of 188 animals (94 males and 94 females), which similarly to the F1 generation, were raised naturally, fostered, or raised artificially and fed the control diet until the end of the experiment.

Semen collection and evaluation

In TEI, the epigenetic marks altered by exposure might be transmitted to subsequent generations through the germline [\(44\)](#page-8-32). Therefore, semen samples from animals of all generations (F0, F1, and F2) were collected and analyzed. Semen was collected via electroejaculation techniques, using the Lane Pulsator IV (Lane Manufacturing Inc., Denver, CO) as specified by Gross et al. [\(43\)](#page-8-31). In brief, ejaculate was collected into a graduated conical vial and its volume was measured. A 30- μ l portion of raw semen was removed and added to a 0.1% paraformaldehyde (PFA) solution at a 1:2 dilution, which was used later to determine semen concentration with a hemocytometer. Total sperm per ejaculate was calculated by multiplying sperm concentration of the ejaculate by the total volume. The remaining semen was transported to the laboratory in a prewarmed (37◦C) semen extender, which was used to evaluate the motility using computer-assisted sperm analysis (CASA) with a Hamilton Thorne semen analyzer (Hamilton-Thorne Research, Beverly, MA). To ensure rams were pubertal and producing high-quality sperm cells for both study and breeding, we used only semen samples with at least 50 \times 10⁶ sperm per ejaculate and more than 10% motility [\(45\)](#page-8-33), as such measurements have been associated with DNA and RNA integrity [\(46\)](#page-8-34). The remaining semen from each qualifying sample was washed with phosphate-buffered saline (PBS), pelleted by centrifugation, preserved in RNAlater, and stored at −80°C.

WGBS of F0, F1, and F2 generations

Genomic DNA from semen samples was extracted using the Quick-DNA Miniprep Plus (Zymo Research, Irvine, CA), and then bisulfite treated with the EZ DNA Methylation-Lightning kit from Zymo Research. In total, 40 samples were selected for WGBS. The 10 F0 rams used to produce the F1 generation were individually sequenced (5 from the control group and their 5 twins from the methionine treatment group). From the F1 generation, we sequenced 10 pooled samples (from 45 sheep total), of which 5 pools included offspring of the F0 control group and 5 pools consisted of offspring of the F0 treatment group. We then individually sequenced 20 rams from the F2 generation: 10 descendants of the F0 control group and 10 of the F0 treatment group (2 sheep descended from each F0 sire). WGBS was performed at the University of Illinois, Urbana-Champagne, using Illumina NovaSeq 6000 sequencing platform, with S4 flow cell, to generate 150 bp paired-end reads and reach 25x mean coverage (Illumina, San Diego, CA). Fastq files were generated and demultiplexed with the bcl2fastq Conversion Software (version 2.20, Illumina). The number of reads generated per sample varied from 189.9 to 285.7 M with an average of 233.5 M. For each sample, quality check of raw reads was performed using FastQC software, version 0.11.8 (http:// www.bioinformatics.babraham.ac.uk/projects/fastqc/) and Trim-Galore version 0.6.5 (https://www.bioinformatics.babraham.ac.u k/projects/trim_galore/) was used to remove adapter sequences, and low-quality reads and bases.

Sequence alignment and DNA methylation analysis

The cleaned data were aligned to the sheep reference genome (Oar_rambouillet_v1.0) using bowtie2 of the Bismark software, version 0.22.3 [\(47\)](#page-8-35), followed by deduplication to remove reads aligned to the same region of the genome. On average, the percentage of alignment was 77%, varying from 67.6% to 80.7%. "Bismark_methylation_extractor" function was used to extract methylation calls at a single-base resolution [\(47\)](#page-8-35) discriminating between cytosines in CG, CHH, or CHG context, where H is A, C, or T. Calculations of read counts and methylation levels were carried out using the "methylKit" R package [\(48\)](#page-8-36). A minimum of 10 reads per cytosine among all samples was used as a cutoff for further analysis. DMCs were defined as those with methylation difference greater than 20% between the treatment and control groups, and with a FDR of 0.01 as threshold values. DMCs that had higher or lower methylation in treatment animals when compared with the control animals were considered as hypermethylated or hypomethylated, respectively. Exon, intron, promoter, and intergenic regions that overlapped with DMCs were annotated. Promoter regions were defined as 10 kb upstream of transcription start sites (TSSs) of genes. Upstream and downstream features were considered as 200 bp sequences from genes start and end positions, respectively. Repetitive elements were downloaded from the University of California, Santa Cruz (UCSC) database [\(49\)](#page-8-37) and overlapped with the DMCs. Figures were generated using the R package "ggplot2" [\(50\)](#page-8-38).

Identification of RNAs expressed in the F2 generation sperm

The same 20 semen samples from the F2 generation used for WGBS were also used for RNA sequencing. The RNAlaterpreserved samples (200 ul) were centrifuged for 4 minutes at 4,000 rpm. After supernatant removal, cells were suspended with 1 ml of somatic cell lysis buffer for 4 minutes on ice [\(51\)](#page-9-0). Samples were centrifuged for 4 minutes at 4,000 rpm and lysis supernatant was removed. Total RNA was then extracted using 1 ml of TRIzol Reagent (Life Technologies, Carlsbad, CA), according to manufacturer instructions, followed by DNase I treatment (Lucigen, Middleton, WI). RNA quality and quantity were determined by NanodropOne (Thermofisher Scientific, Wilmington, DE) and electrophoresis before RNA sequencing (RNA-Seq). RNA-Seq

was performed at the University of Illinois, Urbana-Champagne, using Illumina NovaSeq 6000 sequencing platform, generating, on average, 37.6 M (31.8–47.4 M) 100 bp single-end reads (Illumina). The bcl2fastq Conversion Software (version 2.20, Illumina) was used to generate and demultiplexe the Fastq files. For each sample, quality check of raw reads was performed using FastQC software (http://www.bioinformatics.babraham.ac.uk/pr ojects/fastqc/), and Trimmomatic [\(52\)](#page-9-1) was used to remove adapter sequences, and low-quality reads and bases. STAR [\(53\)](#page-9-2) was then used to align the trimmed reads to the sheep reference genome (Oar_rambouillet_v1.0) using the "–quantMode GeneCounts" option to estimate gene counts. In total, 16,098 expressed genes with at least 15 counts in more than 10 samples were considered for further analysis. The R package "edgeR" [\(54\)](#page-9-3) was used to normalize gene counts based on the trimmed mean of M-values (TMM) method.

Integrating DNA methylation and gene expression

To identify genes affected by transgenerational DMCs, Pearson's correlation (*r*) was calculated between the methylation levels of DMCs located within or in promoter regions (10 kb from TSS) and the normalized expression values of the corresponding genes [\(55\)](#page-9-4). Methylation levels were defined as the ratio of the intensities of methylated and unmethylated cytosines. Significant correlation was achieved with *P*-value \leq 0.10 and $r \geq$ 0.30 [\(55\)](#page-9-4).

Phenotype collection and association analysis

To evaluate whether the F0 methionine-supplemented diet affected growth and reproduction phenotypes of the F1 and F2 generations, we performed an association analysis between F0 diet and birth weight (BWT), WWT, PWT, SC, fat depth (FD), and LMD phenotypes. SC was measured at the widest point in the scrotum using a flexible measuring tape. Each ram was prepared for ultrasound measurements by shearing a dorsal area, on the left side, over the 12th and 13th ribs, which was then rubbed with vegetable oil to create a connection medium for the ultrasound [\(56\)](#page-9-5). The Longissimus dorsi muscle was scanned using an Aloka SSD-500 portable ultrasound machine with a 7.5 MHz linear probe and images were saved to a laptop for further analyses. Using the Image J software [\(57\)](#page-9-6), FD was obtained by measuring adipose tissue that was between the muscle and skin, and LMD was determined at the vertically deepest point of the muscle.

Phenotypes were evaluated for each generation (F1 and F2) using linear mixed models implemented in the "lme4" R package [\(58\)](#page-9-7). For both generations, diet was included as a fixed effect, birth type (number of siblings born) and age of the dam were included as covariables, and the F0 ram pair and litter were included as random effects in the model. Rearing type (single, naturally, artificially, or foster reared) was also included as a fixed effect, and age at measurement as a covariable in the model for all traits, except for birth weight. For LMD and SC, weight of the animal at measurement was also included as a covariate. Animals in the F1 generation were raised in different pens; therefore, pen was also included as a fixed effect in the F1 phenotypes analyses.

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Supplementary Material

Supplementary material is available at *[PNAS Nexus](https://academic.oup.com/pnasnexus/article-lookup/doi/10.1093/pnasnexus/pgac040#supplementary-data)* online.

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Authors' Contributions

C.U.B. contributed to the semen collection and animal phenotyping, analyzed the data, and wrote the manuscript. T.T. managed the sheep and helped with the semen collection and breeding. H.N. and J.T. contributed to the DNA methylation and the RNA-Sequencing experiments. T.C. contributed to the nutritional aspects of the study. H.K. conceived the study and contributed to the writing of the manuscript. All authors discussed the results and commented on the manuscript.

Data Availability

All study data are included in the article, SI Appendix, and Datasets S1 and S2. WGBS and RNA sequencing data have been deposited in NCBI's Gene Expression Omnibus and are accessible through GEO Series acession number GSE198935.

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