Single-Cell RNA Sequencing of *Sox17*-Expressing Lineages Reveals Distinct Gene Regulatory Networks and Dynamic Developmental Trajectories

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Abstract

During early embryogenesis, the transcription factor SOX17 contributes to hepato-pancreato-biliary system formation and vascular-hematopoietic emergence. To better understand *Sox17* function in the developing endoderm and endothelium, we developed a dual-color temporal lineage-tracing strategy in mice combined with single-cell RNA sequencing to analyze 6934 cells from *Sox17*-expressing lineages at embryonic days 9.0-9.5. Our analyses showed 19 distinct cellular clusters combined from all 3 germ layers. Differential gene expression, trajectory and RNA-velocity analyses of endothelial cells revealed a heterogenous population of uncommitted and specialized endothelial subtypes, including 2 hemogenic populations that arise from different origins. Similarly, analyses of posterior foregut endoderm revealed subsets of hepatic, pancreatic, and bil-iary progenitors with overlapping developmental potency. Calculated gene-regulatory networks predict gene regulons that are dominated by cell type-specific transcription factors unique to each lineage. Vastly different *Sox17*-regulons found in endoderm versus endothelial cells support the differential interactions of SOX17 with other regulatory factors thereby enabling lineage-specific regulatory actions.

Key words: single-cell RNA sequencing; Sox17; endoderm; hepato-pancreato-biliary system; endothelium; hematopoiesis.

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Graphical Abstract





2. Transcriptomic profile and developmental trajectory analyses



3. Identification of lineage-specific gene regulatory networks and Sox17 regulons



Introduction

Sets of so-called "master" regulatory genes, such as those in the *Sry*-related SOX transcription factor (TF) family, play critical roles in a spatiotemporally modulated and hierarchically organized cascade of such networks, enabling progressively more complex specification of the many cellular lineages required for completing organogenesis. *Sox17* is a crucial contributor to multiple developmental processes in early vertebrate embryogenesis.¹⁻³ A defining feature of all SOX proteins is a high mobility group (HMG) box domain⁴ that binds the minor groove of the DNA double helix, resulting in DNA bending that enables the overlaying chromatin topology to be modulated.⁵ Interactions between SOX17 and other protein partners during development enable *Sox17* to dynamically regulate target genes⁶⁻⁸ in multiple lineages, including extra-embryonic endoderm, definitive endoderm, vascular endothelium, hematopoietic stem cells, and oligodendrocytes.⁹⁻¹¹

Previous analyses of bulk transcriptomic changes in Sox17null embryos and Sox17-overexpressing cells in culture produced highly variable predictions of Sox17 downstream targets, suggesting cell type-specific effects.¹²⁻¹⁵ Single-cell RNA sequencing (scRNAseq) has enabled investigation of transcriptomic features across different cell types and developmental trajectories. While endoderm development (especially posterior foregut), and endothelium-derived hematopoiesis have been broadly subjected to scRNAseq transcriptomic analyses,¹⁶⁻¹⁹ a more focused decoding of Sox17 lineages is necessary to gain deeper insights into the development of subsets of endodermal and mesodermal tissues.

In this study we used a Sox17-centric strategy, utilizing a $Sox 17^{GFPCre}$ allele alone or in combination with a $R26^{LSL}$. TdTomato Cre reporter, to isolate Sox17-expressing cells from E9.0 - E9.5 embryos. scRNAseq analysis of these cells revealed multiple clusters of endoderm, endothelium, and hematopoietic cells. Trajectory analysis of the endothelial compartment identified 2 pools of hemogenic endothelial cells of different origins. By integrating the endodermal cluster with a previously published dataset,²⁰ we observed a spectrum of overlapping transcriptomic profiles among the hepatic, pancreatic, and biliary progenitors as they segregate within the posterior foregut domain. Applying pySCENIC,²¹ which infers scRNAseq co-expression patterns between genes and further refines direct targets using existing TF bindingmotif databases to predict active gene regulatory networks (GRNs) in various cell types, we identified prospective distinct endodermal and endothelial-specific gene targets for SOX17.

Methods

Mouse Lines

The Sox17GFPCre allele (Sox17tm1.3(CreGFP)Mgn, MMRRC 036463-UNC), containing a GFPCre fusion protein in lieu of SOX17 coding sequences,²² was bred into a CD1 background and maintained in a heterozygous state. Mice that are heterozygous for the $Sox17^{GFPCre}$ allele exhibit no obvious phenotype, are fertile, born at the expected Mendelian ratios, and have normal life expectancy. Sox17GFPCre heterozygous embryos for sequencing experiments were generated by crossing Sox17^{GFPCre} heterozygous males (CD1 background) with either wild-type (CD1 background) or R26^{LSL.TdTomato} (B6.Cg-Gt(ROSA)26Sor^{tm14(CAG-tdTomato)Hze}/I. The Iackson Laboratory, #007914) homozygous (C57BL/6J background) females. Cre-negative, Sox17 wild-type embryos harvested from the same dam established baseline fluorescence for cell sorting. Embryos at embryonic day (E) 9.0-9.5 were dissected in cold PBS and staged by Theiler's criteria. Genotypes were from PCR analysis of yolk sac DNA and fluorescence signal (green indicating presence of Sox17GFPCre and red indicating recombination of R26^{LSL.TdTomato} by Sox17^{GFPCre}).

Genotyping

Tail or yolk-sac tissue digested with proteinase K was analyzed by PCR assay detecting wild-type or mutant *Sox17* allele with EconoTaq PLUS 2X Master Mix (Biosearch Technologies, #30035). Primers (forward: 5' CAGAGGTATGCAGATCTCTGT 3' and reverse: 5' CATTCTGGTCAACATGTAAGGT 3') were annealed at 57 °C.

Fluorescence-Activated Cell Sorting

Embryos were incubated for 10 min at 37 °C with Accumax (Millipore Sigma, #A7089) supplemented with DNase (Life Technologies, #AM2222; 1:1000 dilution ratio), and further disaggregated by vigorous pipetting during incubation. Passing the cell suspension through 35 µm strainer caps (Corning, #352235) led to single cells, which were washed with FACS buffer (R&D systems, #FC001) and pelleted at 4 °C, 1000 rpm for 3 min. Cells were resuspended in FACS buffer containing DNaseI (1:1000 dilution) and stained with 7AAD (15 min, room temperature—RT). Live cells (7AAD-negative) expressing either GFP or TdTomato fluorescence were then sorted into DMEM with 10% FBS at the Vanderbilt Flow Cytometry Shared Resource.

Sequencing and Computational Analysis

Cell suspensions were processed for 3'-scRNAseq by the 10X Chromium system. A NovaSeq 6000 device was used to acquire 150 bp paired-end reads. Base calling was performed by RTA (version 2.4.11; Illumina), and further analysis was carried out using 10X Genomics Cell Ranger software v3.0.2. Initial quality control filtration, unsupervised clustering, and differential gene expression analysis used Seurat 4.²³ Doublet prediction used DoubletFinder.²⁴ Pseudotime analysis used Monocle 3,²⁵ while RNA velocities were calculated with scVelo.²⁶ pySCENIC²¹ was used to infer gene regulatory networks with downstream visuals by Cytoscape²⁷ and ComplexHeatmap.²⁸

Data Availability

Raw scRNAseq data is at ArrayExpress (E-MTAB-12719), Seurat objects are at https://zenodo.org/record/7725887#. ZA5jRR_MLkI, and scripts used to perform quality control, clustering, differential gene expression analysis, Monocle3 and RNAvelocity analyses are at https://github. com/markmagnuson/2023-Linh-scRNASeq-Mouse-Sox17-Expressing-Lineages.

Immunofluorescence Staining

Embryos were fixed with 2% PFA (1 h, RT), incubated in 30% sucrose (overnight, 4 °C), embedded in OCT (Sakura, #4583). Eight micrometre-thick embryonic sections were post-fixed with ice-cold acetone (30 min, RT), permeabilized with 0.3% Triton X-100 (10 min, RT), and blocked with 3% BSA (1 h, RT). Primary antibodies (Supplementary Table S1) were diluted in 1% BSA for staining (overnight, 4 °C). After 3 PBST (0.2% Tween in PBS) washes, secondary antibodies (Supplementary Table S1) were incubated (1 h, RT), followed by 3 PBST washes and autofluorescence quenching with Vector TrueVIEW (following manufacturer protocol; Vector Laboratories, #SP-8400-15). Stained sections were mounted with Vectashield (Vector Laboratories, #H-1700) and imaged using Zeiss LSM710 confocal microscope.

Results

Sox17^{GFPCre} Expression Faithfully Reflects Known *Sox17*-Expressing Lineages and Suggests Several New *Sox17*-Expressing CellTypes

To better define Sox17 gene expression at E9.5, a dynamic time during gastrulation when multiple Sox17associated cellular diversifications are occurring, we began with immunofluorescence labeling of SOX17, PECAM1, and FOXA2, marking previously known *Sox17*-expressing lineages (Fig. 1A). As expected, SOX17 was detected mainly in PECAM1⁺ vascular cells and FOXA2⁺ endoderm. Nuclear signals were also present in scattered SOX17⁺ cells not producing either PECAM1 or FOXA2, located mostly along the dorsal side of embryos (Fig. 1B), suggesting previously unreported *Sox17*-expressing lineages or sites of aberrant gene expression.

To characterize Sox17-expressing populations we developed a dual-color lineage-tracing strategy by intercrossing Sox17GFPCre/+ (Fig. 1C) and R26LSL.TdTomato Cre-reporter mice, to enable identification of short and long-term progeny of Sox17-expressing lineages based on GFP and TdTomato production. Immuno-labeling of SOX17, GFP, and TdTomato in E9.5 embryonic sections confirmed SOX17 colocalization with all GFP, while most TdTomato-positive cells did not have GFP or SOX17 (Fig. 1D), indicating short-term longevity of the GFP-Cre fusion protein and robustness of the dual-color tracing strategy. While TdTomato intensity was uniform throughout the embryos, GFP fluorescence varied within the emerging endoderm at E8.5-E9.5 reflecting temporally varying Sox17 expression throughout the foregut, midgut, and hindgut (Supplementary Fig. S1). Within mesodermal tissues, TdTomato but not GFP was present mostly in the heart at E8.5-9.0, while a mixture of both fluorescence signals was observed within the vasculature in other embryonic regions by E9.5 (Supplementary Fig. S1).

Single-Cell Transcriptomic Analysis Reveals Canonical and Non-Canonical *Sox17*-Expressing Cells

Two separate E9.0-9.5 single-cell collections were prepared from our dual-color strategy (Fig. 2A) using Sox17^{GFPCre/+} males mated with wild type or R26^{LSL.TdTomato}/LSL.TdTomato females. The first sample reporting Sox17 short-term expression was prepared on the basis of GFP produced from a mixture of $Sox17^{GFPCre/+}$; R26^{+/+} and $Sox17^{+/+}$; R26^{+/+} embryos. The second sample was isolated from Sox17GFPCre/+; R26LSL.TdTomato/+ embryos were identified by red fluorescence, and comprised cells derived over a short period after Sox17 expression indicated from their green/red co-fluorescence, or over a longer period by being only red. scRNAseq produced 2 datasets, hereafter referred to as GFP and TdTomato datasets, which were analyzed separately to filter out low-quality cells and predicted doublets (Supplementary Figs. S2 and S3). The integrated (GFP and TdTomato) dataset contained 6934 cells segregated into 19 clusters (Fig. 2B) belonging to 3 main lineages: endoderm (Epcam⁺), endothelium (Pecam1⁺), and hematopoietic cells (*Hba-a1*⁺) (Supplementary Fig. S3).

Cell identities were assigned via differential expression analysis (Fig. 2C). The endothelial lineage ($Cd31/Pecam1^+$, $Tie2/Tek^+$) consisted of hemangioblasts ($Etv2^+$, $Tal1^+$), 3 different clusters of endothelial cells (EC1 to EC3) (differing by expression of histone H1 genes, extracellular matrix Vwa1, and Hox genes), endocardium ($Hand2^+$), liver sinusoidal endothelial cells (LSEC— $Oit3^+$, $Stab2^+$), and hemogenic endothelium (HE— $Cd44^+$, $Sox17^+$). The next most abundant



Figure 1. Temporal lineage tracing of *Sox17* expression with a dual color system in mice. (**A**) Representative image and inset of immunofluorescence labelling of an E9.5 mouse embryonic section showing nuclear SOX17 staining (colocalizes with DAPI staining) seen in both endodermal cells (positive for FOXA2—arrowheads) and endothelial cells (positive for PECAM1—arrows). (**B**) Representative image and inset of immunofluorescence labelling of an E9.5 mouse embryonic section showing SOX17 positive cells that are not positive for either FOXA2 or PECAM1 staining, arrowheads. (**C**) *Sox17* temporal lineage tracing allele with full-length SOX17 protein coding sequence (CDS) replaced with a sequence coding for GFP-Cre fusion protein (black boxes—exon; gray boxes—intron; blue and green boxes—protein coding sequences; black and white triangles—retained loxP sites after recombinase-mediated cassette exchange strategy used to generate the allele.²² (**D**) Immunofluorescence labelling of SOX17, GFP, and TdTomato in *Sox17^{GFPCre/+} R26^{LSLTdTomato/+* E9.5 embryonic sections. Inset shows a group TdTomato positive cells with the majority are negative for both GFP and SOX17 and a small portion positive for GFP but not SOX17, as indicated by arrowhead.}



Figure 2. Single-cell RNA sequencing of murine *Sox17*-expressing lineages using the temporal dual color tracing system captured both expected and non-canonical *Sox17*-expressing cell types.(**A**) Experimental layout of 2 scRNAseq experiments. At around E9.5, single cells from embryos with desired genotypes are isolated for subsequent flow cytometry sorting and RNA sequencing with 10X Chromium platform. Datasets were analyzed using Seurat package version 4.0. (**B**) UMAP visualization of the integrated *Sox17*-expressing lineage dataset. Cells were colored based on clusters identified by unsupervised clustering. Cell types were defined based on differential gene expression analysis. (**C**) Expression of representative marker genes for each cell cluster. *Epcam, Cldn6*, and *Krt19* served as shared markers for 3 endodermal clusters; *Pecam1* and *Eng* for 7 endothelial clusters; and *Gata1*, *Itga2b*, and *Hba-a1* for 8 hematopoietic clusters. The rest of the genes are differentially expressed by individual clusters (*P*-adjusted < .05). Dot color and size indicate gene expression intensity and percentage of cell expressing genes of interest, respectively.

cell group represented hematopoietic lineages, with 4 distinct erythroid clusters, one of which lies proximate to the endothelial island. Three endodermal clusters were identified with scattered expression of hepatic (Afp), pancreatic (Pdx1), anterior endoderm (Sox2), and posterior endoderm (Cdx2) markers. A small number of neuronal progenitors ($SoxB^+$, $Nkx6.1^+$) were $Sox17^-$, suggesting putative emergence from Sox17-expressing progenitors. Together, the 2 datasets reflected known Sox17 expression patterns in endodermal, endothelial, and hematopoietic cells, and also suggested Sox17expression in rare neuronal-lineage cells.

scRNAseq of *Sox17*-Expressing Endothelium Captures Transcriptional Signatures of Early Vasculogenesis, Angiogenesis, and Erythropoiesis

Based on Cd31/Pecam1 expression and tight clustering, the endothelial compartment was defined as EC1/2/3, hemangioblast, HE, erythroid 1, and LSEC (Fig. 3A, 3B). Since there were 3 distinct clusters of ECs that did not differentially express any endothelial subtype (arterial/venous/ capillary/lymphatic) markers, we distinguished them based on their transcriptional profiles. EC3 expressed relatively high levels of Hox genes, also a feature of the HE cluster, which is known for regulating hematopoiesis²⁹ (Supplementary Fig. S4A), suggesting hematopoietic potential. Of note, although the yolk sac was specifically omitted from our dissections, a small portion of EC3 expressed signature placental genes Plac1 and Nrk^{30,31} (Supplementary Fig. S4B), suggesting an extraembryonic (perhaps mobile) origin of EC3. EC1 and EC2 differed mostly by cell-cycle gene expression (Supplementary Fig. S4D). EC1 expressed significantly higher levels (P-adjusted

< .05) of *Cdc20*, *Cenpa*, *Ccnb2*, *and Tuba1c*, suggesting mitotic status, whereas EC2 had higher expression of *histone H1*, *Top2a*, *Cdk1*, and *Aurkb* more fitting the G2-like state.³² However, Seurat cell-cycle scoring predicts a large portion of EC2 cells are in S phase whereas those in the EC1 cluster are in either the G1, G2/M, or S phases (Supplementary Fig. S4C).

Observing progenitor-type and further-differentiated endothelial cells both near a cluster of erythroid cells suggested that Sox17-lineages include cells progressing through vasculogenesis and endothelium-derived hematopoiesis. To assess the transcriptomic alterations of such cells occurring within these individual processes, we performed Monocle 3 trajectory analysis to order cells in pseudotime³³ and used scVelo RNA velocity to reveal putative transitional directions between cells^{26,34} (Fig. 3C). While scVelo uses the unbiased RNA spliced/unspliced ratio, Monocle 3 requires supervised input of the trajectory root, which we selected based on Etv2 defining the conventional hemangioblast population. These analyses recapitulated a well-established model whereby hemangioblasts give rise either indirectly to hemogenic endothelium through the differentiation of EC1 cells (pathway a), or directly to the non-hemogenic EC2 cells (pathway b) (Fig. 3D). In addition, they revealed a potentially bipotent progenitor group EC3, which may originate from mobile yolk-sac cells that become either EC2 (pathway c) or erythroid cells (pathway d).

Because HE and EC3 clusters both express multiple *Hox* genes known to drive hematopoiesis, we further resolved the transcriptional distinctions between these 2 populations. Differential expression analysis (*P*-adjusted < .05) revealed arterial-related signatures for HE that include



Figure 3. Heterogenous continuum of endothelial cell states during vasculogenesis and endothelium-derived hematopoiesis. (**A**) UMAP visualization of the *Sox17*-expressing endothelium subset colorized by initial unsupervised clustering of the *Sox17*-expressing dataset. (**B**) Transcriptional level of top 3 differentially expressed genes by each cluster. Dot color and size indicate gene expression intensity and percentage of cell expressing genes of interest, respectively. (**C**) Developmental trajectory analysis of the *Sox17*-expressing endothelium subset. Pseudotime assignment was performed using Monocle3. RNA velocity streamlines were generated with scVelo and then overlayed with UMAP embeddings colored by cell types in (A). (**D**) Proposed model of multiple developmental pathways from distinct origins to specified endothelial subtypes. Hemangioblasts can give rise to hemogenic endothelial cells (HE) via endothelial cell 1 (EC1)—pathway (a), or directly to EC2—pathway (b). EC3 can differentiate to either EC2—pathway (c) or directly to erythroid cells—pathway (d). Liver sinusoidal endothelial cells (LSEC) appear to be in pathway (c). (**E**) Expression of arterial marker genes in HE and EC3.





Figure 4. Predicted active regulons in the endothelium. (**A**) Network plot of top 10% predicted regulons ranked by "importance" metric (signifying strength of TF-target gene relation). TF (pink nodes) and connected to target genes (white nodes) via edges (gray). *Sox17* node is highlighted in yellow. Thicker to thinner edges indicate stronger to weaker relation of TF-target respectively. The size of each node represents the "betweenness centrality" measurements (possible measure of "hub" gene due to high TF-targets connectivity) of a given TF within the network. Regulon networks are manually classified into bigger gene modules (blue circles) based on known biological functions of master regulator genes. (**B**) Single-cell AUC scores (area under the recovery curve across genes ranked by expression value indicating the enrichment of each regulon in each cell) measure for 6 most prominent regulons embedded on UMAP.

gap-junction genes (*Gja4*, *Gja5*) that become upregulated by Notch signaling (marked by *Hey1*) under shear stress.³⁵ Consistent with *Sox17*-expression itself being a marker for arterial specification,³⁶ HE cells also express *Ephrin B2*, a classical arterial marker³⁷ (Fig. 3E). On the other hand, EC3 express *Hspd1* (heat-shock gene involved in yolk-sac erythropoiesis³⁸), *Npm1* (important modulator of primitive hematopoiesis³⁹), *Ncl* (promoter of the hemogenic GRN⁴⁰), and *Lyar* (necessary for hemocyte generation⁴¹) (Fig. 3F), suggesting the extraembryonic origin and strong hemogenic potential of EC3. Together, these data are consistent with contribution of extra-embryonic ECs to intra-embryonic blood-vessel formation and suggest the existence of at least 2 EC populations with hemogenic potency from different origins at E9.5.

Distinct Hematopoietic, Vasculo-Angiogenic, and Homeostatic Regulons in the Endothelial Lineage

Given that scRNAseq of *Sox17*-expressing lineages unbiasedly captured the dynamic transcriptional changes of vascular formation and endothelial-to-hematopoietic transition of cells from extra- and intra-embryonic sources, we attempted to unveil the key GRNs underlying these important developmental processes. By performing pySCENIC regulon analysis to infer groups of active genes that are regulated as units, with putative direct regulation defined by TF binding motifs located within likely *cis*-regulatory regions of target genes,²¹ we identified 287 regulons among the endothelial compartment clusters. Plotting the top 10% of such regulons revealed 3 distinct GRN clusters for erythropoiesis, vasculo-angiogenesis, and

potential homeostasis of endothelial cells (Fig. 4A). Regulons of the well-established *Klf1/Gata1/Tal1* triplet—master regulators of hematopoiesis^{42,43}—clustered tightly together (Fig. 4A) and are active specifically in erythroid 1 cluster (Fig. 4B), validating the reliability of pySCENIC predictions.

The 2 biggest nodes in the GRN are *Etv2* and *Ets1*, known pioneer TFs during embryonic vasculo-angiogenesis.^{44,45} Although *Ets1* may have redundant functions with *Etv2* (from studies in zebrafish⁴⁶), not many shared targets are observed by our regulon prediction, suggesting cross-species variation. Regulons of *Elk3* and *Sox18*, which contribute to lymphatic vascular development,^{47,48} are clustered closely and overlap with parts of the *Etv2* and *Ets1* regulons, consistent with *Elk3* and *Sox18* regulating a more focused lymphatic subset of endothelial differentiation. Of note, *Elk3* may antagonize *Ets1* transcriptional activation to suppress angiogenesis,⁴⁹ likely through shared targets of *Elk3* and *Ets1. Tagln2*, a marker of smooth-muscle cells recently documented for its function during angiogenesis,⁵⁰ also forms a large node in the endothelial GRN.

Somewhat distinct from the erythropoietic and vasculoangiogenetic GRNs are the regulons for Ybx1 and Tfdp1 (Fig. 4A), general TFs that regulate proliferation, apoptosis, and differentiation in a non-cell-type-specific manner, often being linked to cancer progression.⁵¹⁻⁵⁴ Some angiogenic-specific functions such as proliferation, apoptosis, migration, and tubulogenesis are associated with $Ybx1^{51,55,56}$ but its regulon is notably different from other angiogenic regulons. Its activity in both endothelial and erythroid cells (Fig. 4B) suggests a more general cellular homeostatic function.



Figure 5. Dynamic expression profiles of hepato-pancreato-biliary cells during foregut endoderm organogenesis. (A) UMAP visualization of the integrated endodermal subset. Cells were colored based on clusters identified by unsupervised clustering. Cell types were defined based on differential gene expression analysis. (B) Transcriptional level of top 3 marker genes defining cell type of each cluster. Dot color and size indicate gene expression intensity and percentage of cell expressing genes of interest, respectively. (C) Heatmap of top 20 differential expressed genes by distinct groups of progenitor cells within the developing hepato-pancreato-biliary system. Hepatic and biliary progenitor clusters are further divided into subgroups based on the expression level of organ-specific genes (lo—low; med—medium; hi—high).

Unsupervised clustering of endothelial PySCENIC regulons revealed a cluster specifically activated in hemogenic endothelium (Supplementary Fig. S5) that contains genes previously linked to the emergence of hematopoietic stem cells, such as Runx1, Hox genes, Bcl11a^{57,58} and the more recently investigated Gata3, Cdx4, Cdx1, and Gli3.59-61 Although Sox17, required for endothelial-to-hematopoietic transition,⁶² was not found in this cluster, 4 other Sox members were: Sox7 (interacts with Runx1 to specify HE in the yolk sac⁶³), Sox6 (suppresses embryonic globin genes during definitive erythropoiesis⁶⁴), and Sox2 and Sox21 (unknown functions in vascular and hematopoietic lineages). Foxf1, which is important for endothelial progenitors and vessel sprouting,65 and Foxn3, which is detected in human hemogenic endothelium but has unknown function,66 also appear in this HE-specific regulon cluster, suggesting previously unknown functions of these genes during endothelium-derived hematopoiesis.

New Insights Into Hepato-Pancreato-Biliary Development by scRNAseq Analysis of *Sox17*- and *Prox1*-Expressing Endodermal Lineage

Toward better understanding endodermal, and especially hepato-pancreato-biliary (HPB) development, we re-clustered 392 endodermal cells identified in both the GFP and TdTomato datasets ("Sox17 endoderm dataset") to identify early progenitor cells of various organs (Supplementary Fig. S6A, S6B). Within this dataset, pancreatic progenitors ($Pdx1^+$ and $Rfx6^+$), and hepatobiliary progenitors ($Sox17^+$, $Hhex^+$, and $Prox1^+$) were most abundant. Since HPB cell numbers were insufficient to resolve the transcriptional segregation of progenitor cells from the 3 independent organ anlagen we combined our Sox17 endodermal dataset with a dataset recently reported from the Spagnoli group obtained via sorting *Prox1*-expressing cells,²⁰ hereafter called the "*Prox1* dataset." The *Prox1* dataset contains 346 posterior-foregut cells from embryos at multiple stages during mid-gestation. Analysis of 738 cells combined from the *Sox17* endoderm (392 cells) and *Prox1* (346 cells) datasets, hereafter the "*Sox17-Prox1* endoderm" dataset, resulted in 10 distinct clusters consisting mostly of endoderm and a few mesoderm-derived cell types such as cardiomyocytes, HPSCs, pancreatic and lung mesenchyme (Fig. 5A). There was high integration across the original *Sox17* endoderm and *Prox1* datasets (Supplementary Fig. S6C; Supplementary Table S2). Cell-type assignments of the *Sox17-Prox1* endoderm dataset based on differentially expressed genes (Fig. 5B) were mostly consistent with the previous manual-dissection-based assignments of the *Prox1* dataset (Supplementary Fig. S6D; Supplementary Table S2).

After obtaining 3 distinct clusters of HBP progenitors, we performed differential transcriptomic analysis during their segregation to identify new markers for each progenitor population. We not only identified 287 significantly upregulated genes for pancreatic buds, 624 for liver bud, and 23 for biliary (*P* adjusted < .05) (top 20 differentially expressed genes are listed in Fig. 5C), but also observed substantially overlapping transcriptional profiles among the HBP progenitors.

Pancreatic markers included: *Nepn* (expressed in the dorsal pancreatic bud and duodenum by E9.5⁶⁷), *Cldn4*, *Krt7*, and *Krt19* (epithelial markers highly expressed in pancreatic but absent from hepatic bud⁶⁸), *Ociad2* (unknown function in embryonic pancreatic development but consistent with previous observations⁶⁹), *App*, *S100a10*, and *S100a11* (involved in pancreatic cancer and diseases, patterns not yet reported during embryonic development^{70,71}), *Cdx2* (marking caudal gut tube), and *Sox4* (expressed in pancreatic buds and important for endocrine-cell development⁷²). Other genes identified



Figure 6. Predicted active regulons in the endoderm. (**A**) Network plot of top 10% predicted regulons ranked by "importance" metric signifying strength of TF-target relation. TF (pink nodes) and connected to target genes (white nodes) via edges (gray). *Sox17* node is highlighted in yellow. Thicker to thinner edges indicate stronger to weaker relation of TF-target respectively. The size of each node represents the "betweenness centrality" measurements (possible measure of "hub" gene due to high TF-targets connectivity) of a given TF within the network. Regulon networks are manually classified into bigger gene modules (blue circles) based on known biological functions of master regulator genes. (**B**) Single-cell AUC scores (area under the recovery curve across genes ranked by expression value indicating the enrichment of each regulon in each cell) measure for 8 most prominent regulons embedded on UMAP.

as hepatic markers were previously described as highly expressed in liver buds such as *Apo, Serpin,* and *Fibrinogen* gene families, *Alb, Reln*,^{73,74} and those active in mature liver cells such as *Itih2, Shbg, Lpl,* and *Trf*.⁷⁵⁻⁷⁸ *Sox17*, the most established marker of the biliary bud,⁷⁹ was also the most highly upregulated gene in biliary progenitors. *Flrt3,* reported in the original manuscript of the *Prox1* dataset,²⁰ exhibited similar expression to *Sox17,* and may be a new marker of biliary progenitors. *Itih2, Reln, Hhex,* and *Paqr9* shared the pattern of *Sox17* expression in biliary progenitors but were also upregulated in the liver, suggesting shared characteristics between biliary and hepatic progenitor cells.

Other top biliary-specific genes exhibited high, medium, or low expression, subdividing the biliary cluster into 3 groups (Fig. 5C, *P*-adjusted < .05). The biliary-low group had a high level of pancreatic markers, suggesting that they were notyet developmentally resolved but more akin to the ventral pancreatic state. The biliary-high group was likely moremature biliary epithelial cells whereas the biliary-medium group showed medium levels of pancreatic genes, indicating putative pancreato-biliary bipotent progenitor status. A similar group of biliary-medium/pancreatic-medium genes was found in part of the hepatic cluster carrying low levels of liver markers. These findings are consistent with the existence of multi- and bi-potent pools of progenitor cells during progressive segregation of the 3 foregut anlagen that is under way at E9.0-9.5. Besides having high Sox17 expression, these putative multi- and bipotent progenitors expressed Phlda2, previously verified as expressed in ventral definitive endoderm⁸⁰ yet without a known function in early endodermal organogenesis.

Active Regulons During Endodermal Development

To identify putative GRNs governing HBP segregation from the posterior foregut, specifically not yet addressed in the literature, we performed pySCENIC analysis on the *Sox17*-*Prox1* endoderm dataset, which identified 238 regulons. The top decile was shown in the network plot (Fig. 6A) with further clustering of regulons corresponding to specific cell types based on node proximity and cell types in which regulons were imputed as most active (Fig. 6B).

Besides regulons specific to non-endodermal cell types such as cardiovascular-hematopoietic lineages and pancreatic mesenchyme, we classified 3 separate regulon hubs related to the development of the early endoderm and HBP system. We inferred a dense cluster of medial and caudal *Hox* regulons that, together with Cdx2 and Cdx4 regulons, are predicted in posterior endoderm. Besides a role for Cdx2 in establishing the caudal part of the gut-tube axis, genes in its regulon are more active in pancreatic buds than in liver, biliary, or islet cells, suggesting additional contribution to early pancreas formation.

Another distinct pancreatic endocrine-centric regulon cluster had major nodes of *Neurod1* and *Rfx6*, connected with *Neurog3*, *Neurog1*, *Isl1*, *Mafb*, *Pax6*, *Pou3f4*, *Arx*, *and Pax4*, all encoding TFs involved in islet endocrine-cell differentiation programs.^{81,82} Nhlh1 and Npdc1 regulons were specific to the islet cluster, but as of now, lack identified functions here.

The rest of the network was classified as anterior endoderm and HBP-focused regulon hubs. *Gata4*, *Sox9*, *Foxa1*, *Hnf1b*, *Gata6*, *Jun*, and *Fos* regulons are inferred as strongly active in pancreatic progenitor cells. *Hnf4a*, *Foxa3*, and Nr5a2, which shared some target genes, were upregulated in hepatic progenitors, suggesting their coordinate regulation of hepatic-bud formation and outgrowth.^{83,84} While the Onecut2 regulon was equally active among the 3 HPB domains, the Onecut3 regulon was restricted to hepato-biliary progenitors. Sox17 was the only biliary-major regulon in the mapped network. Sox1, Foxb1, Hoxd3, Hoxa1, and Pou3f2 regulons were identified specifically in the anterior DE population. Of note, regulons associated with the same cell type were not clustered tightly together, reflecting their few shared targets, and implying diverse molecular functions for each regulon responsible during the development of each individual organ. In contrast, the mingling together of regulons important for pancreas, liver, biliary, and anterior endoderm suggests shared target genes among these cell types, in keeping with their overlapping transcriptomic profiles.

Distinct *Sox17*-Regulons Between Endoderm and Endothelium

Perhaps the most important part of this study is our identification of highly independent regulons for Sox17 in endoderm versus endothelium. While pySCENIC predicts 81 endothelial targets for Sox17, only 11 were endoderm-selective (Fig. 7A). To partially validate these targets, we surveyed 3 recently published SOX17 ChIP-seq and CUT&RUN datasets from cell-line-derived human definitive endoderm and mouse primitive endoderm and found the majority of pySCENICpredicted endodermal targets also exhibit SOX17 binding within promoter-proximal regions (Supplementary Fig. S7). Among these genes regulated by Sox17, only *Efnb2* was shared between the endodermal and endothelial Sox17 regulons. The marked diversity of Sox17 regulons as assessed by gene ontology (GO) terms is consistent with SOX17 driving largely different molecular functions in these 2 populations. Indeed, GO-term enrichment patterns suggest that Sox17 works in endothelial cells to regulate blood-vessel morphogenesis,

cell migration, and sprouting during vasculo-angiogenesis, whereas in endoderm it is more geared toward regulating chemotaxis and signaling pathways such as growth-factor stimulus, serine/threonine kinase and Wnt signaling (Fig. 7B).

Discussion

Our robust 2-color lineage-tracing strategy, scRNASeq, and use of several computational methods have further characterized *Sox17*-expressing cell populations and expanded our understanding of putative *Sox17* functions during early stages of lineage diversification and tissue specification. Our results not only integrate previous knowledge of *Sox17*expressing cells but also putatively reveal distinct regulons operating during endothelial and endodermal differentiation, which suggest multiple future lines of investigation.

Tracing *Sox17*-Expressing Lineages Effectively Captures Early-Stage Vasculo-Angiogenesis and Endothelium-Derived Hematopoiesis

Previous attempts to profile single-cell transcriptomes of the endothelium and hematopoietic system used an antibody panel against multiple cell-surface markers.^{19,85} Using just 2 endogenously expressed fluorescent alleles that report shortor long-term expression of *Sox17*, we effectively recorded transcriptomic changes during vasculo-angiogenesis and endothelial-to-hematopoietic transition.

Notably, our findings further delineate some controversial and complex concepts in endothelial and hematopoietic development. We captured a classical hemangioblast population (*Etv2* and *Tal1* positive) that, through our trajectory analysis, gives rise to 2 distinct subtypes of ECs, one of which can advance to become the canonical hemogenic endothelium, supporting the model of *in vivo* unipotency of hemangioblasts.⁸⁶ Furthermore, we identified a hemangioblast-like endothelial population (EC3—negative



Figure 7. Predicted *Sox17*-regulons in endoderm and endothelial cells. (A) pySCENIC predictions of *Sox17* (pink) downstream targets (blue) in the endothelium and endoderm. (B) Gene ontology enrichment analysis of *Sox17* target genes in the endothelium and endoderm.

for *Etv2* and *Tal1*), that expresses many genes suggestive of an extra-embryonic origin and appears to differentiate directly to both erythroids and ECs. Based on recent live imaging⁸⁷ and the fact that yolk sacs were omitted from our scRNAseq, we propose that these bipotent progenitors arise in the yolk sac, migrate to the embryo proper, and contribute to both intra-embryonic vascular (potentially at the dorsal aorta, head vasculature, and endocardium—known secondary hematopoiesis sites in the developing embryo) and hematopoietic system likely through *Hox*-dependent mechanisms.

Our analyses of the endothelium raise several areas for further investigation. First, 2 types of ECs seem to arise from hemangioblasts, which differ mostly by expression of *Histone H1* and other cell-cycle genes, but only one can become hemogenic. Based on the known importance of linker histone H1 in cell-fate determination,⁸⁸ and of cell-cycle regulation association with endothelial-to-hematopoietic transition,⁸⁹ we hypothesize an active participation of *histone H1* during HE specification. Second, whether *Ybx1* and *Tfdp1* regulons, emerging on top of the important endothelial GRN, are critical for endothelial homeostasis or other molecular functions such as migration and morphology, is not known. Lastly, functions of several regulons identified specifically for HE emergence remain to be explored such as *Sox2*, *Sox21*, *Foxn3*, and *Foxf1*.

Although Sox17 is early and widely expressed within the emerging vasculature system (reflected in our usage of $Sox17^{GFPCre}$ allele), its regulon did not appear among the top 10% most "important" ones in our GRN analysis, indicating moderate, redundant (to other SoxF members), or ambiguous functions of Sox17 in primitive endothelial cells. These results are consistent with Sox17 having limited functions in the adult endothelial system despite being widely expressed. Indeed, mutations of Sox17 in the adult vasculature are reported to affect vascular integrity only under challenging conditions such as hypertensive stress.⁹⁰⁻⁹²

Transcriptomic Insights Into Hepato-Pancreato-Biliary Development

Unsupervised clustering of the Sox17-Prox1 endoderm dataset showed 3 distinct clusters of the HPB system, allowing identification of new markers and understudied genes as plausible determinants for each progenitor type. Ociad2, encoding a mitochondria-associated protein and top pancreatic marker was recently reported as specifically upregulated in β - rather than α -cell differentiation from endocrine progenitors,⁶⁹ suggesting links between mitochondrial metabolism and insulin-secreting fate acquisition. Similarly, App (amyloid precursor protein), expressed in adult pancreatic islets,⁹³ could influence pancreatic specification from the posterior foregut through autocrine/paracrine signaling. S100 (Ca²⁺-binding protein with EF-hand motif) family members are also prominent in pancreatic compared to liver and biliary buds, consistent with our previous work showing high S100a11 in endocrine progenitors and S100a10 in early Sox17+ endoderm.⁹⁴ S100 functions in cell proliferation, migration, and other signaling pathways are implicated in many cell types,⁷⁰ but knowledge of their function during pancreatic development is poor. Flrt3 (fibronectin leucine-rich transmembrane protein), which contributes to cell adhesion and receptor signaling in other contexts, is present in biliary progenitors,²⁰ yielding a promising candidate not-yet-determined cellular interactions in biliary development.

Previous attempts to profile single-cell transcriptomes of the developing HPB, perhaps due to technical challenges in obtaining adequate cell numbers, could not resolve all 3 cell types of the system, such as liver-biliary using $FoxA2^{eGFP}$, dorsal and ventral pancreas using Pdx1GFP, and liverpancreatobiliary using Prox1^{eGFP} mice. Our Sox17-centric strategy complements other datasets (especially Prox1^{eGFP} as described above), enabling all 3 populations to be distinguished and, further, identification of a subset of liver progenitors with low-hepatic but medium-pancreatobiliary profile, and 3 subsets of biliary progenitors with highpancreatic, high-biliary, or medium-pancreatobiliary features. These findings indicate the presence of multi- and bipotent progenitors during the gradual segregation of progenitors of the 3 anlagens. These early-stage progenitor cells, besides sharing a high expression of Sox17 and Flrt3 with the biliary-committed cells, also express Phlda2, a cell-surface Pleckstrin homology-like domain family A member, with potential utility in future cell-sorting analyses. Notably, Phlda2 is expressed in the ventral gut tube, suggesting a functional association with HPB development, perhaps by regulating epithelial-to-mesenchymal transition via PI3K/AKT during diversification from the posterior foregut.

We also identified several yet-to-be characterized endodermactive GRNs linked to HPB development including regulons for *Nhlh1* (Nescient Helix-Loop-Helix 1) and *Npdc1* (Neural Proliferation, Differentiation And Control 1), 2 neurogenesis TFs expressed in pancreatic islets and that parallel studies of the human endocrine lineage.^{95,96} Our results also unveiled previously unknown but plausibly stochastic functions of the highly redundant *Foxa* TF members,⁹⁷ with the *Foxa1* regulon operating in early pancreatic progenitors, the *Foxa2* regulon biased toward mature pancreatic endocrine cells, and the *Foxa3* regulon predominantly active in the hepatic bud.

Different *Sox17* Regulons in Endoderm and Endothelium

To potentially distinguish Sox17 functions in the endoderm and endothelium, we compared the pySCENIC-predicted Sox17-regulons from the endothelial subset with those derived from the Sox17-Prox1 endoderm dataset. Of 81 target genes in endothelium compared to 11 predicted in endoderm, Efnb2 is the only common imputed downstream Sox17target. Efnb2 (an ephrin family member) together with related receptor tyrosine kinases modulates cell-cell communication have well-established roles in arterial/venous specification of endothelial cells, consistent with Sox17 being indispensable for arterial fate acquisition.³⁶ Efnb2 was recently proposed as important in defining the dorsal-ventral axis of foregut,⁹⁸ suggesting an unappreciated role of Sox17 in the endodermal gut tube.

Most other endothelial Sox17 targets are unsurprisingly related to vascular formation, including tube morphogenesis, tip and stalk cell migration, and motility. In contrast to promoting "proactive" endothelial-cell behavior in response to the surrounding environmental cues, in endodermal cells, Sox17 may cause more "passive" responses related to sensing chemotactic, growth factor, and particularly Wnt signals. These predicted functions of Sox17 target genes in endoderm are in agreement with previous studies^{99,100} and reinforce the importance of coordinated movements of endodermal cells in response to mesodermal chemotactic cues during gastrulation. Furthermore, the marked difference between endoderm

Identification of *Sox17* in Rare Neural Progenitor Cells

In addition to capturing cells from endodermal, hematopoietic, and endothelial lineages, all are well-established Sox17associated lineages, several neural progenitor cells expressing the canonical markers Sox1/2/3 and Nkx6.1 were identified possibly indicating Sox17 function in these lineages. While Sox17 function is documented in oligodendrocyte development,¹⁰ little is known about its expression or function in neural progenitors. SoxF is associated with neurogenesis in fruit flies¹⁰² and zebrafish,¹⁰³ perhaps supporting Sox17 having a similar role in mammals. In this regard, it is noteworthy that among the low-RNA-content cells excluded from our GFP dataset (Supplementary Methods), a collection of mesenchymal and neural crest-like genes such as Vim, Mest, Nes, Twist1, Prrx2 are expressed. In any case, further analyses and validations are necessary to determine the function of Sox17 in neural lineages.

Conclusion

Our analyses of *Sox17*-expressing lineages using scRNAseq consolidate prior knowledge of *Sox17* and provide new insights into the transcriptomic features, GRNs, and developmental trajectories of both hepato-pancreato-biliary and hemato-endothelial systems.

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Conflict of Interest

The authors declared no potential conflicts of interest.

Author Contributions

L.T.T.: conception and design, collection and assembly of data, data analysis and interpretation, manuscript writing. A.B.O.: conception and design, data analysis, and interpretation. B.L.: collection of data. S.S.: data analysis and interpretation. J-P.C.: data analysis and interpretation. C.V.E.W.: manuscript writing. M.A.M.: conception and design, data analysis and interpretation, financial support, manuscript writing.

Data Availability

Raw scRNAseq data is at ArrayExpress (E-MTAB-12719), Seurat objects are at https://zenodo.org/record/7725887#.

ZA5jRR_MLkI. Scripts used to perform quality control, clustering, differential gene expression analysis, Monocle3 and RNAvelocity analyses are at https://github.com/markmagnuson/2023-Linh-scRNASeq-Mouse-Sox17-Expressing-Lineages.

Supplementary Material

Supplementary material is available at Stem Cells online.

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