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1Single-cell transcriptomics reveals temporal dynamics of critical regulators of germ 2cell fate during mouse sex determination

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15Summary

16Despite the importance of germ cell differentiation for sexual reproduction, gene 17networks underlying their fate remain unclear. Here, we describe a comprehensive 18characterization of gene expression dynamics during sex determination based on 19single-cell RNA sequencing on 14,750 XX and XY mouse germ cells between 20embryonic days 10.5 and 16.5. By computational gene regulation inference analysis, 21we identified sex-specific, sequential waves of master regulator genes during germ 22cells differentiation and unveiled that the meiotic initiator *Stra8* is regulated by 23positive and negative master regulators acting in an antagonistic fashion. Consistent 24with the importance of the somatic environment, we found that rare adrenal germ 25cells exhibit delayed meiosis and display altered expression of master genes 26controlling the female and male genetic programs. Our study provides a molecular 27roadmap of germ cell sex determination at single-cell resolution that will serve as a 28valuable resource for future studies of gonad development, function and disease.

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31Keywords:

32Single-cell RNA-Sequencing (scRNA-seq), sex determination, ovary, testis, gonocytes, 33oocytes, prospermatogonia, meiosis, gene regulatory network, regulon

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34Introduction

35In mice, primordial germ cells (PGCs) arise in the posterior proximal epiblast around 36embryonic day (E) 6.25. PGCs rapidly proliferate and colonize the gonads at around 37E10.5 (Saitou and Yamaji, 2012; Tam and Snow, 1981). The germ cell fate depends on 38sex-specific somatic cues provided by the ovarian and testicular environments rather than 39the chromosomal sex of the germ cells themselves (Byskov and Saxen, 1976; Evans et 40al., 1977; McLaren, 1983).

41In fetal ovaries, germ cells enter meiosis asynchronously in a wave from anterior to 42posterior over about 2 days, between E12.5 and E14.5 (Bullejos and Koopman, 2004; 43Menke et al., 2003; Yao et al., 2003). This entry into meiosis is considered a hallmark of 44commitment to oogenesis. It is triggered by the expression of the pre-meiotic marker 45*Stra8* and the meiosis-associated gene *Rec8* and, at the same time, by the downregulation 46of pluripotency markers such as *Oct4 (Pou5f1)*, *Sox2* and *Nanog* (Baltus et al., 2006; 47Bowles et al., 2006; Bullejos and Koopman, 2004; Koubova et al., 2014; Koubova et al., 482006; Menke et al., 2003; Yao et al., 2003).

49In contrast, germ cells in fetal testes differentiate into prospermatogonia through a 50number of distinct, potentially interrelated events that occur asynchronously over a period 51of several days, but this does not involve entry into meiosis (for a review see (Kocer et 52al., 2009) and (Spiller and Bowles, 2019)). Germ cells adopting the male fate up-regulate 53cell-cycle inhibitors such as *Cdkn2b* (Western et al., 2008) and are mitotically arrested 54from E12.5 onward (McLaren, 1984). They transiently activate the NODAL/CRIPTO 55signaling pathway (Souquet et al., 2012; Spiller et al., 2012a; Spiller et al., 2012b) and 56down-regulate pluripotency genes such as *Nanog, Sox2* and *Pou5f1* (Western et al.,

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572010). From E13.5 onward, they begin to express male-specific genes including Nanos 58homolog 2 (*Nanos2*) (Suzuki and Saga, 2008), *Dnmt3l* (La Salle et al., 2004) and *Piwil4* 59(Aravin et al., 2008) , which ensure normal male gametogenesis by regulating 60spermatogonial stem cell properties.

61Although the cellular origins of oogonia and spermatogonia are well documented, 62numerous open questions related to the molecular mechanisms underlying their 63differentiation and cell fate remain. For instance, the transcriptional programs mediating 64germ cell sex determination are incompletely understood, and the essential genes and 65transcriptional regulators orchestrating such specifications remain poorly defined. In 66developing ovaries, the factors regulating *Stra8* expression are still questioned, and in 67developing testes it is unclear how the different events mediating the commitment and 68differentiation of germ cells toward spermatogenesis are initiated and coordinated. 69Finally, our understanding of how the somatic environment, whether gonadal or extra-70gonadal, directs the transcriptional cascade mediating entry into meiosis and the 71commitment to oogenesis is still unclear.

72To date, most transcriptional analyses relevant for mouse or human germ cell sex 73determination have been conducted using traditional methods such as microarrays or bulk 74RNA-seq on either whole gonads or isolated germ cell populations at few selected time 75points (Gkountela et al., 2015; Guo et al., 2015; Houmard et al., 2009; Irie et al., 2015; 76Jameson et al., 2012; Lesch et al., 2013; Molyneaux et al., 2004; Rolland et al., 2008; 77Rolland et al., 2011; Small et al., 2005; Soh et al., 2015; Tang et al., 2015). These studies, 78although informative, provided only an average transcriptional summary, masking the 79inherent variability of individual cells and lineage types and thereby limiting their

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80capacity to reveal the precise dynamics of gene expression during germ cell sex 81determination.

82To determine the sequence of transcriptional events that is associated with germ cell 83commitment and differentiation toward oogenesis and spermatogenesis, we performed 84time-series single-cell RNA sequencing (scRNA-seq) on developing gonads. We 85recovered 14,750 germ cells from XX and XY gonads across five developmental time 86points from E10.5 to E16.5, encompassing the entire developmental process of gonadal 87sex determination and differentiation. We reconstructed the developmental trajectories of 88male and female germ cells, characterized the associated genetic programs, and predicted 89gene regulatory networks that regulate germ cell commitment and differentiation. In 90particular, we found (i) sex-specific, sequential waves of master regulator genes during 91germ cells differentiation, (ii) the meiotic initiator *Stra8* is regulated by positive and 92negative master regulators acting in an antagonistic fashion, (iii) mRNA transcription and 93mRNA splicing are often disconnected, either temporally or in a sex-specific manner, and 94(iv) ectopic XY adrenal germ cells enter into meiosis with delay together with significant 95alterations in ovarian-specific genes and upregulation of testis-specific genes.

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97Results

98**A single-cell transcriptional atlas of germ cells sex determination and differentiation** 99To generate a gene expression atlas of germ cells sex determination, we used droplet-100based 3' end scRNA-seq (10x Genomics Chromium) of XX and XY gonads from mouse 101embryos at five developmental stages (E10.5, E11.5, E12.5, E13.5, and E16.5) (**Fig. 1A**

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102and B). The selected time points cover the entire process of gonadal sex determination 103and span the emergence and differentiation of the major testicular and ovarian lineages 104including the gonocytes. For each of the 10 conditions, we generated two independent 105replicates from different pregnancies and sequenced an average of 10,000 cells. The 106transcriptomes of the individual cells were sequenced at the depth of ~150,000 reads/cell. 107Using ten well-established germ cell markers, namely *Ddx4*, *Dazl*, *Mael*, *Dppa3*, *Sycp3*, 108*Pecam*, *Pou5f1*, *Stra8*, *Dmrt1*, and *Dnmt1*, we identified 14,750 germ cells among a total 109of 92,267 cells (**Fig. S1A-C**) (see also **Supplementary information**). Among germ cells, 1108,248 were XX (55.9%) and 6,502 were XY (44.1%). It included 70 cells from E10.5, 111953 cells from E11.5, 4,365 cells from E12.5, 6,593 cells from E13.5 and 2,769 cells 112from E16.5. As expected, the median count of UMIs and median number of detected 113genes were higher in germ cells than in somatic cells with 22,584 versus 14,650 and 1145,536 and 4,502, respectively (**Fig. S1D**) (Soumillon et al., 2013).

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116**Cell lineage reconstruction identifies the dynamics of gene expression during XX** 117**and XY germ cell sex determination**

118UMAP projection of the 14,750 germ cells (**STAR Methods**) revealed that at early stages 119(E10.5 and E11.5), the transcriptomes of XX and XY cells globally overlapped, while 120cells from later stages formed two sex-specific branches (**Fig. 1C** and **D**). We then 121analyzed how the transcriptomes of XX and XY cells progress during the process of sex 122determination. To order cells along a pseudotime, we used ordinal regression modeling 123(Telley et al., 2018; Teo et al., 2010) using prior knowledge about the developmental 124stage of each cell capture (see **Fig. 1E**, **Fig. S1E**, **STAR Methods** and **Supplementary** bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 19 aCC-BY-NC-ND 4.0 International license.

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125**information**). We then represented the smoothed expression of the 3,013 top weighted 126genes (**Table S1**) in two distinct ordinal regression models trained on XY and XX cells 127with a double heatmap in which the center represents the earliest cells (pseudotime 0, 128E10.5 cells) and the extremities represent the lineage endpoints (pseudotime 100, E16.5) 129of XX germ cells (left) and XY germ cells (right), respectively (see **Supplementary** 130**information**). The heatmap revealed that XX and XY germ cells diverged as early as 131E12.5, exhibiting dynamic and sex-specific differentiation programs mediated by 132thousands of genes (**Fig. S2**). In addition, using 67 well-known genes involved in mouse 133germ cell pluripotency, sexual development and differentiation (Hill et al., 2018; Spiller 134and Bowles, 2019), we confirmed that our single-cell data accurately recapitulated male 135and female germ cell specification and was consistent with available literature (**Fig. 1F**).

137Reconstructing Gene Regulatory Networks mediating germ cell sex determination

138The identity and transcriptional state of a cell emerges from an underlying gene 139regulatory network (GRN or regulome) in which the activities of a small number of key 140transcription factors and co-factors regulate each other and their downstream target genes 141(Aibar et al., 2017). To comprehensively infer the GRNs at play during XX and XY germ 142cell sex determination, we applied the pySCENIC pipeline (Aibar et al., 2017) to our 143single-cell data. In brief, SCENIC links cis-regulatory sequence information together with 144scRNA-seq data. It first catalogs coexpression modules between transcription factors and 145candidate target genes and then identifies modules for which the regulator's binding 146motif is significantly enriched across target genes; it then creates regulons with only 147direct target genes. Finally, the activity of each regulon is attributed to each cell, using bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 22 aCC-BY-NC-ND 4.0 International license.

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148the AUCell method (Aibar et al., 2017). For germ cells, we identified 837 regulons (512 149positive and 325 negative regulons) containing 13,381 genes (**Table S2**). These genes 150 represented 62% of the total number of genes (21,553) detected in germ cells, indicating 151that our GRN analysis was comprehensive, covering the majority of the germ cell 152transcriptome. The size of each regulon varied from 2 to 2,625 genes, with a median size 153of 19 genes. To compare how XX and XY germ cells acquire their sex-specific identity, 154we selected the 394 positive regulons with AUCell-determined activity in more than 1551,000 cells (activity score >0) and classified them according to their expression pattern 156into 30 profiles or modules (M1 to M30) along pseudotime (Fig. 2). We represented the 157smoothed regulon expression level of XX and XY germ cells with a double heatmap, in 158 which the center represents the starting point of the lineage (pseudotime 0, E10.5) and the 159extremities represent the lineage endpoints (pseudotime 100, E16.5) of the XX germ cells 160(left) and the XY germ cells (right), respectively (Fig. 2). Strikingly, the expression 161patterns revealed numerous transient, sex-specific regulon profiles, mostly at late 162developmental stages (late E13.5 and E16.5). Initially, two modules common to both XX 163and XY gonocytes (M20 and M17) were observed at early developmental stages, which 164were superseded sequentially by a handful of transient and overlapping sex-specific 165regulon modules (M10, M16 and M29 in XX germ cells, and M12, M5 and M14 in XY 166germ cells). By late E13.5 and E16.5, we noted numerous oogonia-specific (M1, M30, 167M21, M28, M6, and M18) and spermatogonia-specific modules (M11, M24, M9, M22, 168M4, M3, M2 and M23).

169We also selected 303 negative regulons with AUCell-determined activity in more than 1701000 cells (activity score >0) and classified them according to their expression pattern

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171into 10 modules (M1 to M10) (**Fig. S3**). Negative regulons all displayed activity in 1720pposition to their repressing master regulator (data not shown) and most of them showed 173a pattern with high expression at early times points, and a progressive 174downregulation/repression over time (M6, M1, M7 and M2 containing 264 regulons). 175Among them, regulons of M1 and M7 could be distinguished by the onset of their sex-176specific repression: regulons from modules 1 and 7 started to be repressed at E16.5 and 177E13.5 in XY germ cells, respectively, while in XX germ cells this repression was 178observed at E13.5 and E16.5, respectively. We also detected 4 modules formed by 34 179regulons with sequential transient expression (M3, M4, M8 and M10). Among these, 180target genes belonging to regulons of module 3 were transiently repressed specifically in 181XY germ cells, in accordance with the male-specific expression of their 12 master 182regulators (data not shown).

183Overall, we identified 697 regulons whose activities were grouped under 40 modules 184based on their sex-specific and temporal expression. The transient, sequential, and often 185sex-specific profiles likely represent a sequential/hierarchical organization of regulatory 186modules required for oogonia and spermatogonia differentiation.

187

188**Sex-specific, sequential waves of cell cycle gene expression during germ cells** 189**differentiation**

190Following PGC colonization of the gonad around E10.5, XX and XY gonocytes undergo 191rapid mitotic proliferation while maintaining pluripotency (McLaren, 2003; Surani et al., 1922007). How germ cells exit the rapid proliferative phase and enter into mitotic arrest in 193testes, or meiosis in ovaries, remains poorly understood. Our scRNA-seq analysis

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194allowed us to comprehensively evaluate the expression of multiple key genes involved in 195the pluripotency and proliferation of germ cells during their sex-specific differentiation. 196We observed dynamic regulation and a strong sexual dimorphism among mitotic genes 197between XX and XY germ cells (Fig. 3 and Fig. S4). As expected, we observed in both 198XX and XY gonocytes around E11.5 a downregulation of transcription factors mediating 199pluripotency such as Nanoq, Pou5f1 (Oct4) as well as other pluripotency-associated 200genes, including *Dppa2* and *Dppa4* (Maldonado-Saldivia et al., 2007; Pesce and Scholer, 2012001; Surani et al., 2007; Western et al., 2005). The profile was similar for genes 202regulating G1-S phase, including the genes encoding Cyclin A2, B1, D3 (*Ccna2, Ccnb1*, 203*Ccnd3*) as well as E2F transcription factor genes *E2f1*, *E2f2*, *E2f3*, *E2f7*, and *E2f8*. In XY 204germ cells, consistent with mitotic arrest in G0 between E12.5 and E14.5, we observed an 205 μ pregulation of cell-cycle inhibitors essential in the control of G1/G0 arrest, including 206Cdkn1b ($p27^{Kip1}$) and Cdkn2b ($p15^{INK4b}$) around E13.5, followed by Cdkn1c ($p57^{Kip2}$), 207*Cdkn2a* (*p*16^{*INK4a*}) and *Cdkn2c* (*p*18^{*INK4c*}) at E16.5. These results confirmed and extended 208previous studies (Western et al., 2008).

209In XX germ cells, we observed sequential waves of sex-specific upregulation of cell-210cycle genes including genes encoding Cyclin H, B2 and G1 (*Ccnh*, *Ccnb2*, *Ccng1*) and 211the cell cycle inhibitor *Cdkn1a* ($p21^{Cip1}$) around E12.5, cyclins C, E1, E2, D1 (*Ccnc*, 212*Ccne1*, *Ccnde2*, *Ccnd1*), E2F transcription factor genes *E2f1*, *E2f2*, and the cell cycle 213inhibitor genes *Cdkn2a* ($p16^{INK4a}$), *Cdkn2c* ($p18^{INK4c}$), *Cdkn2d* ($p19^{INK4d}$) around E13.5, as 214well as genes encoding Cyclins B3, C, O, J (*Ccnb3*, *Ccnc*, *Ccno*, *Ccnj*), and E2F 215transcription factor genes *E2f4*, *E2f5* at E16.5. Overall, our scRNA-seq analysis

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216accurately revealed the complex and sex-specific expression of cell cycle regulators when 217germ cells exit the proliferative phase and either arrest mitotically or enter meiosis.

218

219Predicting regulatory factors promoting meiosis and *Stra8* expression

220Numerous studies have attempted to identify factors regulating the expression of *Stra8* 221(Stimulated by Retinoic Acid 8 gene), which triggers the DNA duplication step that 222precedes meiosis, thus engaging the meiotic program in germ cells (Baltus et al., 2006). 223Retinoic acid (RA) has been proposed as a meiosis initiating substance (Bowles et al., 2242006; Koubova et al., 2006) as it induces *Stra8* mRNA accumulation in RA-treated P19 225pluripotent cell lines (Oulad-Abdelghani et al., 1996), but recent lines of evidence 226 indicated that RA signaling is actually dispensable for entry into meiosis, but instead 227stabilizes *Stra8* expression (Kumar et al., 2011; Vernet et al., 2019). To acquire a better 228understanding of the signals instructing oogonia to transition from mitosis to meiosis, we 229took advantage of our GRN analysis and investigated the positive and negative regulons 230predicted to control the expression of *Stra8* and *Rec8*, a gene that encodes a component 2310f the cohesin complex accumulating during the meiotic S-phase. Consistent with the 232literature, *Stra8* and *Rec8* were transiently upregulated in XX germ cells between E12.5 233and E16.5, coinciding with the entry into meiosis (Fig. 2B and 4B). GRN analysis 234 revealed that both Stra8 and Rec8 expressions were predicted to be regulated by a 235combination of positive and negative master regulators (Fig. 4A, B and Fig. S5). In 236particular, *Stra8* was predicted to be negatively regulated by the mitotic cohesin RAD21 237and the Y-box binding protein YBX1. Both factors were downregulated specifically in 238developing XX germ cells, while expression was maintained in XY germ cells (Fig. 4B). bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 34 aCC-BY-NC-ND 4.0 International license.

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239In parallel, the histone demethylase KDM5A (Jumonji/JARID1) and the transcription 240factor PBX3, both preferentially expressed in XX over XY germ cells (Fig. 4B), were 241predicted to be key positive regulators of *Stra8* (Ge et al., 2018). KDM5A is also a positive 242 regulator of *Ythdc2*, a gene encoding an RNA helicase that acts as critical regulator of the 243transition from mitosis to meiosis in both male and female germlines (Bailey et al., 2017; 244Gonczy et al., 1997). *Rec8* expression was predicted to also be negatively regulated by 245RAD21 and YBX1, but positively regulated, among others, by KDM5A and MSX1 and 246MSX2, two nuclear receptors known to promote meiosis initiation by maintaining or 247enhancing Stra8 expression (Le Bouffant et al., 2011). EZH2, a member of the polycomb 248 repressive complex 2 (PRC2) (Margueron and Reinberg, 2011), also appeared as a 249positive regulator of Rec8 expression that could act in concert with KDM5A to allow 250control of chromatin opening and the correct timing of the mitosis-to-meiosis transition. 251Overall, applying single-cell regulatory network inference to germ cell sex determination 252 leads to the prediction of new critical regulators of meiosis as well as Stra8 and Rec8 253expression.

254

255Variable rates of mRNA splicing in male and female germ cells

256mRNA splicing represents another powerful mechanism to modulate gene expression and 257is known to contribute to the fine-tuning of cell differentiation programs (Kalsotra and 258Cooper, 2011). To investigate splicing dynamics, we applied RNA velocity analysis to 259the developing mouse germ cells to estimate the rates of nascent (unspliced) and mature 260(spliced) transcripts during germ cell differentiation and evaluated whether there were 261gene- or sex-specific differences in transcriptome kinetics. Velocity analysis considers

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262both spliced and unspliced mRNA counts to predict developmental trajectories and speed 263of cell state transitions (La Manno et al., 2018). Consistent with our previous analyses, 264we observed strong directional flow toward the most differentiated germ cells, both in the 265XX and XY branches (**Fig. S6**). We then ordered the cells according to our ordinal 266regression model and examined the temporal progression of RNA biogenesis of XX and 267XY germ cells during the process of sex determination. As expected, unspliced mRNAs 268consistently preceded spliced mRNAs (**Fig. 5**). We also observed variation in 269transcriptomic kinetics. For example, among the meiotic-related genes, *Rec8* and *Stra8* 270exhibited fast kinetics with little differences between unspliced and spliced mRNAs 271whereas genes such as *Hormad2*, *Msh5*, *Tex11*, and *Spo11* exhibited increasing delays in 272spliced transcripts (**Fig. 5A**).

273We also investigated the rates of mature and immature transcripts of some of the genes 274previously described as regulators of *Stra8* and *Rec8* expression (**Fig. 5B**) or as being 275involved in mitosis (**Fig. 5C**). In several cases, we observed a significant disconnection 276between transcription (i.e. the presence of unspliced mRNA) and the presence of mature 277(spliced) mRNAs. For example, this was the case for the aforementioned RNA helicase 278gene *Ythdc2*. *Ythdc2* exhibited increasing levels of unspliced transcripts in both XX and 279XY cells (dotted lines in **Fig. 5B**, top panel) along pseudotime, but spliced mRNAs were 280present only in XX germ cells (solid lines in **Fig. 5B**, top panel), suggesting male-specific 281intronic retention or degradation of *Ythdc2* mRNAs. The Cyclin gene *Ccnb3* also 282revealed sex-specific differences in gene splicing (**Fig. 5C**, fourth panel). While a 283transient sequential increase of unspliced and spliced mRNAs was observed in XX germ 284cells around E16.5, only unspliced mRNAs were observed in XY germ cells at late

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285E16.5. A similar pattern was observed for Cyclin *Ccnd3* (**Fig. 5C**, bottom panel). Overall, 286we observed gene-specific or sex-specific putative intronic retention in numerous genes, 287emphasizing once more the importance of post-transcriptional regulation in male and 288female germ cell lineages.

289

290Ectopic adrenal germ cells also enters into meiosis, but numerous major 291transcriptional regulators of oocyte differentiation are absent or downregulated

292While the majority of PGCs migrate toward the gonadal ridges, a small fraction of germ 293cells are lost along the way and end up in extragonadal organs such as the nearby adrenal 294glands and mesonephroi (Heeren et al., 2016; Upadhyay and Zamboni, 1982; Zamboni 295and Upadhyay, 1983). These adrenal germ cells, irrespective of their genetic sex, have 296been reported to undergo meiosis, differentiate into oocytes and display morphological 297characteristics identical to those of young oocytes in primordial follicles before 298disappearing around 3 weeks of age (Upadhyay and Zamboni, 1982; Zamboni and 299Upadhyay, 1983). To evaluate how an extragonadal somatic environment affects germ 300cell fate, we investigated at the transcriptional level how ectopic adrenal germ cells enter 301into meiosis and commit toward the female fate.

302Time-series 3' single-cell RNA sequencing of developing mouse adrenal cells from 303E12.5, E13.5, E16.5, and E18.5 XY embryos identified 312 adrenal germ cells based on 304the expression of the classical germ cell markers *Dazl*, *Ddx4* and *Mael* (see **STAR** 305**methods**). Overall, we captured 187 adrenal germ cells at E12.5, 92 cells at E13.5, 18 306cells at E16.5, and 15 cells at E18.5. The relatively low number of germ cells at later 307stages may reflect the smaller proportion of germ cells in the growing adrenal glands.

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308UMAP representation of these 312 XY adrenal germ cells combined with 14,718 gonadal 309germ cells revealed that the transcriptome of XY adrenal germ cells partially overlapped 310 with the transcriptome of XX ovarian germ cells, suggesting that their transcriptomes are 311similar and that XY adrenal germ cells enter into meiosis and differentiate into oocytes in 312synchrony with gonadal oocytes (Fig. 6A). However, a more refined analysis 313investigating the expression of selected key marker genes mediating germ cell 314specification revealed a more complex picture. First, meiosis-related genes, including 315Stra8, Sycp1, Sync3, Spo11, Ccdc155, Dmc1, Mei1, Mei4, Meioc, Hormad1, Hormad2, 316*Msh5*, *Tex11*, *Prdm9* and *Smc1b* displayed similar profiles and expression levels between 317XY adrenal germ cells and XX ovarian germ cells (Fig. 6B and Fig. S7). Only a slight 318temporal delay was observed in adrenal germ cells. One notable exception was *Rec8*, 319whose expression was blunted in adrenal compared to ovarian germ cells (**Fig. S7**). These 320results confirmed published data that meiosis is not significantly affected in ectopic 321adrenal germ cells (Upadhyay and Zamboni, 1982; Zamboni and Upadhyay, 1983). 322While several genes and master regulators of oogonia differentiation were unaffected 323(e.g. cyclins *Ccnb3*, *Ccne2*; *Pparq*; the histone demethylases *Kdm5a* and *Phf8*; *Brca2*) 324(**Fig. S7**), we found numerous key female genes exhibiting either downregulation or a 325testis-like profile. It included, for example, genes involved in the WNT- β -catenin 326pathway (Axin2, Lef1, and Sp5), the transcription factor genes Msx1 and Msx2, the cell 327 cycle gene *E2f1*, and the oocyte-specific basic helix-loop-helix transcription factor gene 328Figla (Fig. 6B and Fig. S7). Finally, we found that most genes and master regulators 329involved in male germ cell fate were not upregulated in adrenal germ cells with few 330notable exceptions including the male fate marker *Nanos2*, the NODAL target genes bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 46 aCC-BY-NC-ND 4.0 International license.

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331*Lefty1* and *Lefty2*, the retinoic receptor gene *Rara*, the male germ cell regulator gene 332*Ctcfl* and the spermatogonial stem cell self-renewal gene *Lhx1* (**Fig. 6B** and **Fig. S7**). 333Overall, these results indicated that ectopic adrenal germ cells enter into meiosis at 334around the same time as ovarian germ cells, but numerous genes and master regulators 335related to both the female and male genetic programs were misregulated.

336

337 Discussion

338This study represents the first large-scale scRNA-seq analysis of germ cells throughout 339the gonadal sex determination and differentiation process. The large number of individual 340germ cells profiled, both XX and XY, allowed us to reconstruct a continuous 341representation of changes in gene expression occurring during the process of gonadal 342differentiation, including the mitosis-to-meiosis switch in germ cells in developing 343ovaries, and spermatogonial commitment and differentiation in fetal testes. This 344represents a major advance beyond previous work and has broad implications for studies 345in germ cell development, sex determination and the etiology of human germ cell 346diseases.

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348How do germ cells commit to and acquire sex-specific fates during differentiation of the 349gonad into a testis or an ovary? Our experimental design based on scRNA sequencing to 350profile five developmental stages encompassing gonadal sex differentiation is well suited 351to tracing gene regulatory programs in which specific combinations of transcription 352factors drive sex- and cell type-specific transcriptomes in germ cells. Through 353computational analyses, we have comprehensively constructed the GRNs for XX and XY

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354germ cells during the process of sex differentiation. We found that the gene regulatory 355circuitry mediating germ cell sex determination is composed of 512 positive regulons that 356can be grouped into 30 modules, each of them exhibiting transient, sequential and often 357sex-specific profiles. The fact that regulons are grouped into modules that display 358transient sex-specific profiles suggests a sequential organization of regulatory modules 359that work together to fine-tune the interrelated cellular events that lead to XX and XY 360germ cell differentiation. The master regulator genes present in each specific module may 361not be controlling a single cellular event, but instead a combination of overlapping sex-362specific developmental processes including mitotic arrest, suppression of pluripotency 363genes, prospermatogonia commitment and *de novo* methylation for XY germ cells, as 364well as entry into meiosis, and suppression of pluripotency genes for XX germ cells.

365This regulome analysis also provides an opportunity to identify new critical master 366regulators of germ cell sex determination. While various master regulators have already 367been implicated in playing a key role in pluripotency and germ cell sex-specific 368commitment and differentiation, such as *Dazl, Pou5f1, Dmc1, Rec8, Stra8, Nodal,* 369*Nanos2,* and *Dnmt3l,* our analysis predicted more than 800 positive and negative regulons 370(**Fig. 2, Fig. S3** and **Table S2**), including a large set of new potentially critical regulators 371of germ cell commitment and differentiation, for example KDM5A, KDM5B, NR3C1 372and PHF8. While most of these remain predictions, they provide an important framework 373and guide for future experimental investigation.

374Identifying the molecules controlling the fundamental decision of germ cells to exit the 375cell cycle and enter meiosis represents a major challenge for the reproductive medicine 376community. An example of the usefulness of such a regulome is provided by the bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 52 aCC-BY-NC-ND 4.0 International license.

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377prediction of new factors positively and negatively regulating *Stra8* expression. STRA8 378 the only gatekeeper described to date that engages the meiotic program in developing 379female germ cells (Baltus et al., 2006). The onset of *Stra8* expression in germ cells of the 380developing ovary and its lack of expression in germ cells of the developing testis led to a 381search for the presence of the female "meiosis-initiating substance" (MIS) or male 382"meiosis-preventing substance" (MPS) (Kocer et al., 2009; McLaren and Southee, 1997). 383While RA has emerged as a potential MIS (Bowles et al., 2006; Koubova et al., 2006), 384 recent reports revealed that female germ cells enter meiosis normally even in the absence 385of RA signaling (Kumar et al., 2011; Vernet et al., 2019). Our regulome analysis 386 revealed that the expression of both *Stra8* and *Rec8* is regulated by a combination of 387positive and negative master regulators. Among them, two factors, RAD21 and YBX1, 388are predicted to act as negative regulators of both *Stra8* and *Rec8* expression. *Rad21* and 389*Ybx1* genes are initially expressed in both developing ovary and testis but are specifically 390downregulated in developing ovaries at the time of entry into meiosis. Among the 391positive regulators, we found the transcription factor PBX3 and KDM5A, a histone 392demethylase, transiently expressed in XX germ cells around E13.5 when *Stra8* is 393upregulated. KDM5A has recently been shown to regulate temperature-dependent sex 394determination in red-eared slider turtle by promoting the transcription of the male sex-395determining gene *Dmrt1* (Ge et al., 2018). Interestingly, KDM5A also acts as a negative 396 regulator for the expression of *Rad21* and *Ybx1*, suggesting mutual antagonism between 397the male RAD21/YBX1 factors and KDM5A/PBX3 female factors in regulating Stra8 398expression and the entry into meiosis.

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399Another relevant master regulator is the nuclear receptor MSX2, a member of the Msh 400homeobox gene family composed of three members (*Msx1, 2* and 3). MSX1 and MSX2 401function cooperatively to control the regulation of primordial germ cell migration (Sun et 402al., 2016) and later in XX germ cells to promote meiosis initiation by maintaining or 403enhancing Stra8 expression (Le Bouffant et al., 2011). We found that Msx2 regulon 404activity as well as *Msx1* and *Msx2* gene expression are present in module 16, consistent 405with their dual function (**Fig. 2** and **Fig. 4B**). *Msx2* is expressed in both XX and XY 406PGCs by E10.5 and E11.5 and then is rapidly downregulated in XY germ cells. In 407contrast, *Msx1* is specifically upregulated in XX germ cells from E11.5 onward with a 408peak around E13.5 (**Fig. 4B**). We found 66 predicted target genes regulated positively by 409the master regulator MSX2. Among these genes, we found for example *Msx1, Rec8,* 410*Dlx3, Lef1, Sp5, Axin2, E2f1, Notch1* (**Table S2**).

411As alluded above, two histone demethylases KDM5A (also called Jarid1A, RBP2) and 412KDM5B (also called Jmjd3, Jarid1B or RBP2-H1) have been identified as master 413regulators specifically expressed in E13.5 XX germ cells (**Fig. 2** and **Fig. 4B**). KDM5A 414and KDM5B are histone demethylases that specifically demethylate H3K4me2/me3 and 415H3K27me3, respectively. Both histone demethylases are involved in epigenetic 416regulation of transcription and are essential for embryonic development (Christensen et 417al., 2007; Dahl et al., 2016; Klose et al., 2007). We found that both *Kdm5a* and *Kdm5b* 418genes are transiently expressed in XX germ cells around E13.5 in modules 13 and 14, 419respectively (**Fig. 2** and **Fig. 4B**). In male rat, KDM5A has been shown to be also 420expressed in quiescent gonocytes, mitotic gonocytes and spermatogonia at 6 dpp, and in 421spermatocytes at 12, 15 and 18 dpp (Nishio et al., 2014). We identified more than 2625 bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 58 aCC-BY-NC-ND 4.0 International license.

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422and 1116 predicted positive target genes for KDM5A and KDM5B in germ cells 423including *Ctnnb1* (beta catenin 1), DEAD-Box Helicases *Ddx4* and *Ddx6*, the Retinoic 424Acid Receptor alpha (*Rara*) and the Lysine Demethylase *Kdm2a*, *Kdm2b* and *Kdm3a*, the 425RNA binding protein *Dazl* and the Mitogen-Activated Protein Kinase Kinase Kinase 4 426*Map3k4* (**Table S2**). The biological functions of KDM5A and KDM5B, particularly in 427the context of XX germ cell meiosis regulation and oocyte differentiation remains poorly 428characterized.

429

430**Splicing kinetics and intron retention as post-transcriptional regulation in** 431**developing germ cells**

432Cellular RNAs are regulated at multiple stages, including transcription, RNA maturation, 433and degradation. To study posttranscriptional regulation, and more precisely RNA 434processing, during the process of germ cell sex determination we evaluated the 435abundance of nascent (unspliced) and mature (spliced) mRNAs in the 14,750 XX and XY 436germ cells. We exploited the fact that 23% of reads contained unspliced intronic 437sequences when performing single-cell RNA-seq based on the 10x Genomics Chromium 438protocols (La Manno et al., 2018). Although these splicing events are usually located at 439the very 3' end of mRNA transcripts due to the oligo-dT-based protocol, the RNA 440velocity analysis approach can be used to directly estimate unspliced and spliced mRNAs 441present in single cells (La Manno et al., 2018).

442We found a large variation in splicing kinetics. When analyzing, for example, meiosis-443related genes we identified genes with rapid splicing (e.g. *Stra8*, *Rec8*) as well as genes 444with variable delays in splicing (e.g. *Hormad2*, *Sycp1*, *Spo11*, *Tex11*). This suggested that

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445splicing retention is another layer of post-transcriptional regulation in developing germ 446cells, ensuring precise temporal expression of meiotic and differentiation genes. In 447addition, we identified genes with sex-specific intronic retention/degradation patterns. 448One example is the RNA helicase YTHDC2, a critical regulator of the transition from 449mitosis to meiosis in both male and female germline (Bailey et al., 2017; Gonczy et al., 4501997). YTHDC2, through post-transcriptional control of RNA, both down-regulates the 451mitotic program and facilitates the proper expression of meiotic and differentiation genes. 452*Ythdc2* mutant male and female mice are infertile and mutant germ cells show defects 453soon after the mitosis to meiosis transition (Bailey et al., 2017). Consistent with its role in 454ensuring a transition from mitosis to meiosis, *Ythdc2* expression profile displayed a 455female-specific upregulation between E13.5-E16.5. However, RNA velocity analysis 456 revealed the presence of unspliced *Ythdc2* mRNAs in both XX and XY germ cells, 457suggesting that in XY germ cells these unspliced mRNAs remain immature or are 458degraded in a sex-specific manner. Two other examples are provided by the Cyclins 459Ccnb3 and Ccnd3, which both displayed increasing levels of unspliced mRNAs in XY 460germ cells without the presence of mature mRNAs. Intron retention has been shown to be 461a prominent feature of the meiotic transcriptome of mouse spermatocytes (Naro et al., 4622017). It can either favor accumulation, storage, and timely usage of specific transcripts 463during highly organized cell differentiation programs or cause transcript instability at 464specific developmental transitions (Edwards et al., 2016; Naro et al., 2017; Pimentel et 465al., 2016; Wong et al., 2013; Yap et al., 2012). The temporal or sex-specific variation in 466intronic retention appears to be surprisingly frequent during the process of germ cell sex 467determination and may ensure proper and timely expression of selected transcripts.

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469**Comparing adrenal and gonadal germ cells development provides a tool to** 470**investigate the importance of the somatic environment in the process of oogenesis**

471By comparing the transcriptome of adrenal and gonadal germ cells, we have been able to 472investigate how germ cells respond to three different somatic environments: the adrenal, 473ovarian and testicular environments. It allowed us to also investigate whether the gene 474 regulatory circuitries mediating germ cell sex determination, composed of 837 regulons, 475are interconnected or act independently. The dynamic expression pattern of key marker 476genes of meiosis is strikingly similar in both adrenal and ovarian germ cells with a slight 477delay in adrenal germ cells. It suggests that the initiation and maintenance of meiosis 478proceeds relatively normally in adrenal germ cells. However, we also observed a 479significant alteration in the expression of some key female master regulator genes as well 480as upregulation of male master regulator genes, indicating that the somatic environment 481in the adrenal gland cannot completely support a female fate for these gonocytes. In 482particular, we observed a lack of upregulation of genes involved in the canonical 483WNT/ β -catenin signaling pathway (Axin2, Lef1, and Sp5), suggesting that germ cells in 484this environment are unable to respond to WNT signals, or to express their receptors. 485This may also explain the slight delay in adrenal meiosis progression (Chassot et al., 4862011; Chassot et al., 2008; Naillat et al., 2010). Other master regulator genes such as the 487transcription factor genes *Msx1* and *Msx2*, *Cdx2* and the oocyte-specific basic helix-loop-488helix transcription factor gene *Figla* also displayed significant alteration. Interestingly, 489the absence of Msx1 and Msx2 expression may explain why Rec8 expression, but not 490other meiotic genes such as *Stra8*, is blunted in adrenal germ cells (Fig. S7). Based on bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 67 aCC-BY-NC-ND 4.0 International license.

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491our GRN analysis, we found that both MSX1 and MSX2 are strong positive regulators of 492*Rec8* expression (**Fig. 4A**). Concerning male-specific master regulators, the large 493majority of them are not expressed in XY adrenal germ cells but with few notable 494exceptions including *Nanos2*, *Lefty1*, *Lefty2*, *Rara*, *Ctcfl*, *Lhx1*. Overall, the adrenal 495environment does not provide all the necessary signal(s) required to commit germ cells to 496oogenesis, resulting in adrenal germ cells characterized by an altered identity and delayed 497meiosis.

498

499Compiling single cell transcriptomes from mouse germ cells at five developmental stages 500during the process of sex determination, both in gonadal and extragonadal tissues, 501allowed us to provide a comprehensive insight into the sex-specific genetic programs and 502gene regulatory networks that regulate germ cell commitment toward a male or female 503fate. As such, we have created a valuable and rich resource for the broad biology 504community that should provide insights into how this fundamental decision impacts the 505etiology of infertility and human gonadal germ cell tumours, two of the main clinical 506consequences of defects in germ cell sex determination.

507

508Acknowledgments:

509This work was supported by grants from the Swiss National Science Foundation (grants 51031003A_173070 and 51PHI0-141994) and by the Département de l'Instruction Publique 5110f the State of Geneva (to S.N.). We thank Luciana Romano and Deborah Penet for the 512sequencing, Cécile Gameiro and Gregory Schneiter (Flow Cytometry Facility, University 5130f Geneva), the team of the Animal Facility (Faculty of Medicine, University of Geneva),

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514Julien Prados (Basic Neuroscience, University of Geneva) for his help for pseudotime 515computation and Valentin Durand Graphic Design for help with artwork. We thank also 516Andy Greenfield, the members of the Nef and Dermitzakis laboratories for helpful 517discussion and critical reading of the manuscript.

518Author Contributions

519Conceptualization, S.N.; data generation and investigation, C.M., Y.N., P.S., A.A.C., I.S. 520and F.K.; Formal Analysis and Data Curation, C.M and P.S.; Writing – Original Draft, 521S.N., C.M., and M.-C.C.; Funding Acquisition, S.N., and E.T.D.; Resources, S.N., and 522E.T.D.; Supervision, S.N., and E.T.D.

523 Declaration of Interests

524The authors declare no competing interests

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526STAR Methods:

527**KEY RESOURCES TABLE**

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REAGENT or RESOURCE	SOURCE	IDENTIFIER
Chemicals, Peptides, and Recon	nbinant Proteins	•
Trypsin-EDTA (0.05%), phenol red	Thermo Fisher Scientific	25300054
DPBS, no calcium, no magnesium	Thermo Fisher Scientific	14190144
Fetal bovine serum	Thermo Fisher Scientific	26140087
Draq7™ #B25595	Beckman Coulter	B25595
Critical Commercial Assays	-	-
Papain dissociation system	Worthington	LK003150
Chromium™ i7 Multiplex Kit	10x Genomics	120262
Chromium [™] Single Cell 3' Library & Gel Bead Kit v2	10x Genomics	120237
Chromium™ Single Cell A Chip Kit	10x Genomics	1000009
Qubit dsDNA High Sensitivity	Life Technologies	Q32854
Agilent High Sensitivity DNA Kit Reagents	Agilent	5067-4626
Deposited Data	•	-
Raw data, normalized counts	GEO	GSE136220
Scripts for analysis	GitHub	Available soon
Experimental Models: Organism	ns/Strains	•
Mus musculus: CD-1	Charles River	Strain code 022
Mus musculus: CD-1-Tg(<i>Nr5a1</i> GFP)	(Stallings, 2002)	N/A
Oligonucleotides		
Primers for sex genotyping	(McFarlane et al., 2013)	N/A
Software and Algorithms	· · · · ·	
CellRanger (version 2.3)	10X	www.10xgenomics.com
Python (version 3.6)	Python	Pyth
R (version version 3.6.1)	R-Project	https://www.R-project.org/
Seurat (Version 2.3.0)	Stuart et al, 2018	
heatmaps (version 1.8.0)	Bioconductor	https://bioconductor.org/packag release/bioc/html/heatmaps.html
pheatmap (version 1.0.12)	Bioconductor	https://github.com/raivokolde/ph map
Bmrm (version 4.1)	(Teo et al., 2010)	
ggplot2 (version 3.2.0)	(Wickham, 2009)	https://ggplot2.tidyverse.org
scanpy (version 1.4.4)	(Wolf et al, 2018)	https://github.com/theislab/scanp
scvelo (version 0.1.19)		https://github.com/theislab/scvelo
matplotlib (version 3.0.3)		
pyscenic (version 0.9.14)	(Aibar et al., 2017)	
bbknn (version 1.3.5)	(Park et al, 2018)	https://github.com/Teichlab/bbkr
velocyto (version 0.17.8)	(La Manno et al 2018)	http://velocyto.org/

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530Contact for Reagent and Resource Sharing

531Further information and requests for resources and reagents should be directed to and will

532be fulfilled by the Lead Contact, Serge Nef (<u>serge.nef@unige.ch</u>).

533

534Experimental Model Details

535**Transgenic Mice**

536All animal work was conducted according to the ethical guidelines of the Direction 537Générale de la Santé of the Canton de Genève (experimentation ID GE/57/18). 538*Tg*(*Nr5a1-GFP*) mouse strain was described previously (Stallings et al., 2002) and has 539been maintained on a CD1 genetic background.

540

541 Method Details

542Mouse urogenital ridges, testes, ovaries and adrenal glands collection

543CD-1 female mice were bred with heterozygous Tg(Nr5a1-GFP) transgenic male mice. 544Adult females were time-mated and checked for the presence of vaginal plugs the next 545morning (E0.5). E10.5 (8±2 tail somites (ts)), E11.5 (19±4 ts), E12.5, E13.5, E16.5 and 546E18.5 embryos were collected and the presence of the *Nr5a1*-GFP transgene was 547assessed under UV light. Sexing of E10.5 and E11.5 embryos was performed by PCR 548with a modified protocol from (McFarlane et al., 2013). Urogenital ridges from each sex, 549XY adrenal glands, testes or ovaries were pooled for tissue dissociation.

550

551Single cell suspension and library preparations

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552Urogenital ridges and adrenal glands were enzymatically dissociated at 37°C for 20 and 55340 minutes, respectively, using the Papain dissociation system (Worthington 554#LK003150). Cells were resuspended in DMEM 2%FBS, filtered through a 70 µm cell 555strainer and stained with the dead cell marker Draq7[™] (Beckman Coulter, #B25595). 556Viable single cells were collected on a BD FACS Aria II by excluding debris (side scatter 557vs. forward scatter), dead cells (side scatter vs. Draq7 staining), and doublets (height vs. 558width). Testes and ovaries (from E12.5 to E16.5) were enzymatically dissociated at 37°C 559during 15 minutes in Trypsin-EDTA 0.05% (Gibco #25300054), resuspended in DMEM 5602%FBS and filtered through a 70 µm cell strainer. After counting, 3000 to 7000 single 561cells were loaded on a 10x Chromium instrument (10x Genomics). Single-cell RNA-Seq 562libraries were prepared using the Chromium Single Cell 3′ v2 Reagent Kit (10x 563Genomics) according to manufacturer's protocol. Each condition (organ, sex and 564developmental stage) was performed in two biological independent replicates.

565

566Sequencing

567Library quantification was performed using the Qubit fluorometric assay with dsDNA HS 568Assay Kit (Invitrogen). Library quality assessment was performed using a Bioanalyzer 569Agilent 2100 with a High Sensitivity DNA chip (Agilent Genomics). Libraries were 570diluted, pooled and sequenced on an Illumina HiSeq4000 using paired-end 26 + 98 bp as 571the sequencing mode. Libraries were sequenced at a targeted depth of 100 000 to 150 000 572total reads per cell. Sequencing was performed at the Health 2030 Genome Center, 573Geneva.

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575Bioinformatic Analysis

576Data processing with the Cell Ranger package, cell selection and in-house quality 577controls

578Computations were performed at the Vital-IT Center for high-performance computing of 579the SIB (Swiss Institute of Bioinformatics) (<u>http://www.vital-it.ch</u>). Demultiplexing, 580alignment, barcode filtering and UMI counting were performed with the Cell Ranger v2.1 581pipeline (10x Genomics). Algorithms and versions used are listed in the key resources 582table. Data were mapped to the mouse reference genome GRCm38.p5 in which the eGFP 583(NC_011521.1) combined with the bovine GH 3'-splice/polyadenylation signals 584(Stallings et al., 2002) (NM 180996.1) sequences have been added.

585Cell-associated barcode selection and quality checks were performed with in-house tools. 586(see **Supplementary information** for details)

587

588Gene expression normalization

589UMI counts per gene and per cell were divided by the total UMI detected in the cell, 590multiplied by a scale factor of 10,000 and log transformed.

591

592Germ cells selection

593After barcode filtering based on the unique molecular identifiers (UMI) distribution, we 594obtained 92,267 cells. It included 14,904 cells from E10.5, 16,581 cells from E11.5, 59519,551 cells from E12.5, 25,012 cells from E13.5, and 16,219 cells from E16.5. Among 596the 52,463 XY cells and the 39,804 XX cells, the median number of UMIs was 17,493 597and 17,655 and the median number of detected genes was 4,802 and 4,658, respectively.

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598To determine which one were germ cells, we selected all genes detected in more than 50 599cells, and performed ICA on log normalized values. To assess for batch effect, we built a 600nearest neighbor graph using BBKNN function (BBKNN package). Clustering was 601performed using Scanpy Louvain method with resolution 1 and UMAP were generated 602using Scanpy UMAP method with default parameters. We selected clusters with a strong 603expression of 10 well-known germ cells markers (see **Supplementary table S3** and 604**Supplementary information** for details).

605

606Pseudotime ordering of the cells

607To order the cells along a pseudotime, we took advantage of the discrete prior knowledge 608we have about the embryonic day at which each cell were harvested and generated an 609ordinal regression model (adapted from (Teo et al., 2010)) to obtain a continuous 610pseudotime score reflecting the differentiation status of the cells (see **Supplementary** 611**information** for details).

612

613Gene regulatory network generation

614GRN analysis was generated using pyScenic package (see **Supplementary information** 615for details).

616

617 Regulons hierarchical clustering

618Regulons were clustered using ward.d hierarchical clustering on the AUC matrix with 619Spearman correlation distance. Modulons were determined using cutree with k=10 for 620negative regulons and k=30 for positive regulons.

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622Heatmaps and expression curves

623Heatmaps were generated using R (packages pheatmap and heatmaps). Expression curves

624were generated using ggplot2 (see Supplementary information for details).

625

626Network visualization

627Network views and layouts were generated with Cytoscape V3.7.1.

628

629Velocity analysis

630To generate spliced and unspliced counts data, the velocyto.py script from velocyto 631package was called on each bam file with aforementioned reference genome annotation 632(see **Supplementary information** for details).

633

634Ectopic adrenal germ cells analysis

635The analysis was performed using aforementioned steps: log normalization, ICA, 636neighbor graph, and clustering with the same parameters. Germ cell clusters were 637selected with the same 10 germ cell marker genes (see **Supplementary information** for 638details). For pseudotime ordering of the cells, a model was trained on gonadal cells only 639and the pseudotime for adrenal germ cells was predicted from it.

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641 Data and source code availability

642Germ cells single-cell RNA-seq data is available on GEO (accession number 643GSE136220). Both adrenal and gonadal gene expression data are included in 644ReproGenomics Viewer (Darde et al., 2019; Darde et al., 2015).

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110

845Figure legends

846Figure 1. Generation of the germ cell sex determination atlas. (A) Schematic 847representation of developing testis and ovary highlighting the major events of male and 848female germ cell differentiation as well as the time points used in the study. (B) 849Illustration of the experimental workflow using the 10x Genomics Chromium platform. 850UMAP Projection of 14,750 germ cells colored by time (C), sex (D) and computed 851pseudotime going from 0 (E10.5 cells) to 100 (E16.5 cells) (E). (F) Heatmap of 67 well 852known genes involved in germ cell differentiation. Cells were ordered using a pseudotime 853score generated with ordinal regression modeling, expression was smoothed to reduce 854dropout effect and obtain a better visualization of expression tendencies (expression 855scale: log normalized counts normalized per gene). Cells with lowest score (E10.5) are in 856the center of the figure and those with highest scores (E16.5) are on the left side for XX 857cells and on the right side for XY cells. The relevant processes regulated by these genes 858(cell cycle, male sex determination, meiosis, pluripotency and others) are indicated on the 859left side of the heatmap.

860

861Figure 2. Gene regulation network analysis reveals transient patterns of 862transcription activation during germ cell sex determination. (A) Activity (see STAR 863method) heatmap of the 394 regulons with positive association with their master 864regulator. Regulons were clustered in 30 modules (M1-M30) using hierarchical clustering 865with Spearman correlation distance. Cells were ordered according to their pseudotime 866score with lowest score (E10.5) in the center of the figure and highest score (E16.5) on 867the left side for XX cells and on the right side for XY cells. Boxes on the right display 868examples of master regulators of interest that are colored by dominant activity in XX bioRxiv preprint doi: https://doi.org/10.1101/747279; this version posted August 29, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder, who has granted bioRxiv a license to display the preprint in perpetuity. It is made available under 112 aCC-BY-NC-ND 4.0 International license.

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869(pink) or XY (blue) cells. In brackets is the number of target genes for each master 870regulator. (B) Smoothed expression heatmap of well known marker genes involved in 871germ cells differentiation. Expression scale: log normalized counts normalized per gene. 872

873**Figure 3. Sex-specific, sequential waves of cell cycle genes during germ cells** 874**differentiation.** Smoothed expression heatmap of cell cycle genes. Cells were ordered 875according to their pseudotime. Cells with lowest score (E10.5) are in the center of the 876figure and those with the highest scores (E16.5) are on the left side for XX cells and on 877the right side for XY cells. Log normalized expression values where normalized per row. 878

879**Figure 4. Gene regulation network of the meiotic genes** *Stra8, Rec8* and *Ythdc2*. (A) 880Gene regulation network of *Rec8, Stra8* and *Ythdc2* with connection to their regulators. 881Color of the edge represent positive (green) or negative (red) regulation. Edge width is 882proportional to association score of the target gene to the master regulator. Blue and red-883fill colors indicate high expression in XY and XX germ cells, respectively (Log2 FC). (B) 884Expression profiles of selected genes involved in *Rec8, Stra8* and *Ythdc2* gene regulation. 885The solid line represents the smoothed expression curves of the gene in the cells ordered 886by pseudotime, and the fade band is the 95% confidence interval of the model.

887

888**Figure 5.** Relative abundance of nascent (unspliced) and mature (spliced) 889**transcripts reveals gene- or sex-specific differences in transcriptomic kinetics.** 890Expression profile of spliced (solid line) and unspliced (dash line) forms of transcripts in 891XX (red) and XY (blue) germ cells across pseudotime for (A) meiosis-associated genes, 892(B) selected regulators of *Stra8, Rec8* and *Ythdc2* expression and (C) mitosis-associated

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893genes. As unspliced transcripts are less detected, spliced expression levels were 894multiplied by the gamma factor as in La Manno, 2018. In (B) UMAP projection of 895*Ythdc2* transcripts in the cells colored by pooled abundance of spliced and unspliced 896transcripts. Expression scale: log normalized counts.

897

898**Figure 6.** Altered identity and delayed meiosis in adrenal XY germ cells. (A) UMAP 899projections of 14,718 gonadal cells and 312 ectopic XY germ cells developing in the 900adrenal colored by organ (left) and time (right). Adrenal germ cells are represented with 901larger dots. (B) Expression profiles of selected genes involved in meiosis, oogonia and 902spermatogonia differentiation process. The solid line represents the smoothed expression 903curves of the gene in the cells ordered by pseudotime, and the fade band is the 95% 904confidence interval of the model.

Figure 1 A В XY Germ Cells E 9.5 🎐 E 10.5 XX Germ Cells С Time D Sex E Pseudotime UMAP2 E10.5 E11.5 100 E12.5 -50 0 Female Male E16.5 UMAP1 F Female Male E10.5 E11.5 E11.5 E12.5 E13.5 E16.5 Cell Cycle Male det Meiosis Others Pluripotency z-score LogExp Kit Tildo: 6 0 6

Figure 2

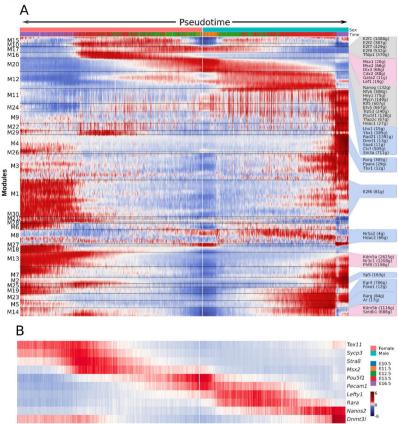


Figure 3

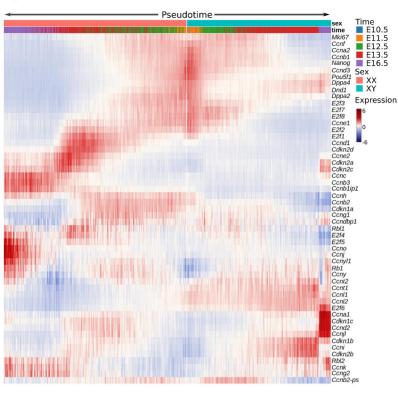


Figure 4

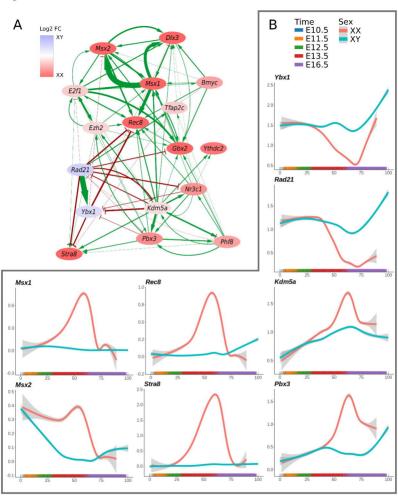
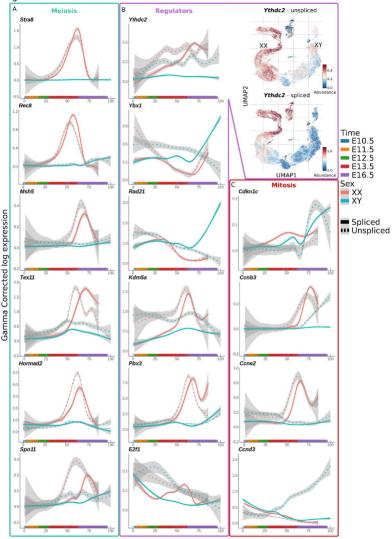


Figure 5



Pseudotime

Figure 6

