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Multilayer omics analysis reveals a non-classical retinoic acid signaling axis that regulates hematopoietic stem cell identity

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SUMMARY

Hematopoietic stem cells (HSCs) rely on complex regulatory networks to preserve stemness. Due to the scarcity of HSCs, technical challenges have limited our insights into the interplay between metabolites, transcription, and the epigenome. In this study, we generated low-input

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AUTHOR CONTRIBUTIONS

Conceptualization, K.S., N.O., and N.C.-W.; methodology, K.S., N.O., M.C.R.-M., P.C., J.M., P.V.P., Y.W.Z., M.M., J.R., M.-E.L., K.J., J.D.C., B.F., P.S., C.M., K.I., N.B.G., E.T., J.M.B., E.L.P., and N.C.-W.; sharing material, B.F. and N.B.G.; investigation, K.S. and N.O.; writing – review & editing, K.S., N.O. and N.C.-W.; supervision, N.C.-W.

DECLARATION OF INTERESTS

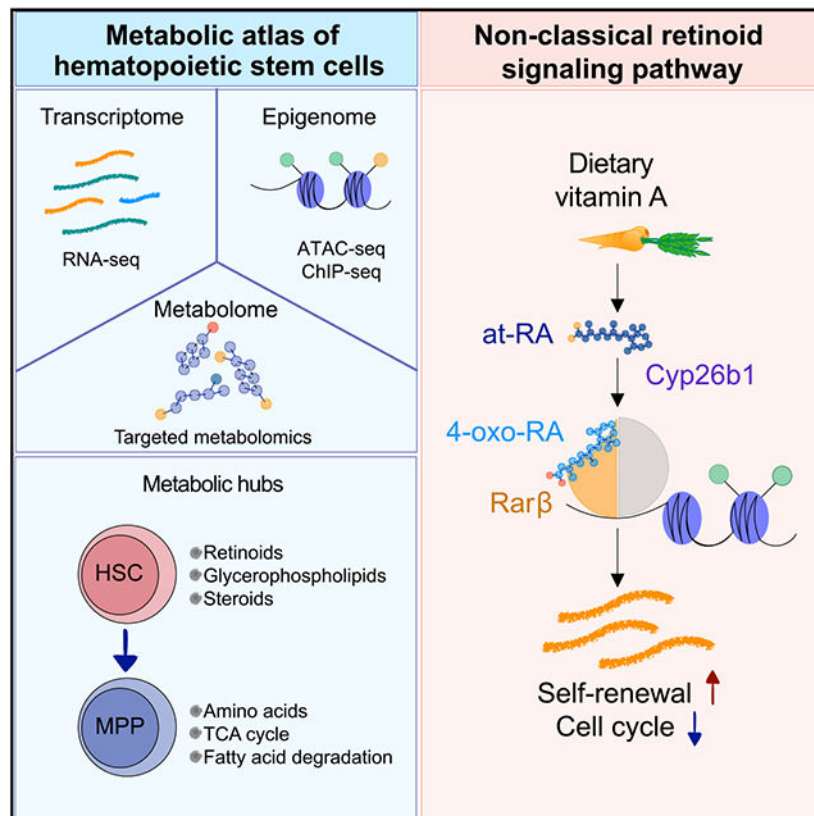
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SUPPLEMENTAL INFORMATION

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metabolomics, transcriptomics, chromatin accessibility, and chromatin immunoprecipitation data, revealing distinct metabolic hubs that are enriched in HSCs and their downstream multipotent progenitors. Mechanistically, we uncover a non-classical retinoic acid (RA) signaling axis that regulates HSC function. We show that HSCs rely on Cyp26b1, an enzyme conventionally considered to limit RA effects in the cell. In contrast to the traditional view, we demonstrate that Cyp26b1 is indispensable for production of the active metabolite 4-oxo-RA. Further, RA receptor beta (Rarb) is required for complete transmission of 4-oxo-RA-mediated signaling to maintain stem cells. Our findings emphasize that a single metabolite controls stem cell fate by instructing epigenetic and transcriptional attributes.

Graphical abstract



In brief

Schönberger et al. generate and integrate low-input multi-omics data on purified hematopoietic stem cells (HSCs) to identify metabolic and epigenetic signaling hubs relevant to stem cell identity. Mechanistically, the authors uncover a non-classical retinoid signaling axis, Cyp26b1-4-oxo-RA-Rarb, important for maintenance of HSC features.

INTRODUCTION

Hematopoietic stem cells (HSCs) sit at the top of a hierarchically organized system and have the unique capability of long-term reconstitution of the entire blood system (Orkin and Zon,

2008; Till and McCulloch, 1961). HSCs can give rise to multipotent progenitors (MPPs), which differentiate stepwise into lineage-committed progenitors and eventually into effector cells (Ikuta and Weissman, 1992; Okada et al., 1992). Under homeostatic conditions, HSCs are highly quiescent and exhibit low biosynthetic activity (Cabezas-Wallscheid et al., 2017; Wilson et al., 2008). Although currently debated, HSCs are commonly described as relying on glycolytic ATP production while inhibiting mitochondrial oxidative phosphorylation (OXPHOS) (Chandel et al., 2016; Ito and Suda, 2014; Liang et al., 2020; Vannini et al., 2016). Nevertheless, HSCs must be able to reversibly switch their metabolic program upon stress-induced activation to meet higher energy demands and drive differentiation (Ito and Suda, 2014; Ito et al., 2019; Simsek et al., 2010; Takubo et al., 2013).

Over the last years, it has become evident that metabolites can play an active role in regulating cell fate (Bräutigam et al., 2018; Hinge et al., 2020; Kalaitzidis et al., 2012; Suda et al., 2011; Takubo, 2014). Metabolites can be detected by transcription factors (TFs), modifying gene expression. Furthermore, the metabolic balance of short-chain carbon metabolites is closely linked to the degree of DNA or histone modification and, thus, to transcriptional regulation (Serefidou et al., 2019; Ulrey et al., 2005). Vitamins in particular have been suggested to mediate epigenetic modifications and to play important roles in stem cell function. For instance, vitamin B3 reduces bone marrow (BM) transplantation toxicity (Vannini et al., 2019), and vitamin C suppresses leukemogenesis by changing the DNA methylation status in HSCs (Agathocleous et al., 2017; Cimmino et al., 2017). Previous work has shown that vitamin A/retinoic acid (RA) signaling plays a role in regulating HSCs (Cabezas-Wallscheid et al., 2017; Purton et al., 1999, 2000). In a prior study, we performed proof-of-principle experiments that showed systemic deprivation of vitamin A in mice leads to loss of HSC quiescence (Cabezas-Wallscheid et al., 2017). Treatment with the active vitamin A metabolite *all-trans*-RA (at-RA) preserves stemness features during stress conditions *in vitro* and *in vivo*. Nonetheless, how retinoids regulate hallmarks of HSCs remains largely unknown.

The low frequency of HSCs within the BM leads to technical limitations so far preventing extensive investigation of the interplay between stem cell metabolism and transcriptome/epigenome signaling networks. Significant advances in low-input sampling have been made recently; Agathocleous et al. (2017) detected around 60 metabolites from only 10,000 cells of different stem and progenitor populations. DeVilbiss et al. (2021) were able to identify as many as 160 metabolites in HSCs/MPPs, comparing them with whole BM(WBM) cells. However, the methods applied in these studies did not detect differences between highly purified stem cell populations and immediate downstream progenitor cells. Here we established low-input metabolic and epigenetic methods and showed that HSCs rely on a non-classical RA signaling axis.

RESULTS

Metabolic landscape of HSCs and downstream progenitors

To explore the networks linking metabolism, epigenetics, and transcription in HSCs (Lin⁻Sca-1⁺c-Kit⁺ [LSK] CD150⁺CD48⁻CD34⁻) and their downstream MPPs (LSK CD150⁻CD48⁺), we established and employed protocols for low-input metabolomics, RNA

sequencing (RNA-seq), chromatin accessibility (assay for transposase-accessible chromatin sequencing; ATAC-seq), and histone chromatin immunoprecipitation sequencing (ChIP-seq) (Figure 1A; Figure S1A).

First, we aimed to shed light on how the composition of metabolites differs in HSCs and MPPs. We developed two low-input liquid chromatography-tandem mass spectrometry (LC-MS/MS) approaches. One approach detects (semi)polar metabolites such as tricarboxylic acid (TCA) cycle metabolites and amino acids, using as few as 10,000 cells as starting material, and the second approach detects polar lipids, bile acids, and retinoids using 40,000 cells as starting material (STAR Methods). Titration experiments confirmed that metabolites were detected above background levels and showed a signal correlation with the input number (Figure S1B). Because of the scarcity of HSCs, we performed the metabolomics experiments using LSK CD150⁺CD48⁻ (HSCs and MPP1, hereafter referred to as HSCs+MPP1) and LSK CD150⁻CD48⁺ (MPP3+MPP4, hereafter referred to as MPPs) (Cabezas-Wallscheid et al., 2014). We identified 51 metabolites in HSCs+MPP1 and downstream MPPs, of which 23 were found to be significantly different (Figure 1B; Table S2). Compared with previous studies, this represents an advance in the purity of cell populations used and the number of differentially abundant metabolites identified (Figure S1C; Agathocleous et al., 2017; DeVilbiss et al., 2021; Karigane et al., 2016; Takubo et al., 2013).

We found several lipids that were significantly enriched in HSCs+MPP1, such as lysophosphocholines (LPCs) and phosphocholines (PCs) (Figure 1B; Table S2). Two of the most highly abundant metabolites in HSCs+MPP1 were RA and its downstream product 4-oxo-RA. This result supports our previous findings and hints at the importance of retinoids in regulation of stem cell function (Figure 1B; Table S2; Cabezas-Wallscheid et al., 2014, 2017). Further, we detected up to 2-fold higher levels of various amino acids, acyl-carnitines, and TCA cycle-related metabolites in MPPs, reflecting their active metabolic state (Figure 1B; Table S2).

We next performed RNA-seq of HSCs and MPPs, focusing primarily on metabolic genes (Figure S1D). Gene Ontology (GO; Figure S1E; Table S1) and gene set enrichment analysis (GSEA; Figure 1C) revealed that “fatty acid metabolism” and “signaling by RA” were enriched in HSCs, whereas “TCA cycle” and “metabolism of amino acids” were enriched in MPPs, in line with our metabolomics data and previous research (Chandel et al., 2016; Ito and Suda, 2014). Correlation between individual metabolites and their corresponding enzymes was observed (Figure 1B; schematic pathways are highlighted in Figure S1F; Table S1). For example, HSCs showed high expression of glycolytic enzymes and low expression of OXPHOS-related enzymes. By grouping differentially expressed genes (DEGs; adjusted p [adj.] < 0.1) between HSCs and MPPs according to metabolic GO terms (Figure S1G; Table S1), we identified potential upstream regulators (Herrmann et al., 2012; Imrichová et al., 2015). For instance, we found C/EBP homology protein / activating transcription factor 4 (CHOP/ATF4) was the main motif for genes involved in “amino acid metabolism” enriched in MPPs, whereas interferon regulatory factor (IRF) was the main motif for “retinol metabolism” genes highly enriched in HSCs (Figure S1G).

Our results show that, upon transition of HSCs to MPPs, rewiring of the cell metabolic status happens at the transcriptional and metabolic levels.

Epigenetic modulation of metabolic pathways in HSCs

We next explored the chromatin accessibility status in HSCs and MPPs by applying ATAC-seq (Figure S1H). Differences in chromatin accessibility and gene expression correlated significantly, as shown by GSEA (Figures S1I and S1Q). Furthermore, GO analysis of genes annotated to gained or lost open chromatin regions (OCRs) yielded terms such as “cell adhesion” and “positive regulation of transcription” for HSC-specific sites and “intracellular signal transduction” and “activation of GTPase activity” for MPP-specific sites (Figure S1J; Table S1), in line with our previous work and the RNA-seq data (Figures S1D and S1E; Cabezas-Wallscheid et al., 2014). GSEA of genes annotated to ATAC-seq peaks retrieved only a small number of pathways that were significantly enriched in HSCs; these included “retinoic acid metabolism,” indicating epigenetic regulation of this pathway (Figure 1D; Table S1). Differences in binding of TFs enriched for the aforementioned metabolic pathways (Figure S1G) were assessed by digital footprinting analysis of the corresponding motifs. As a control, we used CCCTC-binding factor (CTCF) as a TF generally acting in all cells and Runt-related TFs / ETS-domain TFs (RUNX/ETS) as factors particularly relevant to MPPs (Imperato et al., 2015; Nottingham et al., 2007; Willcockson et al., 2019; Figures S1G and S1K). The analysis revealed higher TF occupancy in MPPs for the motifs ATF4 and CHOP, corresponding to the GO term “amino acid metabolism,” in line with our metabolomics data.

We next compared the promoter chromatin state of HSCs and MPPs by performing low-input ChIP-seq for two histone modifications: histone 3 lysine 4 trimethylation (H3K4me3), associated with active genes, and histone 3 lysine 27 trimethylation (H3K27me3), a repressive mark set by Polycomb repressive complex 2 (PRC2) (Margueron and Reinberg, 2011). To ensure high quality, we performed titration experiments and a comparison with recent publicly available data (Figures S1L and S1M; Zheng et al., 2015). As expected, H3K4me3 and H3K27me3 displayed a global anti-correlation with only a few bivalent promoters (Figure S1N; Wei et al., 2009; Weishaupt et al., 2010).

Consistent with RNA-seq and ATAC-seq analysis, GSEA of the H3K4me3 modification revealed terms like “cell cycle” and “TCA cycle” as enriched in MPPs, whereas “retinoic acid metabolism” and “nuclear receptor transcription” were significantly enriched in HSCs (Figure S1O; Table S1). GSEA of H3K27me3-modified genes highlighted “DNA repair” and “phospholipid metabolism” as enriched in MPPs, suggesting epigenetic repression of these pathways specifically in MPPs (Figure S1P; Table S1). Of note, transcription was positively correlated with OCRs and H3K4me3 promoter marks (Figure S1Q), whereas H3K27me3 showed a weak but significant global anti-correlation, as exemplified by gene loci from different metabolic and cycling-related genes (Figure 1E; Figure S1R).

To globally illustrate metabolic networks governing stemness, we integrated the metabolomics data with the RNA-, ATAC-, and ChIP-seq datasets, focusing on KEGG pathway-annotated enzymes that correspond to the metabolites we detected. For this purpose, we created “metabolome-transcriptome-epigenome” (MTE) plots summarizing

all of the assessed layers of regulation (Figure 1F; Figure S1S). For instance, TCA cycle-related enzymes were regulated by H3K4me3, showing a significant average gain of promoter modification in MPPs and, thus, higher gene expression. Further, we identified “sphingo/glycerophospholipid metabolism” and “sterol biosynthesis” as metabolic hubs that previously have not been linked to HSC biology. The most striking outcome of our multi-omics analysis was the strong emphasis on “retinol metabolism” in HSCs. Retinoids were the most highly enriched metabolites in HSCs+MPP1 that strongly correlated with greater chromatin accessibility, higher H3K4me3 but lower H3K27me3 levels, and, consequently, higher levels of expression of enzymes involved in RA metabolism in HSCs (Figures 1B-1F; Figure S1O).

Our integrative multilayer omics approach permits further exploration in future studies to address the role of specific metabolites and enzymes for maintenance of stemness.

Lack of dietary vitamin A leads to loss of the metabolic HSC identity

We next aimed to assess the role of RA metabolism, the most highly enriched metabolic hub detected, in regulating HSC function by specifically disrupting this pathway. Dietary vitamin A (i.e., retinol) serves as the only precursor metabolite for retinoids. Thus, 3-week-old mice were fed control food or a vitamin A-free diet (VAF) for 6 months (Figure 2A). Systemic depletion of vitamin A was confirmed by strongly decreased liver retinol levels after 6 months of VAF diet feeding (Figure S2A). In line with our previous study, flow cytometry analysis of the BM showed a decrease in relative and absolute frequencies of HSCs and a corresponding loss of quiescence (Figures 2B and 2C; Figures S2B and S2C; Cabezas-Wallscheid et al., 2017). Apart from a significant but mild decrease within the erythroid lineage, VAF BM cells did not display any lineage bias (Figure S2D). Moreover, after 48 h of *in vitro* single-cell cultivation of HSCs, a higher division rate was detected in VAF cells, indicating a cycling-primed state (Figure 2D). Serial colony-forming unit (CFU) assays showed decreased *in vitro* self-renewal capacity (Figure 2E). In agreement with this finding, serial WBM competitive transplantation assays revealed a significant decrease in peripheral blood (PB) chimerism, displaying a lymphoid bias (Figure 2F; Figures S2E and S2F). Thus, vitamin A deficiency leads to loss of quiescent repopulating HSCs.

To investigate how retinoids regulate HSC identity, we performed extensive transcriptomic, epigenetic, and metabolic analyses on VAF HSCs. GSEA of RNA-seq data (Figure S2G; Table S1) showed that VAF HSCs exhibit strong downregulation of published HSC signatures such as “dormant HSCs” but enrichment of “MPP” signatures (Cabezas-Wallscheid et al., 2014, 2017; Wilson et al., 2015; Figure S2H; Table S3). Furthermore, Reactome pathways, such as “respiratory electron transport” and “TCA cycle,” were enriched in VAF HSCs (Figure 2G). Next we performed targeted metabolomics and found that vitamin A deficiency led to a significant reduction in the retinoids RA and 4-oxo-RA in HSCs+MPP1 (Figure 2H). Conversely, two TCA cycle metabolites, glutamate and itaconate, were significantly more abundant, suggesting higher metabolic activity of VAF HSCs+MPP1. Most of the metabolites detected in VAF HSCs+MPP1 and VAF MPPs showed similar levels, which is in contrast to control conditions (Figure S2I; Figure 1B; Table S2). We then integrated the metabolomics data with transcriptional changes in

enzymes related to the two main metabolically affected pathways, “retinol metabolism” and “TCA cycle.” Although none of the TCA cycle-related enzymes were transcriptionally deregulated in VAF HSCs, retinol enzymes followed a trend toward downregulation of the pathway (Figure S2J).

To determine the effect of vitamin A deprivation on chromatin accessibility, we applied ATAC-seq (Figure S2K). We integrated the RNA-seq data with genes associated with OCRs specific to control (lost in VAF) and found a significant enrichment of VAF-downregulated genes (Figure S2L). This indicates that vitamin A deficiency leads to loss of OCRs, resulting in reduced expression of the respective genes, as exemplified by two representative gene loci (*P2rx7* and *Rarb*) (Figure S2M). Retinoids can change chromatin accessibility by binding to RA receptors (RARs) (Findley et al., 2019). Thus, we performed digital footprinting analysis for the RAR motif, revealing a significant decrease in VAF HSCs compared with the control (Figure 2I). Additionally, the IRF motif, found previously to be enriched in “retinol metabolism”-annotated genes (Figure S1G), was significantly less occupied in VAF HSCs (Figure S2N), suggesting a potential interplay with interferon regulatory factors.

These data demonstrate that systemic depletion of dietary vitamin A changes the metabolic, transcriptional, and epigenetic profile of HSCs toward a dysfunctional stemness phenotype.

Cyp26b1 is critical for HSC self-renewal and quiescence

To gain deeper insight into the molecular mechanism of RA signaling in HSCs, we screened our omics data for known RA pathway members under homeostatic conditions and upon VAF (Figures 1 and 2). Interestingly, cytochrome P450 family 26 subfamily B member 1 (*Cyp26b1*) was significantly downregulated under VAF conditions and specifically expressed in HSCs compared with downstream progenitors and differentiated blood cells (Figures 2J and 2K; Figure S2O). In an irreversible reaction, Cyp26 enzymes metabolize at-RA into 4-hydroxy-RA (4-OH-RA), which can be further oxidized to the catabolic metabolite 4-oxo-RA, commonly considered an inactive degradation product (Figure 3A). Thus, the at-RA-Cyp26-4-oxo-RA axis is seen as a system to balance RA levels in a cell (Bowles et al., 2006; Hernandez et al., 2007; Niederreither et al., 2002; Ono et al., 2020; Sakai et al., 2001; Yashiro et al., 2004). Our metabolomics data show that RA and 4-oxo-RA are enriched in HSCs+MPP1, indicating enzymatic activity of Cyp26 in HSCs (Figure 1B). Although *Cyp26a1* and *Cyp26c1* were not expressed (Figure 2J; Figure S2O), we sought to test whether Cyp26b1 is important for stemness. To this end, we employed two different Cre-driver mouse models to conditionally delete *Cyp26b1* in HSCs in the adult hematopoietic system (*Mx1Cre x Cyp26b1^{fl/fl}* and *SclCre x Cyp26b1^{fl/fl}*; Figure 3B). In both systems, *Cyp26b1* deletion was confirmed in HSCs by quantitative reverse transcription PCR (RT-qPCR), and a potential compensatory upregulation of *Cyp26a1* or *Cyp26c1* was excluded (Figures S3A and S3J). Four weeks after induction, *Mx1Cre x Cyp26b1^{fl/fl}* knockout (KO) (*Mx-Cyp26b1^{-/-}*) mice exhibited a mild but significant decrease in relative and absolute HSC frequencies compared with the Cre (*Mx1Cre*) or floxed controls (*Cyp26b1^{fl/fl}*) (Figure 3C; Figures S3B and S3C). Although cell cycle phase distribution was unchanged (Figure S3D), *Mx-Cyp26b1^{-/-}* HSCs showed a significantly higher *in vitro* division rate (Figure 3D; Figure S3E). Notably, neither MPPs nor differentiated

BM cell frequencies were affected (Figures S3F and S3G). Functionally, HSCs lacking *Cyp26b1* showed an impaired *in vitro* self-renewal capacity (Figure 3E). Competitive BM transplantation experiments showed an overall decrease in CD45.2 chimerism (Figure 3F). Lymphoid lineages were particularly affected (Figure S3H), and a decreased number of donor-derived HSCs after secondary transplants was observed (Figure 3G; Figure S3I). To confirm these findings, we repeated the experiments using the *ScfCre* driver mouse line (*Scf-Cyp26b1^{-/-}*, which induces adult HSC-specific KO, and observed the same phenotype (Figures S3J-S3S). Additionally, we analyzed mice 7 months after deletion of *Cyp26b1* (Figure 3H). This long-term deletion led to an enhanced phenotype of HSC frequencies and function (Figures S3B and S3T-S3W) compared with short-term *Cyp26b1* deletion and further resembled the VAF conditions (Figures 2E, 2F, and 3I).

We next performed RNA-seq in short-term-deleted (immediately after KO induction) and long-term-deleted (7 months) *Mx-Cyp26b1^{-/-}* HSCs (Figure 3J; Figure S3X; Table S1). GSEA of both datasets revealed enrichment of “MPP” and “cell cycle” signatures in the absence of *Cyp26b1* and downregulation of genes related to “HSC signatures” and, unexpectedly, “RA signaling” after short-term deletion (Figures S3Y-S3Z; Table S3). Furthermore, we found that the GO terms “TCA cycle” and “metabolism of amino acids” were enriched in *Mx-Cyp26b1^{-/-}* HSCs, whereas “cholesterol metabolism” was depleted, suggesting metabolic priming toward a dysfunctional stemness phenotype similar to VAF conditions (Figure 3J; Figure S3AA).

To see whether loss of *Cyp26b1* mimics the transcriptional changes seen in VAF HSCs, we created a gene signature from VAF up- or downregulated DEGs ($\text{padj.} < 0.1$; Table S3) and performed GSEA in *Mx-Cyp26b1^{-/-}* HSCs. Transcriptional changes observed in short-term *Cyp26b1* deletion did not significantly correlate with VAF signatures (data not shown). However, when comparing 7-month *Mx-Cyp26b1^{-/-}* HSCs with VAF HSCs, up- and downregulated genes, respectively, were significantly enriched (Figure 3K; Figure S3AB; Table S3), suggesting that the phenotype observed in *Mx-Cyp26b1^{-/-}* HSCs is at least partially established because of the lack of retinoids. We then performed ATAC-seq on *Mx-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}* HSCs (Figure S3AC). Digital footprinting analysis revealed that the occupancy of the RAR motif was significantly decreased in *Mx-Cyp26b1^{-/-}* HSCs (Figure 3L), further indicating a role of RA metabolites downstream of *Cyp26b1* for RAR activation. To test whether *Cyp26b1* is indeed indispensable for 4-oxo-RA production in HSCs, we performed targeted retinoid metabolomics. Importantly, we found that 4-oxo-RA was depleted in *Mx-Cyp26b1^{-/-}* HSCs+MPP1, whereas RA levels were not affected (Figure 3M).

These data indicate that the enzyme *Cyp26b1* plays an important role in maintaining HSC self-renewal and quiescence, presumably by metabolizing at-RA to 4-oxo RA.

4-oxo-RA regulates HSC function

4-oxo-RA is commonly considered a catabolic by-product of processes limiting the effect of at-RA in the cell (Bowles et al., 2006; Ferreira et al., 2020; Ghyselinck and Duester, 2019; Hernandez et al., 2007; Niederreither et al., 2002; Sakai et al., 2001). However, a few studies have shown that 4-oxo-RA can also be an active metabolite (Baron et al., 2005;

Idres et al., 2002; Pijnappel et al., 1993; Shealy, 1989; van der Leede et al., 1997). Thus, we aimed to unravel whether and how HSCs respond to 4-oxo-RA. To our surprise, we found that *in vitro* treatment with 4-oxo-RA maintained stem cell quiescence and prevented HSCs from undergoing cell division to the same extent as at-RA (Figures 4A-4C). Of note, toxicity effects from *in vitro* treatment were excluded (Figure S4A). When placed into *in vitro* culture, HSCs start a differentiation process involving increased metabolic activity. We hypothesized that 4-oxo-RA-treatment may prevent HSC activation *in vitro*, similar to what has been shown for at-RA (Cabezas-Wallscheid et al., 2017; Purton et al., 1999, 2000). Indeed, we observed a significant decrease in nascent protein translation rates and a lower number of reactive oxygen species (ROS)-oxidized HSCs (Figure 4D-E), indicating low use of OXPHOS as an energy source and, thus, maintenance of HSC features (Signer et al., 2014, Ludin et al., 2014; Suda et al., 2011). A mitochondrial stress test on LSK cells revealed significantly lower basal and maximal respiration upon at-RA and 4-oxo-RA treatment (Figure S4B), in line with recent findings that show reduced basal and maximal respiration in HSCs compared with MPPs (Ito et al., 2019). Of note, mitochondrial content was not affected by the treatments (Figure S4C). Functionally, 4-oxo-RA *in vitro* treatment led to an increased *in vitro* and *in vivo* self-renewal capacity (Figures 4F and 4G). To assess whether 4-oxo-RA might protect HSCs *in vivo* from proliferative activation upon poly(I:C) (pIC) injection, we pre-treated mice with at-RA or 4-oxo-RA (Figure 4H). 4-oxo-RA treatment was associated with higher retention of HSCs in the G0 cell cycle phase, decreased HSC proliferation, and higher self-renewal capacity compared with control conditions after pIC treatment (Figures 4H-4J). The downstream metabolite 4-oxo-RA mimics at-RA effects on HSCs *in vitro* and *in vivo*. This indicates that 4-oxo-RA could be crucial for signaling through the RARs in HSCs.

Next we performed RNA-seq on 24-h *in-vitro*-cultured HSCs+MPP1 treated with dimethyl sulfoxide (DMSO), at-RA, or 4-oxo-RA (Figure S4D). GSEA of 4-oxo-RA-treated versus DMSO-treated HSCs+MPP1 revealed a strong correlation for the signatures “dormant HSCs” and “HSCs” (Figure S4E). Although the overall transcriptional response to at-RA and 4-oxo-RA was very similar (Figure S4D; Table S1), 4-oxo-RA treatment led to additional enrichment for HSC-specific signatures as well as metabolic pathways such as “signaling by GPCR” and “Netrin-1 signaling” (Renders et al., 2021; Figure S4F and S4G). In contrast, at-RA-treated HSCs+MPP1 were further enriched for “amino acid metabolism” and “TCA cycle,” indicating that HSC hallmarks are even better preserved by the metabolite 4-oxo-RA.

An unbiased clustering analysis identified 4 clusters for which we performed GO analysis and a regulatory motif prediction (Figure 4K; Tables S1 and S4). Interestingly, cluster 1 was dominated by genes associated with “DNA replication,” showing strong downregulation by both RA metabolites and enrichment for the E2F motif, which is known to be involved in cell cycle regulation (Dimova and Dyson, 2005; Helin, 1998). Genes in cluster 2, which included *Cyp26b1* and *Rarb*, were highly upregulated by both RAs and linked to “inflammatory response.” This cluster showed enrichment for RAR motifs, suggesting that these are likely direct target genes of 4-oxo-RA and at-RA, in contrast to genes in clusters 3 and 4. Additionally, RT-qPCR analysis showed cluster 2 genes were already induced after 2 h of treatment, further indicating a direct response (Figure S4H). Similarly, genes

induced by 4-oxo-RA are also expressed at significantly higher levels in HSCs compared with downstream MPP populations, whereas 4-oxo-RA-repressed genes are strongly induced upon differentiation (Figure S4I). Thus, 4-oxo-RA-treatment leads to direct and indirect transcriptional changes, inducing HSC-specific and repressing MPP-specific genes.

We showed that 4-oxo-RA is a potent metabolite that regulates gene expression in HSCs and plays an essential role in the retention of HSC quiescence and self-renewal capacity.

4-oxo-RA acts downstream of *Cyp26b1* and is required for HSC maintenance

To unravel whether the lack of 4-oxo-RA causes the transcriptional changes observed with VAF diet feeding or upon *Cyp26b1* deletion, we compared DEGs of *in vitro* 4-oxo-RA treatment with gene expression fold changes found in VAF and *Mx-Cyp26b1*^{-/-} HSCs (Figure 4L; Figures S4J and S4K; Table S4). Globally, transcriptome data of VAF HSCs, short-term as well as long-term deletion of *Cyp26b1* in HSCs, and, interestingly, MPPs resembled the DMSO control condition upon HSC+MPP1 *in vitro* treatment (Figure S4K). Importantly, VAF signatures for up- and downregulated genes showed a significant and strong anti-correlation compared with 4-oxo-RA-induced and 4-oxo-RA-repressed genes, respectively (Figure S4J). Cluster 2 genes in particular, approximately 80% of which contain a RAR motif, were not only strongly downregulated in VAF HSCs but also reduced in 7-month *Mx-Cyp26b1*^{-/-} HSCs (Figure 4L). Thus, 4-oxo-RA is likely the metabolic signal modulating core signature genes that were found to be deregulated in VAF and *Cyp26b1* KO HSCs; however, an at-RA-mediated effect cannot be excluded.

To address whether the positive effects of at-RA on HSC function are conferred by binding of at-RA to RARs or by the *Cyp26b1*-downstream metabolite 4-oxo-RA, we performed RNA-seq on *Mx-Cyp26b1*^{-/-} HSCs+MPP1 that were treated *in vitro* with DMSO, at-RA, or 4-oxo-RA (Figure 5A; Table S1). GSEA of the DMSO condition revealed a strong correlation with the MPP signature when comparing *Mx-Cyp26b1*^{-/-} HSCs+MPP1 against *Cyp26b1*^{fl/fl} HSCs+MPP1, consistent with our previous findings (Figures S3E, S3P, and S5A; Table S3). Although at-RA treatment exerted a transcriptional response in *Mx-Cyp26b1*^{-/-} HSCs+MPP1, we found significant enrichment of the MPP signature that, in contrast, was lost upon 4-oxo-RA treatment (Figure S5A). This suggests that 4-oxo-RA, but not at-RA, can rescue the loss of *Cyp26b1* in *Mx-Cyp26b1*^{-/-} HSCs. To evaluate a functional rescue, we treated *Cyp26b1*^{fl/fl} and *Mx-Cyp26b1*^{-/-} or *Scl-Cyp26b1*^{-/-} HSCs with at-RA, 4-oxo-RA, and their upstream metabolite retinol (Figures 5B and 5C; Figure S5B). Upon treatment with retinol, at-RA, and 4-oxo-RA, *Cyp26b1*^{fl/fl} HSCs retained their quiescence and showed enhanced self-renewal capability. In contrast, in *Scl-Cyp26b1*^{-/-} HSCs, only 4-oxo-RA led to enhanced stem cell quiescence and function, whereas retinol and at-RA treatments had no effect (Figures 5B and 5C). To validate these findings *in vivo*, we pre-treated *Cyp26b1*^{fl/fl} and *Scl-Cyp26b1*^{-/-} mice with at-RA or 4-oxo-RA before challenging them with pIC. Strikingly, 4-oxo-RA, but not at-RA, retained quiescence in *Scl-Cyp26b1*^{-/-} HSCs and led to increased *in vitro* self-renewal capacity compared with DMSO pIC conditions (Figures 5D and 5E).

These data indicate that 4-oxo-RA, produced in a cell-autonomous manner by Cyp26b1 in HSCs, is the main active RA metabolite required to convey the complete transcriptional response to maintain HSC properties.

Rarb is required to mediate 4-oxo-RA-dependent maintenance of HSC function

Next we aimed to investigate which TF may be responsible for transmitting 4-oxo-RA-dependent effects on HSC function. RA metabolites enter the nucleus to bind to RARs; to modulate gene expression, RARs dimerize with retinoid X receptors (RXRs) and bind to RA response elements (RAREs) on genomic DNA (McKenna, 2012). RARs as well as RXRs consist of three different subtypes (α , β , and γ) that show cell-type-specific expression patterns, creating platforms for distinct RA effects in various tissues (Bushue and Wan, 2010; Conserva et al., 2019; Tang and Gudas, 2011). Our gene expression data revealed that *Rarb* (in contrast to *Rarg* and *Rara*) was specifically expressed in HSCs but not in downstream progenitors or differentiated cells and showed significant downregulation upon VAF conditions (Figures 6A and 6B; Figures S6A and S6B). Moreover, some studies report that 4-oxo-RA is a potent ligand and activator of Rarb specifically (Faria et al., 1999; Idres et al., 2002; Pijnappel et al., 1993; Sonneveld et al., 1999), raising the possibility that 4-oxo-RA's effects in HSCs could be mediated through Rarb.

To test Rarb function in HSCs, we first established an *in vitro* retroviral knockdown (KD) system (Figure 6C; Figure S6C). *Rarb* KD was validated by RT-qPCR (Figure S6D) and led to decreased HSC frequencies and reduced *in vitro* self-renewal capacity (Figures 6D and 6E). *In vivo* competitive transplantation of *Rarb* KD and control LSK cells showed that silencing of *Rarb* leads to a severe decrease in PB CD45.2 chimerism (Figure 6F; Figure S6E). Additionally, we performed *in vivo* transplantation assays using a constitutive *Rarb* KO mouse model. *Rarb* KO was confirmed by RT-qPCR, whereas compensatory upregulation of other RARs was excluded (Figure S6F). 16 weeks after transplantation of *Rarb* KO HSCs, CD45.2⁺ BM cells revealed a lower frequency of HSCs compared with the control condition (Figure S6G). These data show that Rarb plays an important role in maintenance of stem cell features.

To unravel whether Rarb is required for mediation of 4-oxo-RA's effects on stemness, we treated *Rarb* KO HSCs with retinol, at-RA, or 4-oxo-RA *in vitro* and analyzed their functional response. Interestingly, none of the metabolites had an effect on proliferation or on *in vitro* or *in vivo* self-renewal capacity in *Rarb* KO HSCs (Figures 6G-6I). A previous study has described the role of Rarg in mediating RA signaling in HSCs (Purton et al., 2006). To investigate a potential involvement of Rarg in (4-oxo-) RA-mediated signaling, we used a constitutive *Rarg* KO mouse model and treated *Rarg* KO and control HSCs with DMSO, at-RA, or 4-oxo-RA *in vitro* (Figures S6H and S6I). Interestingly, *Rarg* KO HSCs responded to at-RA and 4-oxo-RA treatment with enhanced quiescence and increased *in vitro* self-renewal capacity, similar to control HSCs (Figures S6H and S6I). Of note, *Rarg* KO HSCs did not show expression of any RAR except *Rarb* (Figure S6F). These data suggest that Rarb, but not Rarg, is essential for transmitting RA signaling in HSCs.

To evaluate whether Rarb is involved in transcriptional regulation of 4-oxo-RA response genes (Figure 4K; Table S4), we performed RNA-seq in *Rarb* KO HSCs+MPP1 (Figure 6J;

Table S1). Although *Rarb* KO HSCs+MPP1 remained responsive to at-RA and 4-oxo-RA treatment, the overall effect was significantly inferior compared with wild-type cells.

These results indicate that *Rarb* is required to establish a critical gene dosage for proper and complete transmission of RA signaling in HSCs and, ultimately, for maintenance of stem cell identity. We showed that a single metabolite controls stem cell fate by instructing epigenetic and transcriptional attributes. Mechanistically, we dissected an unexpected and non-classical retinoid signaling axis, showing that *Cyp26b1* catalyzes production of 4-oxo-RA, which subsequently mediates signaling via *Rarb*.

DISCUSSION

In this study, we established and applied low-input targeted metabolomics approaches to uncover differences between purified HSCs+MPP1 and their downstream MPPs. Joint analysis of global data on gene expression, chromatin accessibility, and histone modifications emphasized metabolic players that have so far not been linked to HSC biology. For instance, we observed a high abundance of various lipids in HSCs+MPP1. Several studies have previously highlighted changing lipid compositions in relation to stem cell aging or dietary intake (Hermetet et al., 2019; Lu et al., 2019). There is evidence that specific lipid species may have a direct effect on transcription; e.g., by modulating DNA polymerase activity or binding to nuclear receptors (Ardah et al., 2018; Clémot et al., 2020; Kamath-Loeb et al., 2014; Novello et al., 1975). However, further lipidomics will be required to illuminate differential use of signaling or membrane lipids in HSCs and downstream progenitors. The distinct metabolic properties of both populations are further characterized by enrichment of various amino acids in MPPs. The involvement of glutaminolysis in stress-mediated activation of different stem cell systems as well as in a leukemic context has been emphasized previously (Gallipoli et al., 2018; Kim et al., 2020; Sommerkamp et al., 2020). Our metabolomics data revealed higher levels of glutamine and higher expression of its synthesizing enzyme, glutamine synthetase, in HSCs(+MPP1) compared with downstream MPPs but lower levels of glutamate, suggesting that MPPs may rely on energy production supported by glutaminolysis.

The most highly enriched metabolic hub in HSCs was retinol metabolism, as indicated by metabolic, transcriptional, and epigenetic analyses. It is currently widely accepted that vitamin A is metabolized to bioactive at-RA via a classical RA pathway (Cañete et al., 2017). Here we show that HSCs rely on a non-classical RA signaling axis, *Cyp26b1*-4-oxo-RA-*Rarb*. *Cyp26* enzymes are mostly described as preventing excess levels of intracellular at-RA via its degradation to inactive metabolites such as 4-oxo-RA (Bowles et al., 2006; Ghyselinck and Duester, 2019; Hernandez et al., 2007; Niederreither et al., 2002; Sakai et al., 2001). KO studies of *Cyp26* enzymes have shown their relevance in various tissues during development and in adulthood (Ono et al., 2020; Snyder et al., 2020; Yashiro et al., 2004). A previous publication suggested that *CYP26B1* expression is exclusively found and required in human BM niche cells to inactivate at-RA in stem and progenitor cells (Ghiaur et al., 2013). In mice, we showed that *Cyp26b1* was expressed in HSCs and that its deletion led to a deficit in 4-oxo-RA levels and loss of HSC function. To our knowledge, *Cyp26b1* has not yet been considered essential for production of a bioactive retinoid. Strikingly, 4-oxo-RA

treatment resulted in rapid and strong upregulation of genes and enhanced stemness features. Although few studies have previously demonstrated that 4-oxo-RA can act as a bioactive metabolite (Baron et al., 2005; Gaemers et al., 1996; Pijnappel et al., 1993; Satre et al., 1989; Shealy, 1989), so far its role has not been studied in the hematopoietic context. Mechanistically, we hypothesize that 4-oxo-RA induces expression of a small group of genes in HSCs that are deregulated in VAF and *Cyp26b1*^{-/-} HSCs and many of which code for membrane-associated proteins (e.g., Clec1a/b and P2rx7). This, in turn, may lead to the ability to respond to BM niche signals and, thus, to maintain HSC self-renewal and quiescence. Even though we observed a discrepancy between the lineage biases in VAF and *Cyp26b1*^{-/-} transplantations, we nevertheless identified a common core retinoid signaling signature, supporting our pathway hypothesis. We suspect that systemic depletion of vitamin A might have additional effects on the hematopoietic system.

Our results highlighted RARs as potential regulators for the majority of 4-oxo-RA target genes. Depending on RAR and RXR expression patterns, different cell types may react differently to various RA metabolites (Bushue and Wan, 2010; Michaille et al., 1994, 1995; Rowe et al., 1992). For example, Idres et al. (2002) demonstrated that at-RA has a higher binding affinity to Rarg, whereas 4-oxo-RA binds more strongly to Rarb. Indeed, HSCs exhibited high and specific expression of *Rarb* (Cabezas-Wallscheid et al., 2014, 2017; Dahlin et al., 2018; Qian et al., 2018). When we treated *Rarb* KO HSCs with at-RA and 4-oxo-RA, functional responses on cell division and self-renewal were completely abolished. Although we measured an effect on gene expression, it was significantly dampened. Although a previous study has shown that Rarg plays an essential role in mediating at-RA signaling in LSK cells (Purton et al., 2006), we found that *Rarg* KO HSCs still functionally responded to 4-oxo-RA and at-RA, although to a slightly lower extent. This discrepancy may be explained by use of different populations (LSK in Purton et al., 2006 versus HSCs used here) and the fact that *Rarb* is HSC specific, whereas *Rarg* is also expressed in progenitor populations. However, because we did not perform transplantation experiments, the role of Rarg in mediating 4-oxo-RA signaling in HSCs requires further examination.

Our results suggest that binding of 4-oxo-RA to Rarb is required in HSCs to establish a critical gene dosage for proper and complete transmission of RA signaling to maintain stem cell features. A possible explanation for the remaining transcriptional effects in *Rarb* KO HSCs may be that these are conferred by other TFs. Previous publications have shown that retinoids can also cause a transcriptional response via unconventional RAR or RXR heterodimers; e.g., via RXR-peroxisome proliferator-activated receptors (Ppars) (Dawson and Xia, 2012; Xu et al., 2001). Additionally, at-RA has been shown to mediate gene expression independent of RARs via other TFs, such as Irf1 (Coyle et al., 2017). Indeed, our data revealed potential crosstalk between RA and IRF signaling in HSCs, as observed previously in other cell types (Bernardo et al., 2017; Luo and Ross, 2006).

This alternative non-classical RA pathway may also have implications for leukemia therapies. At present, at-RA therapy is exquisitely effective, in combination with arsenic trioxide, as a differentiation therapy in acute promyelocytic leukemia with the PML-RARA fusion protein but is generally not potent for treatment of other leukemia subtypes (Chen et al., 1991; Grimwade et al., 2010). It is possible that at-RA therapy not only promotes

differentiation of leukemic cells but also supports leukemic stem cell quiescence via its downstream metabolite 4-oxo-RA and, thus, increases the risk of relapse. Hence, recent advances in the design of Cyp26-enzyme inhibitors and Cyp26-resistant synthetic at-RA-derivatives (Hernandez et al., 2020; Nelson et al., 2013; Teodorescu et al., 2020) may help to improve prognosis.

Limitations of the study

For technical reasons, the HSC+MPP1 metabolic profiles are based on targeted approaches and were generated using a less stringent sorting scheme compared with the highly pure HSC populations used for RNA-, ATAC-, and ChIP-seq. Thus, further development of metabolomics tools might increase the number of detected metabolites. Further, the discrepancy in HSC purity may lead to underestimation of metabolic differences between HSCs and MPPs compared with the other genome-wide approaches.

STAR★METHODS

RESOURCE AVAILABILITY

Lead contact—Further information and requests for resources and reagents can be directed to and are available from the lead contact, Nina Cabezas-Wallscheid (cabezas@ie-freiburg.mpg.de).

Materials availability—Plasmids generated in this study are available upon request from the lead contact, but a completed Materials Transfer Agreement is required.

Data and code availability—The raw data were deposited in ArrayExpress (<https://www.ebi.ac.uk/arrayexpress>) and are available under the accession numbers [E-MTAB-9729, E-MTAB-9745, E-MTAB-10659, E-MTAB-9752, E-MTAB-9749, E-MTAB-9779, E-MTAB-9780, E-MTAB-9778, E-MTAB-10661]. Further information can be found in the STAR Methods section.

EXPERIMENTAL MODEL AND SUBJECT DETAILS

Mouse models—All mice were bred in-house in the animal facility at the MPIE in individually ventilated cages (IVCs), except for the *Rarg* KO mouse model, which was imported from our collaborator in France (animal facility licensed by agreement #C6721837; N.B.G and B.F. qualified in compliance with the European Community guidelines for laboratory animal care and use - 2010/63/UE). Mice were euthanized by cervical dislocation according to German guidelines. Animal procedures were performed according to protocols approved by the German authorities and the Regierungspräsidium Freiburg (the sacrificing of animals for scientific purposes according to §4 (3) of the German Animal Protection Act; animal protocol numbers G-17/97, G-17/147, G-20/58).

Vitamin A-free diet—3- to 4-week old C57BL/6J female mice were kept in a vitamin A-free diet (0 IU/g vitamin A) or control food (25 IU/g vitamin A) (ssniff Spezialdiäten GmbH) for 16 to 24 weeks and analyzed the same day.

Cyp26b1 knockout—Conditional deletion of *Cyp26b1* was performed using two independent Cre-driver mice, the *Mx1Cre* line (full name *B6. Cg-Tg(Mx1-cre)1Cgn/J*) (Kühn et al., 1995) or *ScfCre* line (full name *B6. Tg(Tal1-cre)42-056Jrg*) (Göthert et al., 2005). These were then crossed with the *Cyp26b1 fl/fl* (full name *B6-Cyp26b1tm2Hmd*) (MacLean et al., 2007) mouse line and induced at 7 to 8 weeks of age. KO of *Cyp26b1* using the *Mx1Cre* driver was performed by intraperitoneal injection of 100µg poly I:C /mouse every other day over 10 days (for a total of 5 injections), followed by a recovery phase of 4 weeks before analysis. Knockout using the *ScfCre* driver was achieved by administering tamoxifen food (400mg/kg tamoxifen-citrate food, ssniff Spezialdiäten GmbH) over a period of 3 to 4 weeks before analysis. Male and female mice were used for analysis. Induction treatments were also administered to *Cyp26b1 fl/fl*, *MxCre* and *ScfCre* littermate controls.

Rarb knockout—*Rarb* straight KO mice were purchased from Jax (*Stock Rarb^{tm1Vg1/HsvJ}, stock No 022999*) and analyzed at 7 to 8 weeks of age together with either wild-type (WT) littermate controls or C57BL/6J mice of the same age. Male and female mice were used for analysis.

Rarg knockout—*Rarg* straight KO mice (Chapellier et al., 2002) were imported from N.B.G., kept for 2 weeks under quarantine conditions, and analyzed at 8 weeks of age together with either WT littermate controls or C57BL/6J mice of the same age. Male and female mice were used for analysis.

MitoOrp mouse model—The MitoOrp mouse model (full name *B6-Gt(ROSA)26Sor(mito-Orp-roGFP2)Tg(CMV-cre)1Cgn*) (Fujikawa et al., 2016) was used to measure ROS levels after *in vitro* treatments of HSPCs (specified elsewhere). Male and female mice were used for experiments at the age of 8 to 20 weeks.

Transplantation models—B6Ly5.1 (CD45.1) or C57BL/6J x B6Ly5.1(CD45.1/2) female mice were used as transplantation recipients and/or supportive/competitive donors.

METHOD DETAILS

HSC/MPP isolation and fluorescence-activated cell sorting (FACS)—Murine BM cells were isolated from pooled femurs, tibias, ilia, and vertebrae by gentle crushing in PBS using a mortar and pestle. Erythrocyte lysis was performed using ACK Lysing Buffer (Thermo Fisher Scientific). To enrich for lineage negative (Lin^{-}) cells, we used the Dynabeads Untouched Mouse CD4 Cells Kit (Invitrogen). Briefly, the erythylsed BM was stained for 30 to 45 minutes with a 1:4 dilution of the Lineage Cocktail provided in the Dynabeads Untouched Mouse CD4 Cells Kit (Invitrogen). Labeled cells were then incubated for 20 minutes with washed polyclonal sheep anti-rat IgG coated Dynabeads (as provided in the kit) at 400 uL/mouse. Depletion of Lin^{+} cells was performed using a magnet. To achieve further purification of HSCs and progenitor cells we used fluorescence- activated cell sorting (FACS). Cell populations were defined as follows: HSCs (LSK CD150⁺ CD48⁻ CD34⁻), MPP1 (LSK CD150⁺ CD48⁻ CD34⁺), MPP2 (LSK CD150⁺ CD48⁺ CD34⁺), MPP3 (LSK CD150⁻ CD48⁺ CD34⁺ CD135⁻), MPP4 (LSK CD150⁻ CD48⁺ CD34⁺ CD135⁺), B cells (B220⁺), myeloid cells (CD11b⁺, GR1⁺) and T cells (CD4⁺CD8⁺). Therefore, the

depleted cell fraction was stained for 30 to 60 minutes using the following monoclonal antibodies: anti-lineage (anti-CD4 [clone GK1.5], anti-CD8a [53-6.7], anti-CD11b [M1/70], anti-B220 [RA3-6B2], anti-GR1 [RB6-8C5] and anti-TER119 [Ter-119]) all PE-Cy7 or BV650 or FITC; anti-CD117/c-Kit (2B8)-PE or BV711; anti-Ly6a/Sca-1 (D7)-APCCy7; anti-CD34 (RAM34)-FITC or AF700; anti-CD150 (TC15-12F12.2)-BV605 or PECy5; anti-CD48 (HM48-1)-BV421 or PECy7. Monoclonal antibody conjugates were purchased from eBioscience or BioLegend. Sorting was then performed using a FACS Aria II, III or FACSymphony (Becton Dickinson). Subsequently, cells were collected into ice-cold PBS for reconstitution assays and ChIP-seq, Stem Pro®-34 SFM (Life Technologies) without cytokines for targeted metabolomics, Complete Stem Cell Medium (specified elsewhere) for *in vitro* treatments, single cell division assays and *in vitro* treatment transplants, PBS with 1% BSA for ATAC-seq, RNA lysis buffer (ARCTURUS PicoPure RNA Isolation Kit (Life Technologies, Invitrogen)) for population RNA-seq, RT-qPCR and stored at -80°C.

Bulk RNA-seq

Generation: Population RNA-seq data were generated as previously described (Cabezas-Wallscheid et al., 2014). RNA of freshly sorted cells was first extracted using the PicoPURE Arcturus kit (Applied Biosystems). For *in vitro* treatment experiments, cells were harvested after 24 hours and directly transferred into SMARTseq v4 reaction buffer. Subsequently, cDNA libraries were prepared using SMARTseq v4 (Takara Bio) chemicals with 12 cycles of amplification. Further, the NEBNext Ultra II FS DNA library kit (NEB) was employed to generate uniquely- and dually-barcoded sequencing libraries from cDNA libraries. To this end, 3 to 10ng of cDNA library was fragmented for 22.5 minutes, adaptors were ligated and libraries were amplified using cycle numbers according to input material. RNA-seq libraries were sequenced at 55 million reads depth, 100bp paired end on the Illumina NovaSeq platform.

Low-level processing: Raw FASTQ files were mapped against the mm10 reference genome using the mRNA-seq tool from the bioinformatics pipeline snakePipes (Bhardwaj et al., 2019). In this tool, *Alignment* mode was used for the mapping of sequenced reads with STAR (STAR_2.7.4a) (Dobin et al., 2013), followed by expression counts quantification by featureCounts (Liao et al., 2014). The quality of the data was checked by running DeepTools QC (3.3.2) (Ramírez et al., 2016). Read coverages for track visualization were obtained via deepTools bamCoverage using RPKM normalization. Genes with an average expression higher than 100 counts in any condition were selected for further analysis. DESeq2 was used to test for differential expression (Love et al., 2014); results were considered significant at a false discovery rate (FDR) equal to 0.1.

Downstream analysis: Principal component analysis (PCA) visualization was performed based on variance stabilized read counts using the DESeq2 package. The expression values of DEGs were used for the visualization of the effect on metabolic pathways and the generation of custom summary metabolic diagrams. For evaluation of expression of the previously published gene signatures of HSC/MPP (Cabezas-Wallscheid et al., 2014), Activation/Dormancy HSCs (Cabezas-Wallscheid et al., 2017), MoI/O/NoMo HSCs (Wilson et al., 2015) and Retinoic acid (Cabezas-Wallscheid et al., 2017) in the pairwise

comparisons, GSEA was performed with the `fgseaMultilevel`(`minSize = 15`, `maxSize = 500`, `eps = 0`) function from the `fgsea` package (Sergushichev, 2016), considering significant pathways at a FDR equal to 0.1. We also performed enrichment of the mouse Reactome pathways (Jassal et al., 2020) as well as our herein-described VAF RNA-seq upregulated or downregulated genes and gene sets (obtained from the GO terms of the metabolic pathways of "fatty acid metabolic process" [GO:0006631], "glycolytic process" [GO:0006096], "nucleotide metabolic process" [GO:0009117], "reactive oxygen species metabolic process" [GO:0072593], "tricarboxylic acid cycle" [GO:0006099], "cellular amino acid metabolic process" [GO:0006520], "cholesterol metabolic process" [GO:0008203] and "retinoic acid metabolism" [including "retinoic acid metabolic process" (GO:0042573), "cellular response to retinoic acid" (GO:0071300), "retinoic acid receptor binding" (GO:0042974) and "retinoic acid receptor signaling pathway" (GO:0048384)]). The GSEA enrichment profile of specific signatures were plotted using `gseaplot2` function (Yu, 2020). Lists of expression levels of the genes involved in the already mentioned GO terms in our datasets were manually generated and represented as barplots using Prism. For *in vitro* treatments RNA-seq datasets, the expression values of the resulting 2077 DEGs from the pairwise comparisons of wildtype 24-hour, 4-oxo-RA and at-RA treatments were VST-transformed and relativized across samples, showing the amount by which each gene deviated in a specific sample from the gene's average (Love et al., 2015). The Euclidean distances between these genes were calculated with the `dist` function, and then sorted into 4 clusters that covary across samples of the same condition using the `hclust` function with the `ward.D2` clustering criteria and `cutree(k = 4)` (Murtagh and Legendre, 2014). The resulting tree was represented using the `heatmap` package (Kolde, 2019). We tested for over-representation of the clustered genes on GO enrichment analysis using *Biological Processes* of DAVID 6.8 (Huang et al., 2009). Finally, the `log2FC` values for the clustered genes in different pairwise comparisons were visualized in boxplots.

The raw data were deposited in ArrayExpress (<https://www.ebi.ac.uk/arrayexpress>) and are available under the accession numbers [E-MTAB-9729, E-MTAB-9745, E-MTAB-10659, E-MTAB-9752, E-MTAB-9749].

ATAC-seq

Generation: ATAC-seq was generated according to Corces and colleagues (Corces et al., 2017) with some variations. In brief, 1,000 to 3,000 cells were sorted according to surface markers and DAPI into PBS 1% BSA in order to ensure viability. Cells were spun down at 500 x g for 10 minutes at 4°C, supernatant was removed and 20µl of complete transposition buffer (1ml Tn5, 10µl 2x TD buffer (Illumina), 0.01% digitonin, 0.3 x PBS) was carefully added to the invisible cell pellet. The transposition reaction was subsequently carried out at 37°C for 30 minutes on a Thermomixer at 700 rpm. DNA was purified using QIAGEN MinElute Reaction Cleanup and eluted in 20µl EB buffer. Libraries were amplified initially for 5 cycles and further amplification was adjusted to input material as assessed by qPCR. Libraries were cleaned up using AMPure XP beads (Beckman Coulter), double-sided size selection was performed by removing large fragments that precipitate with 0.5 x volume and purifying fragments that precipitate with 1.8 x volume ratio. Clean-up was done twice in

order to efficiently remove primers and adaptor dimers. ATAC-seq libraries were sequenced at 75 million reads depth per sample, 100bp paired end on an Illumina NovaSeq platform.

Low-level processing: Reads were aligned in paired-end mode to the mm10 genome using Bowtie2 (Langmead and Salzberg, 2012). Normalization of resulting bam files was obtained using deepTools multiBamSummary (Ramírez et al., 2014). Read coverages for visualization were obtained via deepTools bamCoverage using RPKM normalization and scaling factors obtained above. Peak detection was performed via MACS2 callpeak (Zhang et al., 2008) with a q-value of 0.001.

Downstream analysis: Clustering was performed as previously described (Cauchy et al., 2016) with modifications. The union of peaks was obtained via bedtools merge (Quinlan and Hall, 2010) from ATAC summits. Regions showing \log_2 fold changes versus control either < -1 or $> +1$ were considered specific; those between -1 and $+1$ were considered shared. ATAC matrices were obtained using deepTools computeMatrix ± 3 Kbp around summits. Heatmaps were generated using deepTools plotHeatmap. For GSEA of ATAC-specific sites in RNA-seq \log_2 FC ranked genes (Subramanian et al., 2005), gene sets were created by annotating the top 300 specific peaks to the nearest gene using bedtools closest. GSEAs were run on \log_2 transformed expression data, using weighted as the enrichment statistic, difference of classes as the ranking metric and gene set as the permutation type. For digital genomic footprinting analyses, pyDNase wellington_footprints was used (Piper et al., 2013) in ATAC mode, shifting coordinates by +4bp and -5bp for the positive and negative strand, respectively. Average Tn5 insertion profiles and footprinting occupancy scores were obtained using pyDNase dnase_average_profiles and wellington_score_heatmap, respectively, also in ATAC mode.

To assess differential accessibility in pairwise comparisons at the gene level, mapped read counts on the peaks located along the gene body of all replicates filtered with bedtools window (Quinlan and Hall, 2010) were quantified by featureCounts (Liao et al., 2014) using the '-O' option to allow multi-overlapping reads. DESeq2 was used to test for differential accessibility (Love et al., 2014); results were considered significant at an FDR = 0.1. As described in the RNA-seq methods above, the DESeq2 output was fed into the fgsea package (Sergushichev, 2016) for performing GSEA of the mouse Reactome pathways (Jassal et al., 2020) and gene sets of the selected metabolic GO terms, considering significant pathways at an FDR equal to 0.1.

Gene ontology analysis for genes annotated to HSC- or MPP-specific ATAC-seq peaks was done using the *Biological Processes* database of DAVID (Huang et al., 2009).

The raw data were deposited in ArrayExpress (<https://www.ebi.ac.uk/arrayexpress>) and are available under the accession numbers [E-MTAB-9778, E-MTAB-9779, E-MTAB-9780].

ChIP-seq

Generation: For low-input ChIP-seq we followed the TAF ChIP-seq protocol as described by Akhtar et al. (2019) with few modifications. In brief, cells were stained for FACS sorting with respective antibodies and subsequently crosslinked for 10 minutes at room

temperature using PBS with 1% formaldehyde. The reaction was quenched by 125mM glycine and cells were washed twice with ice-cold PBS. 4,000 DAPI-negative cells were then sorted according to surface markers into 200 μ l RIPA buffer. Nuclei were broken by mild sonication (Diagenode Bioruptor, 3 cycles, low power, 30 s on/off) and chromatin was incubated with antibody-coupled protein G dynabeads (Thermo Fisher Scientific) overnight at 4°C. Chromatin was then fragmented by incubation with 1 μ l Tn5 enzyme in 20 μ l 1x transposition buffer (Illumina) for 40 minutes at 37°C. Stringent washing steps with low salt (once) and high-salt RIPA (four times) as well as TE buffer (twice) were performed to remove all fragmented chromatin that was not associated with the antibody-bead-complex. Reverse crosslinking was performed with proteinase K at 60°C overnight before DNA was isolated using phenol-chloroform extraction and subsequent ethanol precipitation overnight at -80°C. Sequencing libraries were then amplified using unique dual barcode primers (Illumina) and 14 PCR cycles. Libraries were cleaned up using AMPure XP beads (Beckman Coulter). Double-sided size selection was performed by removing large fragments that precipitate with 0.2 x volume and purifying fragments that precipitate with 1.0 x volume ratio. Clean-up was done twice in order to efficiently remove primers and adaptor dimers. ChIP-seq libraries were sequenced at 50 million reads depth per sample, 100bp paired end on an Illumina NovaSeq platform.

Low-level processing: ChIP-Seq datasets were aligned to the mm10 genome and processed as described above for ATAC-Seq datasets. Additionally, to correct for amplification of simple repeat elements due to low starting material, coverage files were subsequently masked for those using bedtools intersect. H3K4me3 enriched regions intersecting with gene TSSs (\pm 1 Kbp) were called via MACS2 callpeak (Zhang et al., 2008) with a q-value of 0.01, using -nomodel -nolambda parameters. H3K27me3 TSS enriched regions were identified using the same method, except adding the -broad parameter for broad peak calling, since H3K27me3 histone mark tends to spread along broad regions of enrichment as suggested in the literature (Adriaens et al., 2016; Chokeshaiusaha et al., 2018; Nakato and Sakata, 2021). In addition, the Pearson correlation coefficient between the H3K4me3 ChIP-seq datasets performed on 1,000 and 10,000 cells were estimated based on the read coverage matrix resulting from the multiBamssummary step.

Downstream analyses: To assess differential histone mark enrichment in pairwise comparisons at gene promoter level, the reads in the TSSs detected peaks were quantified by featureCounts (Liao et al., 2014) as described in the ATAC-seq methods. DESeq2 was again used to test for differential enrichment (FDR = 0.1) and fgsea package was used for the GSEA of the pathways of interest as described above. For the visualization of the overall differences in TSS enrichment of H3K4me3 and H3K27me3 histone marks, genes with an average quantified enrichment higher than 100 counts in any condition were selected. Row z-scores of the average enrichment per condition in the resulting gene promoter regions for relativization across samples were obtained in R via double transposition of center-scaled: $t(\text{scale}(t(x)))$. The Euclidean distances between the enrichment patterns of the genes were calculated with the dist function, and then sorted into 5 clusters using the hclust function with the ward.D2 clustering criteria and cutree(k = 5) (Murtagh and Legendre, 2014). The resulting tree was represented using the pheatmap package (Kolde, 2019).

The raw data were deposited in ArrayExpress (<https://www.ebi.ac.uk/arrayexpress>) and are available under the accession number [E-MTAB-10661].

Targeted metabolomics: (semi-)polar metabolites—For low-input targeted metabolomics on polar metabolites 10,000 HSCs+MPP1 (LSK CD150⁺CD48⁻) and MPPs (LSK CD150⁻CD48⁺) were sorted using flow cytometry into ice-cold Stem Pro-34 SFM (Life Technologies) without cytokines. For extraction of polar metabolites cells were then washed with 2.8% glycerol solution and metabolites were extracted with 100µl 80% MeOH extraction buffer containing 13C yeast extract as internal standard. Samples were subsequently vacuum-concentrated (EZ2 elite, Genevac) and stored at -80°C until further processing. Targeted metabolite quantification by LC-MS was carried out using an Agilent 1290 Infinity II UHPLC in line with an Agilent 6495 QQQ-MS operating in MRM mode. MRM settings were optimized separately for all compounds using pure standards. LC separation was done on a Phenomenex Luna propylamine column (50 × 2 mm, 3 mm particles) using a solvent gradient of 100% buffer B (5 mM ammonium carbonate in 90% acetonitrile) to 90% buffer A (10 mM NH₄ in water). Flow rate was adjusted from 1000 to 750 µl/min. Autosampler temperature was 5°C and the injection volume was 2 µl. Data processing was performed by Agilent MassHunter (Version B.08.00). At least two negative controls were measured for each experiment to evaluate metabolite background levels. Metabolites were only included if they were detected above background levels and retention time was identical to the 13C yeast standard qualifier peak. To evaluate metabolic differences, the area under the curve (AUC) was determined. Data were normalized to the mean of every metabolite in the HSC population per experiment. HSC+MPP1 replicates represent either a single biological replicate or a pool of 2 biological replicates, MPP replicates represent only 1 biological replicate of the corresponding mice.

Targeted metabolomics: retinoids and polar lipids—Low-input targeted metabolomics on retinoids, bile acids, and polar lipids were performed on 30,000 to 50,000 FACS-sorted HSCs+MPP1 (LSK CD150⁺CD48⁻) and MPPs (LSK CD150⁻CD48⁺). Cells were directly sorted into 100µl 100% acetonitrile (ACN) reaching a final concentration of roughly 80% ACN due to contamination of flow-PBS. Samples were then vacuum-concentrated (EZ2 elite, Genevac) and stored at -80°C until further processing. Targeted quantification of these metabolites by LC-MS was carried out using an Agilent 1290 Infinity II UHPLC in combination with a ProLab Zirconium Ultra microLC pump in line with an Agilent 6495 QQQ-MS operating in MRM mode. ESI coupling was achieved with a prototype microLC ESI source (ProLab). MRM settings were optimized separately for selected retinoids, bile acids, and polar lipids using pure standards and transferred for the detection of their respective isomers. LC separation was performed on a 100 × 0.3 mm column with 1.8µm Zorbax Eclipse plus C18 (Agilent) packed by Dr. Maisch GmbH. The solvent gradient was 100% buffer A (10 mM ammonium formiate in 90:10 water:methanol) to 100% buffer B (10 mM ammonium formiate in 90:10-propanol:acetonitrile). Flow rate was adjusted to 5 µl/min. Autosampler temperature was 5°C and the injection volume was 5 µl. Data processing was performed using Agilent MassHunter Software. At least two negative controls were measured for each experiment to evaluate metabolite background levels. Metabolites were only included if they were detected above background levels and

retention time was similar to the standard qualifier peak. To evaluate metabolic differences, the area under the curve (AUC) was determined. Data were normalized to the mean of every metabolite in the HSC population per experiment and the mean of negative controls was subtracted (resulting negative values were set to 0). Whereas each HSC+MPP1 replicate consisted of a pool of biological replicates (4 to 8 mice), MPP replicates represented only 1 biological replicate of the corresponding mice.

Integration of omics datasets and conditions—To study the overall integration between the different omics datasets in the pairwise comparisons between HSC and MPP cell types we generated a swarm plot with the ranked log₂FC expression in the RNA-seq genes with a FDR threshold of 0.1. Swarm plots of the corresponding ATAC-seq gene body and ChIP-seq TSS peaks counts, as described above, were also generated, and pairwise Pearson's correlation tests were performed with respect to the RNA expression swarm plot. In addition, MTE (Metabolome-Transcriptome-Epigenome)-plots were custom-generated using the “Metabologram” plot as previously described (Hakimi et al., 2016) in order to integrate the effects on the different omics datasets at a metabolic pathway level in an unbiased way. The metabolites involved in each targeted-metabolomics pathway and the individual enzymatic genes detected in RNA-seq from the respective KEGG pathway are plotted as slices in the periphery. The color scale represents the log₂FC metabolite abundance, as well as, the individual enzyme log₂FC value in RNA-seq expression, ATAC accessibility (gene body peaks), and histone marks H3K4me3 and H3K27me3 enrichment assessed with ChIP-seq (TSS peaks) in the comparison between MPP and HSC cell types. The individual significances of metabolites log₂FC are calculated using an unpaired Student's t test (*p < 0.05; **p < 0.01; ***p < 0.001) whereas the represented significance in the RNA-seq, ATAC-seq and ChIP-seq bars are determined by the DESeq2 adjusted p value (*p < 0.1; **p < 0.05; ***p < 0.01). Moreover, the average log₂FC values in the different enzymes and metabolites perturbations are plotted in the center, and a Wilcoxon test was used to calculate the significance of the change based on the individual measurements (*p < 0.1; **p < 0.05; ***p < 0.01). Only the pathways involving at least 5 detected enzymes in RNA-seq and at least 1 measured metabolite are shown. In the case of the pairwise comparison between VAF and control HSCs conditions, only metabolites abundance and the enzyme RNA-seq expression in selected pathways are assessed in the plots. All figures were generated with ggplot2 package (Wickham, 2016)

For the visualization of the RNA-, ATAC-, and ChIP-seq data, we used the Integrative Genomics Viewer (IGV) browser and represented merged coverage tracks of individual replicates.

For the integration of the RNA-seq expression perturbations in different conditions, we took the *in vitro* WT 24-hour 4-oxo-RA and at-RA treatments RNA-seq heatmap as reference and generated VST-transformed heatmaps as previously described for the same genes and clusters in the other pairwise comparisons. Additionally, the expression log₂FC of the genes corresponding to cluster 2 were shown individually for different pairwise comparisons, and the presence/absence of a RAR motif in their regulatory cistrome, as retrieved using *in-cis-target* (Herrmann et al., 2012) was indicated.

***In vivo* experiments**

In vivo treatments: 8-to 16-week old C57BL/6J, *Cyp26b1* KO, or *Cyp26b1^{fl/fl}*, mice were injected intraperitoneally 24 hours before sacrificing with either 30mg/kg at-RA (Sigma-Aldrich) or 30mg/kg 4-oxo-RA (Sigma-Aldrich), or with the respective amount of DMSO in PBS. After 8 hours, 100µg poly I:C per mouse was injected. Mice were sacrificed 16 hours later and BM cells were subjected to further analysis such as cell cycle, single cell division assays or colony-forming unit assays (described below).

Characterization of in vivo mouse models

Cell cycle analysis: HSC surface staining defined as (LSK CD150⁺CD48⁻CD34⁻) was performed on erylysed BM cells. Cells were fixed for 10 minutes at 4°C with BD Cytofix/Cytoperm Buffer (Becton Dickinson and Company). Subsequently, intracellular Ki-67 (BD Biosciences) staining was performed using PermWash solution for at least 45 minutes at 4°C (Becton Dickinson and Company). Prior to flow cytometry analysis cells were stained with DAPI (Sigma-Aldrich) at RT for at least 30 minutes.

Single cell division assay: Single HSCs (LSK CD150⁺CD48⁻CD34⁻) were sorted into 72-well Terasaki plates (Greiner Bio-One) containing Complete Stem Cell Medium (specified in Enrichment of HSPCs and cultivation). After 48 hours, each well was checked manually for the number of cell divisions: 1 cell indicated no division, 2 cells indicated 1 division, > 2 cells indicated more than 1 division.

Serial colony-forming-unit assays (CFU)s of HSCs: 200-300 HSCs (LSK CD150⁺CD48⁻CD34⁻) from the various mouse models and their corresponding controls were sorted into and cultured in MethoCult M3434 (StemCell Technologies). 7 Days after plating of CFUs, colonies were quantified (a colony was defined as > 300 cells). In each plating, 10,000 cells of each replicate were used for second and third platings and cultured in MethoCult M3434 (StemCell Technologies). Colonies were quantified 3 and 5 days after the second and third re-platings respectively.

Competitive transplantation experiments: 1.5×10^6 WBM cells from CD45.2⁺ KO or VAF diet models, as well as their corresponding control condition were transplanted into fully irradiated (4.5 Gray +5 Gray) CD45.1 (Ly5.1) mice in competition to 1.5×10^6 WBM cells from 3- to 6-month-old CD45.1/2 mice (i.e., the same age as competitor) by tail vein injection within 24 hours after irradiation. As quality control, a 50:50 ratio of CD45.2 versus CD45.1/2 was confirmed prior to transplantation by flow cytometry. Contribution of CD45.2-donor cells was monitored in PB at 4, 8, 12 and 16 weeks post-transplantation. CD45.2 chimerism was determined by flow cytometry using the following monoclonal antibodies: anti-CD45.1 (A20)-PECy7 or FITC, anti-CD45.2 (104)-PB, anti-CD11b (M1/70)-APCCy7, anti-GR1 (RB6.8C5)-APC, anti-CD8a (53.6.7)-PECy5, anti-CD4 (GK1.5)-PECy5, anti-B220 (RA3.6B2)-AF700. Radioresistant cells (CD45.1) were included to evaluate overall potency of WBM cells.

HSC transplantation experiments: 500 HSCs (LSK CD150⁺CD48⁻CD34⁻) from CD45.2⁺ KO or VAF diet models and control conditions were transplanted into fully irradiated (4.5

Gray +5 Gray) CD45.1 (Ly5.1) mice together with 10^5 supportive WBM cells from 3- to 6-month-old CD45.1/2 mice (the same age as donor) by tail vein injection within 24 hours after irradiation. Contribution of CD45.2-donor cells was monitored in PB at 4, 8, 12, and 16 weeks post-transplantation. CD45.2 chimerism was determined by flow cytometry using the following monoclonal antibodies: anti-CD45.1 (A20)-PECy7 or FITC, anti-CD45.2 (104)-PB, anti-CD11b (M1/70)-APCCy7, anti-GR1 (RB6.8C5)-APC, anti-CD8a (53.6.7)-PECy5, anti-CD4 (GK1.5)-PECy5, anti-B220 (RA3.6B2)-AF700. Radioresistant cells (CD45.1) were included to evaluate overall potency of HSCs.

Gene expression by RT-qPCR analysis: 1,000-2,000 HSCs, MPPs or differentiated cells were sorted using FACS into RNA extraction buffer. Total RNA was isolated using the ARCTURUS Pico Pure Isolation Kit, and reverse transcription was conducted using SuperScript VILO cDNA Synthesis Kit (Invitrogen) according to manufacturer's guidelines. For RT-qPCR analysis, a Fast SYBR Green Master Mix (Thermo Fisher Scientific) was used with a StepONE Real-Time PCR System (Applied Biosystems). RNA expression was normalized to the geometric mean of *Oaz1*, *B2m* and *Tbp* housekeeping gene expression and represented as relative quantification (ratio: $2^{-\Delta\Delta CT}$). For the full list of primers see Table S5. The analysis of amplification curves was carried out using the StepONE software (Applied Biosystems).

***In vitro* experiments**

Enrichment of HSPCs and cultivation: To enrich hematopoietic stem and progenitor cells (HSPCs) for *in vitro* assays, lineage marker (CD4, CD8a, B220, Gr-1, CD11b, Ter119)-positive and CD48-positive cells were depleted from BM using biotin-labeled antibodies and biotin binder streptavidin Dynabeads (Invitrogen). For BM preparation and depletion process, see above. HSPCs were subsequently cultured in Complete Stem Cell Medium (StemPro-34 SFM, LifeTechnologies containing 50ng/ml SCF, 25ng/ml TPO, 30ng/ml Flt3-Ligand [all Preprotech], 100ml/ml Penicillin/Streptomycin, and 2mM L-Glutamine [both Gibco]). Cells were cultured in 24-, 96- or 384-well ultra-low attachment plates and were treated with either at-RA (5 μ M final) (Sigma-Aldrich), retinol (10 μ M final) (Sigma-Aldrich), or 4-oxo-RA (5 μ M final) (Santa Cruz Biotechnology) or the respective amount of DMSO.

Caspase-3/DAPI staining: For active Caspase 3/DAPI staining, *in vitro*-treated cells (5 μ M at-RA, 10 μ M retinol, 5 μ M 4-oxo-RA or DMSO) were harvested after 72 hours and subsequently stained with HSC/MPP surface markers and DAPI (1 μ g/ml) in PBS for 30 minutes. Cells were then fixed for 10 minutes at 4°C and permeabilized using Cytofix/Cytoperm (Becton Dickinson and Company). Intracellular staining with the antiactive Caspase 3-PE antibody (BD) was performed for at least 4 hours at 4°C in PermWash solution (Becton Dickinson and Company).

ROS measurement: The Mito-roGFP2-Orp1 probe allows qualitative measurements of H₂O₂ levels in the mitochondrial matrix of intact living cells (Fujikawa et al., 2016). Fluorescence ratios (405/488 nm) of enriched HSPCs expressing mito-roGFP2-Orp1 were measured by flow cytometry after 72 hours of *in vitro* cultivation (described in

Enrichment of HSPCs and cultivation). As control, samples were treated with either 2mM diamide (Sigma-Aldrich) (fully oxidized) or 10mM DTT (Santa Cruz Biotechnology) (fully reduced).

Measurement of protein *de novo* synthesis by O-propargyl-puromycin (OP-Puro). Analysis of OP-Puro incorporation was performed using the Click-iT® PlusOPP Protein Synthesis Assay Kit (Thermo Fisher Scientific). To measure *de novo* protein synthesis, *in vitro*-treated HSPCs (5µM at-RA, 5µM 4-oxo-RA or DMSO) were incubated for 30 minutes in medium supplemented with OP-Puro (Thermo Fisher Scientific, 20 µM final concentration) at 37°C. After harvesting, cells were surface-stained for HSC markers LSK CD150⁺ CD48⁻ CD34⁻ cells at 4°C. The cells were then fixed and permeabilized for 10 minutes using the Cytotfix/Cytoperm Buffer (Becton Dickinson and Company). The copper-catalyzed azide-alkyne cycloaddition (CuAAC) was performed according to the manufacturer's instructions.

Mito Tracker Green staining on in vitro-treated cells: MitoTracker Green (MTG) localizes to the mitochondria of living cells independent of mitochondrial membrane potential. Surface staining was performed after harvesting of *in vitro*-treated, lineage-depleted cells (described in Enrichment of HSPCs and Treatment) and incubated for 30 minutes at 4°C. Cells were then incubated with MTG (60nM, Invitrogen) and verapamil (50µM, Sigma-Aldrich) at 37°C for 20 to 30 minutes according to de Almeida et al. (2017). Cells were subsequently resuspended in PBS supplemented with verapamil and subjected to flow cytometry-based analysis.

Seahorse assays of in vitro-treated cells: To measure oxygen consumption rates after *in vitro* treatments we performed mitochondrial stress tests using the Agilent Seahorse XF Analyzer (Agilent) according to the manufacturer's instructions. Briefly, 50,000 LSK cells were sorted into 96-well ultra-low attachment plates and immediately treated with at-RA(5µM), 4-oxo-RA(5µM), or the respective amount of DMSO for 24 hours. Cells were then transferred to a poly-D-lysine (Sigma-Aldrich) coated 96-well seahorse plate and cultivated for 1 hour in a CO₂-free incubator in XF Seahorse medium(XF DMEM Medium, 10mMglucose, 1mMpyruvate, 2mMglutamine) (all Agilent). The measurement protocol included injections of 10µM Oligomycin (Sigma-Aldrich), 15 µM FCCP (Sigma-Aldrich) and Rotenone 1µM (Sigma-Aldrich) + Antimycin A 10µM (Sigma-Aldrich) conducted in sequence.

Single cell division assays of in vitro-treated cells: Single HSCs (LSK CD150⁺CD48⁻CD34⁻) were sorted into 72-well Terasaki plates (Greiner Bio-One) containing Complete Stem Cell Medium (described in Enrichment of HSPCs and cultivation) and immediately treated with retinol (5µM final), at-RA (5µM final), 4-oxo-RA (5µM final), or the respective amount of DMSO. After 48 hours, each well was checked manually for the number of cell divisions; 1 cell indicated no division, 2 cells indicated 1 division, and more than 2 cells indicated more than 1 division.

Colony-forming-unit assays (CFUs) of in vitro-treated cells: 1,000 FACS-sorted LSK cells from 8-to 12-week-old mice or 200 FACS-sorted HSCs (LSK CD150⁺CD48⁻CD34⁻) were cultured in 100µl Complete Stem Cell Medium (described in Enrichment of HSPCs

and cultivation) in 96-well ultra-low attachment plates, and were immediately treated with retinol (10 μ M), at-RA (5 μ M), 4-oxo-RA (5 μ M), or the respective amount of DMSO. 72 hours after treatment, all cells of a single well were harvested and cultured in MethoCult M3434 (StemCell Technologies). 3 to 5 days after plating colony numbers were quantified. 10,000 cells of each replicate were used for second and third replating and cultured in MethoCult M3434 (StemCell Technologies). Three days after second and third re-platings respectively, colonies were quantified and replated.

Serial transplantation experiments of in vitro-treated cells: 100HSCs

(LSKCD150⁺CD48⁻CD34⁻) from 8-16-week-old mice were FACS sorted and cultured in 100 μ l Complete Stem Cell Medium (described in Enrichment of HSPCs and cultivation) in 384-well plates and immediately treated with at-RA(5 μ M), 4-oxo-RA(5 μ M), or the respective amount of DMSO. 72 hours after treatment, all cells from a single well were harvested and transplanted into fully irradiated (4.5 +5 Gray) B6 Ly5.1 mice (CD45.1), together with 10⁵ supportive spleen cells (CD45.1/2). Contribution of CD45.2-donor cells was monitored in PB at 4, 8, 12, and 16 weeks post-transplantation in primary recipients. CD45.2 chimerism was analyzed by flow cytometry using the following monoclonal antibodies: anti-CD45.1 (A20)–PECy7 or FITC; anti-CD45.2 (104)–PB.

RNA-seq/RT-qPCR on in vitro-treated cells: 1,000 HSCs (LSK CD150⁺CD48⁻) were sorted and cultured in 100 μ l Complete Stem Cell Medium (described in Enrichment of HSPCs and cultivation) in 96-well low attachment plates. These cells were subsequently harvested after 0 hours, 2 hours or 24 hours to check for gene expression as described above.

Rarb in vitro-knockdown—Knock-down (KD) of *Rarb* was achieved by retroviral transduction of BM cells enriched for HSPCs, with a shRNA targeting *Rarb* or renilla-luciferin-2-monooxygenase as a control. The retroviral miR-E system was used (Sauvergeau laboratory, Montreal, Canada). Briefly, shRNAs were designed using a genome-wide sensor-based shRNA ranked prediction list (Fellmann et al., 2013) and subsequently cloned into a plasmid. This plasmid contained a MSCV promoter including a GFP-IRES and an ampicillin resistance gene. Transformation of the plasmid was performed in competent DH5 α E.coli where the ampicillin resistance gene enabled selection of successfully transformed plasmids. Single colonies were selected and expanded in lysogeny broth (LB) medium with ampicillin. In order to confirm the correct plasmid sequence, plasmid DNA was extracted with the Monarch Plasmid Miniprep Kit (NEB) according to the manufacturer's instructions. Validation of the MSCV-shRNA-*Rarb*-GFP-IRES construct was then carried out by gel electrophoresis and Sanger sequencing. For virus production, we transfected PlatinumE cells with the MSCV-shRNA-*Rarb* plasmids using jetPRIME (Polyplus transfection). Virus-containing supernatant was collected and filtered after 48 hours and 72 hours post-transfection and stored at 4°C. HSPC enriched BM cells (see HSC/MPP isolation and flow cytometry-based sorting) were then transduced by spinoculation. We then transferred the cells to a 6-well plate with Complete StemPro Media (specified in Enrichment of HSPCs and cultivation) adding Polybrene (Sigma-Aldrich) and filtered virus particles (multiplicity of infection approximately 50). Transduced LSK GFP⁺ cells were collected 48 hours after transduction via flow cytometry-based sorting and subjected to further analysis.

For competitive transplantation assays we transduced CD45.1 HSPCs with the control shRNA (shRenilla) and CD45.2 with shRarb. After 48 hours 5,000 LSK GFP⁺ cells were sorted from each condition, pooled and transplanted into fully irradiated (4.5+5 Gray) CD45.1/2 mice together with 10⁵ supportive WBM cells (CD45.1/2). Contribution of CD45.1 versus CD45.2-donor cells was monitored in PB at 4, 8, 12, and 16 weeks post-transplantation in primary recipients. Chimerism was analyzed by flow cytometry using the following monoclonal antibodies: anti-CD45.1 (A20)–PECy7 or FITC; anti-CD45.2 (104)–PB.

QUANTIFICATION AND STATISTICAL ANALYSIS

Statistical analysis was performed using unpaired Student's t test or two-way ANOVA with correction for multiple comparison (by either Tukey test or Sidak's correction). All data are presented as mean ± SD. Significance levels were set at $p^* < 0.05$, $p^{**} < 0.01$, and $p^{***} < 0.001$. GraphPad Prism was used for statistical analyses.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Highlights

- Metabolic and epigenetic hubs that regulate stemness programs
- Lack of dietary vitamin A leads to loss of the metabolic HSC identity
- Non-classical retinoid signaling axis maintains HSC function: Cyp26b1–4-oxo-RA-Rarb
- Rarb is required to establish the critical dosage of stemness genes

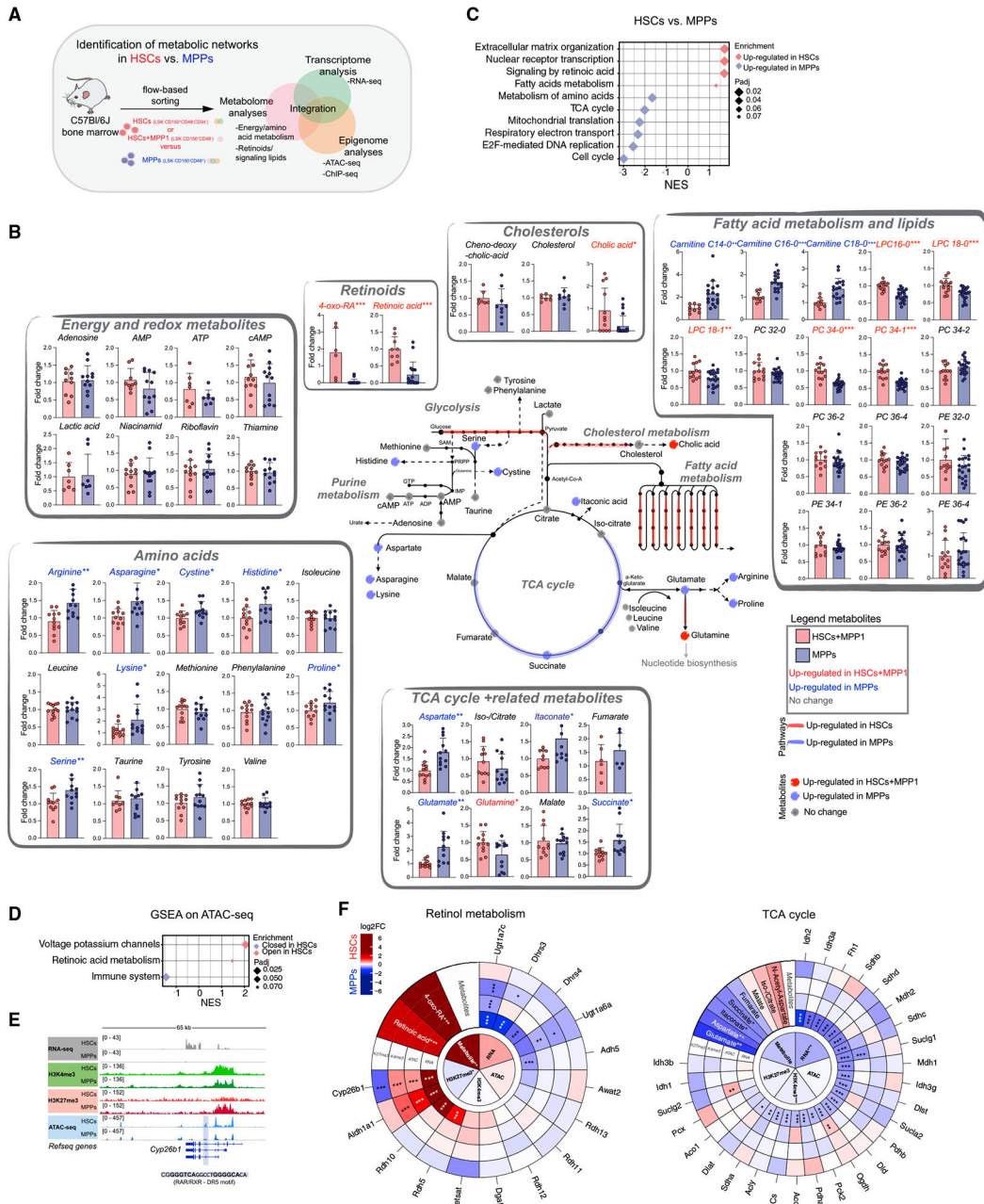


Figure 1. Metabolic and epigenetic landscape of HSCs and downstream progenitors

(A) Summary of the experimental setup.

(B) Schematic integration of metabolomics results on HSCs+MPP1 and MPPs.

Quantification is depicted as fold change (FC) + SD relative to HSCs+MPP1. Metabolite names and dots (upregulated in HSCs+MPP1) are shown in red (upregulated in MPPs) and blue. RNA-seq expression data of enzymes (padj. < 0.1) are shown as colored lines (red, upregulated in HSCs; blue, upregulated in MPPs; see also Figure S1F). n = 6–12; two to three independent experiments per metabolite; unpaired Student's t test; *p < 0.05, **p < 0.01, ***p < 0.001.

(C) GSEA of selected Reactome pathways on RNA-seq data enriched in HSCs and MPPs (n = 3).

(D) GSEA of selected Reactome pathways on ranked differential OCRs between HSCs and MPPs in ATAC-seq.

(E) Gene tracks of the *Cyp26b1* locus with corresponding RNA-seq, ATAC-seq, and H3K4me3 and H3K27me3 ChIP-seq coverage files.

(F) MTE plots integrating metabolomics, RNA-seq, ATAC-seq, and H3K4me3 and H3K27me3 ChIP-seq data on selected KEGG pathways. Depicted is log₂FC between HSCs(+MPP1) and MPPs (red, upregulated in HSCs; blue, upregulated in MPPs).

Significance was calculated using an unpaired Student's t test (metabolomics dataset; *p < 0.05, **p < 0.01, ***p < 0.001) or by DESeq2 padj. value (sequencing datasets; *p < 0.1, **p < 0.05, ***p < 0.01).

Inner circles indicate the average tendencies of the entire KEGG pathway per dataset, and outer circles show individual genes/metabolites. n indicates the number of biological replicates.

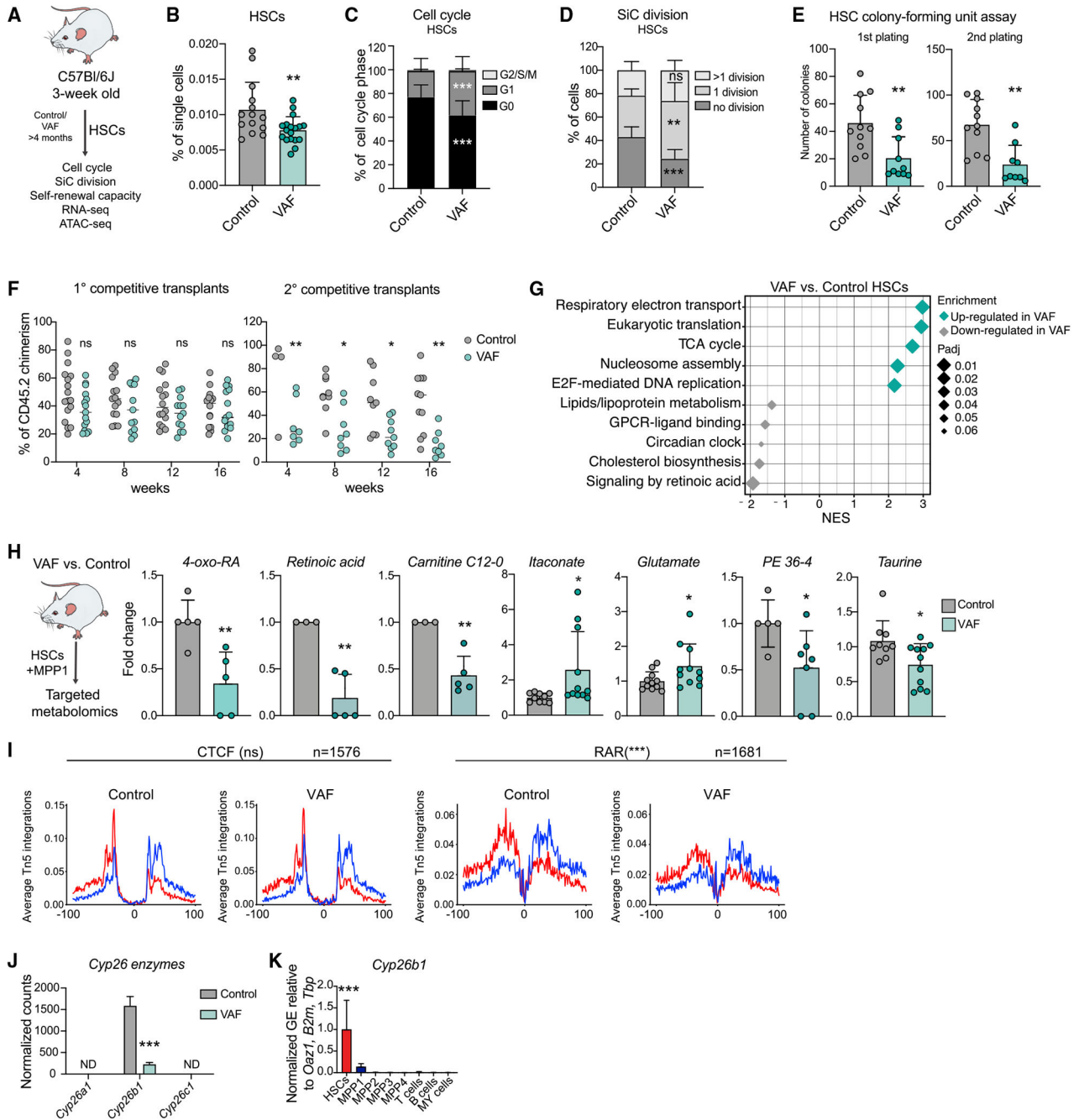


Figure 2. Lack of dietary vitamin A leads to loss of metabolic HSC identity and triggers differentiation

(A) Workflow summarizing analyses performed on VAF HSCs.

(B) Flow cytometry-based analysis of frequencies of control and VAF HSCs. The percentage of single cells is shown. n = 14–19.

(C) Flow cytometry-based analysis of HSC cell cycle control and VAF. The percentage of cell cycle phases (G0, G1, and G2/S/M) is shown. n = 16.

(D) Single cell (SiC) division assay after 48 h in VAF and control HSCs. The percentage of cells is shown. n = 9.

(E) Colony-forming unit assay of HSCs in control and VAF conditions. 1st and 2nd plating. n = 7-8.

(F) Flow cytometry-based analysis of CD45.2 PB chimerism in the competitive transplantation assay of VAF and control WBM cells (CD45.2) versus CD45.1/2 WBM cells. The percentage of CD45.2 chimerism after 1^o and 2^o transplantation is shown; radio-resistant cells were excluded. n = 9–16.

(G) GSEA of selected Reactome pathways on RNA-seq data of control and VAF HSCs.

(H) Targeted metabolomics results showing significantly different metabolites in VAF and control HSCs+MPP1. Quantification is shown as FC + SD relative to control HSCs+MPP1. n = 9–12.

(I) ATAC-seq digital footprinting analysis showing Tn5 insertions on the forward and reverse strand (red and blue, respectively) and CTCF and RAR motifs in VAF and control HSCs. n = 3.

(J) *Cyp26* enzyme expression. Normalized expression counts are shown from VAF RNA-seq. DESeq2 padj.- values: *p < 0.1, **p < 0.05, ***p < 0.01. ND, not detected.

(K) RT-qPCR of *Cyp26b1* gene expression in stem and progenitor populations and differentiated cells. Normalized mean relative to *Oaz1*, *B2m*, and *Tbp* expression and relative to HSCs is shown. Significance in HSCs is compared with all other populations. n = 3; one experiment. GE, gene expression.

(B)–(E), (H), (J), and (K), mean + standard deviation (SD); (B), (E), (H), (I), and (K), unpaired Student's t test; (C), (D), and (F), two-way ANOVA. *p < 0.05, **p < 0.01, ***p < 0.001; ns, not significant. Significance levels are compared with the control. n indicates the number of biological replicates. For (B)–(F) and (H), two or more independent experiments were performed.

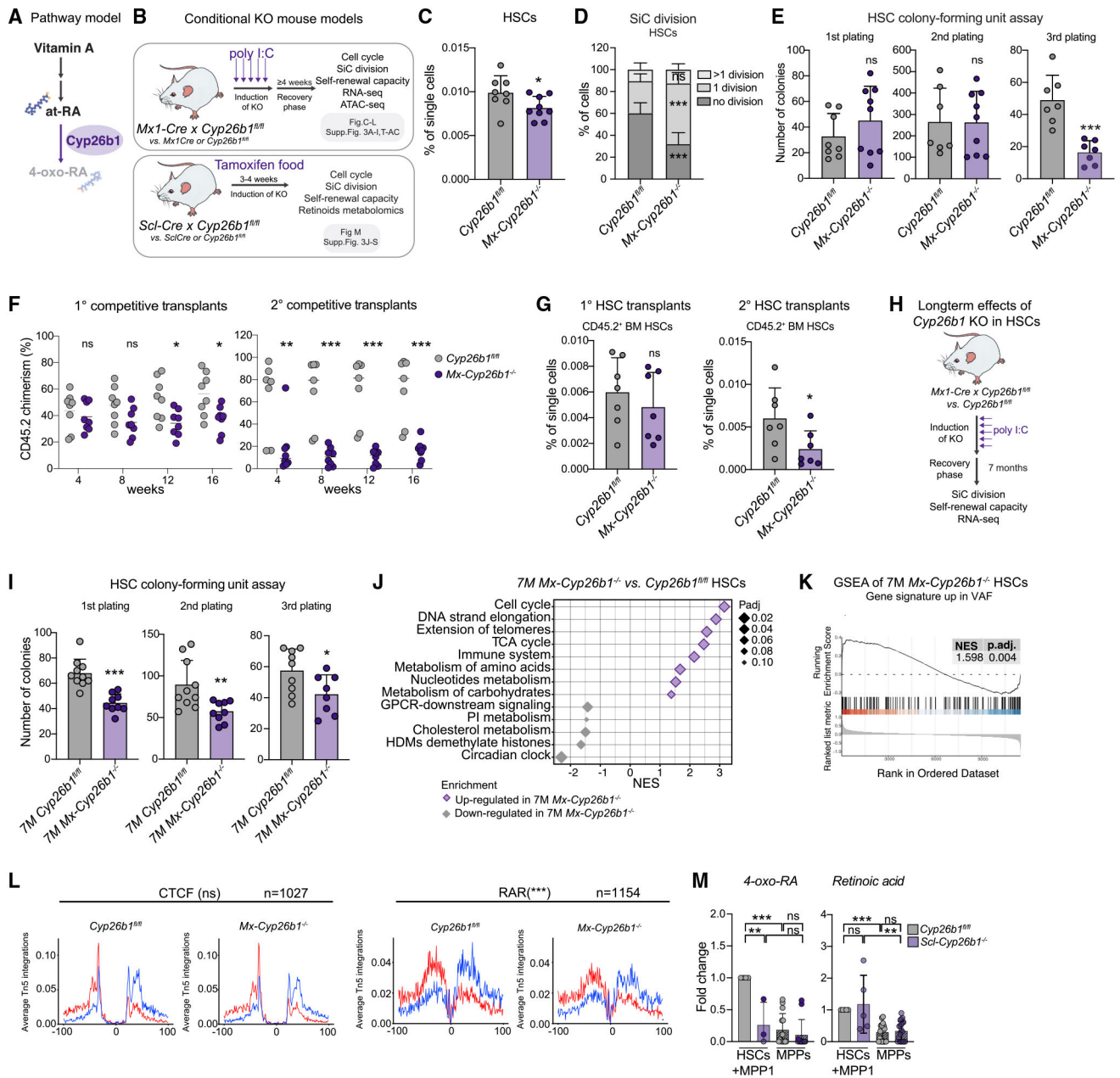


Figure 3. Cyp26b1 is critical for HSC self-renewal and quiescence

(A) Pathway model.

(B) Workflow summarizing analyses performed on two *Cyp26b1* KO mouse models (*SclCre* and *Mx1Cre*).

(C) Flow cytometry-based analysis of HSC frequency in *Cyp26b1^{fl/fl}* (control) and *Mx-Cyp26b1^{-/-}* (KO). Frequency of single cells is shown. Significance levels are compared with the control. n = 8–10.

(D) Single cell (SiC) division assay after 48h in *Cyp26b1^{fl/fl}* and *Mx-Cyp26b1^{-/-}* HSCs. Frequency of cells is shown in percent. n = 10–12.

- (E) Colony-forming unit (CFU) assay of *Cyp26b1^{fl/fl}* and *Mx-Cyp26b1^{-/-}* HSCs; first, second, and third plating. n = 7–9.
- (F) Flow cytometry-based analysis of CD45.2 PB chimerism of 1° and 2° competitive WBM transplantation assays of *Cyp26b1^{fl/fl}* (CD45.2 control) and *Mx-Cyp26b1^{-/-}* (CD45.2 KO) cells versus CD45.1/2 cells. Shown is percent CD45.2 chimerism. n = 7–8.
- (G) Flow cytometry-based analysis of CD45.2⁺ HSCs after 16 weeks of 1° and 2° transplantation of HSCs derived from *Cyp26b1^{fl/fl}* and *Mx-Cyp26b1^{-/-}*. Shown is the percentage of single cells. n = 7.
- (H) Workflow summarizing analyses performed on long-term *Cyp26b1* KO (*Mx-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}*) 7 months after deletion.
- (I) CFU assay of HSCs in 7-month-old *Cyp26b1^{fl/fl}* and *Mx-Cyp26b1^{-/-}*; first, second, and third plating. n = 8–10.
- (J) GSEA of selected Reactome pathways on RNA-seq of 7-month *Mx-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}* HSCs.
- (K) GSEA of “up-regulated genes in VAF HSCs” on RNA-seq of 7-month *Mx-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}* HSCs. n = 2.
- (L) ATAC-seq digital footprinting analysis on the CTCF and RAR motif in *Mx-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}* HSCs. Tn5 insertions are shown on positive and negative strands (red and blue, respectively). n = 2.
- (M) Targeted metabolomics on retinoids in *Scf-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}* HSCs+MPP1. Shown is FC compared with *Cyp26b1^{fl/fl}* HSCs+MPP1. n = 3–12.
- (C)–(E), (G), (I), and (M), mean + SD; (C), (E), (G), (I), and (L), unpaired Student’s t test; (D) and (F), two-way ANOVA. *p < 0.05, **p < 0.01, ***p < 0.001. n indicates the number of biological replicates. For (C)–(G), (I), and (M), two or more independent experiments were performed.

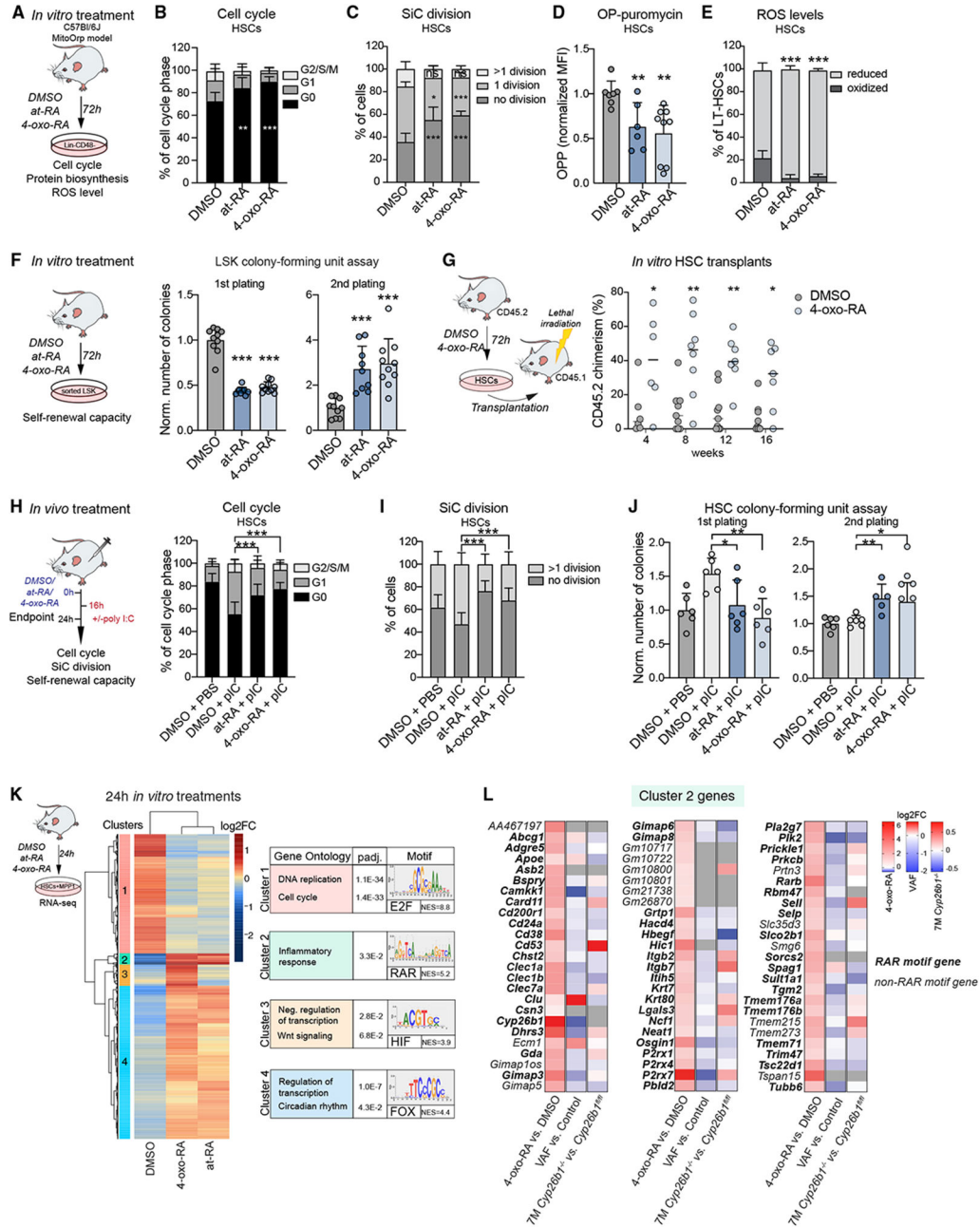


Figure 4. 4-oxo-RA regulates HSC function

(A) Workflow summarizing *in vitro* treatments with DMSO, at-RA, and 4-oxo-RA performed on Lin⁻CD48⁻ BM cells.
 (B) Flow cytometry-based analysis of the cell cycle after *in vitro* treatment, gated on HSCs. The percentage of the cell cycle phase (G0, G1, and G2/S/M) is shown. n = 12.
 (C) Single cell division (SiC) assay after 48-h *in vitro* treatment of HSCs with DMSO, at-RA, and 4-oxo-RA. The percentages of cells are shown. n = 12.
 (D) Flow cytometry-based analysis of O-propargyl (OP) puromycin median fluorescence intensity after 72-h *in vitro* treatment. Gated on HSCs, fold change (FC) normalized to DMSO treatment. n = 6–9.

- (E) Flow cytometry-based analysis of ROS in MitoOrp mouse model after 72-h *in vitro* treatment. Gated on HSCs, shown is the percentage of HSCs. n = 8.
- (F) Colony-forming unit (CFU) assay; plating after 72-h *in vitro* treatment of 1,000 LSK cells with DMSO, at-RA, and 4-oxo-RA; first and second plating. The number of colonies was normalized to the control. n = 7–10.
- (G) Flow cytometry-based analysis of CD45.2 PB chimerism over time. Shown is a transplantation assay comparing 72-h *in-vitro*-treated HSCs with 4-oxo-RA or control (DMSO). Shown is the percentage of CD45.2 chimerism. n = 6–9.
- (H) Workflow showing *in vivo* treatments with DMSO + PBS, DMSO + pIC, at-RA + pIC, and 4-oxo-RA + pIC. Flow cytometry-based analysis of the HSC (LK CD150⁺ CD48⁻CD34⁻) cell cycle. The percentage of the cell cycle phase (G0, G1, and G2/S/M) is shown. Significance levels are compared with DMSO pIC. n = 12.
- (I) SiC division assay of 48-h *in-vivo*-treated HSCs (LK CD150⁺CD48⁻CD34⁻) after DMSO + PBS, DMSO + pIC, at-RA + pIC, and 4-oxo-RA + pIC injections. The percentage of cells is shown. Significance levels are compared with DMSO + pIC. n = 10–12.
- (J) CFU assay of HSCs after DMSO + PBS, DMSO + pIC, at-RA + pIC, and 4-oxo-RA + pIC *in vivo* injections. The number of colonies is normalized to DMSO after the first and second plating. Significance levels are compared with DMSO + pIC. n = 5–6.
- (K) Heatmap of RNA-seq data of 24-h *in-vitro*-treated HSCs+MPP1. Log2FC threshold 0.5, padj. < 0.1 in pairwise comparisons. Shown are biological process GO terms and the main associated TF motif for each cluster. NES, normalized enrichment score. n = 3.
- (L) Log2FC of all cluster 2 genes depicted from 3 RNA-seq datasets (4-oxo-RA 24-h *in vitro* treatment of HSCs+MPP1, VAF HSCs, and 7-month *Cyp26b1* KO HSCs). Genes shown in bold contain the RAR motif. Grey indicates not detected.
- (B)–(F), (H), and (J), mean + SD; (D), (F), and (J), unpaired Student's t test; (B), (C), (E), (G), and (I), two-way ANOVA. *p < 0.05, **p < 0.01, ***p < 0.001. n indicates the number of biological replicates. For (B)–(J), two or more independent experiments were performed.

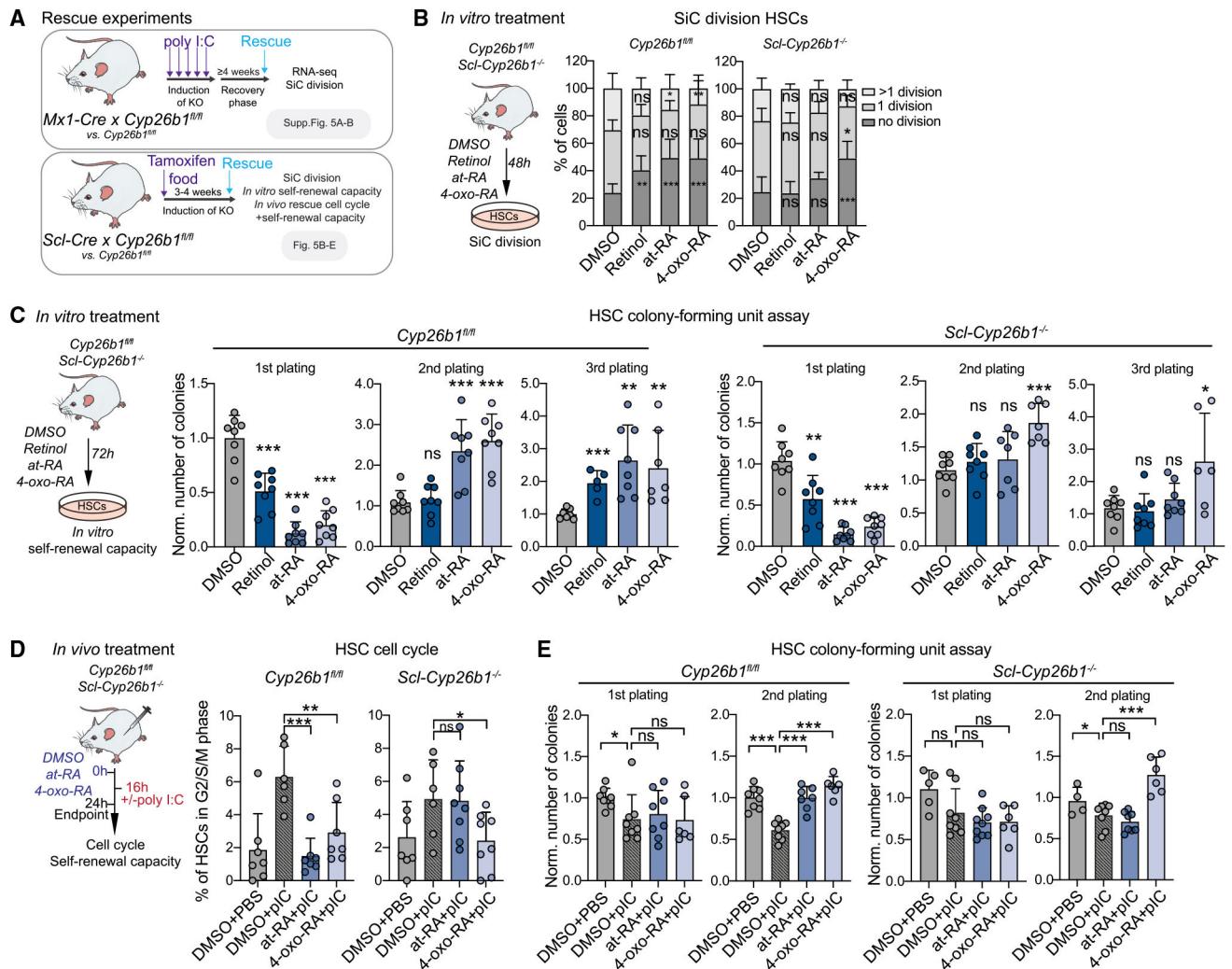


Figure 5. The *Cyp26b1*-downstream metabolite 4-oxo-RA is required for HSC maintenance

(A) Workflow showing rescue experiments performed on the different *Cyp26b1* KO mouse models.

(B) Workflow showing the single cell (SiC) division assay after 48 h *in vitro* treatment of *Scl-Cyp26b1*^{-/-} compared with *Cyp26b1*^{fl/fl} HSCs with DMSO, retinol, at-RA, and 4-oxo-RA. The percentage of cells is shown. n = 12.

(C) Workflow depicting the colony-forming unit (CFU) assay after 72 h *in vitro* treatment of *Scl-Cyp26b1*^{-/-} compared with *Cyp26b1*^{fl/fl} HSCs with DMSO, retinol, at-RA, and 4-oxo-RA. The number of colonies was normalized to control DMSO treatment of each corresponding plating. n = 6–8.

(D) Workflow showing *in vivo* treatments with DMSO + PBS, DMSO + poly I:C (pIC), at-RA + pIC, and 4-oxo-RA + pIC of *Scl-Cyp26b1*^{-/-} compared with *Cyp26b1*^{fl/fl} mice and flow cytometry-based analysis of the HSC cell cycle. The percentage of HSCs in the G2/S/M cell cycle phase is shown. Significance levels are compared with DMSO pIC. n = 6–7.

(E) HSC CFU assay after 72 h *in vivo* treatment of *Scl-Cyp26b1^{-/-}* and *Cyp26b1^{fl/fl}* mice with DMSO + PBS, DMSO + pIC, at-RA + pIC, and 4-oxo-RA + pIC. The number of colonies was normalized to DMSO + PBS treatment of each corresponding plating. n = 4–8. (B)–(E), mean + SD; (C)–(E), unpaired Student's t test; (B), two-way ANOVA. *p < 0.05, **p < 0.01, ***p < 0.001. n indicates the number of biological replicates. Significance levels are compared with the control. For (B)–(E), two or more independent experiments were performed.

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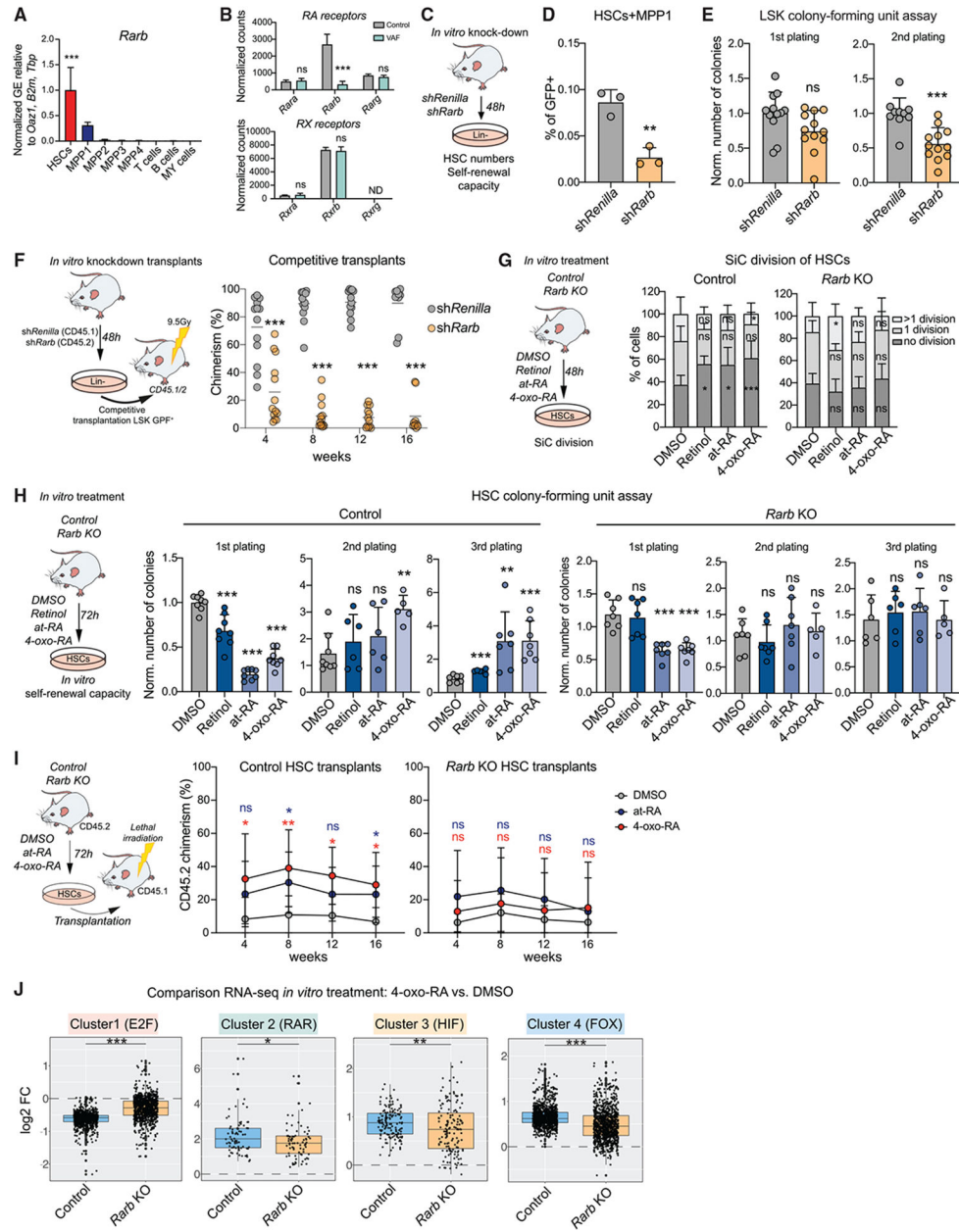


Figure 6. *Rarb* is required to mediate 4-oxo-RA-dependent maintenance of HSC self-renewal (A) RT-qPCR of *Rarb* GE in stem and progenitor populations and differentiated cells. Normalized mean relative to *Oaz1*, *B2m*, and *Tbp* expression and relative to HSCs is shown. Significance in HSCs is compared with all other populations. n = 3, one experiment. (B) Normalized expression counts (DESeq2) of RAR and RXR genes from VAF RNA-seq. DESeq2 padj. values: *p < 0.1, **p < 0.05, ***p < 0.01. (C) Workflow showing *in vitro* *Rarb* KD. (D) Flow cytometry-based analysis of the frequency of HSCs+MPP1 (LSK CD150⁺CD48⁻). The percentage of single cells is shown. n = 3, one experiment. (E) Colony-forming unit (CFU) assay of GFP⁺ LSK cells after *in vitro* *Rarb* KD; first and second plating. The number of colonies was normalized to the control. n = 12.

(F) Workflow showing competitive transplantation of GFP⁺LSK shRarb (CD45.2) and GFP⁺LSK (CD45.1) and flow cytometry-based analysis of PB chimerism over time. Shown is the percentage of chimerism. n = 12–16.

(G) Workflow showing the single cell (SiC) division assay after 48-h *in vitro* treatment of control HSCs compared with *Rarb* KO with DMSO, retinol, at-RA, and 4-oxo-RA. The percentage of single cells is shown. n = 12.

(H) Workflow depicting CFUs after 72-h *in vitro* treatment of control HSCs compared with *Rarb* KO with DMSO, retinol, at-RA, and 4-oxo-RA. The number of colonies was normalized to control DMSO treatment of each corresponding plating. n = 6–8.

(I) Transplantation assay comparing 72-h *in-vitro*-treated control and *Rarb* KO HSCs with at-RA, 4-oxo-RA, or DMSO. Shown is the percentage of CD45.2 chimerism over time. n = 6–9.

(J) Boxplots comparing 24-h *in vitro* 4-oxo-RA effects on GE in control and *Rarb* KO HSCs+MPP1 RNA-seq versus DMSO treatment. All genes of heatmap clusters 1–4 from RNA-seq of *in vitro* treatments after 24 h (Figure 4K) are shown. n = 2–3.

(A), (B), (D), (E), (G), and (I), mean + SD; (A), (D), (E), and (H), unpaired Student's t test; (F), (G), and (I), two-way ANOVA. *p < 0.05, **p < 0.01, ***p < 0.001. n indicates the number of biological replicates. For (B)–(F), two or more independent experiments were performed.

KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
CD8a-BV650	BioLegend	100742; RRID:AB_2563056
CD11b-BV650	BioLegend	101259; RRID:AB_2566568
Gr1-BV650	BioLegend	108442; RRID:AB_2686974
TER119-BV650	BioLegend	116235; RRID:AB_11204244
B220-BV650	BioLegend	103241; RRID:AB_11204069
CD4-BV650	BioLegend	563232; RRID:AB_2738083
CD8a-PE/Cy7	BioLegend	100722; RRID:AB_312761
CD11b-PE/Cy7	BioLegend	101216; RRID:AB_312799
Gr1-PE/Cy7	BioLegend	108416; RRID:AB_313381
TER119-PE/Cy7	BioLegend	116221; RRID:AB_2137789
B220-PE/Cy7	BioLegend	103222; RRID:AB_313005
CD4-PE/Cy7	BioLegend	100422; RRID:AB_2660860
cKit-BV711	BioLegend	105835; RRID:AB_2565956
cKit-BV421	BioLegend	105828; RRID:AB_11204256
cKit-PE	BioLegend	105808; RRID:AB_313217
Sca1-APC/Cy7	BioLegend	108126; RRID:AB_10645327
CD150-PE/Cy5	BioLegend	115912; RRID:AB_493598
CD48-Pacific Blue	BioLegend	103418; RRID:AB_756140
Ki67-PE	Invitrogen	12-5698-80; RRID:AB_11149672
Gr1-APC	BioLegend	108412; RRID:AB_313377
CD11b-APC/Cy7	BioLegend	101226; RRID:AB_830642
CD150-BV605	BioLegend	115927; RRID:AB_11204248
CD48-BV421	BioLegend	103428; RRID:AB_2650894
CD34-FITC	BD Biosciences	553733; RRID:AB_395017
CD34-AF700	BD Biosciences	560518; RRID:AB_1727471
CD45.1-FITC	BioLegend	110706; RRID:AB_313495
CD45.2-Pacific Blue	BioLegend	109820; RRID:AB_492872
CD45.1-PE/Cy7	BioLegend	110730; RRID:AB_1134168
CD127-PE	BioLegend	121112; RRID:AB_493509
CD16/32-APC	BioLegend	101326; RRID:AB_1953273
CD8a-FITC	BioLegend	100706; RRID:AB_312745
CD11b-FITC	BioLegend	101206; RRID:AB_312789
Gr1-FITC	BioLegend	108406; RRID:AB_313371
Ter119-FITC	BioLegend	116206; RRID:AB_313707
B220-FITC	BioLegend	103206; RRID:AB_312991
CD4-FITC	BioLegend	100406; RRID:AB_312691
CD48-PE/Cy7	BioLegend	103424; RRID:AB_2075049
B220-AF700	BioLegend	103232; RRID:AB_493717
Active Caspase3-PE	BD Biosciences	561011; RRID:AB_2033931

REAGENT or RESOURCE	SOURCE	IDENTIFIER
CD4-PE/Cy5	BioLegend	100410; RRID:AB_312695
CD8a-PE/Cy5	BioLegend	100710; RRID:AB_312749
H3K4me3	Millipore	07-473; RRID:AB_1977252
H3K27me3	Cell Signaling	C36B11; RRID:AB_11220433
Chemicals, peptides, and recombinant proteins		
BD Cytotfix/Cytoperm Kit	BD	554722
Dynabeads Untouched Mouse CD4 Kit	Life Technologies	11415D
FastSYBR Green Master Mix	Thermo Fisher Scientific	4385610
OneComp eBeads	eBioscience	01-1111-41
AMPure/RNAClean XP beads	Beckman Coulter	A63881
Deoxynucleotide Solution, Mix	NEB	N0447S
ProtoScript II Reverse Transcriptase	NEB	M0368L
Murine Rnase Inhibitor	NEB	M0314L
Rnase H, recombinant	NEB	M0297L
DNA Polymerase I	NEB	M0209L
DAPI	Sigma-Aldrich	D9542
All-trans-retinoic acid (at-RA)	Sigma-Aldrich	R2625
13-cis-4oxo-Retinoic acid (<i>in vivo</i>)	Sigma-Aldrich	42073
4-Oxo-(9-cis,13-cis)-Retinoic acid (<i>in vitro</i>)	Santa Cruz Biotechnology	sc-477908
Retinol	Sigma-Aldrich	R7632
Rotenone	Sigma-Aldrich	R8875
Antimycin A	Sigma-Aldrich	A8674
Oligomycin	Sigma-Aldrich	O4876
FCCP	Sigma-Aldrich	C2920
Recombinant Human Flt3	PeptoTech	300-19
Recombinant Murine Stem Cell Factor	PeptoTech	250-03
Recombinant Murine Thrombopoietin	PeptoTech	315-14
ACK Lysing Buffer	Lonza	10-548E
Poly-D-Lysine	Sigma-Aldrich	P6407
StemPro-34 SFM (1X)	Life Technologies	10639011
Methocult Mouse M3434	Stem Cell Technologies	M3434
XF DMEM medium	Agilent	103575-100
XF 1.0 M Glucose Solution	Agilent	103577-100
XF 100 mM Pyruvate Solution	Agilent	103578-100
XF 200 mM Glutamine Solution	Agilent	103579-100
MitoTracker Green	Thermo Fisher Scientific	M7514
Protein G Dynabeads	Invitrogen	10003D
Q5® High-Fidelity 2X Master Mix	NEB	M0492S
NEBNext® Multiplex Oligos for Illumina® (96 Unique Dual Index Primer Pairs)	NEB	E6440
Formaldehyde 16%	Pierce	28906
IDT unique dual indexing primers	Illumina	20027213

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Digitonin	Promega	G9441
BSA solution	Sigma-Aldrich	A8577
Critical commercial assays		
SuperScript VILO cDNA Synthesis Kit	Invitrogen	11754050
QIAGEN Plasmid Maxi Kit	QIAGEN	12163
PicoPure® RNA Isolation Kit	Thermo Fisher Scientific	KIT0204
Click-iT® Plus OPP Protein Synthesis Assay Kit *Alexa Fluor® 594 picolyl azide	Life Technologies	C10457
MEGAscript T7 Transcription Kit	Thermo FFisher Scientific	AM1334
QIAGEN MinElute PCR clean up kit	QIAGEN	28204
Tagment DNA TDE1 Enzyme and Buffer Kits	Illumina	20034197
NEBNext Ultra II FS DNA library kit	NEB	E7805
SMARTseq v4	Takare Bio	634889
NEBNext Secondary Strand Synthesis Reaction Buffer	NEB	B6117S
Nextera XT DNA Sample Preparation Kits	Illumina	1502354
Deposited data		
RNA Seq of control and Vitamin A-deficient HSCs and MPPs	This paper	ArrayExpress: E-MTAB-9729
RNA Seq of control and Cyp26b1KO HSCs	This paper	ArrayExpress: E-MTAB-9745
RNA Seq of 7-month-old control and Cyp26b1KO HSCs	This paper	ArrayExpress: E-MTAB-10659
RNA Seq of control and Cyp26b1KO HSCs+MPP1 after 24h of <i>in vitro</i> culture and treatment	This paper	ArrayExpress: E-MTAB-9752
RNA Seq of wildtype and <i>Rarb</i> KO HSCs after 24h of <i>in vitro</i> culture and treatment	This paper	ArrayExpress: E-MTAB-9749
ATAC-seq of HSCs and MPPs	This paper	ArrayExpress: E-MTAB-9779
ATAC-seq of HSCs in Vitamin A-free diet	This paper	ArrayExpress: E-MTAB-9780
ATAC-seq of control and Cyp26b1KO HSCs	This paper	ArrayExpress: E-MTAB-9778
ChIP-seq for H3K4me3 and H3K27me3 in HSCs and MPPs	This paper	ArrayExpress: E-MTAB-10661
Experimental models: Organisms/strains		
C57BL/6J (CD45.2)	MPI-IE	RRID:IMSR_JAX:002014
B6Ly5.1 (CD45.1)	MPI-IE	RRID:IMSR_JAX:000664
B6Ly5.1(CD45.1/2)	MPI-IE	N/A
<i>Mx1Cre</i> (<i>B6. Cg-Tg(Mx1-cre)1Cgn/J</i>)	Kühn et al., 1995	RRID:IMSR_JAX:003556
<i>ScfCre</i> (<i>B6. Tg(Tal1-cre)42-056Jrg</i>)	Göthert et al., 2005	MGI: 3579158
<i>Cyp26b1 fl/fl</i> (<i>B6-Cyp26b1tm2Hmd</i>)	MacLean et al., 2007	RRID:IMSR_RBRC04333
<i>RarbKO</i> (<i>Stock Rarb^{tm1Vg1/HsvJ}</i>)	The Jackson Laboratory	RRID:IMSR_JAX:022999
MitoOrp (<i>B6-Gt(ROSA)26Sor(mito-Orp-roGFP2) Tg(CMV-cre)1Cgn</i>)	Fujikawa et al., 2016	N/A
<i>RargKO</i>	Chapellier et al., 2002; Provided by N.B. Ghyselinck	N/A
Oligonucleotides		
shRNA <i>Rarb</i> TGCTGTTGACAGTGAGCGCCCGCAGA AGATGATTTCTTCTGAATACTTCTGCG GATGCCTA CTGCCTCGGA	Sigma-Aldrich	N/A
shRNA Renilla AAGGTATATTGCTGTTGACAGTGAGC GCAGGAATTATAATGCTTATCTATAGTGAAGCCACA	Sigma-Aldrich	N/A

REAGENT or RESOURCE	SOURCE	IDENTIFIER
GATGTATAGATAAGCATTATAATTCCCTATGCCTACTG CCTCGGACTTCAAGGGGCTA		
Software and algorithms		
FACSDiva	BD	RRID:SCR_001456
FlowJo10	FlowJo LLC	RRID:SCR_008520
Prism8	Graphpad Software	RRID:SCR_002798
Integrative Genomics Viewer (IGV)	N/A	RRID:SCR_011793
DAVID v6.8	Huang et al., 2009	https://david.ncifcrf.gov
snakePipes (2.5.1)	Bhardwaj et al., 2019	https://github.com/maxplanck-ie/snakepipes
deepTools (3.4.0)	Ramírez et al., 2014	https://github.com/deeptools/deepTools/
STAR v2.7.4a	Dobin et al., 2013	https://github.com/alexdobin/STAR
Bowtie2 (2.4.4)	Langmead and Salzberg, 2012	https://github.com/BenLangmead/bowtie2
MACS2 (2.2.7.1)	Zhang et al., 2008	https://github.com/macs3-project/MACS
bedtools (2.30.0)	Quinlan and Hall, 2010	https://github.com/arq5x/bedtools2
pyDNase (0.3.0)	Piper et al., 2013	https://github.com/jpiper/pyDNase
Subread (2.0.3)	Liao et al., 2014	https://sourceforge.net/projects/subread/
GSEA_4.1.0	Subramanian et al., 2005	https://www.gsea-msigdb.org/gsea/index.jsp