

ARTICLE



Bud31-mediated alternative splicing is required for spermatogonial stem cell self-renewal and differentiation

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Alternative splicing (AS) is tightly regulated during cell differentiation and development. AS events are prevalent in the testis, but the splicing regulation in spermatogenesis remains unclear. Here we report that the spliceosome component Bud31 plays a crucial role during spermatogenesis in mice. Germ cell-specific knockout of *Bud31* led to loss of spermatogonia and to male infertility. We further demonstrate that Bud31 is required for both spermatogonial stem cell pool maintenance and the initiation of spermatogenesis. SMART-seq revealed that deletion of *Bud31* in germ cells causes widespread exon-skipping and intron retention. Particularly, we identified *Cdk2* as one of the direct splicing targets of Bud31, knockout of *Bud31* resulted in retention of the first intron of *Cdk2*, which led to a decrease in *Cdk2* expression. Our findings suggest that Bud31-mediated AS within spermatogonial stem cells regulates the self-renewal and differentiation of male germ cells in mammals.

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INTRODUCTION

The process of male germ cell development is complex and highly coordinated. The primary spermatogonial stem cells (SSCs) originate from gonocytes in the postnatal testis, and they function by sustaining continuous sperm production [1]. Gonocytes originate from primordial germ cells during embryogenesis, proliferate until embryonic day (E)15–16, and then become quiescent [2]. After birth, the gonocytes resume proliferation and migrate to the basement membrane of the seminiferous tubules where they differentiate into SSCs [3]. SSCs either self-renew to maintain the stem cell pool or differentiate to produce spermatozoa [4]. PLZF, GFR α 1, and ID4 have been identified as markers of undifferentiated SSCs [5]. RA (retinoic acid) and c-Kit are essential for SSC differentiation [6].

It is known that alternative splicing (AS) is regulated in a tissue-specific manner during development [7], and AS outcomes have been shown to regulate cell differentiation and lineage determination to support tissue identity specification [8]. AS occurs in about 95% of human genes and in about 60% of mouse genes [9], and AS is most prevalent in the testis and brain when compared to other tissues [10]. Defects in AS can lead to various diseases, and aberrant AS can result from mutations in RNA cis-regulatory elements or trans-acting regulatory factors [11]. The trans-acting factors include RNA binding proteins that can act as splicing enhancers or silencers [12], and several RNA binding proteins are differentially expressed in the testis and have been shown to play roles in spermatogenesis [13–15]. Despite these findings,

understanding the splicing factors that control the AS of key genes in spermatogenesis remains a major challenge.

BUD31 belongs to the major B^{act} complex of the human minor spliceosome [16] and is required for spliceosome assembly and catalytic activity [17]. *Bud31*-null yeast cells show bud formation defects and have disorganized actin distribution [18], but the physiological roles of Bud31 remain unknown in mammals. Here, we generated germ cell conditional *Bud31* knockout mice, which led to loss of spermatogonia and to infertility. Through integrative analysis of SMART-seq and RIP-seq data, we identified *Cdk2* as a direct splicing target of Bud31. Our data suggest that Bud31-mediated AS is required for SSC pool maintenance and for the initiation of spermatogenesis.

RESULTS

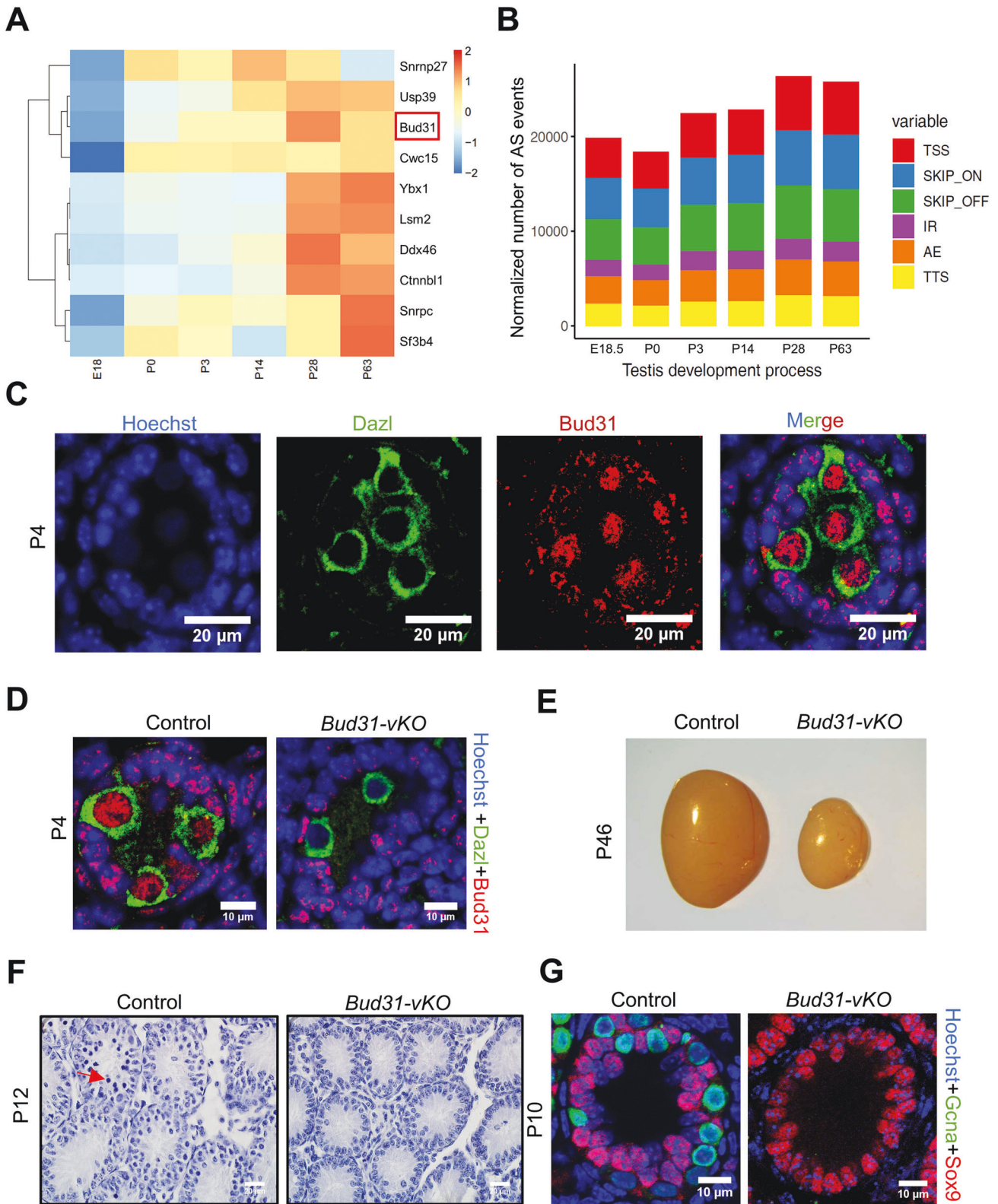
Germ cell-specific *Bud31* knockout results in complete male infertility

The expression levels of splicing factors are tightly regulated during cell differentiation and development [8]. To characterize the splicing factors involved in spermatogenesis, we used publicly available RNA-seq data (E-MTAB-6798) [19] to obtain the levels of 134 known splicing factors [17] in testes at different stages of mouse spermatogenesis (E18.5, postnatal day (P)0, P3, P14, P28, and P63). We found that 10 splicing factors only began to be expressed after birth, which is when spermatogonia proliferation commences (Fig. 1A; Supplementary Table S1). Meanwhile, we

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analyzed AS events using RNA-seq data (E-MTAB-6798) and found that AS events were significantly increased in testes at P3 and reached a peak at P28 in comparison with P0 (Fig. 1B).

Spliceosome component Bud31, which is required for spliceosome assembly and catalytic activity [17], caught our interest because its expression pattern was temporally coordinated with

alternative splicing events (Fig. 1A, B). Bud31 is also known to regulate budding and cell cycle by facilitating G1/S transition in budding yeast [20], suggesting its role in spermatogenesis. We then performed immunoblotting of testes at different stages of mouse spermatogenesis. Consistent with the RNA-seq data, the Bud31 protein level in testes increased dramatically after birth

Fig. 1 Germ cell-specific *Bud31* knockout results in complete male infertility. **A** Heatmap analysis of the expression of known splicing factors at E18 and at different postnatal day points (P0, P3, P14, P28, and P63) in mouse testes using the Evo-devo mammalian organs database (<https://apps.kaessmannlab.org/evodevoapp/>). **B** Histogram showing the occurrence of AS events at E18.5, P0, P3, P14, P28, and P63 in mouse testes using the Evo-devo mammalian organs database. **C** Immunofluorescence staining of *Bud31* (red) and the germ cell marker *Dazl* (green) in the seminiferous tubules of P4 mice. The scale bar is 20 μ m. **D** Immunofluorescence staining of *Bud31* (red) and the germ cell marker *Dazl* (green) in seminiferous tubules of P4 testes of *Bud31*-vKO mice and in littermate controls. The scale bar is 10 μ m. **E** Testes from P46 *Bud31*-vKO mice compared to their respective littermate controls. **F** Hematoxylin staining of the seminiferous tubules of the testes of P12 *Bud31*-vKO and littermate control mice. The scale bar is 20 μ m. Red arrow: germ cells. **G** Immunofluorescence staining of the Sertoli cell marker *Sox9* (red) and germ cell nuclear antigen *Gcna* (green) in the seminiferous tubules of P10 *Bud31*-vKO and their littermate controls. The scale bar is 10 μ m.

(Supplementary Fig. S1A). We also determined the expression of *Bud31* in different organs and found that *Bud31* was highly expressed in testis, ovary, and spleen (Supplementary Fig. S1B). Additionally, co-immunofluorescence staining of *Bud31* and *Dazl*, a marker for undifferentiated spermatogonia [21], showed that *Bud31* was present in *Dazl*-positive cells in seminiferous tubules at P4 (Fig. 1C). We performed immunoblotting of purified germ and somatic cell fractions from P9 testes and found that *Bud31* accumulation was more pronounced in germ cells than in somatic cells (Supplementary Fig. S1C), implying its potential role in spermatogenesis. Subcellular localization analysis revealed that *Bud31* is mainly localized in the nuclei of spermatogenic cells (Supplementary Fig. S1D).

To explore the potential functional impacts of *Bud31* in spermatogenesis, we generated mice carrying a floxed *Bud31* allele in which exons 4–5 was flanked by loxP sites (Supplementary Fig. S1E). Then *Bud31* global knockout mice were generated by crossing *Stra8*-GFP*Cre* deleter mice with *Bud31*-floxed mice (Supplementary Fig. S1F). We found that mice with global deletion of *Bud31* were viable but had a decreased body size (Supplementary Fig. S1G). The testis size of *Bud31* null mice was significantly smaller than littermate controls, with a severe germ cell loss in the tubules (Supplementary Fig. S1H, I). These findings implicate *Bud31* in the development and spermatogenesis. To elucidate the potential role of *Bud31* in spermatogenesis, we next created germ cell specific *Bud31* knockout mice by crossing *VASA-Cre* transgenic mice with *Bud31*-floxed mice (*Bud31*-vKO). The genotype of the conditional knockout mice was confirmed by PCR of tail biopsy DNA (Supplementary Fig. S2A), and the knockout efficiency was assessed by qPCR and immunoblotting of testes at P4 (Supplementary Fig. S2B, C). Additionally, immunostaining of the germ cell marker *DAZL* and *Bud31* in seminiferous tubules further confirmed the lack of *Bud31* in germ cells of *Bud31*-vKO mice at P4 (Fig. 1D and Supplementary Fig. S2D).

Next, we analyzed the phenotypes and found that compared to their littermate controls (*Bud31*^{fl/fl} or *Bud31*^{fl/+}), *Bud31*-vKO mice (P46) had much smaller testes (Fig. 1E). Consistent with this phenotype, hematoxylin staining demonstrated a significant decrease in the number of germ cells in the testes of *Bud31*-vKO mice compared to their littermate controls (Fig. 1F). Furthermore, co-immunofluorescence staining of the Sertoli cell marker *Sox9* and the germ cell marker *Gcna* revealed that *Gcna*-positive cells in *Bud31*-vKO testes were completely absent but were present in control testes at P10 (Fig. 1G). Moreover, no pups were obtained when adult *Bud31*-vKO male mice were housed with wild type fertile female mice for 3 months (Supplementary Table S2). These findings collectively suggest that *Bud31* is essential for spermatogenesis.

***Bud31* knockout leads to severe defects in SSC self-renewal**

To determine the cause of germ cell loss observed in *Bud31*-vKO mice, we performed immunohistochemistry staining against *Plzf* (a known SSC marker) in *Bud31*-vKO and control mice at P8. *Plzf*-positive cells were lost in *Bud31*-vKO testes but were observed in control testes (Supplementary Fig. S2E). To investigate the time of onset of SSC loss in *Bud31*-vKO mice, we performed immunostaining against *Bud31* and *Plzf* in seminiferous tubules at P1, P2, P3,

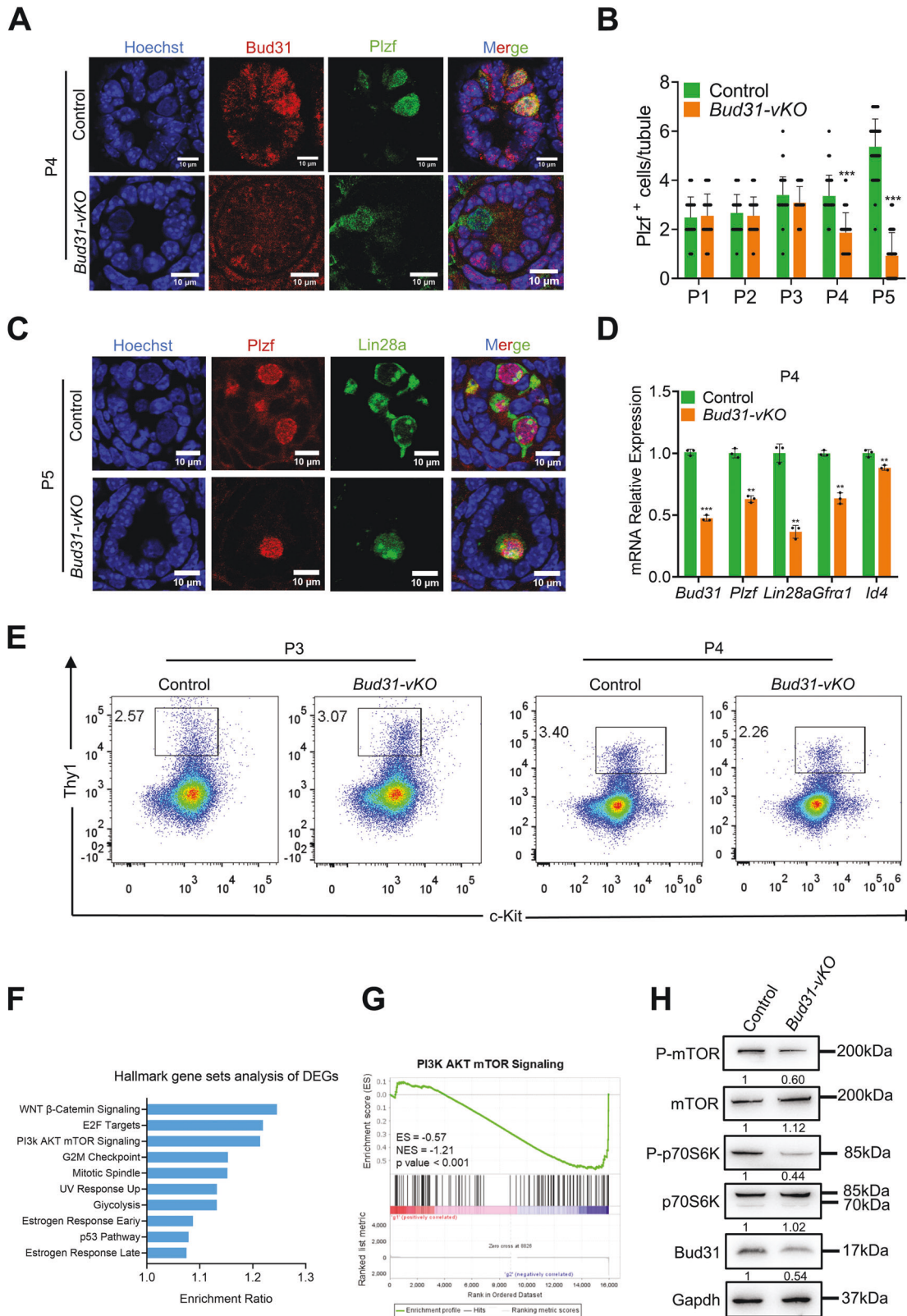
P4, and P5 in *Bud31*-vKO and control mice. Compared to controls, the first point at which a significant reduction in the number of *Plzf*-positive cells became evident was P4 (Fig. 2A, B). Immunoblotting verified the reduced expression of *Plzf* in *Bud31*-vKO mice compared to controls at P4 (Supplementary Fig. S2F). Further, co-staining with an additional SSC marker (*Lin28a*) in seminiferous tubules of *Bud31*-vKO mice at P5 showed that the number of cells co-expressing *Lin28a* and *Plzf* was significantly lower in the *Bud31*-vKO tubules than in controls (Fig. 2C). Subsequently, we used qPCR to examine the expression of SSC markers (*Plzf*, *Lin28a*, *Gfra1*, and *Id4*) in P4 testes, and the levels of these markers were significantly reduced in *Bud31*-vKO testes compared to controls (Fig. 2D). Further, flow cytometry analysis showed that cells expressing the SSC surface marker *Thy1* but not expressing *c-Kit* decreased from 3.4% to 2.26% at P4 in *Bud31*-vKO testes compared with controls (Fig. 2E), confirming that the number of SSCs was reduced as early as P4.

We performed SMART-seq analysis of the sorted *Thy1*⁺/*c-Kit*⁻ SSCs from *Bud31*-vKO and control mice at P4, Gene Ontology and Gene Set Enrichment Analysis (GSEA) of the differentially expressed genes revealed obvious enrichment for PI3K-AKT-mTOR signaling, an essential pathway for normal SSC self-renewal [22] (Fig. 2F, G). Immunoblotting verified the reduced levels of mTOR signaling components in sorted *Thy1*⁺/*c-Kit*⁻ SSCs from the P4 *Bud31*-vKO animals (Fig. 2H). These results implicate *Bud31* in the regulation of SSC self-renewal in newborn mice.

***Bud31*-deficient male germ cells fail to enter meiosis**

Meiosis is a unique process for the differentiation of germ cells, and *Stra8* (Stimulated by Retinoic Acid 8) functions as an essential gatekeeper of meiotic initiation [23]. To assess the potential role of *Bud31* in male meiosis, we crossed *Stra8*-GFP*Cre* mice with *Bud31*^{lox/lox} (*Bud31*-sKO) mice. The knockout efficiency was assessed by qPCR, immunoblotting, and immunofluorescence staining of testes at P10 (Supplementary Fig. S3A–C). The testes size was also greatly reduced in *Bud31*-sKO mice compared to controls (Supplementary Fig. S3D). We then performed hematoxylin staining, which showed that meiotic cells were largely reduced in *Bud31*-sKO mice in comparison with their littermate controls (*Bud31*^{fl/fl} or *Bud31*^{fl/+}) at P10 and P12 (Fig. 3A and Supplementary Fig. S3E). Subsequently, we used immunofluorescence staining of the meiosis markers SYCP3 and γ H2AX in the seminiferous tubules of P12 mice and found that SYCP3 and γ H2AX double-positive cells were significantly decreased in *Bud31*-sKO testes compared with controls (Fig. 3B). Importantly, no spermatocytes later than those with preleptotene stage-like chromosomes were observed in *Bud31*-sKO testes at P12, a time when abundant zygotene chromosomes were already evident in control testes (Fig. 3C). Moreover, no meiotic cells were observed in *Bud31*-sKO testes at P17, a time when pachytene chromosomes were already evident in control testes (Supplementary Fig. S3G, H). This phenotype was similar to that of *Stra8* knockout mice based on our data (Supplementary Fig. S3I, J) and previous study [24], indicating that *Bud31* is required for entry into meiosis.

The expression of *Stra8* is necessary for germ cells to enter into meiosis [25], and we performed immunofluorescence staining of *Stra8* in the seminiferous tubules of P10 mice and found that the



Stra8 signal was significantly diminished in *Bud31-sKO* testes compared to controls (Fig. 3D). A subsequent qPCR assay revealed that the levels of *Stra8* and its known downstream transcriptional activation targets *Hoxa1* and *Cyp26a1* [26] were decreased in P10 *Bud31-sKO* mice compared to controls (Fig. 3E). We further used

both qPCR and immunoblotting to assess *Stra8* and observed significantly reduced *Stra8* levels in P4 *Bud31-vKO* testes compared to controls (Fig. 3F, G). We also noted that P10 *Bud31-sKO* testes had significantly reduced levels of genes involved in spermatogonia differentiation (*c-kit*, *Stra8*, *Sohlh1*,

Fig. 2 *Bud31* knockout leads to severe defects in SSC self-renewal. **A** Immunofluorescence staining of *Bud31* (red) and *Plzf* (green) in seminiferous tubules of P4 mice. The scale bar is 10 μ m. **B** Quantification of *Plzf*-positive cells in seminiferous tubules from P1 to P5 mice assessed by immunofluorescence staining. Counts shown are *Plzf*-positive cells per tubule. At least 60 tubules were counted from at least three different mice. Student's *t* test, error bars indicate the SEM. *****P* < 0.001. **C** Immunofluorescence staining of SSC markers *Plzf* (red) and *Lin28a* (green) in seminiferous tubules of P5 mice. The scale bar is 10 μ m. **D** qPCR to measure the expression of SSC self-renewal-related genes (*Plzf*, *Lin28a*, *Gfra1*, and *Id4*) in P4 *Bud31*-vKO mice compared to littermate controls. Student's *t* tests were performed, and data are shown as the mean \pm SEM of three independent experiments. **P* < 0.05, ***P* < 0.01, *****P* < 0.001. **E** The spermatogonial stem cell proportion was analyzed by assessing cells positive for the SSC marker *Thy1* and negative for the differentiated spermatogonia marker *c-Kit* using flow cytometry in P3 and P4 *Bud31*-vKO mice (compared against littermate controls). **F** Gene Ontology analysis of differentially expressed genes (DEGs) in P4 mouse testes from SMART-seq analysis of SSCs. **G** Gene Set Enrichment Analysis of P13K-AKT-mTOR enrichment in P4 mouse testes from the SMART-seq dataset. **H** Western blotting analysis of mTOR pathway-related protein expression in testes from *Bud31*-vKO mice. *Gapdh* was used as the loading control.

and *Sohlh2*) [27] and meiosis (*Dmc1*, *Sycp1*, *Sycp3*, and *Rec8*) [28] compared to controls (Supplementary Fig. S3F). These results again support that *Bud31* functions to regulate meiotic initiation.

Bud31 regulates AS in spermatogenic cells

In order to explore the role of *Bud31* in AS in spermatogenesis, we performed AS analysis on SMART-seq data using rMATS. *Bud31* knockout resulted in a total of 1948 AS events (Supplementary Table S3), including skipped exons (57%), retained introns (20%), alternative 3' splice sites (11%), alternative 5' splice sites (5%), and mutually exclusive exons (7%) (Fig. 4A, B). We subsequently analyzed the reads mapping distribution and observed that *Bud31* depletion significantly reduced the proportion of exonic reads and increased the proportion of intronic and intergenic reads (Fig. 4C). Furthermore, we calculated the splicing efficiency using the SMART-seq data and found that knockout of *Bud31* resulted in significantly reduced efficiency of 5' splice sites ($D = 0.0885$) and 3' splice site ($D = 0.0657$) respectively (Fig. 4D), indicating impairment of AS upon loss of *Bud31*.

To identify genome-wide binding sites and targets of *Bud31* in spermatogenesis, RIP-seq (RNA immunoprecipitation sequencing) was conducted using spermatogenic cells from P14 wild-type mice. RIP peak distribution analysis revealed that *Bud31* was predominantly mapped to intron regions (81.8%) of pre-mRNAs (Fig. 4E and Supplementary Table S4). We further analyzed the reads intensity and found that *Bud31* was highly enriched in exon-intron regions around splicing sites (Fig. 4F). Moreover, we used the HOMER algorithm to identify the *Bud31*-recognizing RNA motif and found that the most abundant elements were UUUUAAAA and GAGGCAGG (Fig. 4G), which are useful for identifying potential binding sites. We also performed immunoprecipitation with *Bud31* antibody coupled to mass spectrometry in P14 testis. Bubble map analysis revealed that the gene ratio related to the spliceosome and RNA binding was significantly enriched (Supplementary Fig. S4A). Importantly, we found that *Bud31* was predominantly associated with hnRNP proteins, U2 snRNPs, and A-complexes (Supplementary Fig. S4B). Finally, coimmunoprecipitation and immunoblotting verified that *Sf3b1*, *U2af2*, and *Ddx4* interact with *Bud31* (Supplementary Fig. S4C). The interactions between *Bud31* and spliceosome components indicate its role in the regulation of AS.

To identify candidate AS targets regulated by *Bud31* in spermatogenic cells, we compared the *Bud31*-bound genes from the RIP-seq data (3258 genes) with AS-related genes from our SMART-seq dataset (1591 genes) and identified 392 common genes (Fig. 4H). We further carried out pathway enrichment analysis on 392 genes and found pathways including meiotic cell cycle and cell division were highly enriched (Fig. 4I). To verify the reliability our analysis on RIP-seq and SMART-seq data, we subsequently examined candidate *Bud31* targets, and visualization of alternatively spliced exons by sashimi plots revealed, for example, that exon 7 of *Angel2* was skipped in the SMART-seq data (Supplementary Fig. S5A, top). Consistent with this, RIP-seq analysis showed that *Bud31* binds to exon 7 of *Angel2* (Supplementary Fig. S5A, bottom). The presence of the anticipated

spliced isoforms of *Angel2* was confirmed by semiquantitative RT-PCR in the testes of P10 *Bud31*-sKO and littermate control mice using isoform-specific primers (Supplementary Fig. S5B). We further performed qPCR to analyze long-to-short isoform ratio of *Angel2* in the testes of P10 *Bud31*-sKO and littermate control mice. Consequently, long-to-short isoform ratio of *Angel2* was significantly reduced upon loss of *Bud31* (Supplementary Fig. S5C). RIP-qPCR showed that *Bud31* bound to *Angel2* pre-mRNA (Supplementary Fig. S5D). We also validated *Bud31* regulates AS of *Hspa9* through intron 7 retention (Supplementary Fig. S5E–H).

Bud31 depletion leads to increased retention of the first intron of *Cdk2*

To identify the targets that account for the phenotype in *Bud31* cKO mice, we interrogated 392 genes and 701 down-regulated genes (Fig. 4J and Supplementary Table S5) upon *Bud31* deficiency. We found 12 genes, including *Cdk2*, *Ccdc62* and *Lbr* were both differentially spliced and down-regulated (Fig. 4K). We next focus on *Cdk2*, which is not essential for mouse viability, but its deletion has been shown to cause male infertility [29]. SMART-seq analysis showed that disruption of *Bud31* led to the retention of the first intron of the *Cdk2* pre-mRNA (Fig. 5A, top), and our RIP-seq data support that *Bud31* binds intron 1 of *Cdk2* (Fig. 5A, bottom). We next validated the effect of *Bud31* on the AS of *Cdk2* by semiquantitative RT-PCR in the testes of P10 *Bud31*-sKO and littermate control mice using isoform-specific primers (Fig. 5B). To obtain further evidence, we constructed minigenes spanning intron 1 and performed splicing assays by transfecting GC-1 cells with minigenes in combination with *Bud31* siRNAs. *Bud31* depletion greatly increased the intron-containing transcripts of *Cdk2* (Fig. 5C). We then analyzed long-to-short isoform ratio by qPCR in the testes of P10 and observed a significant increase long-to-short isoform ratio of *Cdk2* upon loss of *Bud31* (Fig. 5D). In addition, a splicing reporter assay was performed to confirm the effect of *Bud31* on the AS of *Cdk2*. Knockdown of *Bud31* using siRNAs significantly reduced the luciferase activity encoded by a *Cdk2* intron 1-containing reporter fragment (Fig. 5E). To gain further evidence for the direct binding of *Bud31* to *Cdk2*, a RIP assay was performed in P14 mouse testes using a *Bud31* antibody, and, as expected, RIP-qPCR showed that *Bud31* bound to intron 1 of *Cdk2* pre-mRNA (Fig. 5F). Moreover, an RNA pull-down assay showed successful pull-down of *Bud31* by a biotin-labeled *Cdk2* probe (Fig. 5G).

Intron retention can reduce gene expression at the post-transcriptional level [30]. We therefore performed qPCR in P10 mouse testes and found that *Cdk2* expression was significantly down-regulated in *Bud31*-sKO mouse testes compared to controls (Fig. 5H). We also found that siRNA-mediated knockdown of *Bud31* in GC-1 cells led to significantly reduced *Cdk2* levels (Fig. 5I). Immunoblotting further demonstrated that both two protein isoforms were significantly reduced in *Bud31*-vKO mouse testes compared to controls (Fig. 5J). These findings indicate that deletion of *Bud31* results in the retention of intron 1, which leads to decreased *Cdk2* expression. Moreover, the expressions of *Ccdc62* and *Lbr*, which have been reported to be involved in fertility [31, 32], were also compromised in the absence of *Bud31*

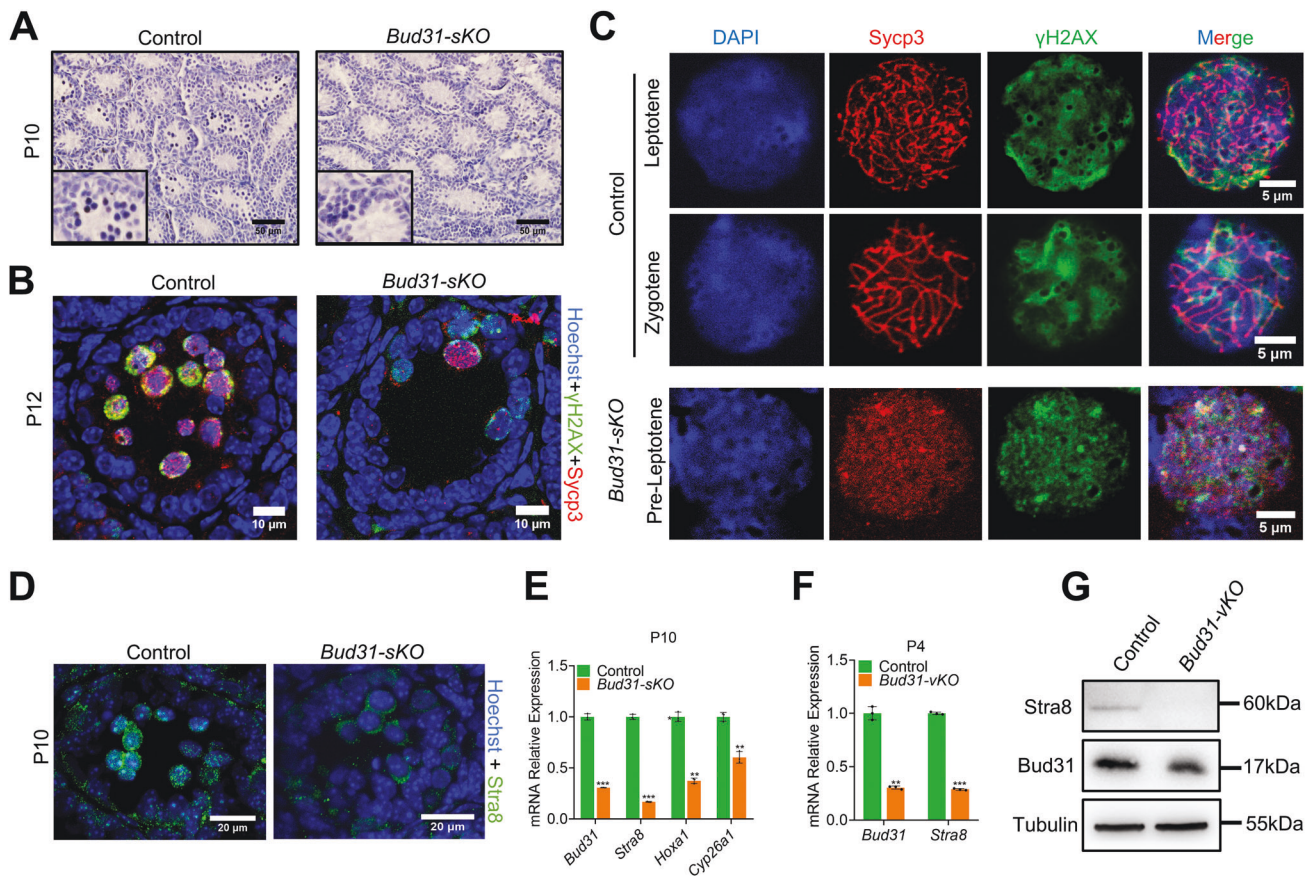


Fig. 3 *Bud31*-deficient male germ cells fail to enter meiosis. **A** Hematoxylin staining of the seminiferous tubules of the testes of P10 *Bud31-sKO* and littermate control mice. The scale bar is 50 μ m. **B** Immunofluorescence staining of the meiotic marker γ H2AX (green) and syndicate complex marker SYCP3 (red) in P12 testis tissue sections. The scale bar is 10 μ m. **C** Immunofluorescence staining of SYCP3 (red) and γ H2AX (green) was performed on chromosome spreads of *Bud31-sKO* mice. The scale bar is 5 μ m. **D** Immunofluorescence staining of *Stra8* (green) in the testicular tissue sections of P10 control and *Bud31-sKO* mice. The scale bar is 20 μ m. **E** The expression of *Stra8* and its downstream targets was assessed by qPCR in the testes of P10 *Bud31-sKO* and littermate control mice. The *Stra8* expression by qPCR (F) and western blotting (G) in P4 testes of *Bud31-vKO* mice and littermate controls. * $P < 0.05$; ** $P < 0.01$; *** $P < 0.001$.

(Supplementary Fig. S51–P). Taken together, these data suggest that *Bud31*-mediated alternative splicing is involved in the regulation of spermatogenesis.

DISCUSSION

Regulation of AS is important for proper spermatogenesis [8], and splicing factors and AS are regulated in a stage-specific manner during spermatogenesis [33]. For example, *Rbm5* is an essential splicing factor in round spermatids, and it regulates the splicing of several spermatid-expressed mRNAs that are critical for producing spermatozoa [34]. *Ptbp2* regulates AS in the meiotic and post-meiotic stages of spermatogenesis, and *Ptbp2* loss results in the absence of spermatozoa [35]. Also, *Bcas2* is involved in pre-mRNA splicing, which is essential for the initiation of meiosis but has little effect on spermatogonia [14]. *Nanos2* and *Ddx5* are required for the splicing of key genes in the maintenance of spermatogonia [13, 15]. Our findings demonstrated that germ cell-specific *Bud31* knockout results in spermatogonia loss and complete male infertility. We further observed significant loss of SSCs as early as P4 in *Bud31-vKO* mouse testes compared to controls (Fig. 2B, E). Our work thus highlights the importance of spliceosome components in SSC pool maintenance.

The mitosis-meiosis transition is a crucial step for spermatogenesis [36]. Retinoic acid (RA) is an essential extrinsic inducer of meiotic initiation by inducing *Stra8* in mammalian germ cells [37]. *Dazl* is a key intrinsic factor for initiating meiosis, which is required

for *Stra8* expression [37]. Meiosis together with *Stra8* acts as an upstream regulator for cell-cycle switching from mitosis to meiosis [38]. *Dmrt1* blocks entry into meiosis via suppresses RA-dependent transcriptional activity [39]. RNA binding protein *Bcas2* is required for the initiation of meiosis via regulating *Dazl* splicing [14], whereas *Nanos2* prevents meiosis initiation by repressing *Stra8* expression, which is required for premeiotic DNA replication [40]. Here we crossed *Stra8-GFPCre* mice with *Bud31^{fllox/fllox}* (*Bud31-sKO*) mice to study the roles of *Bud31* in meiosis. We found that SYCP3 and γ H2AX positive cells were significantly decreased in *Bud31-sKO* testes compared with controls (Fig. 3B). No spermatocytes later than preleptotene-like stage chromosomes were observed in *Bud31-sKO* testes at P12, a time when abundant zygotene chromosomes were already evident in control testes (Fig. 3C). Importantly, levels of *Stra8* and its known downstream transcriptional activation targets *Hoxa1* and *Cyp26a1* were decreased in P10 *Bud31-sKO* mice compared to controls (Fig. 3E). These observations support *Bud31* functions to regulate meiotic initiation in male germ cells.

One of our key findings was that we identified the binding motif and splicing targets of *Bud31* during spermatogenesis through combined analysis of RIP-seq and SMART-seq data, which are high sensitivity and low variability RNA sequencing technologies [41]. We observed that the predominant AS events regulated by *Bud31* were skipped exons (57%) and retained introns (20%). Importantly, we identified *Cdk2* as a direct splicing target of *Bud31*. *Cdk2* is a member of the CDK family that controls the G1/S and S/G2 transitions [42].

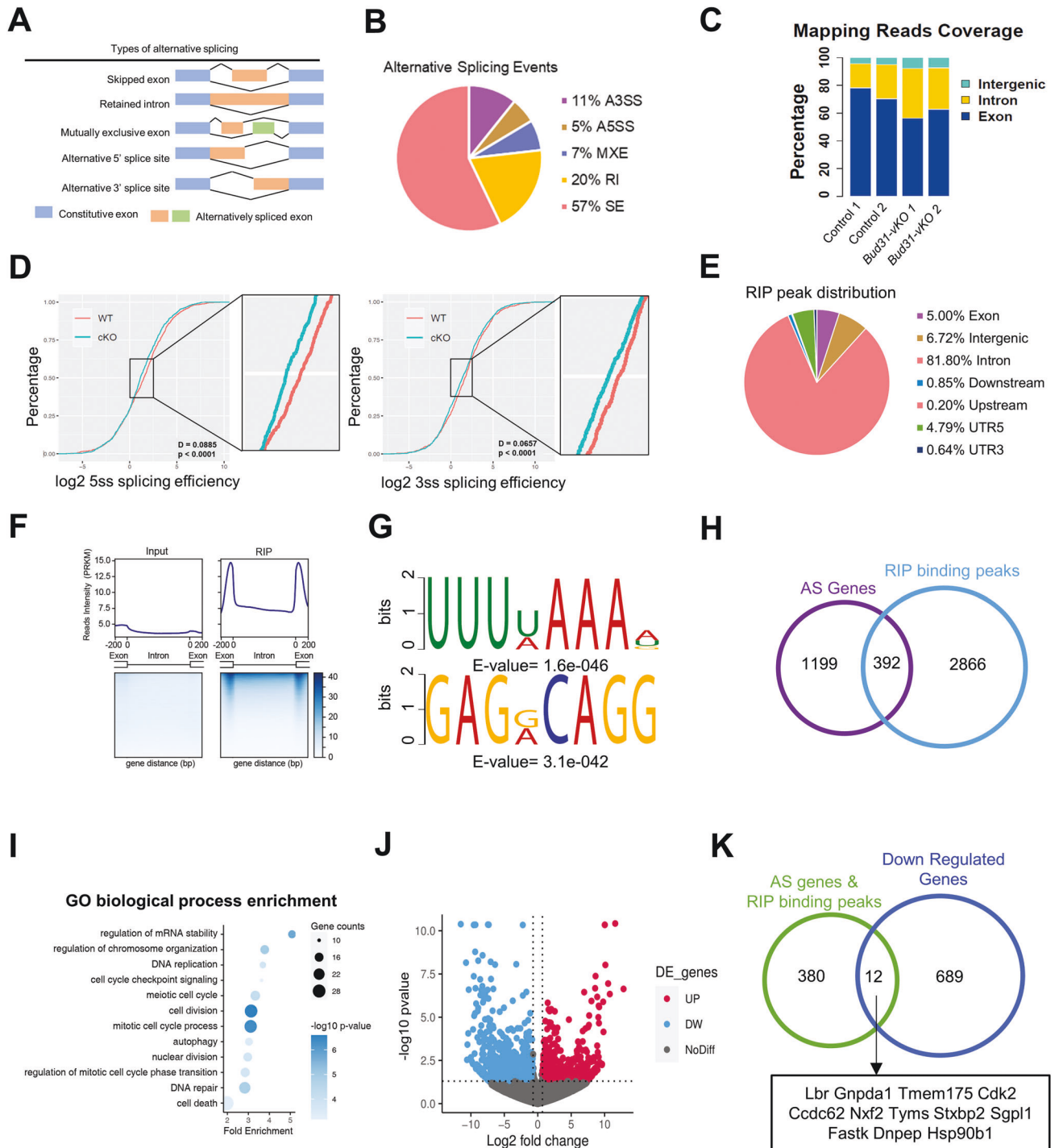
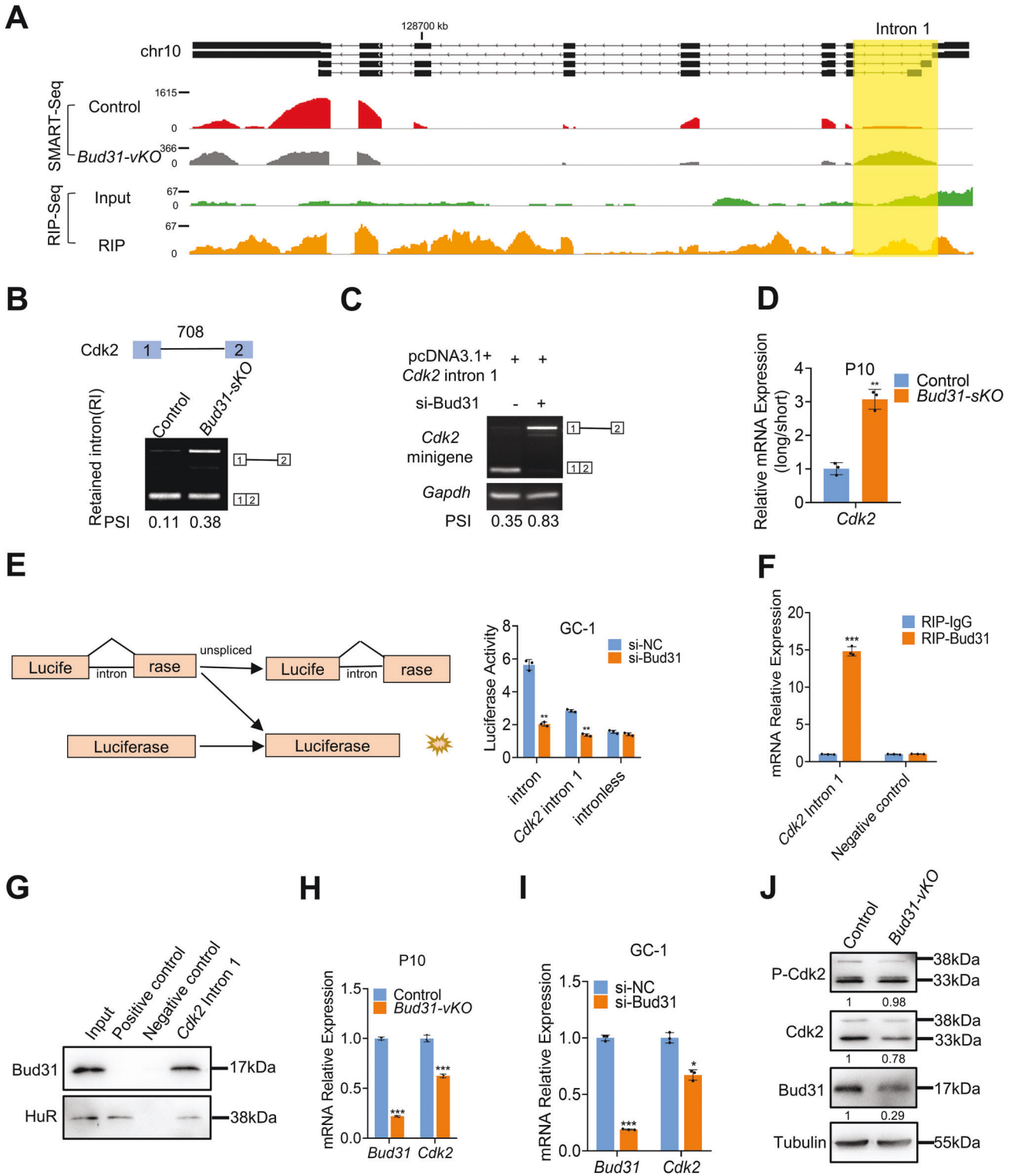


Fig. 4 Bud31 regulates AS in spermatogenic cells. **A** Schematic diagram of AS types. **B** Pie chart depicting the proportions of different types of AS events in the SMART-seq data from spermatogenic cells in the testes of P4 *Bud31*-vKO mice and littermate controls. **C** Mapping reads coverage of the SMART-seq data in spermatogenic cells in the testes of P4 *Bud31*-vKO mice and littermate controls. The percentages of reads aligned to intergenic, intron, and exon regions are shown. **D** Global splicing efficiency at the 5' splicing sites and 3' splicing sites was analyzed with splicing efficiency analysis and annotation in spermatogenic cells in the testes of P4 *Bud31*-vKO mice and littermate controls. **E** Pie chart of the distribution of Bud31 binding peaks from RIP-seq data for primary cells in P14 wild-type mouse testes. **F** The normalized reads intensity distribution around the 3' and 5' splicing sites (± 100 bp) was analyzed using RIP-seq data in primary cells of P14 wild-type mouse testes. **G** HOMER de novo motif analysis of Bud31 binding peaks based on the RIP-seq data. Two significant motifs with their corresponding E-values are shown. **H** Venn diagram of 392 genes common to both the Bud31-binding genes from the RIP-seq data and genes with AS events identified by SMART-seq. **I** Gene ontology (GO) enrichment analysis of biological processes for the 392 genes. **J** Volcano plot of differentially expressed genes (DEGs) from SMART-seq of SSCs in P4 *Bud31*-vKO mice compared to their littermate controls. $|\log_2FC| > 0.7$ and an adjusted p value < 0.05 were considered significant. **K** Venn diagram of 12 genes common to both 392 genes and down regulated genes from SMART-seq of SSCs in P4 *Bud31*-vKO mice compared to their littermate controls.



Cdk2 knockout mice are viable and survive for up to two years, yet both male and female *Cdk2*^{-/-} are sterile [43, 44]. Germ cell-specific *Cdk2* knockout mice by crossing *Hspa2-cre* with *Cdk2*^{flax/flax} mice in our study further confirmed that loss of *Cdk2* causes meiotic failure in spermatocytes (Supplementary Fig. S6A–D). Mice bearing a deregulated allele (*Cdk2*^{Y15S}) are defective in spermatogonial self-renewal and differentiation, resulting in sertoli cell only syndrome [29], suggesting that *Cdk2* is one of the crucial splicing targets of Bud31. Mouse *Cdk2* is known to produce two protein isoforms, Cdk2-beta (a

full-length isoform) and Cdk2-alpha (an exon 6-skipped isoform) [45]. We also identified the exon 6-skipped isoform of *Cdk2* in our SMART-seq data, but we failed to validate the skipped exon 6 in the minigene assay. Furthermore, both *Cdk2*-beta and *Cdk2*-alpha were significantly reduced when *Bud31* was depleted (Fig. 5J). Very recently, it was reported that an Mt2b2 retrotransposon promoter generates a truncated isoform of *Cdk2*, which is essential for preimplantation embryo development [46]. In this report, we found that disruption of *Bud31* induced the retention of intron 1 of the *Cdk2*

Fig. 5 Bud31 depletion leads to increased retention of the first intron of *Cdk2*. **A** The AS pattern and Bud31 direct binding sites in the *Cdk2* pre-mRNA were visualized with IGV using the SMART-seq and the RIP-seq data. The yellow region highlights the AS region and Bud31 binding sites. **B** Semiquantitative RT-PCR was performed to validate AS events in *Cdk2*. Percent spliced in (PSI) was quantified ($n = 3$). **C** Analysis of the splicing of *Cdk2* minigene by semiquantitative RT-PCR. **D** qPCR was performed to analyze long-to-short isoform ratio of *Cdk2* in the testes of P10 *Bud31*-*sKO* and littermate control mice. **E** A splicing reporter assay was performed to assess the splicing of *Cdk2* intron 1 from the pre-mRNA molecule as regulated by Bud31 in GC-1 cells ($n = 3$ biologically independent samples). **F** RIP-qPCR was performed to validate the interaction between Bud31 and *Cdk2* RNA in P14 mouse testes primary cells using the Bud31 antibody and IgG. **G** RNA pull-down assay showing the interaction between the *Cdk2* intron 1 transcript and Bud31 protein. **H** qPCR was performed to measure *Cdk2* expression in testes tissues of P10 *Bud31*-*sKO* and littermate control mice. **I** qPCR analysis of *Cdk2* expression in GC-1 cells transfected with control and Bud31 siRNA. Student's *t* test was performed, and data are shown as the mean \pm SEM of three independent experiments. * $P < 0.05$, ** $P < 0.01$, *** $P < 0.001$. **J** Western blotting analysis of P-Cdk2, Cdk2 and Bud31 levels in testes from P4 *Bud31*-*vKO* and control mice. Tubulin was used as the loading control.

pre-mRNA, which led to decreased *Cdk2* expression. Thus, AS appears to be a crucial regulatory mechanism for the function of *Cdk2*.

In summary, our findings suggest that the spliceosome component Bud31 is a critical splicing regulator in SSC self-renewal and meiotic initiation. We also provide strong evidence that Bud31 predominantly regulates exon-skipping and intron retention during spermatogenesis. Specifically, we verified *Cdk2* as one of the splicing targets of Bud31. Our study demonstrates that Bud31-mediated AS is essential for early spermatogenesis.

MATERIALS AND METHODS

Mice

Bud31^{fllox/+} mice were established at the Nanjing Biomedical Research Institute of Nanjing University. *Cdk2*^{fllox/+} mice and *Strat8* conventional knockout were from Cyagen Biosciences. *Vasa-Cre* mice were obtained from the Jackson Laboratory, and *Strat8-GFP-Cre* mice were a generous gift from Prof. Ming-han Tong at the Chinese Academy of Sciences [47, 48]. *Hspa2-Cre* were a generous gift from Prof. Yujun Xu at Nanjing Medical University. Germ cell-specific *Bud31*-knockout male mice were generated by crossing *Bud31*-floxed mice with *Vasa-Cre* (*vKO*) or *Strat8-GFP-Cre* (*sKO*) transgenic mice. All animals used in our study were housed under a controlled lighting regime (12 h light; 12 h darkness) at 21 °C–22 °C with freely available food and water. The Animal Ethics Committee approved all experimental protocols of the School of Medicine of Shandong University.

Cell culture

Mouse spermatogonia cell line GC-1 was purchased from Wuhan Procell Technology (Wuhan, China). The GC-1 cells were cultured in DMEM medium supplemented with 10% fetal bovine serum (FBS, Gibco), 100 units/mL penicillin, and 100 μ g/mL streptomycin. All cells were cultured in a humidified atmosphere of 5% CO₂ at 37 °C.

Enrichment of spermatogenic cells

The spermatogenic and somatic cells were enriched using a two-step enzymatic digestion process followed by a differential adhesion method [14]. Briefly, after disrupting the tunica albuginea, testes from P9 wild-type mice were transferred into 120 U/ml collagenase type I (Gibco, 17100-017) and incubated at 37 °C for 10 min with gentle shaking every 3–5 min. The cell suspension was then filtered through a 70 μ m filter into a new tube, and the lower sediment was digested with 0.25% trypsin-EDTA (Gibco, 25200-072) at 37 °C for 10 min to dissociate the seminiferous tubules into single cells. The suspension was neutralized with FBS and filtered and mixed with collagenase-digested suspension and centrifuged at 1000 g for 5 min. The cell pellet was suspended in 8 ml of DMEM medium and seeded in a 10 cm culture dish. After 2–3 h of incubation at 37 °C, the floating and weakly adhering cells were transferred to a new 10 cm dish. The fraction of spermatogenic cells comprised the floating and weakly adhering cells, while the attached cells on the bottom of the dish were collected as the fraction of somatic cells. The efficiency of the separation was determined using RT-PCR and western blotting analysis.

RNA extraction and qPCR

Total RNA was extracted from cells or whole testes using TRIzol reagent (Invitrogen, 15596-026) following the manufacturer's instructions. After removing the residual genomic DNA, 1 μ g of total RNA was reverse-transcribed into cDNA using the HiScript III RT SuperMix for qPCR (+gDNA

wiper) (Vazyme, R223-01) according to the manufacturer's protocol. qPCR was performed using ChamQ SYBR Colour qPCR Master Mix (Vazyme, Q411-02) on a Quant Studio 3 system (Thermo Fisher). The primers for the qPCR assay are listed in Supplementary Table S6.

Immunoblotting

Protein samples were prepared for western blotting and immunoprecipitation using tissue lysis buffer with a protease inhibitor cocktail (Beyotime, P011) and were quantified using a BCA reagent kit (Beyotime, P0012-1). Equal amounts of total protein were separated on a 12% SDS-PAGE gel (Servicebio, G2063-50T) and transferred onto PVDF membranes (Millipore, ISEQ00010). The membranes were blocked with 5% nonfat milk for 1 h at room temperature and incubated with diluted primary antibodies overnight at 4 °C. After washing with TBST three times, the membranes were incubated with horseradish peroxidase-conjugated secondary antibodies (1:10000 dilution, Jackson ImmunoResearch) for 1 h at room temperature. The signals were developed with Pierce ECL Substrate (Vazyme, E412-02). The details of the primary antibodies used in this study are shown in Supplementary Table S7. Full and uncropped western blots are shown in Supplementary Figs. S7 and S8.

Histological analysis

Mouse testes were collected immediately after euthanasia and were fixed in 4% paraformaldehyde (Servicebio, G1101) overnight. Following dehydration, the samples were embedded in paraffin and sectioned at a thickness of 4 μ m. After deparaffinization, the slides were stained with hematoxylin, immunohistochemical staining, or immunofluorescence staining. The hematoxylin-stained slides were imaged using a fluorescence microscope (BX53, Olympus), and images were processed using Image J.

Chromosome spread immunofluorescence analysis

Chromosome spread immunofluorescence was performed as described previously [49]. Briefly, seminiferous tubules were incubated in hypotonic solution for 1 h and then transferred to a 100 mM sucrose solution. The samples were minced and spread on slides dipped in 1% PFA and 0.15% Triton X100 (pH 9.0). Slides were incubated in a humidified chamber for 4–5 h, dried, and washed in PBS followed by immunofluorescence staining. Primary antibodies were detected with Alexa Fluor 488- and 594-conjugated secondary antibodies (1:500 dilution, Thermo Fisher Scientific A-11070 and A-11012) for 1 h at room temperature. The slides were washed with PBS three times and mounted with mounting medium with DAPI (Abcam, ab104139). Immunolabeled chromosome spreads were imaged by confocal microscopy using a Dragonfly 200 system (Andor Technology). Projection images were then prepared using Image J software. Primary antibodies used for immunofluorescence are shown in Supplementary Table S7.

SMART-seq

SMART-seq provides sensitive full-length transcriptome profiling in single or few cells [50]. In this study, THY1⁺/c-Kit⁻ SSCs were sorted by flow cytometry in *Bud31*-*vKO* and littermate control mice at P4. About 1000 cells were collected in tubes with lysis buffer and ribonuclease inhibitor. Oligo dT primers were introduced to the reverse transcription reaction for first strand cDNA synthesis, followed by PCR amplification to enrich the cDNA and magnetic bead purification to clean up the products. The cDNA product was checked with a Qubit 3.0 Fluorometer and Agilent 2100 Bioanalyzer to ensure the expected production with a length of around 1000–2000 bp. The cDNA was then sheared into random lengths by ultrasonication for use in the Illumina library preparation protocol,

including DNA fragmentation, end-repair, 3' end A-tailing, adapter ligation, PCR amplification, and library validation. After library preparation, a PerkinElmer LabChip GX Touch and Step OnePlus Real-Time PCR System were used for library quality inspection. Qualified libraries were then loaded onto the Illumina HiSeq platform for PE150 sequencing by Anoroad Gene Tech. After obtaining paired-end reads, clean reads were aligned to the mm10 genome with HISAT2 (version 2.2.0) and sorted with samtools (version 1.9). Mapped reads were visualized with the Integrative Genomics Viewer (IGV). Differential expression was determined with DESeq2. The cutoff was set as p value < 0.05 and $|\log_2FC| > 0.7$. The differentially expressed genes were used for Gene Set Enrichment Analysis. The RNA-seq data generated in this study has been deposited in the NCBI GEO database under the accession number GSE189714.

AS and splicing efficiency analysis

Aligned mapped reads of SMART-Seq data were used for further analysis. AS events were identified by rMATS (version 4.1.0) [51] and were classified into skipped exons, retained introns, alternative 5' splice sites, alternative 3' splice sites, and mutually exclusive exons. Significant events were filtered out with $p < 0.05$ and $|\ln(\text{LevelDifference})| > 0.1$. AS events over the course of testis development were identified with ASprofile [52] based on the RNA-seq data.

Splicing efficiency was determined separately for the 5' and 3' splice sites. We used Kolmogorov-Smirnov test to determine the difference and uniformity of the SMART-seq samples. Splicing efficiency was analyzed using the SMART-seq data with an R package SEEA. The source code used to generate the results has been deposited at Github (<https://github.com/PrinceWang2018/SEEA>). The D statistic indicates the absolute max distance between the CDFs of the two samples. The D values for two CDFs were 0.0885 for 5' splice sites and 0.0657 for 3' splice sites.

RNA immunoprecipitation sequencing (RIP-seq)

RIP was performed using the EZ-Nuclear RIP (Cross-Linked) Kit (Merck Millipore) following the manufacturer's instructions. In brief, the P14 mouse testis tissues were digested into single cells through a two-step enzymatic digestion method. The cells were cross-linked with 0.3% formaldehyde and then lysed and ultrasonicated, and the nucleic acids were sheared into fragments of about 500–1000 bp. The cell lysates were incubated with magnetic beads coated with Bud31 antibody (Proteintech). RNA was extracted from the immune complex while removing DNA and protein, and RNA quality was checked with Quibit and an Agilent 2100. The library was constructed by the RiboBio Biotechnology Company and loaded onto the Illumina HiSeq platform for PE150 sequencing. Clean reads were aligned to the mm10 genome by Tophat (v2.0.13) and sorted with samtools (1.9). RIP peaks were identified with the R package RIPseeker (v1.26.0) [53] and annotated with HOMER [54]. De novo Bud31 binding motif analysis was conducted using MEME program (v4.11.1) [55]. Reads intensity distribution among the exon and intron genome elements was visualized with DeepTools. The RIP-seq data generated in this study has been deposited in the NCBI GEO database under the accession number GSE189715.

RNA pull-down

Cdk2 transcripts were obtained using the RNAMAX-T7 in vitro transcription kit (RiboBio) and then biotin-labeled using the Pierce™ RNA 3' End Desthiobiotinylation Kit (Thermo Fisher Scientific). According to the manufacturer's protocol, RNA pull-down was performed using the Magnetic RNA-Protein Pull-Down Kit (Thermo Fisher Scientific). The proteins were detected by western blot analysis.

Luciferase assay

The *Cdk2* intron 1 sequence was cloned into CMV-LUC2CP/intron/ARE plasmids (Addgene). The plasmids encoding luciferase with or without *Cdk2* intron 1 were co-transfected with *Bud31* siRNAs into GC-1 cells. The pRL-TK vector was used as a control. Luciferase activity was measured 48 h after transfection using the Dual-Luciferase Reporter Assay System (Vazyme, DL101-01). The relative luciferase activity was calculated as the ratio between firefly and Renilla luciferase activity.

Minigene assay

The *Cdk2* minigene was constructed by inserting an additional 708 bp from intron 1 (corresponding to chr10:128534147–128534854, mm10) into

pcDNA3.1 vector between the hind111 and xho1 sites. *Cdk2* intron 1 region was amplified and cloned into pcDNA3.1vector by ClonExpress II One Step Cloning Kit (Vazyme, C112-01) GC-1 cells were transfected with the si-Bud31 together with *Cdk2* intron1 minigene plasmids using jetPRIME® DNA & siRNA Transfection Reagent (PolyPlus). The cells were harvested for RNA extraction 48 h after transfection. Semi-RT-PCR was performed for splicing analysis. The sequence of siRNAs and primers are shown in Supplementary Table S6.

Statistical analysis

The results of all quantitative experiments were based on at least three independent biological samples. All data are presented as means \pm SEM. The statistical significance of the differences between the mean values for the different genotypes was measured by Student's two-tailed t test with a paired t -test. The data were considered significant when the p value was less than 0.05.

DATA AVAILABILITY

The data that support the findings of this study are available from the corresponding author upon reasonable request.

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AUTHOR CONTRIBUTIONS

Conception and design: JQ, HL, and ZL. Development and methodology: JQ, TH, JW, YZ, and QD. Acquisition of data: JQ, TH, ZW, JW, DC, and XW. Analysis and interpretation of data: JQ, TH, ZW, GL, XZ, SL, and ZL. Administrative, technical, or material support: GL, XZ, SL, HL, and ZL. Study supervision: HL and ZL. Writing, review, and/or revision of the manuscript: All authors. Final approval: All authors.

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COMPETING INTERESTS

The authors declare no competing interests.

ETHICS APPROVAL

Our studies did not include human participants, human data, or human tissue.

ADDITIONAL INFORMATION

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