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# **Esrrb guides naive pluripotent cells through the formative transcriptional program**

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**Author Contributions Statement** 

G.M. and E.C. conceived the project. E.C., G.M., D.C. and J.A.H. designed the experiments and interpreted the results. E.C. and E.G. performed ESC experiments and analyses. C.M. and D.B. performed molecular analyses of Esrrb KO cells. V.P. performed ChIP-PCR experiments. M.Chieregato performed 3D experiments. V.C. performed PGCLC assays. F.P. and A.C. performed bioinformatic analysis of transcriptomic data. M.Cesana performed ChIP-seq experiments. A.G. performed ATAC-seq experiments. M.M. performed ChIP-seq and ATAC-seq analysis. G.M., H.K and E.T. performed computational modelling. E.C., F.P. and J.A.H. prepared figures. G.M. and E.C. wrote the manuscript with help from all authors. G.M., D.C. and J.A.H. secured fundings and supervised the project.

**Competing interests Statement** 

# **Abstract**

During embryonic development, naive pluripotent epiblast cells transit to a formative state. The formative epiblast cells form a polarised epithelium, exhibit distinct transcriptional and epigenetic profiles and acquire competence to differentiate into all somatic and germline lineages. However, we have limited understanding of how the transition to a formative state is molecularly controlled. Here we used murine ESC models to show that ESRRB is both required and sufficient to activate formative genes. Genetic inactivation of *Esrrb* leads to illegitimate expression of mesendoderm and extraembryonic markers, impaired formative expression and failure to self-organise in 3D. Functionally, this results in impaired ability to generate Formative Stem cells and primordial germ cells in the absence of *Esrrb*. Computational modelling and genomic analyses revealed that ESRRB occupies key formative genes in naive cells and throughout the formative state. In so doing, ESRRB kickstarts the formative transition, leading to timely and unbiased capacity for multi-lineage differentiation.

> In mouse embryos, naive pluripotent cells exist from embryonic day (E) 3.5 to E4.75 $1-3$ . Upon implantation (E5.0 – E6.5) epiblast cells undergo a maturation phase, named "formative" pluripotency", characterised by epithelial polarisation, lumenogenesis<sup>4</sup> and transcriptional changes in preparation for differentiation<sup>2,3,5–7</sup>. Cells in the formative phase downregulate naive pluripotency markers, upregulate epigenetic modifiers and become competent for both unbiased germ layer formation and primordial germ cell (PGC) specification (E6.5 - E7.5)  $5.7-10$ . What factors guide pluripotent cells through such a series of molecular changes?

> Embryonic development entails transitions through pluripotent states, which can be captured in vitro. Mouse embryonic stem cell (ESCs) are obtained from naive cells of the preimplantation embryo, with whom they share similar transcriptional and epigenetic profiles, and metabolic activity<sup>1,11–13</sup>. Naive ESCs were originally cultured in the presence of the cytokine LIF together with Foetal Bovine Serum (Serum+LIF)<sup>14,15</sup>. More recently, a chemically defined culture condition, based on 2 inhibitors (2i, PD0325901 (PD)=Mek inhibitor and CHIR99021 (CHIR) =GSK3 inhibitor) allowed the expansion of a homogeneous population of naive  $ESCs^{16}$ . Adding LIF to 2i (2iL) makes the culture more robust and delays the process of differentiation $17,18$ .

Formative Stem (FS) cells have been obtained from embryos or from ESCs using AloXR or other media<sup>5,7,19</sup>. They display inactivation of naive factors and induction of formative genes, including Otx2 that is crucial for their self-renewal.

We analysed gene expression changes during the irreversible exit from the naive state. After extinction of the naive pluripotency program a second program, compatible with a formative state, is transiently activated and cells irreversibly commit to differentiate. We found that Esrrb is both sufficient and required to induce formative genes. In the absence of Esrrb, differentiation is skewed towards mesendoderm and trophectoderm, PGCs formation is severely impaired and FS cells cannot be obtained, indicating a critical role of ESRRB in chaperoning pluripotent cells through the initial phases of differentiation.

# **Transcriptional changes during exit from naive pluripotency**

Upon withdrawal of 2iL, ESCs enter a reversible phase in which they self-renew if 2iL is reapplied. If 2iL withdrawal is further prolonged, all ESCs will commit to differentiation and lose self-renewal capacity<sup>10,17,20</sup> (Fig. 1a). We measured the kinetics of ESC commitment starting from 2i or 2iL. After signals withdrawal, cells were left in N2B27 medium, which induces neural differentiation<sup>21</sup>. Every 12 hours we quantified the percentage of self-renewing cells, forming undifferentiated colonies in a clonal assay. Cells differentiating from 2iL maintain full self-renewal capacity for up to 48 hours (h), despite the changes in morphology (Fig. 1b) and the strong reduction in the naive pluripotency markers<sup>22–26</sup> (Extended Data Fig. 1a). After 84h all cells committed and lost self-renewal capacity.

We performed a transcriptome analysis followed by Principal Component Analysis (PCA). Progression along Principal Component (PC) 1 indicated a reduction of naive genes Tfcp2l1 and Nanog and induction of neuroectoderm genes Sox1 and Sox11. Along PC 2 we detected transient activation of the formative markers  $Otx2$ , Pou3f1, Sox3, Fgf5, Lef1, Hes6 and  $Dnmt3a/b^{5,6,27-29}$  (Fig. 1c).

Unsupervised hierarchical clustering on samples differentiating from 2iL identified 6 groups of genes ('gene signatures', Fig. 1d, Extended Data Fig. 1b). Two signatures were highly expressed in 2iL and downregulated more or less rapidly ("naive early" and "naive late" gene signatures). Several formative markers (*Etv4*, *Etv5*, *Dnmt3a*, *Dnmt3b*, *Lef1*, *Pou3f1*, *Otx2, Sox3*)  $^{6,27-30}$  were transiently upregulated during the reversible phase. Thus, we defined 2 signatures as "formative early" and "formative late", reaching maximal expression at 24-36h and 60h. Genes lowly expressed in 2iL, reaching their maximum in committed cells at 84h or 96h, formed the "early committed" and "late committed" signatures (Supplementary Table 1).

Full activation of the formative programs was associated with gradual loss of reversibility, as reported<sup>10,31</sup>. Cells differentiating from 2i show faster kinetics<sup>17</sup>. The 2iL and 2i time series displayed striking similarities in gene expression changes, with 2i cells showing anticipation by ~24h (Fig. 1b-c, Extended Data Fig. 1a-b and Supplementary Table 2).

Analysis of embryo data<sup>32</sup> revealed that the two naive gene signatures were enriched in E4.5 genes, the formative signatures were enriched in E5.5 genes and the committed signatures in E6.5 genes (Fig. 1d), indicating that our in vitro assay recapitulates transcriptional changes observed in the embryo.

We then asked whether commitment affected the response to 2iL. After 48h of differentiation cells responded to 2iL by upregulating naive markers, downregulating formative markers and were fully clonogenic (Extended Data Fig. 2a-b). In contrast, after 96h cells failed to form colonies after reinduction, failed to reactivate naive markers and further upregulated committed markers. However, analysis of direct targets of JAK/ STAT, WNT and FGF revealed that the responsiveness of key signalling pathways was not significantly changed after commitment (Extended Data Fig. 2c). We conclude that commitment is associated with a change in the interpretation of external signals.

# **Reversibility is associated with Esrrb expression**

Different transcriptional responses to signals could be due to changes in chromatin accessibility, thus we performed Assay for Transposase-Accessible Chromatin followed by sequencing (ATAC-seq). We identified regions accessible only in  $2iL$  (*Tfcp2l1* locus), only at 48h, maintained throughout the reversible phase (Lef1 locus) or accessible only after commitment (Fig. 2a and Extended Data Fig. 2d). Transcription factors motif analysis (Fig. 2b) revealed an enrichment for SOXs, TCF3, ESRRB and KLFs in 2iL; in the reversible phase (2iL - 48h) we found motifs of ESRRB, KLFs and NFYA/B together with SMAD3 and ETS, downstream mediators of the TGF-beta and FGF pathways, which promotes formative transition<sup>5,6,19,31</sup>. Peaks found only at 48h were enriched for the formative transcription factors ZIC3 and OTX2, for ASCL2 and for ESRRB and MYB only on promoters. After commitment we observed enrichment for TEADs, SOXs, GLIS3, JUN/FOS, ZIC3 and OTX2. Thus, chromatin accessibility is dynamically regulated during commitment, with the persistence of accessible regions during the reversible phase, under the control of SMAD3, ETSs, KLFs and ESRRB.

Culture of ESCs under Serum+LIF conditions, in the absence of feeders, generates a heterogeneous population of pluripotent and partially differentiated cells<sup>3,10,18,33–36</sup>. Consistently, naive gene signatures were expressed at lower levels in Serum+LIF than in 2iL, while formative and committed genes were more abundant in Serum+LIF (Extended Data Fig. 2e).

We took advantage of such heterogeneity and analysed the genome-wide binding profiles of several pluripotency regulators and chromatin modifiers previously generated in Serum+LIF37. We calculated the relative enrichment of factors at the promoters of genes belonging to the 6 gene signatures, seeking potential regulatory mechanisms (Fig. 2c). The core pluripotency factors POU5F1, known as OCT4, and SOX2 were found significantly enriched at all signatures. Polycomb Repressive Comples 2 (PRC2) components were significantly bound to committed genes. Interestingly, both naive and formative signatures were significantly bound by naive pluripotency factors (KLF4, TFCP2L1, and ESRRB).

ESCs in the reversible phase express formative genes, which may be regulated by pluripotency factors. We asked whether the forced expression of pluripotency factors enriched at naive and formative signatures could extend the reversible phase during ESC differentiation. We generated a pool of cells stably expressing individual factors, differentiated them for 96h and found that they were still able to form naive colonies (Extended Data Fig. 2f and Fig. 2d). We extracted genomic DNA from the pluripotent colonies, compared the frequency of genomic integration of each factor, and observed a strong enrichment for Esrrb integration. We generated lines stably expressing single factors, differentiated them individually and confirmed that Esrrb expression led to robust colony formation (Fig. 2e and Extended Data Fig. 2g).

Esrrb has been shown to efficiently reset primed Epiblast Stem cells (EpiSCs) to naive pluripotency38,39. Committed cells at 96h might be EpiSCs and Esrrb could be in fact resetting them. However, we failed to detect EpiSC-specific markers in committed cells

(Extended Data Fig. 3a-b). We conclude that Esrrb forced expression prolongs the reversible phase during ESC differentiation.

We observed that *Esrrb* mRNA expression rapidly decreases upon 2iL withdrawal, with a ~90% reduction after 48h. ESRRB protein is still present in most cells after 48h of differentiation from 2iL, becoming barely detectable at 96h (Fig. 2f and Extended Fig. 3c). Moreover, we observed full reactivation after 2iL reinduction at 48h (48+24) and no response at 96h (96+24). These results indicate that cells in the reversible phase express ESRRB protein and are capable to reinduce Esrrb mRNA, while cells committed to differentiate have permanently lost *Esrrb* expression, as also reported under Serum+LIF conditions<sup>40</sup>.

To dissect the mechanism controlling *Esrrb* expression during differentiation we analysed the role of both signalling pathways and epigenetics. Esrrb is a direct target of the repressor TCF7L1<sup>24,41</sup>. Treatment with CHIR, which causes derepression of TCF7L1 targets<sup>42,43</sup>, elevated the expression of Esrrb for 96h, accompanied by extended reversibility (Extended Data Fig. 3d-e). FGF had a minor negative effect on *Esrrb* expression. We then analysed the epigenetic profile of the Esrrb locus. In 2iL and at 48h ESRRB strongly binds to his intronic enhancer<sup>44</sup> (Extended Data Fig. 3f), compatible with reactivation of *Esrrb* mRNA expression upon 2i treatment. In 2iL this enhancer is enriched for H3K27ac and H3K4me3. Both activating marks are then lost and H3K27me3 is gained, leading to a complete silencing (Extended Data Fig. 4a-b). We treated fully committed cells with Sodium Butyrate (NaButy), a histone deacetylase inhibitor, and with 2i. In committed cells H3K27ac and ESRRB protein levels were undetectable (Extended Data Fig. 4b). NaButy treatment maintained H3K27ac levels. Upon 2iL pulse, ESRRB protein was strongly detected. We conclude that Esrrb expression is positively controlled by H3K27ac and 2i.

# **Esrrb promotes the expression of formative genes**

Next, we generated cells expressing an Esrrb-IRES-Venus (EIV) transgene under a Doxycycline (DOX)-inducible promoter, to induce Esrrb expression specifically during differentiation and to isolate by FACS pure populations of Esrrb-IRES-Venus positive cells upon DOX induction or pure Esrrb-IRES-Venus negative cells in the absence of DOX. Upon replating in 2iL, EIV+ cells robustly formed naive colonies, confirming that *Esrrb* expression is sufficient to confer reversibility (Fig. 3a-b).

We performed transcriptional analysis and confirmed *Esrrb* induction in EIV+ cells, while a panel of naive markers were only mildly expressed. Commitment genes were strongly repressed by Esrrb expression. Surprisingly, several genes of the formative signatures (n=57) were highly induced (Fig. 3c-e). We conclude that  $\overline{Esrrb}$  expression during differentiation results in activation of both naive and formative genes.

Our results suggest a role of ESRRB as a positive activator of the formative gene program, beside its role as a naive factor<sup>22–24,45</sup>. To further investigate this, we performed Chromatin Immunoprecipation (ChIP)-sequencing for ESRRB. The large majority of ESRRB binding occurs in 2iL and at 48h (Fig. 4a-b). Several formative genes promoters are bound by

ESRRB in 2iL and at 48h (2iL – 48), in line with its capacity to induce their expression. ESRRB peaks on naive genes (e.g. *Tfcp211*) decrease after 48h, supporting its role in sustaining the naive transcriptional network (Fig. 4b-c and Extended Data Fig. 3f). On the contrary, peaks on formative genes are present in 2iL and the signal is maintained (or increased) at 48h. These observations endorse the concept of Esrrb as a direct activator of the formative gene program during the reversible phase. A search for biological processes enriched in genes bound by ESRRB identified Oxidative phosphorylation, Krebs cycle and glycolysis (Supplementary Table 3), as reported $46$ .

How is ESRRB binding dynamically regulated between the naive and formative states? Previous studies showed that ESRRB-bound regions are decorated by specific epigenetic marks<sup>38,47</sup>. Indeed, epigenetic profiling revealed differences in the levels of H3K27me3, H3K9me3 and DNA methylation in ESRRB-bound regions in naive or formative states (Extended Data Fig. 4c).

# **ESRRB activates both naive and formative programs**

Next, we asked whether *Esrrb* inactivation would shorten the reversible phase leading to more rapid commitment. Transient knockdown of Esrrb (Fig. 5a) led to inability to form colonies after 48h and anticipated reduction of a naive marker. Similar results were obtained using *Esrrb* KO ESCs previously generated by gene-targeting<sup>24</sup> (Extended Data Fig. 5a). We generated 3 Esrrb KO clonal lines by CRISPR/Cas9 system in 2iL (Fig. 5b, Extended Data Fig. 5b), to exclude the possibility that multiple rounds of gene-targeting and long-term culture in Serum+LIF could have induced cell adaptation or selection. Esrrb KO clones showed no gRNAs off-target mutations (Supplementary Fig. 1) and no morphological differences (Extended Data Fig. 5c), they displayed long-term self-renewal in 2iL, although with a partial downregulation of some pluripotency markers (Extended Data Fig. 5d), as reported<sup>24,48</sup>. *Esrrb* KO lines showed reduced self-renewal capacity relative to parental cells, consistently with the anticipated commitment of Esrrb KO cells (Fig. 5b, bottom). The reduction in colony number could be due to viability impairment, as reported upon acute *Esrrb* deletion<sup>38,41,47</sup>. The proliferation rate and viability of Esrrb KO clones did not differ from those of wild-type (WT) cells (Extended Data Fig. 6a). We obtained transcriptomes from Esrrb WT and KO clones. Analysis of Apoptosis and Cell Stress signatures revealed no differences (Extended Data Fig. 6b), further ruling out a viability impairment of *Esrrb* KO cells.

PCA indicated anticipated progression of *Esrrb* KO cells (Fig. 5c). Naive signatures were reduced (84 genes) and committed genes were upregulated in Esrrb KOs (278 genes), in line with the anticipated loss of self-renewal observed in clonal assays. Interestingly, formative genes were globally downregulated (148 genes) in multiple Esrrb KO clones (Fig. 5d-e and Extended Data Fig. 6c), confirming that Esrrb regulates both the naive and formative programs.

# **ESRRB is required for generation of FS cells**

To uncouple the role of ESRRB in the maintenance of naive pluripotency from its role as activator of the formative program we generated Esrrb KO cells expressing a DOX-inducible Esrrb transgene ('Conditional Esrrb cells', Fig. 6a).

We gave a pulse of DOX between 24 and 48h, at the time of activation of the formative program and observed induction of formative genes (*Tcf15, Dnmt3a, Dnmt3b* and *Utf1*, Fig. 6b).

In a complementary strategy, we expanded Conditional Esrrb cells in 2iL+DOX. Expression of naive markers was comparable to the one observed in WT cells, with no spontaneous expression of lineage markers (Extended Data Fig. 6d). We withdrew 2iL and DOX and ESRRB protein was undetectable after 48h (Fig. 6c,d). We therefore asked whether acute loss of ESRRB would affect formative gene expression. Global transcriptome profiling revealed impaired induction of 128 formative genes, including *Otx2*, *Utf1*, *Dnmt3a* and Dnmt3b, compared to WT cells (Fig. 6e-f and Extended Data Fig. 6e). From these two experiments, whereby ESRRB is either specifically added or acutely removed during formative gene activation, we conclude that ESRRB is an inducer of formative genes, independently from its role as a naive factor.

FS cells have been obtained from embryos or from ESCs using AloXR medium19. If Esrrb is a critical inducer of formative genes, it should not be possible to obtain *Esrrb* KO FS cells. After 3 passages in AloXR medium, WT cells rapidly downregulated naive genes and upregulated formative markers (Extended Data Fig. 6f-g). WT cells could be easily stabilised in AloXR for >9 passages. In contrast, *Esrrb* KO clones displayed an aberrant morphology and repeatedly collapsed soon after passage 3 (Fig. 6g).

We performed transcriptome analysis during FS conversion. Gene signatures of Apoptosis and Cell Stress revealed no differences between Esrrb WT and KO (Extended Data Fig. 7a), thus ruling out a general viability impairment of Esrrb KO cells. We looked for those early expression alterations distinguishing WT from *Esrrb* KO cells. The formative genes Otx2, Dnmt3a and Dnmt3b peaked after 48h (P1) and were then maintained at high levels in WT FS cells, but not in Esrrb KO cells (Fig. 6h and Extended Data Fig. 7b-c). Lineage markers Nes, Hand1, Foxa2 and Cdkn1c were significantly upregulated in Esrrb KO cells from P1. We conclude that Esrrb genetic inactivation leads to inability to generate FS cells and impaired induction of formative genes. Esrrb was detected only during the first 48h of FS cell generation (2iL and P1), and not in stably expanding WT FS cells, indicating that Esrrb plays an early role during establishment of FS cells and not for their maintenance. FS cells rely on the transcription factor  $Otx2$  for their self-renewal<sup>19</sup>. In the absence of ESRBB most cells were devoid of OTX2 by passage 2 (Extended Data Fig. 7d), in agreement with their collapse. We conclude that during FS cell establishment, ESRRB is required for robust induction of formative genes.

Primed EpiSCs are an in vitro model of the peri-gastrulation epiblast 49–51 and are obtained from either post-implantation embryos or  $ESCs^{39,52-54}$ . Otx2 is required for FS cell identity, but dispensable in EpiSCs<sup>19,30</sup>. We asked whether EpiSCs could be obtained from *Esrrb* KO

ESCs. We applied AFX conditions<sup>55</sup> and both *Esrrb* WT and KO cells robustly expanded for  $>10$  passages. *Esrrb* and *Klf4* were downregulated, *Oct4* was maintained and EpiSC-specific markers Fgf5 and T were partially induced (Extended Data Fig. 7e). We conclude that ESRRB is dispensable for EpiSCs generation.

# **PGCs specification is impaired by loss of ESRRB**

Competence for PGC specification is acquired in the formative state<sup>5-7,10</sup>. To become responsive to inductive signals for germ cell specification, ESCs must extinguish their naive identity and transit to epiblast-like cells(EpiLCs). EpiLCs are molecularly similar to the formative epiblast 6,56. ESRRB is crucial for the induction of the formative program, thus PGC specification should be impaired in the absence of Esrrb. Indeed, a CRISPR-Cas9 genome-wide screen showed that gRNAs targeting Esrrb were underrepresented both in formative EpiLCs and in  $PCGLCs<sup>57</sup>$  (Extended Data Fig. 8a-b).

Thus, we sought to confirm the role of ESRRB as a regulator of PGC specification by generating novel clonal *Esrrb KO* lines in the *Stella*-GFP: *Esg1*-tdTomato (SGET)<sup>57</sup> reporter ESC line (Extended Data Fig. 8c-d), which did not show any mutations in predicted offtargets (Supplementary Fig. 2).

Esrrb KO lines exhibited reduced capacity to specify *Stella*+ PGCLC at both day 3 and day 5, as compared to WT cells (Fig. 7a). This reduction was not due to impaired proliferation or survival of Esrrb KO cells, given that in our experiments we replated equal numbers or Esg1+ EpiLCs and observed no differences in the number of cells after PGCLC induction (Extended Data Fig. 8e).

We isolate those few *Stella+* PGCLC that were derived from *Esrrb* KO lines by flow cytometry and analysed them by RNAseq. WT and KO cells follow a different trajectory during PGCs specification suggesting that the developmental programs are not appropriately activated in Esrrb KO cells (Fig. 7b). Formative genes (Fgf5, Dnmt3a, Etv5, Utf1, Otx2) were significantly reduced in *Esrrb* KO EpiLCs (Fig. 7c-d and Extended Data Fig. 8f). Moreover, we observed significant downregulation of both early and late PGCs genesets in Esrrb KO PGCLC (Extended Data Fig. 8g), corroborating the idea that the full germline program was not appropriately activated. Several PGC markers, such as Dazl, Kit, Nanog and *Tfcp2l1* failed to activate fully in *Esrrb* KO cells, although we observed expected activation of the core PGC markers Prdm14, Blimp1 and Tfap2c/Ap2y. We conclude that the absence of Esrrb leads to a loss of robustness in PGCs specification.

Previous studies have indicated that Esrrb promotes PGC specification via BMP4 production from the extraembryonic ectoderm58. In our system we provide excess of exogenous BMP4 and BMP8. We measured the expression of 6 BMP direct transcriptional targets<sup>59</sup> during PGCLC induction and found no differences upon Esrrb deletion (Extended Data Fig. 8h). We conclude that Esrrb promotes PGC specification both via BMP-independent and BMPdependent mechanisms.

Further transcriptional analyses revealed that Esrrb KO cells robustly expressed somaticmesodermal markers (Pitx2, Pbx1, Lefty1, FoxP1) at both EpiLC and PGCLC stages (Fig.

7d). Similarly, during neural differentiation in N2B27 all Esrrb KO cells display a robust expression of markers of mesoderm, endoderm and trophectoderm (Extended Data Fig. 9a).

Taken together these results endorse the role of ESRRB as a key coordinator of the formative gene program that is preparatory for unbiased germ-layer and germ-cell differentiation. In the absence of ESRRB, PGC specification is impaired and mesoderm, endoderm and trophectoderm markers are aberrantly activated.

# **Impaired lumenogenesis in Esrrb KO 3D structures**

The formative epiblast in the embryo is a polarised epithelium with an apical domain facing a lumen, the proamniotic cavity<sup>4,6</sup>. Culture of ESCs in 3D allows for epithelialization and self-organisation similarly to the formative epiblast<sup>4,60,61</sup>. We asked whether the faulty activation of the formative program observed in Esrrb KO cells could affect morphogenesis.

WT ESCs plated in a hydrogel of extracellular matrix in N2B27 medium formed 3D structures with an apical domain marked by F-ACTIN accumulation and the formative gene PODXL (Supplementary Table 1), as observed in the peri-implantation formative epiblast<sup>4,60</sup> (Extended Data Fig. 9b, Fig. 8). *Esrrb* KO clones formed fewer structures with a reduced area, but comparable roundness (Extended Data Fig. 9c).

We then analysed the polarisation and lumenogenesis of 3D structures. Most WT structures showed a strong and apically localised PODXL signal at 48h, that after 72h and 96h defined a central cavity (Fig. 8a-b). In Esrrb KO, the majority of structures failed to form a lumen. We then quantify F-ACTIN intensity along a diameter. In WT cells we found a prominent central peak at 48h, separating into two peaks by 96h, indicating the formation of apical domains facing a central lumen (Extended Data Fig. 9d). Esrrb KO clones failed to do so. Molecularly, *Esrrb* KO failed to fully activate formative genes, including  $Otx2$  (Fig. 8c-d) and Extended Data Fig. 9e), which has been demonstrated to be both sufficient and required for lumen formation in  $3D^{62}$ . Our results reveal that *Esrrb* inactivation causes impaired activation of formative genes and lumenogenesis in 3D structures.

Esrrb inactivation results in inefficient activation of the key formative gene Otx2, under several different experimental conditions (Fig. 5e, 6f, 6e, 7c-d, 8c-d). How does ESRRB regulate Otx2? ESRRB might regulate the FGF and TGF-beta signals, which promote transition towards formative state<sup>6,19,31</sup>. However, *Otx2* levels were unchanged after stimulation or inhibition of both pathways (Extended Data Fig. 10a). Otx2 expression might be controlled epigenetically. Otx2 promoter was found bivalent in naive cells (Extended Data Fig. 10b), while an *Otx2* downstream enhancer was bound by ESRRB. ESRRB binding was consolidated in formative cells (Fig. 4c), with a concomitant increase in H3K27ac (Extended Data Fig. 10b), indicating a potential direct regulation of  $Otx2$  expression by ESRRB.

To gain a more comprehensive understanding of how ESRRB regulates  $Otx2$  and the transition from naive to formative state we turned to computational modelling. We extended a gene regulatory network of naive pluripotency<sup>17,39,63</sup> by adding formative genes and we inferred interactions between components from RNAseq and ChIP-seq (Fig. 8e and

Extended Data Fig. 10c). We then defined the naive, formative and committed states (Extended Data Fig. 10d) and constrained the model asking whether it could orderly proceed through them. The model started from the naive state (step 0), it gradually activated formative genes while naive genes were inactivated (step 9, Fig. 8f-g). Finally, all formative genes were inactivated (step 15).

The model showed that *Esrrb* KO cells fail to activate some formative genes, including *Otx2*, while naive genes were also inactivated more rapidly (Fig. 8f-g and Extended Data Fig. 10d), in agreement with the faster exit kinetics observed in Esrrb KO cells (Fig. 5).

We then focussed on how ESRRB regulates the expression of formative genes. ESRRB engages in positive interactions with formative genes already in the naive state, which are maintained until the formative state is reached (Fig. 8g). Thus, Esrrb is pre-wired to formative genes in the naive state, in line with ATAC-seq and ESRRB ChIP-seq results. In the absence of *Esrrb* these positive interactions do not take place and the activation of formative genes is impaired (Fig. 8g, bottom panels). Concerning  $Otx2$  regulation, we detected activating interactions from Esrrb and the formative factors Lef1, Utf1 and Dnmt3b. In Esrrb KO all those formative genes fail to activate. Thus, Otx2 expression appears to be controlled by ESRRB, both directly and indirectly.

# **Discussion**

ESC differentiation entails inactivation of naive genes followed by a phase of renovation, named formative pluripotency, in preparation for unbiased germ layer specification  $6,10$ . We have identified gene signatures of the formative state that are transiently activated during pluripotency progression (Supplementary Table 1). Subsequently, pluripotent cells express lineage-specific transcription factors and segregation of definitive embryonic lineages occurs. Characterisation of transcriptional and epigenetic profiles of early embryos revealed that in the formative state at E5.5 the enhancer landscape of epiblast cells is already set for the specification of neuroectoderm lineage<sup>64</sup>. Not surprisingly, some markers of the formative state (e.g. *Otx2, Pou3f1, Zic3*) are retained in the neuroectoderm lineage.

We also found that activation of formative genes leads to irreversible commitment to differentiate, as reported<sup>10</sup>. Of note, "reversibility' indicates the capacity of early differentiated cells to revert to naive pluripotency<sup>10,40</sup>. This transition could be considered as reprogramming from formative to naive pluripotency. For instance, after 48h of 2iL withdrawal, cells can fully revert, or reprogram, back to the naive state when exposed to 2iL.

What orchestrates this ordered progression? What activates formative genes? Our unexpected findings are that ESRRB covers this role. ESRRB was first characterised as a pivotal transcription factor for the maintenance of the naive pluripotency network $17,22-24,45$ , acting downstream of both NANOG and the WNT pathway and its inactivation results in partial loss of naive markers, which is compensated by other naive factors, such as Nr5a2<sup>48</sup>. However in vivo studies showed that Esrrb expression arises in cleavage stage embryos<sup>65,66</sup> and is maintained in pluripotent cells until the peri-implantation stage<sup>62</sup>, in line with the persistence of ESRRB for up to 48h of in vitro ESC differentiation (Fig. 2f).

Esrrb expression pattern is consistent with a dual role both in the maintenance of naive pluripotency and in activation of formative pluripotency. Our ChIP-sequencing experiments showed that ESRRB binds naive and formative genes in 2iL (Fig. 4). Upon 2iL withdrawal, binding on naive genes decreases while peaks on formative genes are maintained throughout the formative phase.

When overexpressed in ESCs, ESRRB ectopically induces both naive and formative gene expression (Fig. 3c-e). Also during resetting of EpiSCs by Esrrb overexpression, we noticed robust induction of formative markers *Otx2*, *Dnmt3b* and *Utf1*<sup>39</sup>. *Esrrb* inactivation leads to impaired induction of formative genes, less robust PGC specification and spontaneous activation of mesendoderm and trophectoderm markers. Furthermore, Esrrb KO ESCs failed to form FS cells. Such results clearly endorse the concept of ESRRB as a direct activator of the formative gene program and show that correct activation of the formative program is required for timely and unbiased multilineage differentiation of murine naive pluripotent cells.

We investigated the molecular mechanisms associated with dynamic binding of ESRRB in naive and formative cells. ESRRB-bound loci in naive cells were enriched for H3K4me3, H3K27ac and depleted of DNA methylation (Extended Data Fig. 4c), in agreement with a work from Atlasi and collaborators<sup>47</sup>, reporting that 2iL specific enhancers are accessible regions, decorated by H3K27ac and enriched for ESRRB binding. Loci bound by ESRRB only in formative cells are heavily DNA methylated. ESRRB binds DNA-methylated regions, leading to gene activation<sup>38</sup> also during reprogramming. Of note, ESRRB binds key chromatin regions during cell divisions to preserve the transcriptional identity of  $ESCs^{67}$ . This bookmarking activity might also explain the persistent binding of ESRRB on formative genes.

Embryos deficient for Esrrb, or deficient for its upstream regulator Nanog, showed reduced numbers of  $PGCs^{25,58,68}$ , which has been imputed to lower production of BMP4 by the extraembryonic ectoderm<sup>58</sup>. However, tetraploid complementation experiments, whereby extraembryonic tissues are provided by wild-type embryos, revealed a reduction in PGCs<sup>68</sup>, indicating that ESRRB must control PGCs number by additional, cell-autonomous mechanisms. We conducted in vitro assays in which BMP4 was exogenously provided and saw a reduction in PGCLCs upon *Esrrb* inactivation. Thus, we would propose that the reduction of PGCs in *Esrrb* mutant is due to both reduced BMP signalling and to faulty formative program activation.

Esrrb null embryos display placental defects at E8.5 and die by E10.5. Epiblast-specific deletion of Esrrb or tetraploid complementation allowed to rescue those defects, indicating that ESRRB is a critical regulator of the trophectoderm lineage<sup>69–71</sup>. Nonetheless, *Esrrb* null embryos were under-represented in a large tetraploid complementation study<sup>68</sup>, suggesting additional Esrrb developmental functions in embryonic cells. ESRRB is detected in the epiblast up to E5.0 and *Esrrb* null embryos show growth defects at  $E6.0^{58}$ . Diapause is a state of metabolic dormancy whereby epiblast cells are held between naive and formative state, and self-organise into polarised rosette-like structures<sup>41,72</sup>. *Esrrb* null embryos in diapause display a dramatic reduction in the number of epiblast cells, which fail to self-

organise41. Consistently with these in vivo observation, Esrrb inactivation in a 3D in vitro model led to reduced number and size of structures, and impaired self-organisation.

We propose that ESRRB confers robustness to epiblast cells transitioning from naive to formative pluripotency. The absence of ESRRB causes alterations (e.g. embryo size and number, PGC number) with partial penetrance. However, when the progression of epiblast cells is delayed or blocked, as in diapause or in FS cells, Esrrb becomes strictly required for self-renewal of pluripotent cells. *Esrrb* and *Nr5a2* are two orphan nuclear receptors with overlapping functions, both in totipotent and naive pluripotent cells<sup>48,66</sup>. Interestingly, Nr5a2 is expressed both in the naive and formative epiblast and Nr5a2 null embryos are under-represented and display severe defects at  $E6.5^{73}$  indicating a role for Nr5a2 in the control of pluripotency progression. It would be therefore interesting to investigate the effect of combined inactivation of Esrrb and Nr5a2.

Reprogramming studies further support a role for ESRRB in multiple embryonic lineages, showing that Esrrb localises preferentially near genes expressed in the epiblast, extraembryonic lineages and  $PGCs^{38,74}$ . ESRRB plays also a role, in combination with  $NR5A2$ , in the zygotic genome activation of totipotent blastomeres<sup>66</sup>. These observations indicate a multifaceted function of ESRRB in the control of several early embryonic lineages, raising the question of how ESRRB activity can be interpreted in different contexts, possibly thanks to a combination of cell signalling, epigenetic and metabolic regulation.

# **Methods**

### **ESCs culture**

All cell lines were routinely cultured on plates coated with 0.2% Gelatin (Sigma-Aldrich, G1890) in N2B27 medium (DMEM-F12 and Neurobasal at 1:1 ratio (Life Technologies), 1X N2 Supplement (Life Technologies), 1X B27 Supplement (Life Technologies), 2mM L-Glutamine (Life Technologies), 0.1mM 2-mercaptoethanol) with the addition of 2iL (3uM CHIR99021 (Axon), 1uM PD0325901 (Axon), 1uM LIF (Qkine)). Media was replaced every other day and cells were passaged every 3 days at 1x104 cells/cm<sup>2</sup> density, following dissociation with Accutase (Life Technologies, cat. A1110501). E14IVc mouse ESCs were kindly provided by Austin Smith's laboratory<sup>75</sup>. Esrrb fl/fl and Esrrb-/- cells (Extended Data Fig.5a) were provided by Hitoshi Niwa's laboratory<sup>24</sup>.

# **Monolayer differentiation, clonal assay, ESCs to EpiSCs differentiation and FS cells generation**

For monolayer differentiation experiments, 5000 cells/12 well were plated at single cell density on 0.2% Gelatin coated plates in N2B27 medium with 2iL.

For clonal assays, cells were dissociated at indicated time points and 300 cells/12 well were plated at single cell density on 0.2% Gelatin coated plates in KSR medium (GMEM (Sigma Aldrich, G5154) supplemented with 10% KnockOut Serum Replacement (Life Technologies), 2% FBS (Sigma Aldrich), MEM non-essential amino acids (Life Technologies), 1mM Sodium Pyruvate (Life Technologies), 2mM L-Glutamine, 0.1mM

2-mercaptoethanol) with 2iL. After 4 days, cells were fixed and stained for Alkaline Phosphatase (AP) (Sigma, 86R 1KT) according to manufacturer instructions. Plates were scanned with Epson Scanner and AP positive colonies were scored manually.

For ESCs to EpiSCs differentiation, 35000 cells/12 well were plated on fibronectin (Sigma Aldrich FC010)-coated plates in N2B27 medium supplemented with 20 ng/ml ActivinA (Qkine), 12.5 ng/ml FGF2 (Qkine) and 1uM XAV939 (Axon Medchem). After three days cells were passaged in clumps using Accutase and were subsequently passaged every two days in a ratio of 1:5 or 1:10 depending on the cell density. ROCK inhibitor (Y27632 dihydrochloride, Axon Medchem) was added one hour before detaching the cells and for 6-12 hours after plating.

For Formative Stem (FS) cells generation, mouse ESCs were plated at standard density in fibronectin-coated well in N2B27 medium. The next day, medium was changed to AloXR (3 ng/ml of activin A, 2 μΜ XAV, 1.0 μΜ BMS439 in N2B27 medium). The next day cells were dissociated into clumps with Accutase and plated at higher density than established cultures (1/5 ratio). Medium was changed every day and cells split every other day.

### **3D structures generation**

10000 mouse ESCs were resuspended in a 20uL drop of Matrigel (Corning, 356231) in a 8-well chamber slide (Life Technologies, 154534PK) and placed at 37° for 3 minutes to allow polymerisation. Each well was then filled with 300uL of N2B27 to allow 3D structures formation. Medium was changed after 2 days.

### **RNA extraction, cDNA synthesis and quantitative PCR**

Total RNA was isolated using Total RNA Purification kit (Norgen Bioteck, cat.37500) and complementary DNA was synthesised using M-MLV Reverse Transcriptase (Life Technologies, cat.28025-013) and random hexamers. qPCR was performed with SYBR Green Master mix (Bioline BIO-94020). Expression levels were normalised to Gapdh. See also Supplementary Table 4 for primer details.

### **RNA-sequencing library preparation and sequencing for ESCs experiments**

Total RNA was quantified using the Qubit 2.0 fluorimetric Assay (Thermo Fisher Scientific). Libraries were prepared from 250 ng of total RNA using the 3'DGE mRNAseq sequencing service (TIGEM NGS Core) which included library preparation, quality assessment, and sequencing on a NovaSeq 6000 sequencing system using a single-end, 100-cycle strategy (Illumina Inc.).

### **RNA-sequencing data pre-processing and analysis for ESCs experiments**

Illumina NovaSeq base call (BCL) files were converted in fastq file through bcl2fastq ([http://emea.support.illumina.com/](http://emea.support.illumina.com/content/dam/illumina-support/documents/documentation/software_documentation/bcl2fastq/bcl2fastq2-v2-20-software-guide-15051736-03.pdf) [content/dam/illumina-support/documents/documentation/software\\_documentation/bcl2fastq/](http://emea.support.illumina.com/content/dam/illumina-support/documents/documentation/software_documentation/bcl2fastq/bcl2fastq2-v2-20-software-guide-15051736-03.pdf) [bcl2fastq2-v2-20-software-guide-15051736-03.pdf](http://emea.support.illumina.com/content/dam/illumina-support/documents/documentation/software_documentation/bcl2fastq/bcl2fastq2-v2-20-software-guide-15051736-03.pdf) - (v2.20.0.422). The raw data were analyzed by Next Generation Diagnostic srl proprietary 3'DGE mRNA-seq pipeline (v2.0) which involves a cleaning step by quality filtering and trimming ([https://jgi.doe.gov/data-](https://jgi.doe.gov/data-and-tools/bbtools/bb-tools-user-guide/usage-guide/-bbmapsuite37.31)

[and-tools/bbtools/bb-tools-user-guide/usage-guide/-bbmapsuite37.31](https://jgi.doe.gov/data-and-tools/bbtools/bb-tools-user-guide/usage-guide/-bbmapsuite37.31)), alignment to mm10 reference genome assembly<sup>76</sup>, and counting by gene<sup>77</sup> using mm10 Ensembl assembly (release 93). Differential expression analyses were performed using edge $R^{78}$  on genes having more than 1 CPM in more than the minimum number of samples belonging to one condition minus 1 and less than 20% of multi-mapping reads, simultaneously.

PCA was performed on  $log_2(CPM)$ , after filtering out genes with average raw counts across the dataset less than 5, using prcomp function from R (v. 4.2).

Time course differential expression analysis was performed through Gaussian process regression <sup>79</sup>after voom<sup>80</sup> transformation of  $log_2(CPM)$ . Genes with log-ratio of marginal likelihood greater than 5 were considered differentially expressed and used for clustering analysis. Gene clusters were first defined by dividing genes in three groups, based on their maximum expression (maximum at time 0, between 24 and 72 hours and between 84 and 96 hours respectively). A hierarchical clustering based on Pearson correlation, performed on the aforementioned groups, allowed the identification of the 6 gene signatures (naive early, naive late, formative early, formative late, committed early, committed late) used in this study.

Pathway and gene sets enrichment analysis was conducted using the R package Enrichr(v. 3.0) on KEGG and Wikipathways (wikipathways.org) databases.

To perform the enrichment of cell-stress (GO:0033554) and apoptosis (KEGG) gene signatures in KO experiments, we used pre-ranked Gene Set Enrichment Analysis (GSEA) from fgsea (v 1.14.0) R package. Pre-ranked lists for each time-point or passage were generated by multiplying log2 fold change (L2FC) and false discovery rate (FDR) values as obtained by the differential expression analysis between KO and WT samples $81-85$ .

#### **Generation of Overexpression (O/E) ESCs**

For DNA transfection, Lipofectamine 2000 (Life Technologies, cat. 11668019) was used and reverse transfection was performed. Briefly, cells were dissociated with Accutase and resuspended in N2B27 +2iL. 1.5x10<sup>5</sup> cells were mixed with 750uL 2iL, 3uL Lipofectamine 2000 (Life Technologies), 125uL of Optimem, 500ng of transposon and 500ng of transposase and plated in a Gelatin coated well of a 12 well plate. Media was changed to 2iL after overnight incubation.

#### **siRNA transfection**

For siRNA transfection, E14 cells were dissociated and resuspended in N2B27 + 2iL.  $25x10<sup>3</sup>$  cells were mixed with 400uL 2iL, 1.5 uL Lipofectamine 2000 (Life Technologies), 100uL of Optimem (Life Technologies), siRNA at a final concentration of 40nM and plated in a Gelatin coated well of a 12 well plate. Media was changed to 2iL after overnight incubation. 2iL was withdrawn for differentiation assay after 7h and replaced with N2B27 medium.

### **Generation of Knock-out ESCs using CRISPR-Cas9-mediated mutagenesis**

gRNAs were cloned into U6 vector. Two gRNAs targeting different exons of a gene were co-transfected into E14 ESCs stably expessing Cas9, using Lipofectamine 2000 (Life

Technologies). Transfected cells were selected using G418/Neomicin (50 ug/ml). Clones were picked and expanded in 2iL. gRNA sequences are listed in Supplementary Table 5.

#### **Immunofluorescence staining and Image Analysis**

Immunofluorescence was performed on Fibronectin (Merck, cat. FC010) coated glass coverslips. Cells were fixed for 10 min with 4% Formaldehyde at RT, followed by permeabilization in PBS  $+ 0.5\%$  Triton X-100 for 20 min at RT and blocking with PBS+0.5% Triton X-100 + 3% FBS for 1 hour at RT. Cells were incubated with primary antibodies in blocking solution overnight at 4°C. After washing with PBS, cells were incubated for 30 min at RT with Alexa Fluor-conjugated secondary antibodies (Life Technologies) used at 1:500 dilution. After washing with PBS, cells were mounted with Fluoroshield with DAPI (Sigma Aldrich, F6057). Images were acquired with Leica SP5 confocal microscope equipped with a charge-couples device camera, using the LAS AF software. Antibodies are listed in Supplementary Table 6. For image analysis, Cell Profiler was used to quantify mean fluorescence intensity for each nucleus.

### **Western blot**

Total cell extracts were obtained by lysing cell pellets in Sonication buffer (10mM HEPES pH7.8, 150mM NaCl, 5mM EDTA, 5% glycerol, 0.5% NP40) with the addition of protease inhibitors (Sigma Aldrich, P8340) and 1mM DTT, and sonicated briefly with Bioruptor. PVDF membranes were blocked with 5% milk in TBST 0.5% for 1h at RT. Primary antibodies were incubated overnight at 4°C. HRP-conjugated secondary antibodies were incubated for 1h at RT. Images were digitally acquired using a ImageQuant LAS 4000 (GE Healthcare) and its proprietary software. Antibodies are listed in Supplementary Table 6.

### **Chromatin immunoprecipitation for ChIP-PCR**

For ChIP-PCR, cell suspension was crosslinked with 1/10 volume of fresh Formaldehyde solution (11% methanol free Formaldehyde, 100mM Nacl, 1mM EDTA, 0.5mM EGTA, 50mM HEPES) in culture medium and incubated for 8 min at RT on an orbital shaker. Formaldehyde was quenched by adding 1/20 volume of 2.5M Glycine. After 2 min incubation at RT, cells were centrifuged at 500g for 3 min and cell pellet was washed twice with ice cold PBS+PIC before storage at -80°C. To obtain nuclear lysates, pellets from fixed cells were resuspended  $(1ml/10<sup>7</sup>$  cells) in ice cold LB1 buffer  $(10mM$  NaCl, 1mM EDTA, 50mM HEPES pH 7.5, 10% glycerol, 0.5% NP40, 0.25% Triton X-100) +PIC, rotated for 20min at 4°C and spun for 5min at 1500g in a table top centrifuge. Cell pellet was resuspended  $(1mL/10^7 \text{ cells})$  in ice cold LB2 buffer  $(10mM \text{ Tris} \text{ Hcl pH8})$ , 200mL Nacl, 1mM EDTA, 0.5mM EGTA) +PIC, rotated for 10 min, spun at 1500g for 5 min and resuspended in LB3 buffer (10mM Tris-Hcl pH8, 1mM EDTA, 100mM NaCl, 0.5mM EGTA, 0.1% Na-deoxycholate, 0.5% N-lauroylsarcosine) +PIC. Nuclear lysates were sonicated with Branson Sonifier 450A for 8 cycles (1minON/ 2min OFF) to obtain DNA fragments with an average size of 400bp.

60ug of DNA were diluted in 600uL LB3+PIC and 10 uL of Dynabeads protein G (Life Technologies) were added. Samples were rotated for 3h at 4°C. Supernatants were then incubated overnight at 4°C with 2ug of appropriate primary antibody or IgG in a rotating

wheel, followed by incubation with 10uL of Protein G Dynabeads for 2h at 4°C. Beads were collected with a magnetic stand and were then washed 3 times (5min each on a rotating wheel) with 1mL of low salt wash buffer (0.1% SDS, 2mM EDTA, 1% Triton X-100, 20mM Tris pH8, 150mM NaCl) at 4°C, followed by one wash in high salt wash buffer (0.1% SDS, 2mM EDTA, 1% Triton X-100, 20mM Tris ph8, 500mM Nacl), one wash with LiCl buffer (250mM LiCl, 1% NP40, 1mM EDTA, 10mM Tris pH8) and one wash with 1mL TE buffer +50mM NaCl. Chromatin-antibody complexes were eluted by incubating in 210uL of Elution buffer (50mM Tris-HCl pH8, 10mM EDTA, 1% SDS) on a shaker block at 65°C for 20min followed by centrifugation at 16000g for 1min. Reverse crosslinking was performed by incubating at 65°C overnight. DNA was purified with Qiagen QIAquick PCR Purification kit.

The following antibodies and cell number were used for each ChIP replicate: ESRRB ChIP: 3x10<sup>7</sup> cells, 2ug mouse ESRRB antibody (Perseus cat.PP-H6705-00); H3K27ac ChIP: 3x10<sup>6</sup> cells, 2.5ug rabbit H3K27ac antibody (Abcam cat.ab4729).

### **Chromatin immunoprecipitation library preparation and sequencing**

 $10<sup>7</sup>$  cells were fixed with 1% formaldehyde for 15 minutes at room temperature. Samples for ChIP-seq were prepped as previously described $86$ .

Libraries were prepared from 10 ng of DNA using the NEBNext® Ultra™ II DNA Library Prep Kit for Illumina (New England Biolabs). Quality of libraries was assessed by using Bioanalyzer DNA Analysis (Agilent Technologies), and quantified by using Qubit 4 Fluorometer (Thermo Fisher Scientific).

Libraries were sequenced on a NovaSeq 6000 sequencing system using a paired-end (PE) 100 cycles flow cell (Illumina Inc.).

### **ChIP-sequencing bioinformatic analyses**

Paired sequencing reads were aligned on mouse mm10 reference genome using BWA  $(v0.7.17)^{87}$  and filtered with samtools v(1.9) <sup>88</sup> to remove unmapped read pairs, not primary alignment, reads failing platform quality, with mapping quality score below 30 and duplicate reads were then removed using picard MarkDuplicates ("Picard Toolkit." 2019. Broad Institute, GitHub Repository. [https://broadinstitute.github.io/picard/\)](https://broadinstitute.github.io/picard/) (v.2.18.27).

Each sample was equally split in two pseudoreplicates, peaks were called with MACS2  $(v2.2.5)^{89}$  with p < 0.1 on both samples and pseudoreplicates and filtered after Irreproducible Discovery Rate analysis with a threshold of 0.05. Coverage signal profile was generated with deeptools<sup>90</sup> using CPM normalisation.

# **ATAC-seq and bioinformatic analyses**

ATAC-seq libraries were prepared starting from cryopreserved cells aliquots containing approximately 0.4 million cells. Each aliquot was thawed by brief warming at 37°C in a water bath, dropwise transferred into 10 mL warm 1X PBS (Euroclone, #ECB4004) and then centrifuged at 200 rcf for 5 minutes. Cell pellet was resuspended in 1 mL of warm 1X PBS and 10 uL of suspension were used for cell counting. ATAC-seq libraries (two

for each condition) were generated starting from 100,000 live cells for each sample $91$ . Ten PCR cycles were performed for each library using a SimplyAmp (Applied Biosystems, #A24811) thermal cycler. Finally, the libraries were run on a 2% agarose gel using the E-gel electrophoresis system (Thermofisher, #G6400EU) for size selection. Fragments ranging from 200 bp to 700 bp were then purified using the Zymoclean Gel DNA Recovery Kit (Zymo Research, #D4007). Sequencing was performed using 2x50 bp reads on an Illumina Novaseq-6000. Libraries pool was load on a S1 flowcell at the final concentration of 250 pM using 1% PhiX.

Paired sequencing reads were aligned on mouse mm10 reference genome using BWA  $(v0.7.17)^{87}$  and filtered with samtools  $(v1.9)^{88}$  to remove unmapped read pairs, not primary alignment, reads failing platform quality, with mapping quality score below 30 and duplicate reads were then removed using picard MarkDuplicates (Picard Toolkit." 2019. Broad Institute, GitHub Repository. [https://broadinstitute.github.io/picard/\)](https://broadinstitute.github.io/picard/) (v2.18.27). Peaks were called using the ENCODE ATAC-seq pipeline<sup>92</sup> [\(https://github.com/ENCODE-DCC/atac](https://github.com/ENCODE-DCC/atac-seq-pipeline)[seq-pipeline\)](https://github.com/ENCODE-DCC/atac-seq-pipeline) (v1.10.0) using an IDR threshold of 0.05.

TF motifs enrichment analysis on promoter-annotated peaks (+-2kb from the TSS) was carried out using Homer's findMotifsGenome93 (-size given) for de novo motif discovery. Only transcription factors with a percentage of targets > 8 were considered.

### **CUT&RUN-seq analysis**

Cleavage Under Targets and Release Using Nuclease sequencing (CUT&RUN-seq)94 data, generated in Gretarsson and colleagues<sup>95</sup>, were analysed as follows: raw Fastq-sequences were trimmed to remove adaptors with TrimGalore (v0.4.3.1, -phred33 --quality 20 -stringency 1 -e 0.1 --length 20), quality checked and aligned to the mouse mm10 genome using Bowtie2 (v2.3.4.2, - I 50 -X 800 --fr-N 0 -L 22 -i 'S, 1, 1.15'--n-ceil 'L,0,0.15'--dpad 15 --gbar 4 --end-to-end --score-min 'L,-0.6,-0.6'). Analysis of the mapped sequences was performed using Seqmonk (v1.46.0) and R statistical software (v4.0.4)

### **Generation of Esrrb-knockout in SGET ESC for PGCLC specification**

For analysis of PGCLC induction, *Esrrb* KO cells were generated in the *Stella-GFP: Esg1*tdTomato (SGET) compound-reporter mESC line<sup>57</sup>. Briefly, two spCas9 plasmids (pX459) Addgene #62988) carrying gRNAs that induce deletions of exons 2 and 3 (gRNAs sequences are listed in Supplementary Table 5) were transiently transfected with lipofectamine 3000, following the manufacturers guidelines. Transfected cells were selected with puromycin  $(1.2 \mu g/ml)$  for 60 hours and subsequently seeded at low density (1000) cells per 9.6cm<sup>2</sup>) for single colony picking. After clonal expansion, homozygous knockout clones were identified by PCR genotyping and confirmed by western blot. Three independent clonal WT and *Esrrb* KO cell lines were selected for further analysis.

# **Cell culture and PGCLC induction**

Esrrb KO SGET ESCs were routinely maintained and regularly passaged on gelatin in 2i/L culture media (NDIFF 227 supplemented with PD0325901 (1  $\mu$ M), CHIR99021 (3 $\mu$ M), LIF (1000 U/ml), FBS (1%) and penicillin/streptomycin (1%)); filtered through 0.22 μΜ

filter) in a humified  $CO_2$  incubator at 37°C. Epiblast-like cells (EpiLC) were induced by seeding  $3x10^4$  naive ESC per cm<sup>2</sup> on fibronectin-coated plates and maintained in EpiLC media (NDIFF 227 supplemented with knockout serum replacement (KSR) (1%), ActivinA (20 ng/ml), bFGF (12.5 ng/ml) and penicillin/streptomycin (1%)) for 46 hours. For subsequent induction of PGCLC, 1.5x10<sup>6</sup> EpiLC were seeded per well of an ultra-low attachment microwell 6-well plate (Iwaki 4810-900) using PGCLC culture media (GMEM supplemented with KSR (15%), NEAA (0.1 mM), Sodium Pyruvate (1 mM), Penicillin/ Streptomycin(1%), B-mercaptoethanol (0.1mM), L-glutamine (1mM), BMP4 (500 ng/ml), LIF (1000 U/ml), SCF (100 ng/ml), BMP8a (500 ng/ml), EGF (50 ng/ml). A half-media change was performed every day. See Supplementary Fig. 3 for the gating strategy used.

### **Flow-cytometry of Esrrb KO SGET lines**

After dissociation in single cell suspension using TrypLE, Esrrb KO or WT SGET PGCLC at 3- or 5- days induction were resuspended in PBS/1%FBS and filtered. PGCLC were isolated using fluorescent activated cell sorting with FACS Aria III (Becton Dickinson) and FACS diva software (v9.0), according to  $Stella-GFP(SG)$  and  $Esg-tdTomato$  (ET) expression that is indicative of authentic PGCLC ( $SG + ET^{low}$ ). Data analysis was performed with FlowJo software (v10.7.1).

### **RNA sequencing of Esrrb KO EpiLC and PGCLC**

Total RNA was collected from Esrrb KO or WT bulk ESC, EpiLC and from sorted SG+ETlow PGCLC of three independent biological replicates lines using the PicoPure RNA isolation kit (Applied Biosystems KIT0204), following the manufacturer instructions. After quantification of total RNA with Qubit III and quality check with high sensitivity RNA Screen Tape (Agilent 5067-5579) to ensure RIN > 8.5, 100ng of RNA was used for library preparation for NGS sequencing with NEB next Ultra II Directional RNA protocol for Poly(A) mRNA magnetic Isolation Module (NEB #E7490) following manufacturer guidelines. Multiplexed amplified libraries were sequenced on an Illumina NextSeq (SE50).

### **Bioinformatics analysis of RNA sequencing data for EpiLC and PGCLC**

After removal of the adaptors with TrimGalore (0.4.3.1) raw reads were mapped to the mm10 (GRCm38) reference genome with RNAstar (2.6.0b-2) using default settings. Reads associated with a MAPQ score <20 were discarded. The data was quantified using the RNA-seq quantification pipeline for directional libraries in seqmonk software (v1.46.0) to generate log2 reads per million (RPM) or gene-length-adjusted (RPKM) gene expression values. We determined differentially expressed genes (DEG) using the DESeq2 package (version, 1.24.0) and applying a multiple-testing adjusted  $p$ -value (FDR) <0.05 significance threshold.

#### **Computational modelling**

The computational modelling was performed using the reasoning engine for interaction networks  $(RE:IN)^{17,63,96}$ . This approach supports the modelling of gene networks via Abstract Boolean Networks (ABN), allowing to specify partially known networks by specifying certain interactions as definite while other interactions are designated as possible.

In this logical modelling setting, an ABN contains a set of components which can be active or inactive (represented by a Boolean value). The networks are constrained by experimental observations obtained from experimental measurements, and formal verification methods are utilised to handle the large state space of candidate solutions and identify consistent models when they exist or prove inconsistency which requires a revision of the model. The methodology has proven to be applicable to study stem cell systems and the implementation has been extended to support integration of new analysis procedures and support the use of computational notebooks. The source code is publicly available on GitHub [\(https://](https://github.com/fsprojects/ReasoningEngine) [github.com/fsprojects/ReasoningEngine\)](https://github.com/fsprojects/ReasoningEngine), together with the files used to build the ABN [\(https://github.com/kuglerh/Esrrb\)](https://github.com/kuglerh/Esrrb).

The initial ABN (Extended Data Fig. 8g) was constructed from the experimentally validated ABN (0.717 cABN) described by Dunn and collaborators<sup>39</sup>. We added the formative genes Etv5, Tcf15, Dnmt3a/b, Otx2, Utf1, Lef1, Pou3f1<sup>19,28,29</sup>. We kept the 0.717 cABN definite interactions, connecting the signals LIF, CH and FGF to the network, and added a positive interaction between MEK/ERK and ETV5. All these interactions are based on previous experimental studies that identified the direct targets of these signals<sup>24,26,28,44,97,98</sup>. We also kept the additional 0.717 cABN interactions as possible. We then derived a set of possible interactions from time course gene expression data (Fig. 1c-d), by calculating Pearsons' correlation coefficients (shown in Fig. 7e). A positive interaction between two components was defined as possible when the coefficient between the two components was above a threshold value. A negative possible interaction was set when the Pearson's coefficient was below the negative of the threshold value. A threshold value of 0.55 was determined by constructing a set of experimental constraints (Extended Data Fig. 8h), and looking for the maximum Pearson coefficient threshold that could satisfy those constraints, as described before in<sup>17,63</sup>. Additional possible interactions were obtained from ChIP-seq data (Fig. 3f-g).

Experimental constraints were obtained by discretising expression measurements. We started from the 2iL time course data, calculated the maximum expression value of each component and for each time point we assigned to that component a Boolean value of 1 if its expression was above 0.5 of the maximum value. The naive, formative and committed states correspond to 2iL, 48h and 96h time points, and we also included protein expression levels for Esrrb (Fig. 2h). Esrrb KO constraints were derived from time course RNAseq data of Fig. 5c-e, following the procedure described above, while Esrrb conditional KO data are based on Extended Data Fig. 5b. After verifying that all experimental constraints were satisfiable, we identified required and disallowed interactions (shown in Extended Data Fig 8g). We then generated a set of model solutions and picked a representative one, which was used to calculate trajectories and generate the network diagrams shown in Fig. 7f-g.

### **Statistics and reproducibility**

No statistical method was used to predetermine sample size, but our sample sizes are similar to those reported in previous publications<sup>28,48,60</sup>. No data were excluded from the analyses. Data distribution was assumed to be normal but this was not formally tested. For experiments with cells lines, we randomly allocated a fraction of each cell population to

different biological replicates. For the analysis of immunostaining and flow cytometry data, we analysed random fields or random fraction of cells. Other kind of experiments were not randomized. Data collection and analysis were not performed blind to the conditions of the experiments, but data analyses have been performed with identical parameters and software. Data representation and statistical analyses were performed using R software, unless stated otherwise. The statistical tests used are indicated in figure legends. The number of biological replicates and independent experiments, both >2, is indicated in figures legends. Key experimental results have been obtained by 2 independent operators.

# **Extended Data**

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a: Line chart showing dynamics of mRNA expression based on qPCR of four pluripotency markers (Tfcp2l1, Esrrb, Sall4, Oct4) in E14 cells during monolayer differentiation (withdrawal of either 2iL or 2i for 96h) both in 2iL (purple) and 2i (green). White circles indicate the mean of n=4 independent experiments, shown as dots. P-values indicate twosided unpaired t-test between the indicated time points.

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b: Heatmaps showing Z-score normalised expression of all genes of each group (defined in Fig. 1d) in E14 cells differentiating from 2iL (purple box) and 2i (green box). Integration of n=2 independent biological replicates for each time point. See also Supplementary Table 2 for the biological processes enriched in the 6 signatures.

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#### **Extended Data Fig. 2. Transcriptional response changes during commitment**

a: Bar plot showing the number of AP positive colonies in the clonal assay of cells cultured in 2iL and during differentiation (purple bars) and of cells in which 2iL was re-applied for 24h at the indicated time point (yellow bars, re-induction). Bars indicate mean +/-SD of n=8 independent experiments, shown as dots. Only the sample '24' was measured in n=4 independent experiments. Two-sided unpaired Student t-test.

b: Heatmaps showing Z-score normalised expression of selected genes for each group (naive, formative, committed) during differentiation and re-induction. Integration of n=4 independent experiments for each time point.

c: Barplots showing expression by RNAseq of Jak/Stat direct targets (Socs3 and Stat3, orange), WNT targets (Cdx2 and Axin2, green) and FGF targets (Dusp6 and Spry4, purple) in differentiating cells and after re-induction with 24h of LIF. Mean +/-SD of n=4 independent experiments.

d: UCSC genome browser visualisation of normalised ATAC-seq profiles at the indicated loci. Rectangles indicate peaks found only in 2iL (green) or only at 48h (red). Integration of n=2 biological replicates.

e: Volcano plot summarising published RNA-seq data98 of ESCs cultured in Serum+LIF (S+L) or 2iL. Data were interpolated with the six groups of genes identified in Fig. 1 (naive early and late, formative early and late, committed early and late).

f: Schematic representation of experimental strategy. Cells overexpressing pluripotency genes were mixed and differentiated for 96h. The clonal assay was then performed and cells were collected after 4 days. PCR on genomic DNA was used to identify factors enriched in pluripotent colonies. g: Bar plot showing quantification of AP positive colonies of cells overexpressing an empty vector or pluripotency factors, either maintained in 2iL or differentiated for 96h. Bars indicate mean n=2 independent experiments, shown as dots.

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### **Extended Data Fig. 3. Characterisati on of ESC differentiation and regulation of Esrrb expression**

a: Representative images of immunostaining for EpiSCs markers (Oct4 and T) in WT cells maintained in 2iL or differentiated for 96h in N2B27 or in presence of CHIR and Activin A to induce T expression. Scale bar=25μm. Similar results were obtained in n=2 independent experiments.

b: Barplots showing expression by RNA-seq of key EpiSCs markers in WT cells maintained in 2iL or differentiated for 96h upon 2iL withdrawal. Mean of n=2 independent biological

replicates is shown. n.d. indicates samples in which expression was undetectable or below 5 CPM.

c: Violin plot showing quantification of mean intensity (arbitrary units) for ESRRB in E14 cells cultured in 2iL or differentiated for 48h, 96h or 120h (48, 96 120) or after reinduction with 2iL for 24h (48+24 and 96+24). At least 3 randomly selected fields for each sample have been measured. N=3 independent experiments were analysed. Each violin indicates an independent experiment.

d: Left: Representative images of clonal assay followed by Alkaline Phosphatase staining of cells either maintained in 2iL or differentiated for 96h with or without the Gsk3 inhibitor CHIR (96+CHIR). Centre: Bar plot showing quantification of AP positive colonies. Bars indicate mean of 2 biological replicates, shown as dots. Right: Bar plot showing relative mRNA expression, measured by qPCR, for Esrrb. Bars indicate mean of 2 biological replicates, shown as dots.

e: Barplot showing expression by qPCR of Esrrb in E14 cells cultured in 2iL, N2B27, ActivinA (20ng/ml), FGF2 (12.5 ng/ml) and inhibitors of TGF-beta (A83- 01, 1 μM) and FGF signalling pathways (PD173074, 0.5 μm) for 48h. Mean +/- SD of 3 independent biological replicates are shown as dots.

f: ChIP-PCR analysis of E14 cells cultured in 2iL and differentiated for 24h, 48h, 72h and 96h in N2B27. Immunoprecipitation was performed using anti-ESRRB and anti-H3K27ac antibody followed by PCR with primers located on *Esrrb intron or Tfcp2l1*, Utf1 and Tcf15 promoter regions. Fold-enrichment over a negative region is plotted. Mean +/-SD of n=4 independent experiments, shown as dots.

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#### **Extended Data Fig. 4. Regulation of Esrrb expression**

a: Genome browser snapshot of histone modifications on regulatory regions on Esrrb gene in naive (2iL, blue) and formative (48h, red) states. Integration of n=2 biological replicates. b: Top: Representative images of immunostaining for H3K27ac (green) and ESRRB (red) in E14 cells cultured in 2iL, differentiated for 84h (84) or after a pulse with 2iLIF for 24h at 84h (2iL pulse), with or without Sodium Butyrate (NaButy or H2O) treatment. Nuclei were identified by DAPI staining (blue). Scale bar: 25μm. Bottom: Barplot showing quantification

of mean intensity for H3K27ac (blue) and ESRRB (red) immunostaining normalised to the 2iL H2O samples. Mean +/-SD of n=3 independent experiments, shown as dots. c: Plots showing abundance of the indicated histone modifications detected by CUT&RUN and DNA methylation in naive (2iL, left) and formative cells (48, right), on regions bound by ESRRB only in 2iL ('2iL'), only at 48h ('48'), or in 2iL and after 48h ('2iL - 48'), identified in Fig. 4a-b. Integration of n=2 biological replicates. For '2iL' and '2iL - 48' regions we observed enrichment for H3K4me3, H3K27ac, H3K27me3 and H3K9me3 in naive cells. In formative cells, H3K4me3 and H3K9me3 decreased by ~50% while H3K27me3 was lost, while DNA methylation substantially increased. Those regions, where Esrrb binding increases at 48h ('48'), are heavily DNA methylated and pre-decorated by H3K4me3 and H3K27ac in naive cells, while the repressive marks H3K9me3 and H3K27me3 are absent.



#### **Extended Data Fig. 5.** *Esrrb* **KO clones characterisation**

a: Left: Bar plot showing the number of AP positive colonies after clonal assay of cells with loxP sites flanking the second exon of both alleles of *Esrrb* (*Esrrb* fl/fl, dark blue) and Esrrb KO cells generated by Cre-mediated recombination (light blue), cultured in 2iL and differentiated for 24h, 48h and 72h in N2B27. Mean +/- SD of n=3 independent experiments, shown as dots. Right: Barplots showing expression measured by qPCR of Esrrb in Esrrb fl/fl (dark blue) and Esrrb KO (light blue) cells cultured in 2iL and differentiated for 24h, 48h and 72h. Mean of n=2 independent experiments.

KIf<sub>5</sub>

 $Sox2$ 

KIf4

Tbx3

Nanog Tfcp2l1

Faf4

KIf<sub>2</sub>

Pou<sub>5f1</sub>

b: Schematic representation of edited alleles of 3 CRISPR-generated *Esrrb* KO clones. The edited genome is indicated in red. The blue sequence is an insertion. Black bars indicate deletions.

c: Bright field images of 3 CRISPR-generated Esrrb KO clones, cultured in 2iL and after 48h of 2iL withdrawal. Scale bar: 300μm.

d: Barplot showing expression by RNAseq of naive markers in WT E14 cells and in 3 CRISPR-generated Esrrb KO clones. WT values were set as 1. Mean of n=2 biological replicates.



**Extended Data Fig. 6. Proliferation and viability analysis of** *Esrrb* **KO clones and FS differentiation**

a: Left: Proliferation assay over 4 days of WT cells and Esrrb KO clones, cultured in 2iL. Mean +/-SD of n=3 independent experiments is shown. Right: Barplot showing percentage of dead cells measured by Propidium Iodide staining in two WT cell lines and 2 Esrrb KO clones. Boiled cells (95 degrees Celsius for 5 min) were used as positive control. Mean +/-SD of n=3 independent experiments is shown. P-value calculated with One-way ANOVA followed by Tukey multiple pairwise-comparisons.

b: Gene Set Enrichment Analysis (GSEA) of key markers of Apoptosis and cell stress in WT and *Esrrb* KO cells cultured in 2iL (naive) and 48h (formative), which failed to detect any significant differences between WT and KO cells. P-values calculated by the GSEA software.

c: Expression measured by qPCR of selected naive and formative genes in WT E14 cells (grey) and three Esrrb KO clones (blue) cultured in 2iL and after 24h, 48h and 72h of differentiation in N2B27. Mean of n=2 biological replicates is shown.

d: Expression measured by qPCR of naive and lineage markers in Conditional Esrrb cells kept in 2iL+DOX. WT cells and Esrrb KO expressing a DOX-inducible empty vector (iEmpty) kept in  $2iL+DOX$  are used as controls. Mean  $+/-$  SD n=3 independent experiments (dots) is shown.

e: Gene expression of formative genes measured by qPCR in Conditional Esrrb cells cultured in  $2iL+DOX$  (3<sup>rd</sup> bar) and withdrawn of  $2iL$  and DOX for 48h (4th bar). Esrrb KO and WT cells expressing an inducible Empty vector (iEmpty) differentiated for 48h were used as controls (2nd and 6th bars). Bars indicate mean +/-SD of n=5 independent experiments, shown as dots. One-way ANOVA followed by Tukey multiple pairwise-comparisons.

f: Left: Experimental strategy used for FS cells generation from ESCs. Right: Representative images of WT cells cultures in AloXR medium for 3 passages (P1, P2 and P3). Scale bar: 25μm. Similar results were obtained in n=3 independent experiments.

g: Relative mRNA expression measured by qPCR of naive and formative genes in E14 cells cultured in 2iL or AloXR medium for up to 3 passages. Mean of n=3 technical replicates.

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### **Extended Data Fig. 7. FS cell differentiation of** *Esrrb* **KO clones**

a: Gene Set Enrichment Analysis (GSEA) of key markers of Apoptosis and cell stress in WT and *Esrrb* KO cells cultured in 2iL (naive) and P1/48h (formative) failed to detect any significant differences between WT and KO cells. P-values calculated by the GSEA software.

b: PCA of RNA sequencing data of WT and *Esrrb* KO cells during FS differentiation. Genes contributing to Principal Components PC1 and PC3 are indicated. N=3 independent

biological replicates, shown as dots, for 2iL samples. N=4 for P1-P3 samples. N=2 for KO3 at P2 and P3.

c: Heatmaps showing mean normalised relative mRNA expression measured by qPCR of naive and formative genes in WT and Esrrb KO cells cultured in 2iL or AloXR medium for up to 3 passages (P1, P2, P3). Mean of n=3 technical replicates.

d: Representative images of immunostaining for TFCP2L1 and OTX2 in WT cells (left panels) and for OTX2 in Esrrb KO cells (right panels) cultured in 2iL or AloXR medium for up to 3 passages. Nuclei were identified by DAPI staining (blue). Scale bar: 25μm. Similar results were obtained in n=2 independent experiments.

e: Left: Representative images of WT and Esrrb KO cells cultured in FGF2+ActivinA+XAV for at least 6 passages, to induce EpiSCs differentiation. Scale bar: 25μm. Right: Barplots showing gene expression measured by qPCR of naive (Esrrb and Klf4), general pluripotency (Oct4) and EpiSCs (Fgf5, T) markers in WT and Esrrb KO cells cultured in FGF2+ActivinA+XAV for at least 6 passages, to induce EpiSCs differentiation. Embryoderived EpiSCs (OEC2 and GOF18) and WT E14 ESCs cultured in 2iL are used as controls. Mean +/-SD of N=4 biological replicates, shown as dots.

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**Extended Data Fig. 8. PGCLC differentiation of** *Esrrb* **KO clones**

a: Normalised frequency of individual gRNAs (indicative of KO) targeting Esrrb during induction of PGCLC (CRISPR screening results from 57). Dots indicate the mean of  $n=2$ independent CRISPR screens.

b: Left: Frequency of individual gRNA targeting Esrrb in EpiLC that have acquired correct formative status (Stella-) and EpiLC blocked from formative transition (Stella+). Note Esrrb gRNA (KO) are enriched in EpiLC that fail to acquire formative status, indicating a functional role for Esrrb in promoting the formative program. Right: Normalised frequency

of individual gRNAs targeting Olfr568 as a representative negative control gene that should not influence the induction of PGCLC upon KO. Dots indicate the mean of n=2 independent CRISPR screens.

c: Immunoblot of clonal lines derived from SGET ESC transiently transfected with Cas9 and gRNAs binding Esrrb coding sequence. Out of 5 independent Esrrb KO clones, 3 (A1.2, B2.1, A2.5) were randomly chosen for further validations. Beta-TUBULIN was used as loading control. The experiment was repeated 3 times with similar results. *Esrrb* KO clones do not display Esrrb protein expression, but a shorter mRNA can still be detected (Fig. 7d). d: Schematic representation of SGET activation during in vitro cell fate transitions of ESC (Stella+/Esg1+) into EpiLC (Esg1+) and early and late PGCLCs (Stella+) (adapted from Hackett et al., 2018).

e: Total number of cells in SGET WT and Esrrb KO clones obtained after 3 days of PGCLC induction from EpiLC differentiation. Mean  $+/-SD$  of n=3 independent experiments (dots) is shown.

f: Gene expression of selected genes in WT (grey) and n=3 independent Esrrb KO SGET lines (blue) at EpiLC, d3 and d5 PGCLC stages.

g: Expression of the PGC-early (left) and PGC-late (right) geneset in EpiLC, d3 and d5 PGCLC from WT and Esrrb KO lines. Bars indicate the median, box indicates the 25th and 75th percentiles, whiskers represent median plus/minus the interquartile (25-75%) range multiplied by 2. Two-sided paired Student t-test, n.s. not significant. Integration of  $n=3$ biological replicates for each sample.

h: Gene expression of BMP direct targets in WT (grey) and n=3 independent *Esrrb* KO SGET lines (blue) at EpiLC, d3 and d5 PGCLC stages.

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#### **Extended Data Fig. 9. Differentiation of** *Esrrb* **KO clones in 2D and 3D**

a: Heatmap showing Z-scored, mean-scaled, normalised gene expression, measured by RNA-seq, of master regulator genes for each of the three primary germ layers and trophoblast in WT cells and three Esrrb KO clones cultured in 2iL and after 24h, 48h and 72h of differentiation in N2B27. Integration of n=2 biological replicates for each sample. b: Representative images of WT cells cultured in N2B27 medium in matrigel for 48h, 72h or 96h, to allow 3D organisation and lumenogenesis. F-actin was labelled by Phalloidin

staining (green) and immunostaining for the apical protein PODXL was performed (red). Scale bar: 30 μm. Similar results were obtained in n=5 independent experiments. c: Top: Barplot showing quantification of number of structured/field in WT and Esrrb KO cells cultured in N2B27 medium in matrigel for 48h, 72h or 96h. Bars indicate mean of 2 independent experiments, shown as dots. Centre: Violin plot showing quantification of Area (expressed in pixels) of >14 structures in WT and Esrrb KO cells. P-values calculated by two-way repeated measures ANOVA. Similar results were obtained in 3 independent experiments. Bottom: Violin plot showing quantification of the ratio of the 2 main diameters (roundness) of  $>17$  structures in WT and *Esrrb* KO cells, as shown in the WT panel. P-values indicate two-sided unpaired t-test. Similar results were obtained in 3 independent experiments. Box plots show  $1<sup>st</sup>$ ,  $2<sup>nd</sup>$  and  $3<sup>rd</sup>$  quartile, whiskers represent median plus/minus the interquartile (25-75%) range multiplied by 1.5.

d: Line plots showing quantification of F-ACTIN intensity along the diameter of 3D structures obtained by culturing WT and Esrrb KO cells in N2B27 in matrigel for 48h, 72h or 96h. At least 8 structures were quantified from n=2 independent experiments. The shades indicate the SD.

e: Violin plots showing quantification of OTX2 intensity in 3D structures obtained from WT and Esrrb KO cells cultured in N2B27 in matrigel for 48h. N>380 nuclei for each sample. Two independent experiments are shown (left and right). Box plots show 1<sup>st</sup>, 2<sup>nd</sup> and 3<sup>rd</sup> quartile, whiskers represent median plus/minus the interquartile (25-75%) range multiplied by 1.5.

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a

 $\mathbf c$ 

 $\mathbf d$ b Otx2 Esrrb  $H = 0$ tx2 cond. KO  $1.5$ Formative Esrrb KO Naive to Naive to Formative  $to$ Relative mRNA expression<br>C. C. G. G. C. C.  $\overline{E}$ formative Committed formative to  $1.2 -$ Committed Naive **ALL** Timestep  $\overline{0}$ 20  $\overline{0}$ **H3K27**  $4.44.$ لتحط 20 0 20  $0 \mid 20$ Formative LIF and the first GSK3i 13K9me3 H3K27me3 H3K4me3 Naive FGF **MEK** Formative Tcf3 Stat3 Naive Act A A83 FGF **LIGd V2B27**  $\overline{a}$  $Oct4$ Formative Sox2 Naive Nanog Naive Pluripotency Formative KIf<sub>2</sub> عا المبه Tfcp2l1 KIf4 Gbx2  ${\sf Tbx3}$ Esrrb Tbx3 Tcf3 Esrrb Tfcp2l Otx2 Otx2 GSK3i Formative Pluripotency Tcf15 Gbx2 Dnmt3a Lef1 Utf1 **LIE** Stat3 Etv<sub>5</sub> Dnmt3a Dnmt3b Pou3f1 Dnmt3b **Signal Activated** Signal or Component Inactive **MEK** Nanog KnockOut **Component Active** Pou3f FGF Not constrained Oct4 Etv5 Required and Definite **Disallowed** -Optional

Signals and mediators Core Naive Pluripotency **S**Formative Pluripotency Component Active Signal Activated Signal or Component Inactive

**Extended Data Fig. 10. Network analysis of formative gene regulation by Esrrb**

a: Barplot showing expression of Otx2 measured by qPCR in ES cells treated for 48h with ActivinA (20ng/ml), FGF2 (12.5 ng/ml) and inhibitors of TGF-beta (A83-01, 1 μM) and FGF signalling pathways (PD173074, 0.5 μm). Cells cultured in 2iL or N2B27 for 48h were used as controls. Mean +/-SD of n=3 independent biological replicates (dots) are shown. b: Genome browser snapshot of histone modifications at Otx2 enhancer (E) bound by Esrrb and promoter  $(P)$ , in naive and formative cells. Profiles are the integration of  $n=2$  biological replicates.

c: ABN derived from a Pearson correlation threshold of 0.56 (see Methods). Solid black lines indicate required and definite interaction, dashed lines indicate optional interactions,

red lines indicate disallowed interactions. Positive regulations are indicated by a black arrow, negative regulations are indicated by a black circle-headed line.

d: Summary of 4 experimental constraints, each with initial (left column) and final (right column) conditions. Gene expression is discretized as high (blue) or low (white).

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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# **Data availability**

Sequencing data that support the findings of this study have been deposited in the Gene Expression Omnibus (GEO) under accession code GSE184137. Previously published RNAseq and CUT&RUN data that were re-analysed here are available under accession codes GSE23943 and GSE146863. Primers, oligonucleotides sequences and antibodies are present in Supplementary Tables 4, 5 and 6. Source data are provided with this study. All other data supporting the findings of this study are available from the corresponding author on reasonable request.

#### **Code availability**

Data files and models used to build the ABN are available at [https://github.com/kuglerh/](https://github.com/kuglerh/Esrrb) [Esrrb.](https://github.com/kuglerh/Esrrb) The code used to build the ABN has been described in  $17,39,63$  and made publicly available on GitHub at: <https://github.com/fsprojects/ReasoningEngine>.

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# **Editor summary**

Carbognin, Carlini, Panariello et al. report that ESRRB drives activation of the transcriptional program regulating the formative transition of naive embryonic stem cells.

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**Figure 1. Transcriptional changes associated with irreversible exit from naive pluripotency.** a: Schematic representation of the first stages of exit from the naive state. Upon 2i or 2iL withdrawal, cells transit through a reversible phase before being irreversibly committed to differentiate.

b: Top: Morphology and AP staining images after clonal assay of E14 cells cultured in 2iL and after 2iL withdrawal. Bottom: Barplot showing the relative number of AP positive pluripotent colonies after clonal assay of E14 cells cultured both in 2iL (purple) and 2i (green) and after the withdrawal of either 2iL or 2i every 12h for 96h. Mean +/-SD of n=3 independent experiments. Unpaired two-sided t-test '2iL 0' vs '48' p=0.97, '2iL 0' vs '96' p=0.0096. Scale bars= 30 μm.

c: PCA of RNA sequencing data of cells differentiating from 2iL (purple) and from 2i (green).

Genes contributing to the first two Principal Components are indicated. N=2 independent biological replicates for each time point, shown as dots.

d: Top: Line plot showing expression dynamics of differentially expressed genes during differentiation, grouped by hierarchical clustering based on Pearson Correlation. Grey shades represent a 95% bootstrap confidence interval around mean values. Integration of n=2 independent biological replicates for each time point.

Pie charts represent the intersection of the gene signatures with published gene sets of mouse embryo development at E4.5, E5.5 and E6.5. Bottom: Heatmaps show the sum of the log2-scaled normalised expression values of the intersection lists shown in the pie charts, averaged by different time points.

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#### **Figure 2. Differentiation reversibility is associated with Esrrb expression**

a: UCSC genome browser visualisation of normalised ATAC-seq profiles at the indicated loci. Rectangles indicate peaks found only in 2iL (green), only at 48h, both in 2iL and 48h (purple). Integration of n=2 independent biological replicates for each time point. b: Ballon plot summarising the percentage of ATAC peaks containing a given motif, and the associated p-value, at the indicated time points. Peaks on promoters, peaks at 10Kb from TSS and all peaks were analysed and are represented in blue, green and orange respectively. Integration of n=2 independent biological replicates for each time point.

c: Balloon plot summarising published ChIP-seq data of ESCs cultured in Serum+LIF from the Codex compendium<sup>37</sup>. The size of each balloon indicates the fold enrichment, the colour indicates the statistical significance.

d: left: Bar plot showing the number of AP positive colonies after clonal assay performed on cells overexpressing a pool of pluripotency genes and maintained in 2iL (grey bars) or differentiated for 96h (blue bars). Cells overexpressing an empty vector were used as control (empty). Bars indicate mean +/-SD of n=3 independent experiments, shown as dots. Right: Bar plot showing enrichment of genomic integrations of 8 naive genes in cells differentiated for 96h and plated for clonal assay compared to cells in 2iL. Bars indicate mean +/-SD of n=3 independent experiments, shown as dots.

e: Representative images of clonal assay followed by Alkaline Phosphatase staining of cells overexpressing an empty vector or pluripotency factors, either maintained in 2iL or differentiated for 96h. N=2 independent experiments, quantified in Extended Data Fig. 2g. f: Immunostaining for ESRRB (green) in E14 cells cultured in 2iL or differentiated for 48, 96 or 120h (48, 96 120) or after reinduction with 2iL for 24h (48+24 and 96+24). Nuclei were identified by DAPI staining (blue). Scale bar: 25μm. N=3 independent experiments, quantified in Extended Data Fig. 3c.



### **Figure 3. Esrrb promotes the expression of formative genes**

a: Schematic representation of E14 cells transfected with an inducible Esrrb-Ires-Venus vector (EIV) and differentiated for 96h with or without Doxycycline (DOX) treatment. Cells were sorted for presence or absence of Venus expression (EIV+ and EIV- respectively) and further characterised.

b: Left: Representative images of Alkaline phosphatase staining after clonal assay of cells expressing EIV or an inducible Empty vector (iEmpty), cultured in 2iL or without 2iL for 96h (96), in the presence of DOX. Right: Barplot showing number of AP positive colonies in cells expressing EIV or iEmpty, cultured in 2iL or without 2iL for 96h, in the presence or absence of DOX (+D or - D). Mean +/-SD of 4 biological replicates. Two-sided unpaired Student t-test.

c: Heatmaps showing mean-scaled normalised expression levels, measured by RNA-seq, of selected naive, formative and committed genes in E14 cells expressing EIV cultured in 2iL or differentiated for 96h in the presence or absence of DOX (96-DOX or 96+DOX respectively). Integration of n=2 independent experiments.

d: Expression levels of selected naive and formative genes measured by qPCR in cells treated as described in Fig. 3b. Mean of n=2 independent experiments. Expression of naive genes is normalised to iEmpty cells kept in 2iL -D. Formative genes are normalised to E14 cells differentiated for 48h.

e: Scatter plot showing transcriptome analysis of E14 cells expressing EIV cells differentiated for 96h in N2B27 with or without DOX. Down-regulated (Log2FC < -1 and p-value  $< 0.01$ ) and Up-regulated (Log2FC  $> 1$  and p-value  $< 0.01$ ) genes are plotted on the left or right part of the panel respectively. The Y-axis indicates the mean expression on a log scale. Genes belonging to the 6 genes signatures described are represented by coloured dots. Selected genes are highlighted. Integration of n=2 independent experiments.

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#### **Figure 4. Esrrb promotes the expression of formative genes**

a,b: ChIP-seq analysis of E14 cells cultured in 2iL and differentiated for 48h and 96h in N2B27. Time points are colour-coded in blue (2iL), cyan (48h) and yellow (96h). N=1 biological replicate. a: Venn diagram showing the intersection of significant ESSRB peaks for each given time point obtained by ChIP-seq analysis of E14 cells cultured in 2iL and differentiated for 48h and 96h in N2B27.

b: Binding heatmaps displaying the read coverage density of ESSRB peaks along with average intensity. Peaks are grouped by the presence in one or multiple time points.

For example, the "2iL - 48" group contains peaks found both in 2iL and after 48h of differentiation.

c: Representative genome browser snapshots of selected gene loci bound by ESSRB in each given time point. Both reads distributions as line plots and peak intervals are displayed. N=1 biological replicate.

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#### **Figure 5. Esrrb coordinates the activation of naive and formative programs.**

a: Left: Bar plot showing number of AP positive colonies after clonal assay of E14 cells transfected with a non-targeting control siRNA (siCo, dark grey), siGFP (light grey) or siEsrrb (blue) and cultured in 2iL or differentiated for 24h and 48h. Centre and Right: Expression analysis by qPCR of *Esrrb* and *Tfcp211* genes in E14 cells transfected with siCo, siGFP and *siEsrrb* and differentiated for 24h or 48h. Bars indicate mean +/-SD of n=4 independent experiments, shown as dots. The 24h sample was analysed in n=3 experiments.

b: Top: Immunoblot of clonal lines derived from E14 cell population stably expressing Cas9 and transfected with 2 gRNAs flanking Esrrb DNA-binding region. Three Esrrb KO clones were chosen (KO1, KO2, KO3). GAPDH was used as a loading control. Bottom: Barplot showing number of AP positive colonies after clonal assay of E14 cells (WT) and 3 Esrrb KO clonal lines cultured in 2iL and after 24h, 48h and 72h of differentiation. Mean +/-SD from n=3 independent experiments, shown as dots.

c: PCA of RNA sequencing data obtained from E14 (WT) and 3 Esrrb KO clones cultured in 2iL and after 24h, 48h and 72h of differentiation. N=2 biological replicates for each data point, shown as dots.

d: Transcriptome analysis of Esrrb KO cells cultured in 2iL and after 24h, 48h and 72h of differentiation in N2B27. Down-regulated and Up-regulated genes (P-value <0.05, FC >1 or <-1, compared to WT) are plotted on the left or right part of each panel. Genes belonging to the 6 genes signatures are highlighted with coloured dots. Integration of n=2 biological replicates for each cell line. Mean of the 3 independent Esrrb KO clones.

e: Heatmaps showing mean-scaled normalised expression levels, measured by RNA-seq, of selected naive, formative and committed genes in WT and Esrrb KO clones. Integration of n=2 biological replicates for each cell line. Mean of the 3 independent Esrrb KO clones.

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#### **Figure 6. Esrrb is required for generation of FS cells**

a: Experimental strategy used to induce Esrrb specifically at the time of activation of the formative program.

b: Relative expression of Esrrb and selected formative genes measured by qPCR in Conditional Esrrb cells differentiated for 72h and treated with a pulse of DOX between 24 and 48h. Esrrb KO clones expressing an inducible Empty vector (iEmpty) served as controls. Bars indicate mean  $+/-$  SD of n=5 independent experiments for Tcf15 and n=3 for all other markers, shown as dots.

c: Experimental strategy used to remove Esrrb at the time of activation of the formative program. d: Immunostaining for ESRRB in WT cells in 2iL and in Conditional Esrrb cells cultured either in the presence or absence of DOX for 48h. Esrrb KO cells expressing an Empty vector served as negative controls. Scale bar= 25 μm. Representative images from 3 independent experiments.

e: Volcano plot depicting DEGs (adjusted P-value<0.05) in *Esrrb* conditional cells kept without DOX vs WT cells after 48h of differentiation. Genes belonging to the 6 gene signatures are highlighted with coloured dots. Total number of Formative early and Formative late genes down and up-regulated in Conditional Esrrb cells are coloured in green and purple in the bottom corners. Integration of n=5 independent experiments. f: RNAseq analysis in Esrrb conditional cells withdrawn of 2iL and DOX for 48h (3rd bar). WT cells expressing an inducible Empty vector (iEmpty) cultured either in 2iL or differentiated for 48h were used as controls (1st and 2nd bar). Bars indicate mean +/-SD of n=5 independent experiments, shown as dots.

g: Representative images of WT and Esrrb KO cells cultured in AloXR for 3 or 9 passages. Scale bar: 25<sub>km</sub>. Esrrb KO cells collapsed between passage 4 and 6 in n=3 independent attempts.

h: Line plots showing gene expression during FS differentiation. Mean  $+/-$  SD of n=4 independent biological replicates, shown as dots.

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#### **Figure 7. Differentiation towards PGCs is impaired by loss of Esrrb**

a: Left: Quantification of the percentage of Stella-GFP positive PGCLC at day3 (early) and day5 (late) of independent WT (grey) and *Esrrb* KO SGET lines (blue) (n=3 independent KO clones and matching WT controls, shown as dots). Bar indicates mean value. p-values indicate two-sided unpaired t-test. Right: Flow cytometry plots showing impaired induction of PGCLC in Esrrb-knockout (KO) cells. Percentages of Stella+ PGCLC are shown in representative plots of three independent WT and KO lines.

b: PCA showing the developmental trajectory of independent Esrrb KO (blue) and matched-WT (grey) SGET lines during induction of PGCLC, based on the global transcriptome of n=3 independent KO clones and matching WT controls, shown as dots.

c: Volcano plots depicting DEGs in Esrrb KO EpiLC, d3 and d5 PGCLC. Down-regulated and Up-regulated genes (adjusted p-value <0.05) are plotted on the left or right part of each panel respectively. Formative -early and -late and PGC -early and -late signatures (genesets) are highlighted with coloured dots indicating general shifts in activity of specific programs. Integration of n=3 independent KO clones and matching WT controls.

d: Barplots showing gene expression of selected genes in independent WT (grey) and Esrrb KO lines (blue) at EpiLC, d3 and d5 PGCLC stages. Integration of n=3 independent KO clones and matching WT controls. See also Extended Data Fig. 8.

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#### **Figure 8. Impaired lumenogenesis in Esrrb KO 3D structures**

a: Representative images of WT and Esrrb KO cells cultured in N2B27 medium in matrigel for 96h. Nuclei were identified by DAPI staining (blue). Left: Filamentous (F) ACTIN was labelled by Phalloidin staining. Right: Immunostaining for PODXL. Scale bars: 30μm. Similar results were obtained with 2 Esrrb KO clones in n=2 independent experiments. b: Barplot showing quantification of number of structures with an apically localised PODXL (polarised), with a defined central cavity (lumen) or negative for PODXL (negative) in WT

and Esrrb KO cells cultured in N2B27 medium in matrigel for 48h, 72h or 96h. Bars indicate mean of n=2 independent experiments, shown as dots.

c: Heatmaps showing mean normalised expression measured by qPCR of the naive gene Tfcp211 and formative genes in WT and Esrrb KO cells in 2iL or cultured in N2B27 in matrigel for 24h, 48h, 72h or 96h. Mean of n=3 independent experiments. Stars indicate p-value<0.05 calculated by two-sided unpaired Student t-test.

d: Representative images of immunostaining for OTX2 in WT and Esrrb KO cells cultured in N2B27 in matrigel for 48h. Scale bar: 30μm. Similar results were obtained with 2 Esrrb KO clones in n=2 independent experiments.

e: Heatmap showing Pearson's correlation of naive, core and formative genes, obtained from RNAseq data of 2iL withdrawal (Fig. 1c-d)

f: Left, trajectory followed by WT ESCs from the naive (step 0) to formative (step 9) to committed state (step 14) in a representative model. Right, trajectory followed by Esrrb KO cells.

g: Network representation of the model used to calculate the trajectories shown in f. Black solid lines indicate interactions from active components. Grey lines indicate interactions not present, as they emanate from inactive components. Positive regulations are indicated by a black arrow, negative regulations are indicated by a black circle-headed line.