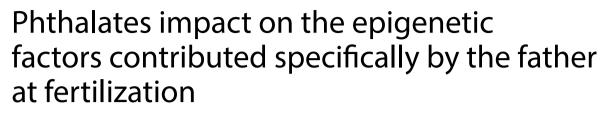
# RESEARCH

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# Abstract

**Background** Preconception exposure to phthalates such as the anti-androgenic dibutyl-phthalate (DBP) impacts both male and female reproduction, yet how this occurs largely remains unknown. Previously we defined a series of RNAs expressly provided by sperm at fertilization and separately, and in parallel, those that responded to high DBP exposure. Utilizing both populations of RNAs, we now begin to unravel the impact of high-DBP exposure on those RNAs specifically delivered by the father.

**Results** Enrichment of RNAs altered by DBP exposure within the Molecular Signature Database highlighted cellular stress, cell cycle, apoptosis, DNA damage response, and gene regulation pathways. Overlap within each of these five pathways identified those RNAs that were specifically ( $\geq$  fivefold enriched) or primarily ( $\geq$  twofold enriched) provided as part of the paternal contribution compared to the oocyte at fertilization. Key RNAs consistently altered by DBP, including *CAMTA2* and *PSME4*, were delivered by sperm reflective of these pathways. The majority (64/103) of overlapping enriched gene sets were related to gene regulation. Many of these RNAs (45 RNAs) corresponded to key interconnected CRREWs (Chromatin remodeler cofactors, RNA interactors, Readers, Erasers, and Writers). Modeling suggests that *CUL2*, *PHF10*, and *SMARCC1* may coordinate and mechanistically modulate the phthalate response.

**Conclusions** Mediated through a CRREW regulatory network, the cell responded to exposure presenting stressedinduced changes in the cell cycle—DNA damage—apoptosis. Interestingly, the majority of these DBP-responsive epigenetic mediators' direct acetylation or deacetylation, impacting the sperm's cargo delivered at fertilization and that of the embryo.

Keywords Phthalates, Sperm RNA, Paternal contribution, Chromatin modifiers

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# Background

It is now well-known that sperm delivers an entire set of extra-chromosomal components, including RNAs, at fertilization ([1], reviewed in [2]). We defined a series of paternal-provided RNA elements (REs, exon-sized sequences) that are enriched at least fivefold above the oocyte and delivered at fertilization, providing a unique set of RE-containing RNAs (RE-RNAs) while markedly enhancing those present in the oocyte [3]. To date, several of these sperm RE-RNAs have been shown to respond to exposures reflective of lifestyle [4–7]. Some have now been implicated in offspring phenotype [6,



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8–11], highlighting the importance of understanding their role in development.

Phthalates are endocrine disruptors widely used in consumer products [5, 12-14], such as vinyl plastics, personal care products, and some medication coatings [15–18]. To date, it is known that phthalate exposure in males has an adverse impact on semen and embryo quality, as well as time to pregnancy [19-22], but the mechanism(s) remains obscure. To begin to address this gap, we defined a series of sperm REs that respond to phthalates [5] using the dibutyl-phthalate (DBP) Inflammatory Bowel Disease (IBD) mesalamine crossover cross-back model (reviewed in [17]). To evaluate the impact of high-DBP exposure, we recruited men taking one of two formulations of mesalamine; one was encapsulated in a DBP-containing coating, and one was without DBP in the coating. Sperm RE-RNAs [5] were isolated and compared to those observed in the oocyte and zygote. Two paternal provided classes were defined from REs present in the zygote. Those paternal provided REs enriched  $\geq$  fivefold compared to the oocyte [3], and excluding those defined here as fivefold enriched [3], those paternal REs,  $\geq$  twofold enriched compared to the oocyte. Through RE expression, we show the mechanistic impact of high-DBP exposure acting through epigenetic modifiers and how they affect those RE-RNAs paternally provided to the oocyte at fertilization.

## Results

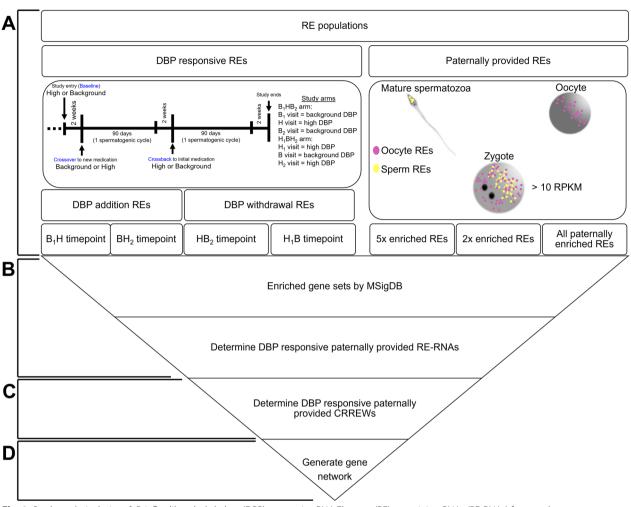
Sperm RNAs are known to respond to environmental exposures [4-6]-like dibutyl-phthalate (DBP), an endocrine disruptor found in some medications, including the coating of Asacol, whose active ingredient is mesalamine used to treat Inflammatory Bowel Disease (IBD) [5, 15, 22]. At the recommended maximal Asacol dosage, DBP exposure from the coating exceeds the Environmental Protection Agency (EPA) reference dose for a 150-pound individual by 300–700% (reviewed in [5, 23]) based on the DBP primary urinary metabolite, monobutyl phthalate (MBP). Men on Asacol had MBP urinary concentrations 1,000 times higher than the median male concentration reported in the National Health and Nutrition Examination Survey (NHANES [24] within the general United States population [23]. However, studies also indicate that lower level environmental background exposures to DBP from personal care and consumer products may impact semen and embryo quality, and time to pregnancy [19–22]. Analysis of those sperm RNA Elements (REs, exon-sized RNA fragments) altered in response to high-DBP exposure from using DBP-coated mesalamine, Asacol, compared to the non-DBP coated mesalamine, Pentasa, has begun to define DBP exposome pathways that impact sperm RE-containing RNAs (RE-RNAs) [5].

As summarized in Fig. 1A, REs responsive to high-DBP exposure [5] modifying the male contribution at fertilization was considered. Men who were on non-DBP coated mesalamine (e.g., Pentasa) transitioned to high-DBP coated mesalamine (Asacol) (referred to as baseline to crossover;  $B_1H$ ) in the baseline non-DBP ( $B_1HB_2$ ) study arm as well as men transitioning from non-DBP coated mesalamine (e.g., Pentasa) back to high-DBP coated mesalamine (Asacol) (referred to as crossover to crossback; BH<sub>2</sub>) in the high-DBP (H<sub>1</sub>BH<sub>2</sub>) study arm, were considered. Comparison of REs responding to DBP withdrawal was from the men starting on high-DBP coated mesalamine transitioning to non-DBP coated mesalamine (baseline to crossover;  $H_1B$ ) and men transitioning from high-DBP-coated mesalamine back to non-DBPcoated mesalamine (crossover to crossback; HB<sub>2</sub>).

#### Biological pathways altered by DBP exposure

The REs defined from this series of high-DBP exposures or withdrawals were associated with biological pathways within the Molecular Signature Database (MSigDB) using the DBP responsive RE-RNAs summarized in Fig. 1B (Additional file 2: Table S1) as input. These included all positively or negatively correlated RE-RNAs, or the entire set of correlated RE-RNAs described as altered between each study visit, e.g., B<sub>1</sub>H (high-DBP exposure). For each set of genes, enrichment (Fig. 1B) identified five major biological processes; cellular stress, cell cycle, DNA damage response, apoptosis, and gene regulation (Fig. 2A, Additional file 3: Table S2). Each enriched biological process included specific MSigDB gene sets within both study arms (B<sub>1</sub>HB<sub>2</sub> and H<sub>1</sub>BH<sub>2</sub>).

The majority of enriched gene sets were associated with gene regulation (191/392 gene sets), indicating a large proportion of DBP-responsive RE-RNAs function as either transcription factors (TFs) or CRREWs (Chromatin remodeler cofactors, RNA interactors, Readers, Erasers, and Writers [4]). DBP-responsive TF binding sites were identified, and the number of unique TFs assigned to these binding sites is summarized in Additional file 4: Table S3A. However, there was no statistical significance in the number DBP responsive TF encoded RE-RNAs (Additional file 4: Table S3A), which suggested other modulators of gene expression may dominate, and CRREWs were considered (Fig. 1B and D, Additional file 5: Table S4). The proportion of CRREWs was higher than expected (Additional file 4: Table S3B). Accordingly, their potential as modulators among the various enriched biological processes was examined (Fig. 2A). In total, 119 CRREWs were specific to the analysis within the B<sub>1</sub>HB<sub>2</sub> comparisons, while 60 CRREWs were specific to those within the H<sub>1</sub>BH<sub>2</sub> comparisons. Fifty CRREWs were represented in the analysis of both study arms (Additional

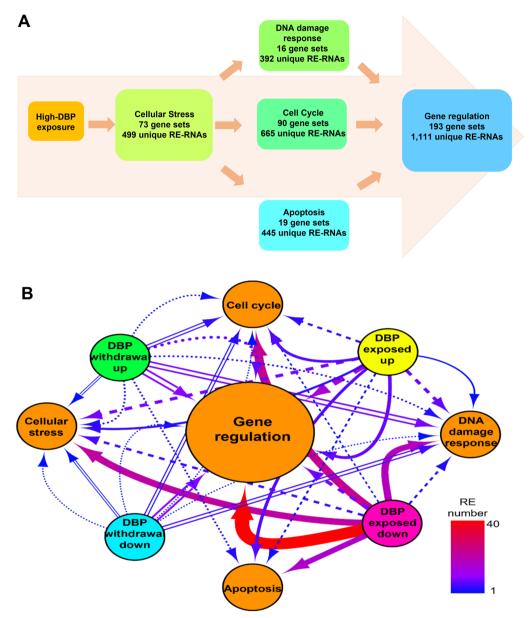


**Fig. 1** Study analysis design. **A** Briefly, dibutyl-phthalate (DBP) responsive RNA Element (RE)-containing RNAs (RE-RNAs) from each crossover– crossback segment and paternally provided set were identified. **B** Ontology was assessed by the Molecular Signature Database (MSigDB), and shared DBP responsive and paternally provided RE-RNAs determined. **C** Shared RE-RNAs were evaluated for presence in overlapping DBP responsive and paternally provided MSigDB enriched gene sets. CRREWs (chromatin remodeler cofactors, RNA interactors, Readers, Erasers, and Writers) RE-RNAs were identified, and their presence within overlapping DBP responsive and paternally provided MSigDB gene sets was assessed. **D** Gene network to visualize CRREW biological process interactions was generated. H<sub>1</sub>B; high-DBP (baseline visit) to background DBP (crossover visit), BH<sub>2</sub>; background DBP (crossover visit) to high-DBP (crossback visit), B<sub>1</sub>H; background DBP (baseline visit) to high-DBP (crossover visit), HB<sub>2</sub>; high-DBP (crossover visit) to background DBP (crossback visit)

file 5: Table S4). Together this suggests that a start arm's initial drug coating (i.e., high-DBP coated mesalamine or non-DBP coated mesalamine) impacts these biological processes through a unique set of CRREW modulators. In total, 50 DBP-responsive CRREWs were shared between both study arms modulating these biological processes.

# DBP-responsive and paternally provided RE-RNAs

Consideration was given to whether the DBP-responsive RE-RNAs and enriched pathways were present, enriched, and/or unique in those provided by the father at fertilization. Enriched vs unique paternal REs were defined by the presence, or lack of the RE in the oocyte, with an RPKM < 2 considered absent, as this is the lower threshold in which RE presence exceeds experimental error. Two types of paternally provided REs, and their associated gene names (RE-RNAs), were examined. The first comprised the 289 REs (from 206 RE-RNAs) previously defined as paternally enriched (fivefold paternally enriched, Fig. 1A) [3] from a non-IBD population exposed only to background levels of DBP. The second included an additional set of 250 REs (from 93 RE-RNAs), not including those previously defined, that appear to have at least a twofold enrichment in sperm compared to the oocyte (twofold paternally enriched, Fig. 1A, Additional



**Fig. 2** Biological pathways enriched in response to dibutyl-phthalate (DBP). **A** DBP responsive enriched biological pathways were identified using the Molecular Signature Database (MSigDB). The total number of unique RE-RNAs and enriched gene sets is provided. Enriched gene sets were either unique to DBP study arm (B<sub>1</sub>HB<sub>2</sub> or H<sub>1</sub>BH<sub>2</sub>) or within each study arm. B<sub>1</sub>HB<sub>2</sub> provided the background DBP study arm baseline to crossover to crossback, H<sub>1</sub>BH<sub>2</sub> provided the high-DBP study arm baseline to crossover to crossback. **B** DBP-responsive RNA Elements (REs) within the enriched biological pathways that share paternally provided RE-containing RNAs (RE-RNA) were identified. Paternally provided: REs determined as fivefold paternally enriched or twofold paternally enriched. Node color indicates the following; *Orange*: enriched biological processes, *Yellow*: RE abundance increases following DBP exposure, *Pink*: RE abundance decreases upon DBP exposure, *Green*: RE abundance increases upon DBP withdrawal. Edge color indicates the total number of DBP responsive REs (1–40 REs) with an overlapping paternally provided RE-associated gene name moving between nodes. Scaling for edge color is continuous with 1 RE attributed to a *Dark Blue* color and 40 REs attributed to a *Red* color. Edge line type indicates the following; *solid*: background DBP (baseline visit) to high-DBP (crossover visit) (H<sub>1</sub>B), *dots*: background DBP (crossover visit) to high-DBP (crossover visit) (BH<sub>2</sub>)

file 6: Table S5). Both paternally provided sets were identified from those observed at a level of at least 10 RPKM in the zygote. A total of 83 REs ( $5 \times$  paternally enriched: 75 REs [3],  $2 \times$  paternally enriched: 8 REs (Additional file 6: Table S5)) were specific to the sperm. In addition, as previously stated, an RPKM > 10 in the zygote was a requirement for the paternally provided REs. This leads to the possibility of the RPKM abundance in the zygote exceeding the combined RPKM in the sperm and oocyte. Only 2% of the paternally provided RE-RNAs (11/539 RE-RNAs) > 5 RPKM were more abundant in the zygote than in sperm. Comparing these paternally provided RE-RNAs to those defined as DBP responsive defined a series of RE-RNAs that were both DBP responsive and paternally provided (Figs. 1B, 2B).

Using Cytoscape [25] to aid visualization, the 132 paternally provided DBP-responsive RE-RNAs identified in Fig. 2B represented a significantly larger overlap between data sets than expected (p < 4.358e-35, representation factor = 3.0). Of these RE-RNAs, a significant proportion was CRREWs (45 CRREWs; Fig. 1C, Table 1, Additional file 7: Table S6). From this list, 86 RE-RNAs, including 38 CRREWs (Table 1), were within the DBPenriched biological processes, including GOMF chromatin binding and GOBP cellular response to stress (Figs. 1B, 2B). Most of the DBP responsive CRREWs were specific to the B<sub>1</sub>HB<sub>2</sub> or the H<sub>1</sub>BH<sub>2</sub> comparisons. The chromatin remodeler cofactors PHF10, CUL2, ATXN7, PHC3, SMARCC1, and EYA3, were identified (Table 1), indicating these CRREWs likely modulate the DBP response between these processes. Of these, CUL2, PHF10, and SMARCC1 were visually full-length in all DBP responsive and paternally provided samples that passed the Transcript Integrity Index (TII) for identification of samples of similar RNA quality [26] (Table 1, Additional file 1: Figure S1). Their representation in the shared enriched gene sets within each biological process supports the essential role of these three CRREWs in the DBP response.

As summarized in Table 2, the paternally enriched DBP-responsive RE-RNAs, including *ACSM3*, *PSME4*, *CCDC7*, *NUP98* and *CAMTA2*, responded similarly throughout the study, increasing or decreasing in abundance when exposed to or withdrawn from high-DBP. *CAMTA2* and *PSME4* were full-length (Additional file 8: Table S7), suggesting post-fertilization activity. The corresponding MSigDB gene sets for the aforementioned DBP responsive and paternally provided CRREWs, along with the non-CRREW RE-RNAs *CAMTA2* and *PSME4*, are highlighted in Fig. 3 and Table 3.

A total of 46 of the 132 DBP responsive and paternally provided RE-RNAs were not within any of the enriched MSigDB gene sets related to the biological processes highlighted in Fig. 2. These 46 RE-RNAs were evaluated separately using EnrichR to identify gene function (Additional file 9: Table S8) and determine whether they reported functions within these biological processes. This highlighted multiple full-length CRREWs. First is the histone deacetylase complex (HDAC) [27, 28] regulated EFCAB6, a chromatin remodeler cofactor associated with androgen receptor (AR) signaling, proteolysis, and transcriptional regulation. It further highlighted the chromatin remodeler cofactor RARA, which functions in histone methylation [29, 30], is involved in apoptotic cell clearance, the positive regulation of the cell cycle, cellular response to estrogen and hormone stimulus, and the negative regulation of transcription by RNA polymerase II (Additional file 9: Table S8). Interestingly, the chromatin remodeler cofactor FBRS had no reported ontologies within EnrichR. However, it is part of the RING2-FBRS replication-independent complex involved in histone modification [29, 31, 32].

## Discussion

Utilizing the DBP-responsive sperm RE-RNAs [5], fivefold paternally enriched RE-RNAs [3], and twofold paternally enriched RE-RNAs, we have begun to frame the effect of exposures on what is paternally provided at fertilization. Significantly more than expected RE-RNAs corresponding to CRREWs (38 DBP responsive, paternally provided CRREWs within shared enriched MSigDB gene sets) were identified. This included three full-length RE-RNAs, consistent with the view that they act as mediators between pathways in response to exposure. This increase in the proportion of CRREWs but not TFs mimics what we previously reported within a series of body mass index (BMI) responsive RE-RNAs [4]. Consistent with the above, if they play a role during protamine replacement and syngamy as the blastocyst begins to form, one would expect a more significant proportion of CRREW RE-RNAs than TFs remaining in the mature sperm.

DBP impacts 86 paternally provided RE-RNAs (Figs. 2B, 3) ontologically linked to cellular stress, cell cycle, apoptosis, DNA damage response, and gene regulation. While most of these RE-RNAs appear responsive to DBP in either the H<sub>1</sub>BH<sub>2</sub> or B<sub>1</sub>HB<sub>2</sub> exposure comparisons, a subset is responsive irrespective of exposure duration or time removed from high-DBP. Three full-length CRREWs (*CUL2, PHF10,* and *SMARRC1*) and two full-length fivefold paternally enriched non-CRREW RE-RNAs (*CAMTA2* and *PSME4*) were identified. These five RE-RNAs respond to the addition or removal of high-DBP irrespective of the study arm and are within a series of biological processes, as represented in Fig. 3.

This analysis identified a highly complex, interconnected gene network (Fig. 1D) reflecting DBP responsive and paternally provided RE-RNAs. To more readily

A. fivefold	A. fivefold Paternal enriched and DBP responsive CRREWs	hed and DB	P responsive	e CRREWs								
CRREW	CRREW class Human	Human	Paternally <sub>}</sub>	Paternally provided samples		DBP respon	DBP responsive samples					
		proteome	sperm proteome Visually full-RE length	II-RE	Mean abundance	DBP study arm	Visually full- length	RE	Baseline mean abundance	Crossover mean abundance	Crossback mean abundance	Movement with phthalate
CUL2	Chromatin remodeler	Yes	Full-length	Full-length chr10_35049683_35049765 chr10_35054434_35054539	73.34378112 90.27970798	B <sub>1</sub> HB <sub>2</sub>	Full-length	chr10_35071199_35071 339ª	45.88953277	45.88953277 36.94494826	33.3796977	Down— same
	coractor			chr10_35060874_35060968 chr10_35062960_35063062	124.36174959 76.39002731	H <sub>1</sub> BH <sub>2</sub>	Full-length	chr10_35031300_35031386 10.9300058 12.60999224 16.5514561	10.9300058	12.60999224	16.5514561	Up—up
EFCAB6	Chromatin remodeler cofactor	Yes	Full-length	chr22_43755766_43755832	47.99058386	H <sub>1</sub> BH <sub>2</sub>	Full-length	chr22_43808995_43809131 <sup>b</sup> 23.04421341 22.47121388	23.04421341	22.47121388	30.92004033	Same—up
FBRS	Chromatin remodeler	No	Full-length	Full-length chr16_30661180_30661215 chr16_30661304_30661333	1 39.16671 978 1 63.82992422	H <sub>1</sub> BH <sub>2</sub>	Full-length	chr16_30665035_30665079 <sup>a</sup> 11.7002433	11.7002433	23.79308874	13.7795832	Up—same <sup>c</sup>
	COLACION			chr16_30662420_30662468 chr16_30668772_30668979	322.18875278 38.16171231			chr16_30665306_30665401 <sup>a</sup> 15.91554696 33.4514483 chr16_30665411_30665530 <sup>b</sup> 25.49395297 12.03010593	15.91554696 25.49395297	33.45144483 12.03010593	17.72288399 22.8260116	Up—same <sup>c</sup> Same -up <sup>c</sup>
FUS	RNA interactor Yes	or Yes	Full-length	Full-length chr16_31189665_31189794	90.62018963	$B_1HB_2$	Full-length	chr16_31179681_31179790 <sup>a</sup>	17.54623506	8.059807977	9.112771891	Down -same
PHF10	Chromatin remodeler cofactor	N	Full-length	Full-length chr6_169703905_169704088 56.77073068	56.77073068	B <sub>1</sub> HB <sub>2</sub>	Full-length	chr6_169712386_16971 2539ª	104.6714394	104.6714394 73.28088898	72.69274424	Down— same <sup>c</sup>
								chr6_169717742_16971 7906 <sup>b</sup>	26.5058166	26.5058166 21.75793957 28.02153713	28.02153713	Same -up
						H <sub>1</sub> BH <sub>2</sub>	Full-length	chr6_169715708_16971 5857 <sup>b</sup>	46.4094406	46.4094406 41.91086488	25.73117816	Same— down <sup>c</sup>
								chr6_169715266_16971 5305 <sup>5</sup>	9.913662168 3.92151334	3.92151334	12.24840542	Same—up <sup>c</sup>
TP53BP1	Reader	No	Full-length	Full-length chr15_43438324_43438416	60.10469689	B <sub>1</sub> HB <sub>2</sub>	Full-length (≥ 1 < 35 sam-	chr15_43491669_43491753 <sup>a</sup> 90.52982404 57.56060158	90.52982404	57.56060158	54.69346007	Down— same <sup>c</sup>
							ples)	chr15_43474673_43474767 <sup>a</sup> 43.09581869 24.32817473	43.09581869	24.32817473	22.95757362	Down— same <sup>c</sup>
									19.25400217	11.49681526	12.46340685	Same—up <sup>c</sup>

Table 1 Dibutyl-phthalate (DBP) responsive Chromatin remodeler cofactors, RNA interactors, Readers, Erasers, and Writers (CRREWs)

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Tab

B. twofold Paternally enriched and DBP responsive CRREWs

CRREW	3		Paternally provided samples		DBP res	DBP responsive samples	Sa				
	class sperm proteo	sperm proteome Visually full-length	lly RE ngth	Mean abundance	DBP study arm	Visually full- length	RE	Baseline mean abundance	Crossover mean abundance	Crossback mean abundance	Movement with phthalate
ACTB	Chromatin No remod- eling cofactor	Full-lengt (≥ 1 < 7 samples)	ull-length chr7_5529161_5529400 ≥ 1 < 7 chr7_5529535_5529663 samples)	608.1603759 160.4580747	B <sub>1</sub> HB <sub>2</sub>	Fail	chr7_5527147_5527891 <sup>a</sup>	9.927226458	39.23923731	76.15182438	Up—same
ASXL3	Chromatin Yes remod- eling cofactor	Full-length (≥ 1 < 7 samples)	Full-length chr18_33607594_33607676 <sup>d</sup> (≥ 1 < 7 samples)	126.69565505	H1BH2	Fail	chr18_33605537_33605658 <sup>b</sup> 49.02305219 chr18_33607594_33607676 <sup>b,d</sup> 100.1024646	49.02305219 100.1024646	57.68603612 122.0676208	29.20425494 65.30310662	Samedown
ATXN7	Chroma- No tin remod- eling cofactor	Full-I	Full-length chr3_63913157_63913225 chr3_63952379_63952483 chr3_63979915_63980167 chr3_63982186_63982445	23.23374838 65.56893528 65.82895373 51.9743582	B1HB2	Full-length (≥ 1 < 35 samples)	chr3_63971410_63971449 <sup>a</sup> chr3_63970990_63971199 <sup>a</sup> chr3_63970590_63970729 <sup>a</sup>	44.13861655 28.29537781 28.9651738	18.85341672 16.13056589 31.0349008	31.88951213 15.78642347 22.84394278	Down—up <sup>c</sup> Down—same <sup>c</sup>
			chr3_63982939_63983021 chr3_63988059_63988324 chr3_63997621_63997687	86.70154882 86.65469577 20.627258	H1BH2	Full-length (≥ 1 < 55 samples)	chr3_63990176_63990374° 15.20540033	15.20540033	23.06433484	18.39674764	Up—same
BRD2	Reader No	Full-lengtt (≥ 1 < 7 samples)	Eull-length chr6_32974462_32974765 <sup>d</sup> [≥ 1 < 7 chr6_32975384_32975521 samples) chr6_32976031_32976169 chr6_32976250_32976169 chr6_32978126_32978388 chr6_3297828_32980132 chr6_329873828_32980132	167.2971302 244.581243 246.1430444 449.0591325 290.1415452 215.4520379	B1HB2	Full-length (≥ 1 < 35 samples)	chr6_32974462_32974765 <sup>a, d</sup> 148.0520041 chr6_32975021_32975112 <sup>a</sup> 88.41784757	148.0520041 88.41784757	95.59297034 5.373315186	97.45927523 53.689177	Down—same
CBX8	Reader No	Full-lengtl (≥ 1 < 7 samples)		109.1088811	B1HB2	Full-length (≥ 1 < 35 samples)	chr17_79796497_79796540ª	67.72774064	35.94307833	47.37031239	Down—same
CUL4A	Writer Yes	Full-lengtl (≥ 1 < 7 samples)	Full-length chr13_113245152_113245237 <sup>d</sup> 45.83401639 ≥ 1 < 7 samples)	<sup>4</sup> 45.83401639	H1BH2	Fail	chr13_113245152_113245 237 <sup>b, d</sup>	4.749607197	11.83695093	4.810742772	Same—down
DDX21	RNA inter- No actor	Full-lengt (≥1 < 7 samples)	Full-length chr10_68956077_68956312  ≥ 1 < 7 chr10_68956128_68956312 samples) chr10_68959806_68960249	45.59930818 58.23824687 27.30981821	B1HB2	Full-length (≥ 1 < 35 samples)	chr10_68973545_68973664 <sup>a</sup>	12.48308777	6.652350194	6.801472421	Down—same

(continued)
Table 1

B. twofold Paternally enriched and DBP responsive CRREWs

CRREW	CRREW	Human	Paternally	Paternally provided samples		DBP res	DBP responsive samples	5				
	class	sperm	Visually	BE	Mean	DBP	Visually full-	BE	Baseline mean	Crossover mean Crossback	Crossback	Movement
		proteome	full-length		abundance	study arm	length	ł	abundance	abundance	mean abundance	with phthalate
DDX5	Chromatin No remod- eling cofactor	ON C	Full-length	Full-length chr17_64499616_64500326 chr17_64502439_64502549 chr17_64502926_64503098 chr17_64502926_64503098	50.18733594 222.7743864 174.5232727 562.365823	H1BH2	Full-length (≥ 1 < 55 samples)	chr17_64508057_64508199ª	18.07129807	31.49088399	21.44690173	Upsame
EYA3	Eraser	N	Full-length (≥1<7 samples)	Full-length chr1_28035544_28035680 (≥ 1 < 7 samples) chr1_2803839_28038905 chr1_28042571_28042650 <sup>d</sup>	40.65905966 71.9858758 82.19180154	B1HB2	Full-length (≥ 1 < 35 samples)	chr1_27989697_27989811 <sup>ª</sup> 17.51387147	17.51387147	8.11829011	7.684114697	Down—same
				chr1_28048383_28048426 chr1_28057994_28058094	55.11261243 55.29632114	H1BH2	Full-length (≥ 1 < 55 samples)	chr1_28042571_28042650 <sup>b.d</sup> 89.90445658	89.90445658	77.74204547	93.81864264	Same—up
FBL	Writer	No	Full-length (≥ 1 < 7 samples)	Full-length chr19_39834668_39834813 (21<7 chr19_39840233_39840327 samples)	60.41931957 50.69038934	H1BH2	Fail	chr19_39839859_39839958 <sup>b</sup>	18.59527254	27.37708055	9.213151401	Same—down
FOXP1	Chromatin No remod- eling cofactor	oN r	Full-length (≥1 < 7 samples)	Full-length chr3_71041328_71041532 <sup>d</sup> ≥ 1 < 7 samples)	42.11617683	H1BH2	Fail	chr3_71041328_71041532 <sup>b, d</sup>	15.6839618	13.71369054	15.54280611	Same—up
FOXP4	Chromatin No remod- eling cofactor	ON L	Fail	chr6_41587793_41587897 chr6_41597176_41597242	39.27112581 144.390806	B1HB2	Fail	chr6_41591221_41591322 <sup>a</sup>	45.87619906	26.85038148	20.82985849	Down—same
FTO GLYR1	Eraser Reader	oN oN	Fail Fail	chr16_53873786_53873865 chr16_4822875_4822931	21.75113943 85.08743926	B1HB2 H1BH2	Fail Fail	chr16_54055231_54055250 <sup>a</sup> chr16_4845074_4845153 <sup>b,d</sup>	69.62113525 36.46972236	20.61269425 46.9269976	18.47722558 20.87481521	down—same Same—down
	3	2	3	chr16_4832774_4832912 chr16_4835774_4832912 chr16_4845074_4845153 <sup>d</sup> chr16_4846174_4846210 <sup>d</sup>	56.47345151 86.16449545 214.7925019	2	-	chr16_4846174_4846210 <sup>b.d</sup> chr16_4847228_4847342 <sup>b</sup>	67.90414093 18.02496292	142.7455894 35.7298856	36.28550649 10.55306118	
GSK3B	Writer	°N N	Full-length	Full-length chr3_119863419_119863605 chr3_119876413_119876508 chr3_119905755_119905852 chr3_119947268_119947351 <sup>d</sup>	47.57577249 74.65344499 40.17183664 8.201198964	B1HB2	Full-length (≥ 1 < 35 samples)	chr3_119947268_119947351 <sup>a.d</sup> 9.469777621	9.469777621	4.330235615	3.812284788	Down—same
HDGF	Chromatin No remod- eling cofactor	ON L	Full-length (≥ 1 < 7 samples)		29.31885782 103.5140225 153.7851866	B1HB2	Full-length ( <u>&gt;</u> 1 < 35 samples)	chr1_156746941_156747070 <sup>a</sup> 38.46470389	38.46470389	21.80162743	33.42011021	Down—up

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B. twofold	d Paternally	enriched and	I DBP respo	B. twofold Paternally enriched and DBP responsive CRREWs								
CRREW	CRREW	Human	Paternally	Paternally provided samples		DBP res	DBP responsive samples	es				
	class	sperm proteome	Visually full-length	2	Mean abundance	DBP study arm	Visually full- length	RE	Baseline mean abundance	Crossover mean Crossback abundance mean abundanc	r Crossback mean abundance	Movement with phthalate
JAK2	Writer	No	Fail	chr9_5044403_5044520	73.43333397	B1HB2	Fail	chr9_5093247_5093296 <sup>a</sup>	20.58490527	32.01820286	32.69512962	Up—same
				chr9_5050686_5050831	107.4942939							
				chr9_5054563_5054884	130.4274597							
				chr9_5064883_5065040	25.21798197							
				chr9_5066678_5066789	24.52971222							
				chr9_5069022_5069208	21.28614607							
				chr9_5072492_5072626	14.53980654							
JMJD1C	Eraser	No	Full-length	Full-length chr10_63215263_63215455	35.51650661	B1HB2	Full-length (≥ 1 < 35 samples)	chr10_63380318_63380482 <sup>b</sup> 17.4600717	17.4600717	19.05969651	18.90688543	Same—up
KDM3B	Eraser	No	Full-length ( $\geq 1 < 7$ samples)	ull+ength chr5_138381516_138381590 ≥ 1 < 7 samples)	46.44162202	B1HB2	Fail	chr5_138381516_138381748ª	12.66998754	4.873031368	7.239254403	Down—same
METTL14	Writer	°Z	Full-length	chr4_118689370_118689457 chr4_118691981_118692068 chr4_118694436_118694526 <sup>d</sup> chr4_118703935_118704051	123.1705451 31.29652938 64.94446923 25.19397513	B1HB2	Full-length (≥ 1 < 35 samples)	chr4_118694436_118694526 <sup>a,d</sup> 83.51980054	<sup>d</sup> 83.51980054	46.03741119	51.4908201	Down—same
NCL	Chromatin No remod- eling cofactor	oN u	Full-length (≥ 1 < 7 samples)		102.5438988 67.46658314	B1HB2	Fail	chr2_231461540_231462017 <sup>a</sup> 5.236450253	5.236450253	20.29187093	12.3903226	Up—same
PBK	Writer	No	Fail	chr8_27833056_27833133	84.32665353	B1HB2	Fail	chr8_27822319_27822488 <sup>a</sup>	29.13220667	13.70207793	20.37717724	Down—same
РНСЗ	Chroma- tin remod- eling cofactor	°N -h	Full-length (≥1<7 samples)	Full-length chr3_170136419_17013666; (> 1 < 7 samples)	_17013666547.04021032	B1HB2	Fail	chr3_170136366_170136 670 <sup>b</sup> chr3_170125959_170126 008 <sup>b,e</sup>	33.10320015 50.56724341	23.37991969 47.14446851	38.36697809 39.30243571	Same—up <sup>c</sup> Same—down <sup>c</sup>
				chr3_170145423_17014552	_170145521 43.83520446	H1BH2	Full-length (≥ 1 < 55 samples)	chr3_170125959_170126 008 <sup>b,e</sup>	52.42505534	68.67472239	68.63626944	Up—same
PIAS2	Chromatin Yes remod- eling cofactor	n Yes	Full-length (≥ 1 < 7 samples)	cull-length chr18_46829734_46829867 (2 1 < 7 samples) chr18_46890580_46891054	126.9338048 94.25493752	H1BH2	Full-length (≥ 1 < 55 samples)	chr18_46864164_46864248 <sup>b</sup>	22.18313576	34.11708408	15.93112434	Same — down

B. twofol	d Paternall	y enriched and	B. twofold Paternally enriched and DBP responsive CRREWs	ive CRREWs								
CRREW	CRREW	Human	Paternally pr	Paternally provided samples		DBP res	DBP responsive samples	es				
	class	sperm proteome	Visually R full-length	RE	Mean abundance	DBP study arm	Visually full- length	RE	Baseline mean abundance	Crossover mean Crossback abundance mean abundanc	n Crossback mean abundance	Movement with phthalate
PKM	Writer	Yes	Full-length c	Full-length chr15_72199029_72199756	209.0372187	H1BH2	Full-length	chr15_72218943_72219110 <sup>b</sup>	227.6530273	228.3467372	257.298983	Same—up
			U	chr15_72202454_72202620	90.41567139		(≥ 1 < 55					
			U	chr15_72203022_72203188	104.69183		samples)					
			U	chr15_72206728_72206880	186.5303306							
			U	chr15_72207127_72207277	114.0294777							
			U	chr15_72208621_72208891	435.9339603			chr15_72221168_72221284 <sup>b</sup>	509.0236626	472.2128562	505.8016084	
			U	chr15_72209673_72209859	216.5984929							
			U	chr15_72210347_72210478	202.6510004							
			U	chr15_72217409_72217500	179.5251466							
			U	chr15_72218944_72219110	477.2075803							
PRDM2	Writer	No	gth	chr1_13731000_13731117	24.97864201	B1HB2	Fail	chr1_13732779_13732882 <sup>a, d</sup>	18.88791629	10.83481881	1 2.63840862	Down—same
			(≥ 1 < 7 <sub>Cl</sub> samples)	chr1_13732779_13732882 <sup>d</sup>	37.83172965							
RAD23B	Chromatin No	in No	Full-length c	Full-length chr9_107300141_107300222	148.4985198	B1HB2	Full-length	chr9_107284227_107284516 <sup>b</sup> 135.0056956	135.0056956	108.3285612	102.4563633	Same—up
	remod-		U	chr9_107302035_107302114	358.8938006							
	cofactor		U	chr9_107306379_107306647	179.2885343							
			U	chr9_107318752_107318879	199.0418759							
			U	chr9_107321983_107322118	194.6844742							
			U	chr9_107323890_107324017	157.6747147							
			U	chr9_107324834_107325004	166.7800603							
RARA	Chromatin No remod- eling cofactor	oN	Full-length c	Full-length chr17_40348316_40348464	264.966321	H1BH2	Full-length	chr17_40352566_40352785ª	16.33385634	26.58279889	13.14358956	Up—same
RNF168	Writer	No	Full-length c	Full-length chr3_196475231_196475312	48.87929838	B1HB2	Full-length	$chr3\_196499399\_196499448^a  15.55914629$	15.55914629	1.041898901	5.470952467	Down—same
			U	chr3_196483770_196483891	241.4196715							
			U	chr3_196487399_196487578	559.0102154							
			U	chr3_196488607_196488683	281.9957217							
RUVBL2	Chromatin No	in No	Fail d	chr19_49007302_49007368	59.04042657	B1HB2	Full-length	chr19_49014484_49014603 <sup>b</sup>	47.65755052	13.18043333	33.28447611	Same—up
	eling cofactor		U	chr19_49009776_49009882	35.42102967		c≤ > I < JS samples)	chr19_49011192_49011310 <sup>b</sup>	53.64749641	15.75904163	35.37293219	

Table 1 (continued)

		ט. ואטוטוע רמופווומווץ פווווכוופע מווע עשר ופאטטוואואפ כאתבאיא										
CRREW	CRREW	Human	Paternally	Paternally provided samples		DBP res	DBP responsive samples	les				
	class	sperm proteome	Visually full-length	R	Mean abundance	DBP study arm	Visually full- length	RE	Baseline mean abundance	Crossover mean Crossback abundance mean abundance	Crossback mean abundance	Movement with phthalate
SET	Chromatin No remod- eling cofactor	N	Full-length (≥ 1 < 7 samples)	Full-length chr9_12869170_128691227 (≥ 1 < 7 chr9_128691858_128692000 <sup>d</sup> samples) chr9_128693896_128694042	90.43894815 72.31913227 151.4424237	H1BH2	Full-length (≥ 1 < 55 samples)	chr9_128691837_128691856 <sup>a</sup> 156.10463 chr9_128691858_128692000 <sup>a.d</sup> 42.4648848	156.10463 <sup>d</sup> 42.4648848	270.2214865 65.60493112	292.7547895 83.79094344	Up—same
SF1	RNA inter- No actor	°2	Full-length (≥ 1 < 7 samples)	chri1_64764606_64766155 chri1_64768106_64768286 chri1_64769022_64769129 chri1_64769223_64769338 <sup>d</sup> chri1_647692426_64769609 chri1_64769964_64770053 <sup>d</sup>	26.12431153 481.6714801 287.9247696 347.3117268 282.135809 189.6875959	B1HB2	Full-length (≥ 1 < 35 samples)	chr11_64769426_64769669 <sup>a</sup> 172.4290602 chr11_64769223_64769338 <sup>a.d</sup> 268.8584151	172.4290602 1 268.8584151	119.3861192 177.0664881	127,4741581 189,0964138	Down—up
				chr11_64770256_64770408 chr11_64773430_64773505 chr11_647736498_64776626	285.8362465 81.68394169 547.7503902			chr11_64769964_64770053 <sup>b.d</sup> 263.9851006	<sup>1</sup> 263.9851006	166.8656433	179.5980223	
SMARCC1	Chroma- tin remod eling cofactor	о 2	Full-lengt	Full-length chr3_47622207_47622341 <sup>d</sup> chr3_47635190_47635344 <sup>d</sup> chr3_47636022_47636136 chr3_47693241_47693300 chr3_47701778_47701402	96.91272122 101.6629144 211.0242123 161.5219186 293.2391371	B1HB2	B1HB2 Full-length	chr3_47622207_47622341 <sup>&amp; d</sup> 69.77555581 chr3_47765620_47765659 <sup>°</sup> 109.4318057 chr3_47635190_47635344 <sup>b d</sup> 68.84826131	<sup>d</sup> 69.77555281 109.4318057 <sup>d</sup> 68.84826131	82.07564582 60.44008143 67.34912737	58.44521961 77.52801638 52.97551238	Up—same <sup>c</sup> Down—same <sup>c</sup> Same—up <sup>c</sup>
				chr3_47706409_47706530 chr3_47710683_47710808 chr3_47729025_47729094 chr3_47736034_47736126 chr3_47738029_47738110 chr3_47745908_47745993	354.2425594 239.6062289 108.5173138 318.1530337 551.5659307 250.9244825	H1BH2	H1BH2 Full-length	chr3_47714415_47714490 <sup>b</sup> 79.49924111 chr3_47638725_47638780 <sup>a</sup> 164.273275	79.49924111 164.273275	65.37542844 199.1667454	51.74915032 152.0656841	Same—down <sup>c</sup> Up—same
TLE4	Chromatin No remod- eling cofactor	0 N	Full-length	<b>chr3_47772817_47772936</b> Full-length chr9_79573689_79573786 chr9_79652593_79652794 chr9_79704783_79704902 chr9_79705889_79705942 chr9_79706747_79706899 chr9_79708118_79708250 chr9_7972959_79723035	90.04905398 81.6334674 123.9598518 79.65856586 308.2412894 197.0445962 82.17201832 41.67603336	B1HB2	Full-length (≥ 1 < 35 samples)	chr9_79592157_79592236 <sup>b</sup>	467,4843202	474.343387	262.241103	Same — down

Table 1 (continued)

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CRREW CRREW class											
Class	>	Paternally	Paternally provided samples		DBP res	DBP responsive samples	S				
	s sperm proteome	Visually full-length	RE	Mean abundance	DBP study arm	Visually full- length	RE	Baseline mean abundance	Crossover mean Crossback abundance mean abundance	Crossback mean abundance	Movement with phthalate
TRIM28 Reader	der No	Full-length (≥ 1 < 7 samples)	Full-length chr19_58547792_58547906 (≥ 1 < 7 samples)	62.21120415	B1HB2	Full-length (≥ 1 < 35 samples)	chr19_58547135_58547511 <sup>a</sup>	17.9583947	11.84868698	12.65668525	Down—same
TRMT5 Writer	er No	Full-length	Full-length chr14_60975475_60976126 <sup>d</sup> chr14_60977514_60977638 chr14_60979231_60979886	112.849635 181.1539029 238.7932734	B1HB2	Full-length	chr14_60975475_60976126 <sup>a.d</sup> 162.1052502	162.1052502	126.0231338	104.0717295	Down—same
YBX1 RNA i actor	RNA inter- No actor	Full-length (≥ 1 < 7 samples)	Full-length chr1_42683403_42683466 (1<7 samples)	112.849635	H1BH2	H1BH2 Full-length (≥1 < 55 samples)	chr1_42693490_42693523 <sup>a</sup>	15.04921986	16.15993097	18.42589961	Up—same
YWHAZ Reader	der No	Full-length	Full-length chr8_100916525_100920752 18.15976034 chr8_100924135_100924298 110.0538877 chr8_100924916_100925039 162.8023477 chr8_100951929 100955129 82.9448817	18.15976034 110.0538877 162.8023477 82.9444817	B1HB2		chr8_100952850_100953057 <sup>a</sup> 7.347282187	7.347282187	9.551674351	6.886102163	Up—same
ZNF541 Chroma remod- eling cofactor	Chromatin No remod- eling cofactor	Fail	chr19_47521479_47521654		H <sub>1</sub> BH <sub>2</sub> Fail	Fail	chr19_47521854_47521994 <sup>a</sup> 20.03276583	20.03276583	10.73806747	14.37279423	Down—same

A fivefold paternally enriched and B) twofold paternally enriched. Visual integrity was based on the UCSC Genome Browser. Mean RE abundance is in Reads per Kilobase per Million (RPKM)

 $B_{\gamma}HB_{2}$  background DBP study arm baseline to crossover to crossback,  $H_{\gamma}BH_{2}$  high-DBP study arm baseline to crossover to crossback

Bold text indicates the RNA Element (RE)-containing RNA (RE-RNA) is significantly altered within both DBP study arms

Italicized text indicates the same RE was found in the baseline to crossover and crossover to crossback comparison

<sup>a</sup> indicates the RE is from the baseline to crossover comparison

<sup>b</sup> indicates the RE is from the crossover to crossback comparison

<sup>d</sup> indicates the RE is shared between at least one DBP responsive RE and the paternally provided set <sup>c</sup> indicates a pattern of a gene in response to DBP is unknown

<sup>e</sup> indicates the RE is shared between both DBP study arms

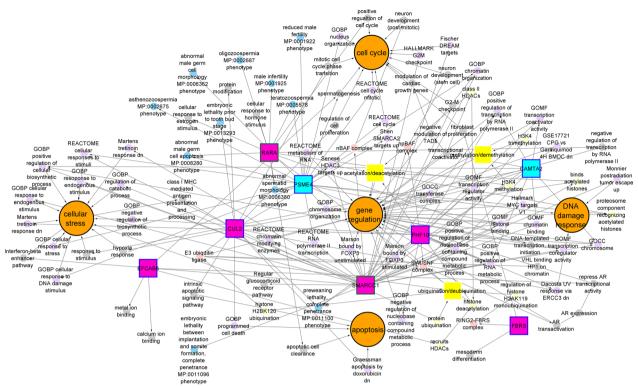
Five fold Pater	nally enriched			Two fold Pater	nally enriched		
H <sub>1</sub> B vs B <sub>1</sub> H	$H_1B vs HB_2$	BH <sub>2</sub> vs B <sub>1</sub> H	BH <sub>2</sub> vs HB <sub>2</sub>	H <sub>1</sub> B vs B <sub>1</sub> H	H <sub>1</sub> B vs HB <sub>2</sub>	BH <sub>2</sub> vs B <sub>1</sub> H	BH <sub>2</sub> vs HB <sub>2</sub>
ACSM3	STK39	ANKRD36B	VTI1B	ATXN7	ATXN7	EYA3	PKM
ANKRD36C	ERC1	ANKRD36C	AKT3	SMARCC1	PHC3		
CAMTA2	PSME4	CTNS	ANKRD36B		SMARCC1		
CCDC7	STRN3	CUL2	ERC1				
CTNS		KIAA0586	KIFAP3				
CUL2		MORC2	NUP98				
LMBR1L		NPIPA8	PARP6				
MORC2		NUP214	PER1				
NUP214		PER1	PHF10				
PSME4		PHF10	PSME4				
SEC31A		POLDIP2	RGPD6				
STK39		PSME4	SLC22A23				
STRN3		RGPD6	STK39				
		RGPD8					
		STK39					
		ULK4					

Table 2 Dibutyl-phthalate (DBP) responsive and paternally provided RNA Element (RE)-containing RNAs (RE-RNAs)

RE-RNAs in bold indicate pattern in the same direction upon addition and subtraction of DBP. Paternally provided; five fold paternally enriched or two fold paternally enriched, H<sub>1</sub>B; high-DBP (baseline visit) to background DBP (crossover visit), BH<sub>2</sub> background DBP (crossover visit) to high-DBP (crossback visit), B<sub>1</sub>H; background DBP (baseline visit) to high-DBP (crossover visit), HB<sub>2</sub> high-DBP (crossover visit) to background DBP (crossback visit). Bold text indicates the RE-RNA is shared within both drug study arms.

interpret this gene network, the focus was given to the full-length DBP responsive paternally provided RE-RNAs highlighted in Fig. 3. Here, SMARCC1 and PHF10 (top of Fig. 3) function as part of the SWI/SNF complex (middle left of Fig. 3) to enhance the transactivation of AR [33-35] in direct opposition to the AR transcriptional repression by the chromatin remodeling cofactor *EFCAB6* (Additional file 9: Table S8, bottom of Fig. 3) [27, 28]. Interestingly, DBP has anti-androgenic activity (reviewed in [13]); however, AR was not found as directly responsive to high-DBP exposure or withdrawal [5], which is consistent with the lack of an in vitro interaction between DBP and AR [36]. In response to DNA damage, the SMARCC1 and PHF10 containing SWI/ SNF complex (middle left of Fig. 3) are known to accumulate, likely enabling transient chromatin accessibility to DNA-binding and DNA damage response proteins [37]. As expected, PHF10 and SMARCC1 were within a number of the same enriched gene sets (Table 3, Fig. 3), including GOMF histone binding alongside PSME4, and GOMF transcription regulator activity and GOBP positive regulation of transcription by RNA polymerase II with CAMTA2, indicating shared functions. CAMTA2, while not a CRREW, is a transcriptional activator that associates with class II HDACs to negatively modulate topological associated domains (TADs) [38, 39]. However, the proteasome component PSME4 acts to recognize acetylated histones, promoting histone degradation

during spermatogenesis and the DNA damage response [40, 41]. The chromatin remodeler cofactor RARA regulating transcription in a ligand dependent manner (Additional file 9: Table S8). RARA functions in response to estrogen stimulus (Additional file 9: Table S8), is involved in H3K4 methylation [30] as part of a heterodimer and induces histone deacetylation when the heterodimer associates with specific multiprotein complexes [42]. These relationships begin to highlight how the DNA damage response may feedforward regulating gene expression (center of Fig. 3). Together with PSME4, CUL2 was within the enriched DNA damage response gene set Dacosta UV response via ERCC3 dn (Table 3, Fig. 3). As part of the E3 ubiquitin ligase complex (middle left of Fig. 3), CUL2 alongside BAF250, elongin C and ROC1 ubiquitinate histone H2BK120 aiding in SWI/ SNF complex H3K4 trimethylation [43, 44]. CUL2 further enables the interaction of VHL with elongin B and elongin C to form the E3 ubiquitin ligase complex to recruit VHL to HP1 chromatin [45, 46]. In addition, the CUL2 containing E3 ubiquitin ligase has been identified as important in Adenovirus inactivation of a DNA damage response [47]. It is integral to the progression of G1 to S and the S-phase-dependent DNA damage response [48]. While not identified within the enriched MSigDB gene sets from Additional file 3: Table S2, RARA participates in the regulation of the cell cycle and apoptotic cell clearance (Additional file 9: Table S8, bottom of Fig. 3).



**Fig. 3** Interconnected gene network of paternally provided dibutyl-phthalate (DBP) responsive RNA Elements (RE)s. The gene network highlights those relationships corresponding to the full-length RE-containing RNAs (RE-RNAs) *CAMTA2, EFCAB6, PSME4, SMARCC1, PHF10, RARA, FBRS* and *CUL2.* Paternally provided RE-RNA is either fivefold or twofold paternally enriched. Key genes are highlighted based on node color. *Dark blue node borders* indicate fivefold paternal enrichment, while a *green border* indicates twofold paternal enrichment. Node color and shape are as follows; *pink squares*: CRREW (Chromatin remodeler cofactor, RNA interactor, Reader, Eraser, and Writer) RNA, *blue square*: key RNA that is not a CRREW, *orange circle*: major enriched biological pathways, *bright yellow circle*: indicate functions related to acetylation/deacetylation, methylation/demethylation and ubiquination/deubiquination. *light yellow circle*; specific process related to acetylation/deacetylation, methylation/demethylation and ubiquination/ deubiquination, *light pink circle*: protein complexes that include at least one key gene, *purple circle*; enriched MSigDB geneset, *grey circle*; gene function not assigned by an MSigDB geneset, *blue circle*; MGI phenotype

This indicates a potential interaction with CUL2 within the apoptotic gene sets *Graessman apoptosis by doxorubicin dn* and *GOBP programmed cell death* (Table 3, Fig. 3). These relationships highlight the potential cooperation between these CRREW complexes and how a DBP-induced DNA damage response may impact the cell cycle, leading to its arrest and eventually, cell death.

*CUL2* and *PSME4* were also within *REACTOME cellular responses to stimuli* (Table 3, Fig. 3). While little is known about the function of FBRS, it is part of the RING2-FBRS complex (bottom right of Fig. 3), a type of Polycomb group (PcG) complex [29, 31, 32] that acts as a transcriptional activator of mesoderm differentiation, and a regulator of H2AK119ub1 levels [49]. *PSME4* and *SMARCC1* are within the gene sets *REACTOME RNA polymerase II transcription, Senese HDAC3 targets up*, and *GOBP chromosome organization* (Table 3, Fig. 3). With DBP-responsive RE-RNAs represented within each enriched biological process, an interconnected network centered on cellular response to DNA damage as

modulated by CRREWs was highlighted (Figs. 2A, 3). This is consistent with a known effect of phthalate exposure resulting in DNA damage [50, 51].

Intriguingly, the fivefold paternally enriched CUL2, PHF10, EFCAB6, and FBRS, and twofold paternally enriched SMARCC1 and RARA are chromatin remodeler cofactors (Fig. 3, Additional file 5: Table S4) providing a foray into mechanism. As shown in Fig. 3, the majority of these eight DBP responsive and paternally provided RE-RNAs are involved in acetylation or deacetylation [27, 28, 38, 39, 44, 46, 52], except CUL2 and FBRS (Fig. 3). This highlights the importance of paternally derived acetylation factors during the final steps of spermatogenesis and, potentially, early embryogenesis. During spermatogenesis, acetylation of histone H4 is a critical step in replacing histones with protamine (reviewed in [53, 54]). Within 3 h of fertilization, the paternal chromatin will undergo transient hyperacetylation of histone H4 (reviewed in [53, 55]). To date, the molecular components integral

RE-RNA	CRREW	CRREW class	Enriched biological process	Enriched MSigDB Gene Set
CAMTA2	No	-	Cellular stress	GOBP positive regulation of cellular biosynthetic process
			Gene regulation	GOBP positive regulation of nucleobase containing compound metabolic process
				GOBP positive regulation of RNA metabolic process
				GOBP positive regulation of transcription by RNA polymerase II
				GOCC chromosome
				GOMF chromatin binding
				GOMF transcription coactivator activity
				GOMF transcription regulator activity
CUL2	Yes	Chromatin remodeler cofactor	Cellular stress	REACTOME cellular responses to stimuli
			Apoptosis	Graessman apoptosis by doxorubicin dn
				GOBP programmed cell death
			DNA damage response to UV exposure	Dacosta UV response via ERCC3 dn
			Gene regulation	GOCC transferase complex
				Shen SMARCA2 targets up
PHF10	Yes	Chromatin remodeler cofactor	Cellular stress	GOBP negative regulation of biosynthetic process
				GOBP positive regulation of cellular biosynthetic process
				Martens tretinoin response dn
			Gene regulation	GOBP negative regulation of nucleobase containing compound metabolic process
				GOBP positive regulation of nucleobase containing compound metabolic process
				GOBP positive regulation of RNA metabolic process
				GOBP positive regulation of transcription by RNA polymerase II
				GOCC chromosome
				GOMF histone binding
				GOMF transcription coregulator activity
				GOMF transcription regulator activity
PSME4	No	-	Cellular stress	GOBP cellular response to DNA damage stimulus
				GOBP cellular response to stress
				REACTOME cellular responses to stimuli
			Cell cycle	GOBP nucleus organization
				REACTOME cell cycle
				REACTOME cell cycle mitotic
			DNA damage response to UV exposure	Dacosta UV response via ERCC3 dn
			Gene regulation	GOBP chromatin organization
				GOBP chromosome organization
				GOMF histone binding
				REACTOME metabolism of RNA
				REACTOME RNA polymerase II transcription
				Senese HDAC3 targets up

 Table 3
 Enriched biological processes of key dibutyl-phthalate (DBP) responsive, paternally provided RNA Element (RE)-containing

 RNAs (RE-RNAs)

RE-RNA	CRREW	CRREW class	Enriched biological process	Enriched MSigDB Gene Set
SMARCC1	Yes	Chromatin remodeler cofactor	Cellular stress	GOBP cellular response to endogenous stimulus
				GOBP positive regulation of cellular biosynthetic process
				GOBP regulation of catabolic process
				GOBP response to endogenous stimulus
				Martens tretinoin response dn
			Cell cycle	Fischer DREAM targets
				Hallmark G2M checkpoint
			DNA damage response to UV exposure	Monnier postradiation tumor escape up
			Gene regulation	GOBP chromatin organization
				GOBP chromatin binding
				GOBP chromosome organization
				GOBP positive regulation of RNA metabolic process
				GOBP positive regulation of nucleobase containing compound metabolic process
				GOBP positive regulation of transcription by RNA polymerase II
				GOCC chromosome
				GOMF histone binding
				GOMF transcription coactivator activity
				GOMF transcription coregulator activity
				GOMF transcription regulator activity
				GSE17721 CPG vs gardiquimod 4 h BMDC dn
				Hallmark MYC targets V1
				Marson bound by FOXP3 stimulated
				Marson bound by FOXP3 unstimulated
				REACTOME chromatin modifying enzymes
				REACTOME RNA polymerase II transcription
				Senese HDAC3 targets up

RE-RNAs are visually full-length using the UCSC genome browser. DNA damage response: DNA damage response to UV exposure. Paternally provided: fivefold paternally enriched or twofold paternally enriched; CRREW: chromatin remodeler cofactor, RNA interactor, reader, eraser and writer.

to transient hyperacetylation remain elusive [53]. These RNAs may function in this transient hyperacetylation event.

# Conclusions

Alterations in mouse sperm RNAs have been linked to offspring's metabolic health and stress response [2, 6, 8–11]. These studies have provided evidence in favor of the paternal origins of health and disease (POHaD) (reviewed in [12, 56, 57]). Recently, environmental exposures, including DBP and bisphenol A (BPA), and lifestyle

factors such as BMI have been associated with alterations of epigenetic marks in sperm [4, 5, 12, 58–61], that is beginning to reconcile exposure and POHaD. Each of the CRREWs highlighted (*CUL2, SMARCC1, PHF10, EFCAB6, FBRS,* and *RARA*) alongside the non-CRREW *CAMTA2* and *PSME4* are paternally delivered as fulllength RNAs ready for translation and early utilization in the fertilized oocyte. Perhaps these three CRREWs play a role directly following fertilization as the father's chromatin is restructured or during syngamy. Interestingly, these genes are not represented within the human oocyte proteome [62], although CUL2, PSME4, and EFCAB6 are within the human sperm proteome [63]. As described above, they may encode early transient events like hyperacetylation in response to DBP exposure. On one hand, these RNAs are likely essential in functions prior to Embryonic Genome Activation, consistent with the MGI phenotype Ontology Annotations [64]. For example, CAMTA2, CUL2, PHF10, and SMARCC1 mouse knockdowns result in embryonic and/or preweaning lethality (Fig. 3, blue circles). On the other hand, PSME4 and RARA knockdowns impair male fertility due to several abnormalities related to spermatogenesis [64] (Fig. 3, blue circles). This emphasizes the importance of the sperm providing full-length transcripts and proteins at fertilization, as they may serve as the driving force behind the DBP-induced decreases in semen and embryo quality and subsequent increases in time to pregnancy.

## Methods

#### **DBP** responsive REs

The differentially expressed REs summarized in Estill, MS et al. [5] from the crossover-crossback designed study were utilized (Additional file 2: Table S1). Men entered the study were on either a high-DBP-coated mesalamine at baseline (high-DBP study arm (+), 112 semen samples, Fig. 1A) or non-DBP-coated mesalamine at baseline (background DBP study arm (-), 63 semen samples, Fig. 1A) [5]. It is important to note that both medications contain the same active pharmaceutical, mesalamine, and were exchangeably prescribed to IBD patients. They differed only in the presence of DBP in the coating. The 90-day intervals were designed to be reflective of a spermatogenic cycle and hence washout, when men would switch to the opposing drug from baseline to crossover,  $B_1H$  (background DBP to high-DBP)/ $H_1B$  (high-DBP to background DBP), then switched back from crossover to crossback,  $HB_2$  (high-DBP to background DBP)/BH<sub>2</sub> (background DBP to high-DBP). Here, REs were evaluated as a function of this 90-day spermatogenic cycle and the duration of high-DBP exposure/withdrawal. This study was approved by the institutional review boards Partners Hospitals (Massachusetts General Hospital) protocol 2005P001631 and of Harvard T.H. Chan School of Public Health, Beth Israel Deaconess Medical Center, and Brigham and Women's Hospital. The use of human tissue was approved by the Wayne State University Investigation Committee and carried out under the Wayne State University Human Investigation Committee IRB protocol 095701MP2E(5R).

## **Paternally provided REs**

Paternally provided REs (generated from 7 non-IBD semen samples not exposed to high-DBP) were characterized from a total of 75,988 REs [11,386 RE– RE-containing RNAs (RE-RNAs)] identified within the zygote having a reads per kilobase per million (RPKM) > 10 [3]. As the zygote has yet to undergo embryonic genome activation, RE-RNAs present will be those provided directly by the sperm and oocyte [3]. Paternally enriched REs delivered at fertilization in which enrichment was at least fivefold higher when compared to the oocyte (fivefold paternally enriched) were described as having a median abundance > 25 RPKM in sperm, < 5 RPKM in the oocyte, and > 10 RPKM in the zygote [3]. This yielded a series of stringent REs that the father provides at fertilization.

To expand upon what may be paternally provided, an additional set of twofold paternally enriched REs were defined using a lower enrichment threshold for comparison (Fig. 1A, B). From the total 51,089 zygotic REs (10,277 RE-RNAs) independent of the paternally or maternally enriched REs previously defined [3], the paternal RE/maternal RE ratio was calculated in the following manner. If the RPKM of the zygotic RE was larger than the sum of the sperm and oocyte REs, the contribution of the sperm and oocyte equaled their respective RPKM abundance. If the zygote RPKM was less than the sum of the sperm plus oocyte REs, paternal contribution (Pc) was calculated as  $Pc = Z - \left(\frac{Z}{1 + \left(\frac{S}{o}\right)}\right)$ , where Z represents the zygote REs RPKM, s represents the sperm RE RPKM and *o* represents the oocyte RE RPKM. Paternally contributed REs at a level twofold greater than the maternal contribution were termed twofold paternally enriched REs. While a series of these paternally provided REs are enriched in the sperm compared to the oocyte, some are specific to the sperm. For REs specific to the sperm, the RPKM in the oocyte was <2, the abundance value in which true RE presence cannot be confirmed. Each set of paternally provided REs was evaluated as a separate and combined RE list, as defined in Fig. 1.

#### Sample and transcript integrity

The transcript Integrity Index (TII) algorithm [26] was used to identify samples of similar quality [3, 5] using the 22 stable sperm-specific transcripts we previously defined [26]. The TII threshold was set at 50% of the transcript covered by at least 5 reads per million (RPM). Samples within the fourth quartile (Q4) were considered to have poor quality RNA [26]. Those samples passing TII were used to visually assess the paternally delivered RE corresponding RNAs of interest using the UCSC Genome Browser using Gencode version 36 [65]. RNAs were considered full-length if a minimum of 5 RPKM covered the transcript in all samples (7 paternally provided samples, 55 high-DBP study arm samples, 35 background DBP study arm samples). The 5 RPKM cutoff defines the minimum abundance in which there can be confidence in RE presence.

## Gene ontology and statistical analysis

Enriched biological processes and pathways were evaluated using the Molecular Signature Database (MSigDB) version 7.5.1, employing the following collections: Hallmark gene sets (Hm), curated gene sets (C2), Gene Ontology (GO) gene sets (C5), and immunologic gene sets (C7). The collection C3: regulatory target gene set sub-category transcription factor (TF) targets were used to identify biologically corresponding TFs within the data. Each collection was considered separately. Thresholds were set to return the top 100 gene sets with a False Discovery Rate (FDR) q < 0.05 and a minimum of a two-gene overlap.

MSigDB analysis enables a maximum of 500 recognized genes per analysis. To evaluate the DBP responsive REs in Additional file 2: Table S1, each DBP comparison in Fig. 1A was separated into six groups based on the empirical (bootstrapped) p value that was generated using random resampling [5]. To group REs into the six empirical p value range groups, the REs within the largest DBP responsive comparison (all significantly associated REs within the(B<sub>1</sub>H comparison [5], Fig. 1B) were used. This would ensure that no comparison visualized in Fig. 1B would contain more than 500 unique RE-RNAs for MSigDB investigation. The six empirical *p* value range groups were as follows: group 1 = p < 0.013, group 2 = pbetween 0.013 and 0.023, group 3 = p between 0.023 and 0.032, group 4 = p between 0.032 and 0.041, group 5 = pbetween 0.041 and 0.045, and group 6 = p between 0.045 and 0.05. In the B<sub>1</sub>H, all correlated REs within Fig. 1B (3,651 [2,311 genes] REs), this segregated the REs as follows; group 1=711 REs (577 unique genes with 485 genes recognized), group 2 = 706 REs (566 unique genes with 486 genes recognized), group 3=718 REs (565 unique genes with 477 genes recognized), group 4 = 693REs (551 unique genes with 470 genes recognized), group 5=451 REs (374 unique genes with 323 genes recognized), and group 6=372 REs (311 unique genes with 250 genes recognized).

EnrichR [66, 67], along with GeneCards (https://www. genecards.org/) [68] and the NIH Genetics Home Reference (https://ghr.nlm.nih.gov/), were utilized to assess gene function and disease associations. EnrichR categories of *Pathways*, *Ontologies*, and *Diseases/Drugs* were considered. Mediators of gene expression above TFs, considered Chromatin remodeler cofactors, RNA interactors, Readers, Erasers, and Writers (CRREWs). Briefly, CRREWs were identified from the curated list as described [4, 63], and key transcripts of interest were evaluated as part of the human sperm proteome.

The significance of proportional overlaps for TFs and CRREWs within the data was determined by the hypergeometric probability test with normal approximation from http://nemates.org/MA/progs/overlap\_stats.html. This provides a p value corresponding to a representation factor value indicating whether the overlap is significantly more or less than expected. A two-tailed t test for two samples of unequal variance was performed to calculate p values associated with the paternal/maternal contribution fold change using Microsoft 365 Excel (version 2202).

# Abbreviations

Abbrevia	tions			
AR	Androgen receptor			
В	Men transitioning from the high-DBP mesalamine to background DBP mesalamine (crossover visit)			
B <sub>1</sub>	Men entering on the non-DBP mesalamine (background DBP baseline visit)			
B₁H	Background DBP (baseline visit) to high-DBP (crossover visit)			
	Men returning to non-DBP mesalamine (background DBP cross-			
B <sub>2</sub>	back visit)			
BH <sub>2</sub>	Background DBP (crossover visit) to high-DBP (crossback visit)			
$B_1HB_2$	Background DBP study arm, baseline to crossover to crossback			
BMI	Body mass index			
BPA	Bisphenol A			
C2	Curated gene sets			
C3	Regulatory target gene set sub-category transcription factor targets			
C5	GO gene sets			
C7	Immunologic gene sets			
CRREWs	Chromatin remodeler cofactors, RNA interactors, Readers, Erasers,			
CHILLANS	and Writers			
DBP	Dibutyl-phthalate			
EPA				
	Environmental protection agency			
FDR	False discovery rate			
GO	Gene ontology			
Н	Men transitioning from the non-DBP mesalamine to high-DBP			
	mesalamine (crossover visit)			
H1	Men entering on the high-DBP mesalamine (high-DBP baseline visit)			
Η <sub>1</sub> Β	High-DBP (baseline visit) to background DBP (crossover visit)			
$H_1BH_2$	High-DBP study arm, baseline to crossover to crossback			
$H_2$	Men returning to high-DBP mesalamine (high-DBP crossback visit)			
HB <sub>2</sub>	High-DBP (crossover visit) to background DBP (crossback visit)			
HDACs	Histone deacetylase complexes			
Hm	Hallmark gene sets			
IBD	Irritable bowel disease			
MBP	Monobutyl phthalate			
MSigDB	Molecular signatures database			
nBAF complex Neuron-specific chromatin remodeling complex				
NHANES	National Health and Nutrition Examination Survey			
npBAF cor				
	complex			
RE	RNA Element			
Paternally	provided REs 5-Fold paternally enriched/twofold paternally enriched REs			
PDT	Photodynamic therapy			
PcG	Polycomb group			
POHaD	Paternal developmental origins of health and diseaseQ4: fourth			
. 01100	quartile			
REDa	RNA element discovery algorithm			
	nu velement abeovery algorithm			

RE	RNA element
RE-RNA	RE-containing RNA/gene
RPKM	Reads per kilobase per million
RPM	Reads per million
TAD	Topological associated domain
TF	Transcription factor
TII	Transcript integrity index

# **Supplementary Information**

The online version contains supplementary material available at https://doi. org/10.1186/s13072-022-00475-2.

Additional file 1: Figure S1. Chromatin remodeler cofactor, RNA interactor, reader, eraser and writer (CRREW) RNA Element (RE)-containing RNA (RE-RNA) visual integrity. Representative samples chosen for A) *CUL2*, B) *SMARCC1* and C) *PHF10*. Integrity of DBP responsive and paternally provided CRREWs was determined using the UCSC Genome Browser Gencode version 41 track. Threshold for an RE-RNA to be considered full-length was set at a minimum of 5 Reads per Kilobase per Million (RPKM) across all transcript exons in all 7 paternally provided samples and all DBP responsive samples (high-DBP study arm (H<sub>1</sub>BH<sub>2</sub>), 55 samples; background-DBP study (B<sub>1</sub>HB<sub>2</sub>) arm: 35 samples).

Additional file 2: Table S1. Number of RNA elements (REs) responsive to dibutyl-phthalate (DBP). REs were obtained from the publication Estill, MS et al. (2019b) (5). H<sub>1</sub>B; high-DBP (baseline visit) to background DBP (crossover visit), BH<sub>2</sub>; background DBP (crossover visit) to high-DBP (crossback visit), B<sub>1</sub>H; background DBP (baseline visit) to high-DBP (crossover visit), HB<sub>3</sub>; high-DBP (crossover visit) to background DBP (crossback visit).

Additional file 3: Table S2. Enriched biological processes and pathways related to cellular stress, cell cycle, apoptosis, DNA damage response and gene regulation. RNA Element (RE) indicated in Fig. 1 panel B processes were used to guery the Molecular Signature Database. Bolded text indicates the gene set is enriched in the paternally provided and DBP responsive RE-containing RNAs (RE-RNAs) evaluated. Italicized text indicates a gene set enriched upon DBP exposure addition and withdraw irrespective of original study arm. H<sub>1</sub>B; high-DBP (baseline visit) to background DBP (crossover visit), BH<sub>2</sub>; background DBP (crossover visit) to high-DBP (crossback visit), B1H; background DBP (baseline visit) to high-DBP (crossover visit), HB<sub>2</sub>; high-DBP (crossover visit) to background DBP (crossback visit), purple text; gene sets related to cellular stress, brown text; gene sets related to the cell cycle, green text; gene sets related to apoptosis and cell death, red text; gene sets related to DNA damage response (DNA damage response to UV exposure), blue text; gene sets related to gene regulation., indicates no enrichment in the gene set.

Additional file 4: Table S3. Number of dibutyl-phthalate (DBP) responsive transcription factor (TF) binding site gene sets and Chromatin remodeler cofactors, RNA interactors, Readers, Erasers and Writers (CRREWs). A) Enriched TF binding site gene sets. Enriched gene sets were separated based on the identification of having a known TF reported to bind. B) Number of DBP responsive CRREWs. Gene lists were generated from those RNA Element (RE)-containing RNAs (RE-RNAs) represented within Fig. 1. Representation factor and *p* value were determined by hypergeometric probability test.

Additional file 5: Table S4. All Di-butyl phthalate (DBP) responsive and paternally provided CRREWs within sperm. H<sub>1</sub>B; high-DBP (baseline visit) to background DBP (crossover visit), BH<sub>2</sub>; background DBP (crossover visit) to high-DBP (crossback visit), B<sub>1</sub>H; background DBP (baseline visit) to high-DBP (crossback visit), HB<sub>2</sub>; high-DBP (crossover visit) to background DBP (crossback visit), HB<sub>2</sub>; high-DBP (crossover visit) to background DBP (crossback visit), attennally provided, RE-containing RNAs (RE-RNAs) that are fivefold paternally enriched or twofold paternally enriched.

Additional file 6: Table S5. REs unique to the zygote that are twofold paternally enriched. A) DBP responsive and 2x paternally enriched. B) 2x paternally enriched but not DBP responsive. REs required the paternal contribution to be > twofold the maternal, or the maternal RE abundance to be < 2 RPKM and paternal RE abundance < 25 and > 2 RPKM. #DIV/0 indicates contribution is solely from the father. Green fill indicates the RE is shared between two genes in the sperm contributed set.

Additional file 7: Table S6. Number of paternally provided Chromatin remodeler cofactors, RNA interactors, readers, erasers and writers (CRREWs). A) Number of paternally provided CRREWs. B) Number of dibutyl-phthalate (DBP) responsive, paternally provided CRREWs. Representation factor and *p* value were determined by hypergeometric probability test. Paternally provided CRREWs include those that are fivefold paternally enriched and twofold paternally enriched.

Additional file 8: Table S7. Integrity of specifically paternally provided and di-butyl phthalate (DBP) responsive transcripts. RNA Element (RE)-containing RNAs (RE-RNAs) represented respond to DBP addition and subtraction in the same direction. Visual inspection is based on the UCSC Genome Browser. Bold text indicates the RE is shared between the paternally provided and DBP responsive samples, blue text indicates the DBP responsive RE was associated with the baseline to crossover (B<sub>1</sub>H or H<sub>1</sub>B) comparison and red text indicates the DBP responsive RE was associated with the crossover to crossback comparison (HB<sub>2</sub> or BH<sub>2</sub>). Paternally provided indicates samples in which the fivefold paternally enriched and twofold paternally enriched REs were obtained. B<sub>1</sub>HB<sub>2</sub>; background DBP study arm baseline to crossover to crossback, H<sub>1</sub>BH<sub>2</sub>; high-DBP study arm baseline to crossover to crossback. Mean RE abundance is in Reads per Kilobase per Million (RPKM).

Additional file 9: Table S8. Gene Ontology of dibutyl-phthalate (DBP) responsive, paternally provided RNA Element (RE)-containing RNAs (RE-RNAs) not within the enriched biological processes. Ontology was assigned using EnrichR. Bold text; indicates function related to the enriched biological processes highlighted in Fig. 2B, italics; indicate an ontology that is shared by at least two RE-RNAs, na; no ontology reported, not within EnrichR; the RE-RNA is not recognized by EnrichR, ...; no relevance to enriched biological processes highlighted in Fig. 2B,  $B_1HB_2$ ; background DBP study arm baseline to crossover to crossback, Paternally provided; fivefold paternally enriched and twofold paternally enriched RE-RNAs.

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Not applicable.

#### Author contributions

Planning and patient recruitment for the MARS (Mesalamine and Reproductive Health Study) study, which provided the DBP responsive REs, was by RH, FLN and JBF. RH and SAK designed and directed the original primary study. SAK directed the RNA isolation, characterization, and sequencing and data analysis. GMS performed data analysis of the presently described work. All authors read and approved the final manuscript.

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#### Availability of data and materials

Sequencing data for the DBP responsive REs are deposited as a GEO data set with the following accession number: GSE129216 and referenced in [5]. The REs utilized to determine the 5 × enriched and 2 × enriched paternally provided REs defined in [3]. Oocyte and zygote sequences were downloaded from the GEO database accessions GSE44183 and GSE71318.

#### Declarations

#### Ethics approval and consent to participate

The semen samples were collected, processed, and analyzed at Wayne State University under the IRB protocols H-06-67-96 and HIC 095701MP2F.

#### **Consent for publication**

Not applicable.

#### **Competing interests**

The authors declare no competing financial interests but the following competing interest. FLN is a current employee and a shareholder of Biogen, Cambridge, MA. The original work on MARS Study (2 arm study) at Harvard T. H. Chan School of Public Health (HSPH), however, pre-dated the current employment. This manuscript does not mention any Biogen products or any of the disease states that Biogen is actively doing research in (to the coauthor's knowledge). The authors declare no non-financial competing interests.

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