DEVELOPMENTAL BIOLOGY

Gastrulation-stage gene expression in *Nipbl^{+/-}* mouse embryos foreshadows the development of syndromic birth defects

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In animal models, Nipbl deficiency phenocopies gene expression changes and birth defects seen in Cornelia de Lange syndrome, the most common cause of which is Nipbl haploinsufficiency. Previous studies in Nipbl^{+/-} mice suggested that heart development is abnormal as soon as cardiogenic tissue is formed. To investigate this, we performed single-cell RNA sequencing on wild-type and *Nipbl^{+/-}* mouse embryos at gastrulation and early cardiac crescent stages. Nipbl^{+/-} embryos had fewer mesoderm cells than wild-type and altered proportions of mesodermal cell subpopulations. These findings were associated with underexpression of genes implicated in driving specific mesodermal lineages. In addition, Nanog was found to be overexpressed in all germ layers, and many gene expression changes observed in Nipbl^{+/-} embryos could be attributed to Nanog overexpression. These findings establish a link between Nipbl deficiency, Nanog overexpression, and gene expression dysregulation/lineage misallocation, which ultimately manifest as birth defects in Nipbl^{+/-} animals and Cornelia de Lange syndrome.

INTRODUCTION

Each year, 1 of every 33 babies in the United States is born with a birth defect (1), the most prevalent of which are congenital heart defects (CHDs), neural tube defects, and cleft lip/palate (2). Given the major impact that birth defects have on infant mortality and morbidity (3, 4), there is a need to elucidate their origins, but their diversity and sporadic nature pose challenges for identifying causal mechanisms. A promising approach is to study genetic syndromes that present multiple, concurrent defects in various body parts, many of which mirror common isolated birth defects. Studying them might thus provide insights into the causes and development of isolated birth defects.

Cornelia de Lange syndrome (CdLS) affects an estimated 1 in 10,000 to 1 in 30,000 live births (5) and is characterized by craniofacial anomalies, delays in growth and maturation, intellectual disability, neurological impairments, and abnormalities of limbs, especially arms and hands, coupled with issues in the visual, auditory, gastrointestinal, genitourinary, and cardiopulmonary systems (6).

Most CdLS cases—more than 55%—are caused by heterozygous mutations in the gene Nipped-B-like (NIPBL) (7), named for its homology to the Drosophila gene Nipped-B. These mutations often produce a nonfunctional protein, suggesting that CdLS arises from haploinsufficiency (8). Even a subtle 15% reduction in NIPBL gene expression can produce a mild yet recognizable CdLS phenotype (9). These observations highlight the importance of precise *NIPBL* gene dosage in human development.

The NIPBL gene encodes a universally conserved protein that plays a role in loading cohesin onto chromosomes (10). Cohesin, similarly conserved and ubiquitous, is a four-subunit protein



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complex (encoded by the genes Smc1a, Smc3, Rad21, and either Stag1 or Stag2) essential for chromosome organization and genome stability (11). Mutations in the cohesin subunits SMC1 and SMC3 account for a small proportion of clinically mild CdLS (~5% and <1%, respectively) (12–14). In addition, mutations in HDAC8, which catalyzes cohesin release from chromatin during mitosis, are found in a distinct subset of patients with CdLS (15). Mutations in RAD21 have also surfaced in individuals exhibiting a CdLS-like phenotype but with substantially milder cognitive impairment (16). Collectively, these findings reinforce the idea that impairment of cohesin function contributes to CdLS.

Cohesin was initially identified for its role in sister chromatid cohesion during mitosis (11). However, pronounced defects in sister chromatid cohesion or irregularities in mitosis have not been observed in either patients with CdLS or Nipbl-haploinsufficient $(Nipbl^{+/-})$ mice (17, 18), suggesting that cohesin has additional functions. Studies in CdLS patient cells and Nipbl-haploinsufficient animal models indicate that cohesin is involved in transcriptional regulation (19). Specifically, Nipbl haploinsufficiency leads to alterations in the expression of many hundreds to thousands of genes (18). Many of the affected genes are regulated by long-distance enhancers (20), aligning with the emerging concept of NIPBL and cohesin as critical determinants in DNA looping (21).

Most gene expression changes in Nipbl-deficient animals are small, usually less than twofold. Although likely to be inconsequential individually, these small changes can act collectively to produce structural and functional defects. For example, in zebrafish, joint depletion of two developmental genes down-regulated by nipbl deficiency produced a CdLS-like phenotype (22), suggesting that altered gene expression is the ultimate cause of developmental and physiological abnormalities. Thus, CdLS exemplifies a class of genetic disorders known as "transcriptomopathies" (23), in which the cumulative or synergistic effects of minor disturbances to gene expression lead to developmental abnormalities.

Previously, we reported that Nipbl-haploinsufficient mice displayed birth defects phenocopying those in CdLS (18). These

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included CHDs (primarily atrial septal defects), in about 30% of *Nipbl^{+/-}* mice. Subsequently, we used a conditional *Nipbl* allelic series to investigate the role of Nipbl expression in the production of CHDs (24). That study showed that Nipbl^{+/-} mice exhibit heart abnormalities early in development: At embryonic day 13.5 (E13.5), 70% of Nipbl^{+/-} mice displayed delays in ventricular septal fusion, whereas 3 days earlier, at E10.5, 100% showed right ventricle hypoplasia (24). In situ hybridization experiments showed reduced expression of two transcription factors crucial for early heart progenitor cell growth and differentiation: Nkx2-5 and Mesp1 (24). That structural abnormalities may begin at the earliest stages of heart development was suggested by results in in nipbl-morphant zebrafish, in which defects in the initial migration of cardiogenic mesoderm were detected as early as 18 hours after fertilization (22). These results suggested that, at least for CHDs, causal events may occur as early as gastrulation, when the three primary germ layers form and the earliest progenitor cells of major tissues and organs begin to differentiate (25).

In this study, we sought to identify developmental alterations during gastrulation that might account for birth defects in Nipbl^{+/-} mice. We used single-cell RNA sequencing (scRNA-seq) to compare the cellular compositions, lineage trajectories, and transcriptional landscapes of Nipbl^{+/-} mouse embryos to their wild-type (WT) counterparts at two stages spanning the end of gastrulation: the late bud (LB) stage (E7.5) and cardiac crescent (CC) stage (E7.75). Our findings reveal that Nipbl^{+/-} embryos have the same cell populations as WT embryos but display subtle misallocation of specific mesodermal cell populations. Our evidence suggests that this occurs as a result of alterations in specific cell fate decisions, including the choice by mesoderm cells to progress toward a noncardiac versus cardiac fate. Our observations strongly suggest that these events cannot be attributed to changes in apoptosis, cell proliferation, global developmental delay, or the structure of cell lineages. As in earlier research, we observed that most gene expression changes in Nipbldeficient tissues at these stages were small (18), but we also identified several key developmental genes that are more markedly misexpressed in Nipbl^{+/-} embryos, the most notable of which was Nanog. Nipbl+/- embryos failed to down-regulate Nanog at the end of gastrulation, which normally occurs in all but germ cells. As a result, the misexpression of many Nanog target genes was observed in all germ layers. We also saw substantial underexpression of Hox genes and overexpression of Nodal signaling genes, which play roles in anterior-posterior and left-right patterning, respectively. As a result, we propose a model in which birth defects in CdLS arise from the prolonged overexpression of Nanog and dysregulation of developmental pathways governing axial patterning, resulting in the misdirection of cell fate decisions, and misallocation of specific progenitor cell populations.

RESULTS

Gastrula-stage *Nipbl^{+/-}* mice display the same cell populations as are found in WT mice

To investigate early factors influencing birth defects in CdLS, we generated WT and $Nipbl^{+/-}$ littermate embryos by crossing $Nanog^{Cre/+}$ mice (26) with $Nipbl^{Flox/Flox}$ mice (24) as described in Materials and Methods and shown in Fig. 1A. To ensure an accurate accounting of cell populations and proportions at well-defined stages of early embryonic development, we generated a large excess of

embryos and sorted them into groups of narrowly defined stage based on morphological criteria (27). Using the 10x Genomics Chromium Single Cell Expression platform (28), we performed scRNA-seq on five WT and six $Nipbl^{+/-}$ samples of LB-stage embryos (E7.5) and eight WT and eight $Nipbl^{+/-}$ samples of CC-stage embryos (E7.75) (Fig. 1B and fig. S1). Given the low cell numbers in individual LB-stage embryos and the 10x Genomics Chromium Single Cell Expression system's capture efficiency, samples at the LB stage consisted of pairs of embryos, whereas at the CC stage, they consisted of single embryos. Pairing LB-stage embryos facilitated the capture of rare cell groups, such as primordial germ cells (PGCs), which typically comprise about 50 cells per embryo at this stage (29).

At LB stage, we captured a median of 2537 cells per sample, with a median of 17,301 RNA transcripts per cell (fig. S2 and table S1). At CC stage, we captured a median of 4116 cells per sample, with a median of 14,997 RNA transcripts per cell (table S1). As expected, all *Nipbl*^{+/-} embryos expressed both *Cre* and *Betageo*, which report an inactivated *Nipbl* allele (24), while WT embryos did not (fig. S3, A and B). *Nipbl*^{+/-} embryos across both stages expressed *Nipbl* at levels that were ~50% lower than WT counterparts (fig. S3C).

We corrected for batch effects among embryos of identical stage and genotype using Seurat's integration protocol (30) (Fig. 1C and fig. S4), which identifies anchors (cells of similar gene expression across samples of the same biological condition) and uses them to align cells into a space shared by all samples. Recognizing that all cells in *Nipbl^{+/-}* tissues exhibit substantial gene expression changes (18) and considering that clustering algorithms rely on differences in gene expression among cells (30), we implemented measures to prevent our cell clustering from being skewed by gene expression alterations attributable to Nipbl haploinsufficiency. We did this by first clustering cells from WT samples (Fig. 1C), using a robust iterative clustering method that considered both intracluster stability and intercluster variation (fig. S5) to determine the optimal number of clusters for cells at each developmental stage. WT cells were clustered into 18 cell populations at LB stage (Fig. 1D) and 26 cell populations at CC stage (Fig. 1E). We then projected $Nipbl^{+/-}$ cells onto these WT cell populations at corresponding stages (Fig. 1C). We observed that all Nipbl^{+/-} cells could be projected to WT cell populations, with each WT population receiving some Nipbl+/- cells (Fig. 1, D and E). This pattern held true across individual Nipbl^{+/-} samples, as well as the total Nipbl^{+/-} cells in aggregate at each stage (Fig. 1, F and G). To ensure that any differences observed in cell populations were not the result of technical artifacts introduced by the projection algorithm, we performed additional studies in which WT cells were projected onto Nipbl+/- clusters (figs. S6 and S15). In both cases, Nipbl+/- cells contributed to all clusters but, as we describe later, in varying proportions.

scRNA-seq captured cells from all germ layers and progenitors of major tissues

To assign biological identities to clustered cell populations, we used WT cells as a reference. For each WT cell population, we performed differential gene expression analysis (DGEA) by comparing it to all other cells within embryos of identical stage (Mann-Whitney *U* test). We detected markers indicative of germ layer identity in every cluster (data S1 and S2 and table S2), enabling us to associate each cluster with a specific germ layer at each developmental stage (Fig. 2A). Figure 2B displays all cells from all samples, categorizing

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Fig. 1. *Nipbl*^{+/-} **mice do not lack any cell populations found in WT mice.** (A) *Nipbl* alleles used in this study. *Nipbl*^{Flox} contains an inverted gene trap cassette encoding β -geo flanked by *Cre* recombinase target sites in intron 1 of *Nipbl* gene alleles (24). In this inverted orientation, there is no trapping of the *Nipbl* gene, and *Nipbl* is expressed normally. However, when this cassette is exposed to Cre recombinase, the gene trap cassette gets inverted producing the *Nipbl*^{Flox} and *Nipbl*^{Flox} mice, the resulting littermates are either entirely *Nipbl*^{Flox/+} or entirely *Nipbl*^{Flox/+}, as *Nanog*^{Cre/+} mice carry a transgene that expresses *Cre* recombinase in the earliest cells of the developing embryo (26). (B) Lateral view of LB stage and anterior view of CC-stage embryos subjected to scRNA-seq. A, anterior; P, posterior; AL, allantois; L, left; R, right; HF, head fold; ML, midline. Dashed line represents where embryonic tissue was separated from extraembryonic tissue. Scale bars, 100 µm. (C) Workflow used to filter out low-quality cells and doublets, cluster WT cells into optimal number of clusters at each stage, and project *Nipbl*^{+/-} cells onto WT clusters of the same stage. Uniform manifold approximation and projection (UMAP) of clusters in WT and *Nipbl*^{+/-} embryos at (D) LB and (E) CC stages. UMAP of clusters in each *Nipbl*^{+/-} embryo at (F) LB and (G) CC stages.



Fig. 2. scRNA-seq captured cells from all germ layers, as well as progenitors of major tissues. (A) UMAP of clusters assigned to germ layers in LB- and CC-stage embryos. (B) UMAP of germ layers in LB- and CC-stage embryos. Expression of genes marking germ layers of (C) LB- and (D) CC-stage embryos in UMAP. UMAP of cell populations in germ layers of (E) LB- and (F) CC-stage embryos. Heatmap of fold change in expression of the most differentially expressed transcription factor genes (lowest *Q* values from Mann-Whitney *U* test) (101) of cell populations from all other cell populations in germ layers of (G) LB- and (H) CC-stage embryos.

them into germ layers at both LB and CC stages of development. Figure 2 (C and D) further depicts the assignment of cells based on the expression of germ layer markers, at LB and CC stages, respectively. These markers include those for ectoderm, such as *Utf1*, *Sox2*, and *Pou3f1* (*31–33*), mesoderm, including *T*, *Hand1*, *Vim*, *Twist1*, and *Prrx2* (*34–38*), and endoderm, *Ttr* (*39*).

To identify cell types within germ layers, we reapplied DGEA after clustering individual germ layers. For the endoderm, this enabled us to identify definitive endoderm progenitors (DEPs) (*Sox4* and *Foxa2*) (40, 41), as well as extraembryonic endoderm (XEnd) (*Hnf4a* and *Tbx3*) (42, 43) at LB stage (Fig. 2E, data S3, and table S3). In CC-stage embryos, we captured identical cell types in the endoderm and visceral endoderm (VE) (*Hnf4a* and *Esx1*) (Fig. 2F, data S4, and table S3) (42, 44). DEPs and XEnd give rise to the gut and placenta, respectively.

Within the ectoderm of LB-stage embryos, we identified early progenitor populations including intraembryonic ectoderm progenitors (IEPs) (Pou3f1 and Otx2) (33, 45), neural ectoderm progenitors (NEPs) (Cdx1 and Nkx1-2) (46, 47), and surface ectoderm (SE) (Id1, Msx2, and Msx1) (48) (Fig. 2, E and G, data S5, and table S4). In addition, we detected a small portion of extraembryonic ectoderm (XEct) (Elf5 and Tead4) (49, 50), which was expected, as a small quantity of XEct cells was included in our dissection. By CC stage, IEPs, NEPs, and XEct were no longer detectable, a phenomenon previously noted (51). Rather, we continued to detect SE. We also detected six distinct neural populations (Fig. 2, F and H, data S6, and table S4). These neural populations included prosencephalic neural plate (Six3 and Hesx1) (52, 53), mesencephalic neural plate (En1 and Pax2) (54, 55), rhombencephalic neural plate (Hoxa1 and Hes3) (56, 57), midline neural plate (Foxa2 and Nkx2-9) (58, 59), spinal neural plate (Sox2 and Ezr) (60, 61), and neural crest (Pax3 and Foxd3) (62, 63) (data S6). Collectively, these populations constitute the nascent progenitors of the brain, spinal cord, and peripheral nervous system.

Within the mesoderm of LB-stage embryos, we identified six distinct groups of cells, detailed in Fig. 2 (E and G), data S7, and table S5. These consisted of (i) neuromesodermal progenitors (NMPs) expressing markers T and Nkx1-2 (34, 47); (ii) derivatives of NMPs including Mesp1-expressing mesoderm progenitors (MMPs) (Mesp1) (64), two types of first heart field (FHF) cells (FHF1 and FHF2) marked by Hand1 (35), cells of the second heart field (SHF) with Id2 and Mef2c (65, 66), and three kinds of paraxial mesoderm (PM) cells, further categorized into PM progenitors (PMPs) (Tbx6 and Meis2) (67, 68), trunk PM (TPM) (Foxc2 and Tcf15) (69, 70), and head PM (HPM) (Alx1 and Tcf15) (70, 71); (iii) hematopoietic cells including hemangioblasts (HMBs) (Tal1 and Etv2) (72, 73) and primitive erythrocytes (PEs) (Gata1 and Tall) (72, 74); and (iv) two rare populations comprising cells of the primitive node (PN) (Noto and Foxj1) (75, 76) and PGCs (Tfap2c and Msx1) (77, 78). At CC stage, we detected all mesodermal populations found earlier, along with several that emerge later in development. These comprised lateral plate mesoderm progenitors (LPMPs) (Tlx2 and T) (34, 79), additional populations of MMPs (MMP1 and MMP2) (Mesp1) (64), cardiomyocytes (CDMs) (Mef2c and Nkx2-5) (80, 81), and presomitic mesoderm (PSM) (Tcf15 and Meox1) (70, 82) (Fig. 2, F and H, data S8, and table S5). Collectively, these progenitors are responsible for the formation of structures including the skeletal muscle, bone, blood, and heart.

Nipbl^{+/-} mice have fewer mesoderm cells, PEs, FHF cells, and more PM cells

We analyzed the cellular composition of embryos at both LB and CC stages, quantifying the proportion of cells within each germ layer that contributed to the total cell count. LB-stage mutants exhibited 13% fewer mesoderm cells (Fig. 3, A and B, and data S9), while concurrently displaying a greater proportion of endoderm and ectoderm cells. We sought to ascertain whether this decrease in mesoderm was generalized or restricted to specific subpopulations. Focusing on LB-stage embryos, we merged mesodermal cell subpopulations of similar biological identity together (FHF1 + FHF2 into FHF and PSM + HPM into PM) (Fig. 3C) and calculated the percentage of cells across these subpopulations, relative to the overall mesoderm. The findings (Fig. 3D) revealed a 77% reduction in PEs $Nipbl^{+/-}$ embryos (P = 0.06, t test; data S10). In addition, differences were observed in two mesodermal derivatives of the neuromesoderm: (i) Mutants had 24% fewer FHF cells (Fig. 3D); and (ii) Nipbl^{+/-} embryos showed a contrasting pattern in PM, a 33% increase in PM cells compared to WT (Fig. 3D).

Since Nipbl^{+/-} cells were projected onto WT cell populations, we wondered whether any observed differences between Nipbl^{+/-} and WT embryos might have occurred as a result of misprojecting cells, i.e., assigning cells to incorrect clusters. To investigate this, we independently clustered *Nipbl*^{+/-} cells and projected WT cells onto those clusters; we refer to this as reverse projection (fig. S6). If observed differences in the allocation of Nipbl+/- cells to particular clusters had been a result of misclassification due to technical limitations of projecting cells, then the same differences should not appear when reverse projection was done. If misclassified cells were simply distributed at random one should expect reverse projection to produce differences opposite to those produced by the original, forward projection. However, this was not found to be the case. Cluster assignments resulting from reverse projection quantitatively resembled those of forward projection (fig. S6, A to D). Germ layer identities, which were based on the expression of specific markers (table S6 and data S11), were generally the same in the reverse projection analysis as well (fig. S6, E to H).

Last, we quantified the proportion of cells within each germ layer and mesodermal population following reverse projection. Consistent with the findings from forward projection (Fig. 3B), $Nipbl^{+/-}$ embryos showed 13% fewer mesoderm cells than WT embryos, while concurrently showing more endoderm and ectoderm cells (fig. S6M and data S13). Likewise, the mesoderm of $Nipbl^{+/-}$ embryos showed fewer FHF cells (24% fewer) and more PM cells (22% more) than WT embryos (Fig. 3D, fig. S6N, and data S14). [Because very few PEs are present in $Nipbl^{+/-}$ embryos (Fig. 3D), it was not possible to cluster these cells into a distinct cell population during reverse projection (fig. S6, K and L).] Together, these data indicate that differences in cell population sizes observed in $Nipbl^{+/-}$ embryos represent true biological changes and are not a consequence of technical issues, such as misprojection.

Nipbl^{+/-} embryos do not show changes in developmental timing

Cellular composition changes very quickly during and after gastrulation; one possible explanation for differences in proportions of cell types could be a change in the overall pace of development, such that embryos of one genotype were slightly delayed or accelerated relative to the other. To investigate whether this was the case for



Fig. 3. *Nipbl^{+/-}* **embryos exhibit changes in the sizes of mesodermal subpopulations that are not accompanied by changes in developmental timing. (A)** UMAP of germ layers in LB-stage WT and *Nipbl^{+/-}* embryos. (B) Percentage of cells in germ layers from all cells in LB-stage WT and *Nipbl^{+/-}* embryos. Error bars show SEM. *P* values from *t* test. (C) UMAP of cell populations in mesoderm of LB-stage WT and *Nipbl^{+/-}* embryos. (D) Percentage of cells in mesodermal cell populations from all cells in LB-stage WT and *Nipbl^{+/-}* embryos (bottom). Error bars show SEM. *P* values from *t* test. (E) Lateral view of WT EB- and EHF-stage embryos subjected to scRNA-seq. Dashed line represents where embryonic tissue was separated from extraembryonic tissue. Scale bars, 100 µm. (F) Workflow used to filter out low-quality cells and doublets and cluster cells at EB and EHF stage sinto optimal number of clusters. (G) UMAP of clusters assigned to germ layers in EB- and EHF-stage embryos. (H) Density of cells from WT EB-, LB-, and EHF-stage embryos along pseudo-time (calculated using URD). (I) Density of cells in germ layers of LB-stage WT and *Nipbl^{+/-}* embryos along pseudo-time.

Nipbl^{+/-} embryos, we used pseudo-temporal ordering. To ensure that pseudo-time accurately mirrored real developmental time, we augmented our analysis with scRNA-seq data from an additional two pairs of WT embryos at the early bud (EB) stage and two pairs of WT embryos at the early head fold (EHF) stage (Fig. 3E and fig. S7). EB-stage embryos are 2 hours younger and EHF-stage embryos are 2 hours older than LB-stage embryos, so these supplementary samples provided the temporal resolution necessary to discern

even minor changes (less than 2 hours) in developmental timing (27). We eliminated low-quality cells and doublets (Fig. 3F, fig. S8, and table S8) before integrating cells of the same stage (fig. S9). We then clustered EB-stage cells into 8 distinct populations and EHF-stage cells into 13 distinct populations (fig. S10, A and B). Each population was subsequently annotated as ectoderm, mesoderm, or endoderm (Fig. 3G and fig. S10, C and D) based on the expression of specific germ layer markers (data S15 and S16 and table S9).

We ordered cells from each embryo at every developmental stage (EB, LB, and EHF) using URD (83), which constructs a diffusion map of transition probabilities and, starting with an assigned group of root cells, performs a probabilistic breadth-first graph search using the transition probabilities. When we visualized the arrangement of cells from each stage based on their density in pseudo-time, we found that cells from WT embryos ordered in accordance to their developmental stage: EB came first, followed by LB, and lastly EHF (Fig. 3H and data S17), while showing partial overlap between cells of different stages. This confirmed that the pseudo-time values we acquired were an accurate representation of actual developmental timing. When the pseudo-time orderings of WT and Nipbl^{+/-} LB-stage embryos were compared with each other, we found no statistically significant deviations (Kolmogorov-Smirnov test) (Fig. 3I). These findings argue that the observed reduction in mesoderm cells in *Nipbl^{+/-}* mice at LB stage cannot be attributed to overall developmental delay or acceleration. The fact that Nipbl haploinsufficiency does not result in global changes in developmental timing strongly suggests that birth defects in CdLS result from specific cellular or molecular irregularities within individual developmental pathways and not a globally altered developmental timeline.

Nipbl^{+/-} embryos do not show changes in cell lineage trajectory

To discern whether alterations in the sizes of cell population in *Nipbl*^{+/-} embryos were attributable to changes in the structures of cell lineages, we used scVelo (84) to compute the RNA velocity for all mesoderm cells from LB-stage embryos. RNA velocity provides a predictive metric for a cell's future transcriptional state, gauging the equilibrium between the synthesis of spliced mRNA from unspliced mRNA and mRNA degradation. scVelo was used to build cell lineage trajectories separately for WT and Nipbl^{+/-} embryos at LB stage (Fig. 4A). In WT mesoderm, five distinct lineages were discernible (Fig. 4B and data S18), with NMPs giving rise to three terminal fates via four specific pathways. These pathways encompassed the differentiation of NMPs into FHF, SHF, and PM. Note that Mesp1-expressing cells have the versatility to differentiate into both cardiac mesoderm and PM. While Mesp1 is typically recognized as a cardinal factor for cardiac specification (85), our findings suggest that its influence may extend beyond this role into paraxial specification as well. As a result, the PM has dual progenitors, PMPs and MMPs. We also observed a fifth lineage, independent of NMP lineages, where HMBs differentiate into PEs. Notably, PGCs and PN cells did not form part of any identified lineages. Examination of the mesoderm in Nipbl^{+/-} embryos revealed lineage trajectories identical to those in WT (Fig. 4A and data S19). These observations suggest that variations in the overall structures of cell lineage pathways do not explain differences in the number of FHF and PM cells in $Nipbl^{+/-}$ embryos (Fig. 3, B and D).

Nipbl^{+/-} embryos misdirect mesoderm cells into PM at the expense of the FHF

To explore whether variations in cell fate decisions might be responsible for the observed differences in the numbers of FHF and PM cells in Nipbl^{+/-} embryos, we used CellRank (86) to compute the likelihood of cells from the mesoderm (excluding HMBs, PEs, PGCs, and PN cells) transitioning terminally into cells of SHF, FHF, or PM fate (data S20 and S21). HMBs, PEs, PGCs, and PN were

omitted from the calculation because our trajectories derived from RNA velocity indicated that these populations do not ultimately transition into SHF, FHF, or PM. In CellRank, the absorption probability defines that the likelihood that a specific cell type will make a transition to a terminal state, derived using RNA velocity-directed, random walks from initial to terminal cell states (86). We represented these probabilities in uniform manifold approximation and projection (UMAP) space, with shades of blue to signify low probabilities and red for high probabilities. Figure 4 (C and D) illustrates that the probabilities of NMPs, MMPs, and PMPs making a terminal transition solely into SHF do not vary significantly between Nipbl^{+/-} and WT embryos, as quantified in the adjacent violin plots. However, the transition probabilities into FHF are 27 to 48% lower in Nipbl^{+/-} embryos (Fig. 4, E and F), while the probabilities for transitions into PM are 9 to 11% higher (Fig. 4, G and H). Together, these results support the hypothesis that disparities in cell numbers in Nipbl^{+/-} embryos stem from a misdirection of cells from FHF pathway toward a PM fate (Fig. 4I).

Nipbl^{+/-} embryos do not show evidence of altered apoptotic activity or cell proliferation

Altered cell numbers in different mesodermal subpopulations of *Nipbl^{+/-}* embryos could also conceivably stem from modifications in rates of cell death or proliferation. Focusing on apoptotic activity, we carried out DGEA on WT and Nipbl^{+/-} embryos at LB stage, using genes associated with apoptosis from two well-known gene sets: Reactome Apoptosis and Hallmark Apoptosis (87, 88). We ranked each gene by minimum Q value, arranging them from lowest to highest, and visualized their expression across all germ layers in *Nipbl^{+/-}* embryos as heatmaps of the fold change relative to their WT counterparts (fig. S11, A and B, and data S22). For both gene sets, we saw no visible pattern of differences in the expression of genes with even the lowest *Q* values between any of the germ layers in both WT and *Nipbl^{+/-}* embryos. Although genes from these gene sets tend to mark cells with the capacity for apoptosis, their expression levels are not necessarily indicative of cells actively undergoing that compared 180 apoptosis-associated genes in hematopoietic ²/₂ cells that were either bealthy compared cells that were either healthy or undergoing apoptosis (89) and identified 93 apoptosis-associated genes that were differentially expressed. When we examined these genes in the germ layers of Nipbl^{+/-} embryos, we also saw no visible difference with WT embryos (fig. S11C and data S22). These data suggest that changes in apoptotic activity are unlikely to be a major contributor to differences in cell type proportions.

To examine cell proliferation, we again used DGEA across all germ layers of both WT and *Nipbl^{+/-}* embryos at LB stage, focusing on the meta-proliferating cell nuclear antigen (PCNA) gene set, an ensemble of genes that exhibit the strongest positive correlation with PCNA expression, a recognized biomarker of cell proliferation (90). When we visualized the expression of these genes in the same manner as the gene sets above, we found no discernible variations in the expression levels of the meta-PCNA genes between the germ layers of WT and Nipbl^{+/-} embryos (fig. S12A and data S23). As another measure of cell proliferation, we used Seurat to assign cells from LB-stage WT and Nipbl^{+/-} embryos into phases (G₁, S, and G_2 -M) of the cell cycle (91). Seurat does this by calculating a cell cycle phase score based on the expression of canonical S phase and G2-M phase markers. Seurat considers these marker sets to be

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Fig. 4. *Nipbl^{+/-}* mice misdirect mesoderm cells into PM at the expense of the FHF. (**A**) RNA velocities, calculated by scVelo of mesoderm cells from LB-stage WT and *Nipbl^{+/-}* embryos in UMAP. (**B**) Cell lineage trajectories in mesoderm of LB-stage WT and *Nipbl^{+/-}* embryos. Probability of mesoderm cells from LB-stage WT and *Nipbl^{+/-}* embryos terminally transitioning (absorption probabilities calculated using CellRank) into (**C**) SHF, (**E**) FHF, or (**G**) PM fates in UMAP. Violin plot of probability of NMPs, MMPs, and PMPs from LB-stage WT and *Nipbl^{+/-}* embryos terminally transitioning (absorption probabilities calculated using CellRank) into (**C**) SHF, (**E**) FHF, or (**G**) PM fates in UMAP. Violin plot of probability of NMPs, PValues from test. (**I**) Schematic illustrating how mesoderm cells in *Nipbl^{+/-}* embryos are misdirected into PM fate at the expense of FHF fate.

anticorrelated in their expression, so when cells express neither, they are considered to be in G₁ phase. As expected, in all germ layers, cells from LB-stage WT and $Nipbl^{+/-}$ embryos assigned into all phases of the cell cycle (fig. S12B and data S24). In all germ layers, there was no statistically significant difference in the proportions of cells in each cell cycle between WT and $Nipbl^{+/-}$ embryos (fig. S12C). We therefore concluded that extensive alterations in cell proliferation are not likely responsible for disparities in cell subpopulations.

NipbI^{+/-} mice underexpress genes predicted to drive the transition of mesoderm cells into FHF

Next, we sought to investigate whether the misdirection of mesoderm cells in Nipbl^{+/-} embryos at the LB stage could be attributed to the misexpression of genes that drive the transition of mesoderm cells into either FHF or PM. To answer this question, we also used CellRank to identify potential driver genes of the FHF and PM fates, using those mesoderm cells that specifically contribute to these developmental pathways (Fig. 5, A and D). CellRank achieves this by calculating a correlation coefficient between the likelihood (absorption probabilities) of cells progressing toward a particular lineage fate and the expression level of individual genes (86). In this context, genes with positive correlation coefficients are considered drivers, as their expression elevates alongside an increase in absorption probabilities. Conversely, genes with negative correlation coefficients are deemed antidrivers, as their expression diminishes with increasing absorption probabilities. To minimize the risk of false discoveries, we set a threshold, accepting genes with correlation coefficients greater than 0.25 as drivers and those less than -0.25 as antidrivers.

CellRank identified 383 genes as drivers of FHF fate (Fig. 5B and data S25). Eleven percent of them were transcription factors. Among these were Hand1 and Tbx20, transcription factors previously recognized for their roles in promoting FHF development (35, 92). Several transcription factors that have not been previously linked to FHF development were also predicted to be FHF drivers, including Msx1, Msx2, Foxf1, Hoxb6, and Pitx1. Of these, Hoxb6 and Pitx1 are known to play important roles in segmentation and patterning. Gene set overrepresentation analysis using the Molecular Signatures Database (MSigDB)'s Hallmark gene sets (87), which characterize well-defined biological states and processes, revealed that FHF drivers were significantly enriched in genes associated with transforming growth factor- β (TGF- β) signaling (Fig. 5C), which has been previously described as important in CDM proliferation (93). Genes associated with epithelial-to-mesenchymal transition (EMT) were also significantly enriched (see below). Conversely, CellRank predicted 225 genes to be antidrivers of FHF fate, with 16% being transcription factors. Among these were genes known to be involved in pluripotency (Pou5f1), mesoderm specification/expansion (T, Cdx1, Sp5, and Zic3), anterior-posterior patterning (Hoxb1 and Hoxa1), and PM development (Hes7, Meis2, Tbx6, Gbx2, and Foxb1).

CellRank predicted 66 genes to be drivers and 115 genes to be antidrivers of PM fate (Fig. 5E and data S26). A substantial proportion (22%) of PM drivers were transcription factors. These included *Tcf15* and *Foxc2*, transcription factors that have been previously recognized for their role in regulating PM development (Fig. 5E) (69, 94). The *Irx* transcription factors *Irx5*, *Irx1*, and *Irx3*—known for their roles in segmentation during development (95)—were also identified as PM drivers. PM drivers did not exhibit significant overrepresentation of any Hallmark gene sets (Fig. 5F). Of all PM antidrivers, 20% were identified as transcription factors, including

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Hand1, *Cdx2*, *Msx2*, *Msx1*, and *Cdx4*. *Hand1*, *Msx2*, and *Msx1* had also been predicted as drivers for FHF. This overlap prompted us to conduct a comparative analysis between PM antidrivers and FHF drivers. Our examination revealed that 40% of all PM antidrivers were concurrently FHF drivers (Fig. 5, G and H).

The confluence of expressed genes between FHF drivers and PM antidrivers seems to indicate that during normal development, increased expression of these shared genes by mesoderm cells predisposes them to transition into FHF, while decreased expression of these same genes steers them toward PM (Fig. 5I). This set of shared genes may thus be considered to be a "lineage branching signature."

How does *Nipbl* haploinsufficiency affect the expression of driver and antidriver genes? Examination of *Nipbl*^{+/-} embryos revealed significant misexpression in NMP, MMP, and PMP cells of numerous driver and antidriver genes associated with both FHF and PM (Fig. 5J, fig. S13, and data S27 and S28). Most affected driver and antidriver genes were down-regulated. To ascertain whether this was more than coincidental, we used a chi-square analysis, which revealed a notable pattern: *Nipbl*^{+/-} embryos underexpressed FHF drivers at a higher frequency than they overexpressed them [166 of 174 differentially expressed genes (DEGs)] (Fig. 5J). Similarly, they commonly underexpressed PM antidrivers (40 of 51) (fig. S13), aligning with expectations since many PM antidrivers serve dual roles as FHF drivers.

Notably, genes associated with EMT were highly enriched among FHF drivers that were underexpressed in $Nipbl^{+/-}$ embryos (Fig. 5K). A total of 15 EMT genes was found to be underexpressed, including the EMT transcription factors Msx1 and Snai2 and signaling genes such as Igfbp4, Pdgfrb, and Tgfb1 (Fig. 5J). These results suggest that, in the context of Nipbl haploinsufficiency, skewed differentiation of mesoderm cells toward the PM lineage at the expense of FHF lineage may be attributable to the underexpression of genes driving FHF fate. These results are consistent with the idea that genes associated with EMT play a role in this lineage misdirection.

Nipbl^{+/-} mice show large changes in the expression of major developmental regulators in all germ layers

Using DGEA to compare the germ layers of LB-stage WT and $Nipbl^{+/-}$ embryos (data S29 to S31), we found that $Nipbl^{+/-}$ embryos misexpressed hundreds of genes across all germ layers. Underexpression was more common than overexpression in all cases (Fig. 6A), supporting a broad role for Nipbl in enhancing gene expression. Most of gene expression changes were subtle, i.e., less than twofold (Fig. 6A). This pattern of gene expression changes agrees with earlier studies (18). Gene set enrichment analysis (GSEA) for MSigDB's Hallmark gene sets found that Nipbl^{+/-} embryos showed enrichment, and no de-enrichment, for 4 of 40 gene sets: oxidative phosphorylation in the mesoderm; MTORC1 signaling in the ectoderm; and G₂-M checkpoint, Myc targets, and E2F targets in the endoderm (Fig. 6B). In these cases, however, enrichment was driven by a relatively small number of the genes in these sets; the vast majority was either not differentially expressed in Nipbl^{+/-} embryos or showed changes much smaller than 1.5-fold (Fig. 6C).

Genes exhibiting substantial changes in expression—greater than twofold up-regulated or down-regulated—were nevertheless observed across every germ layer of $Nipbl^{+/-}$ embryos (Fig. 6A). Individual curation of these genes unveiled associations with developmental processes (Fig. 6D). Within the mesoderm, two- to sixfold up-regulation of genes involved in Nodal signaling, including *Tdgf1*,





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Fig. 6. *Nipbl^{+/-}* mice show large changes in the expression of major developmental regulators in all germ layers. (**A**) Number of differentially expressed genes (Q < 0.05, Mann-Whitney U test) in germ layers of LB-stage *Nipbl^{+/-}* embryos showing small (≤ 2 -fold) or large (>2-fold) changes in expression from that of WT embryos. (**B**) Normalized enrichment score of statistically significant (Q < 0.05, FGSEA) Hallmark genes sets in germ layers of LB-stage *Nipbl^{+/-}* embryos from that of WT embryos. (**C**) Fold change in expression of Hallmark gene sets from Fig. 5B in germ layers of LB-stage *Nipbl^{+/-}* embryos from that of WT embryos along their average expression in WT embryos. (**D**) Fold change in expression of DEGs (Q < 0.05, Mann-Whitney U test) in germ layers of LB-stage *Nipbl^{+/-}* embryos showing large changes in expression (>2-fold) from that of WT embryos along their average expression in WT embryos.

Eomes, *Lefty2*, and *Lhx1*, was observed (96–99). At the same time, three clusters of genes were robustly down-regulated: those associated with primitive erythropoiesis, including *Gata1* and *Klf1* (two-to threefold) (74, 100); *Hox* genes such as *Hoxb8*, *Hoxb5*, and *Hoxa5* (twofold); and genes associated with Notch signaling, including *Hey2* and *Nr2f2* (twofold) (101, 102) (Fig. 6D).

In the ectoderm, five transcription factor genes tied to the hedgehog signaling pathway were down-regulated more than twofold, including *Pax2*, *Sox9*, *Nkx6-1*, *Sox1*, and *Irx2* (103–107) (Fig. 6D). In the endoderm, there was a distinct two- to threefold up-regulation of several adult hemoglobin genes such as *Hbb-bt*, *Hba-a2*, *Hba-a1*, and *Hbb-bs* (Fig. 6D). Consistent patterns were evident in both the ectoderm and endoderm, mirroring the mesoderm's trends. Genes related to Nodal signaling were up-regulated, and *Hox* genes were noticeably down-regulated, across all germ layers. The magnitude of changes in Nodal signaling genes and *Hox* genes, being greater than twofold in both directions, and their critical roles in various germ layers, strongly suggests that disruptions in these pathways could be major contributors to phenotypes observed in *Nipbl*^{+/-} mice.

When we compared the sets of DEGs obtained from forward projection (Fig. 6) with those obtained from reverse projection (fig. S14), we found that greater than 94% of DEGs in mesoderm and ectoderm were identical (fig. S14, A and B). For the endoderm, reverse projection showed more than 75% of the same DEGs (fig. S14C). As was the case for changes in the relative sizes of cell populations, we conclude that DEGs observed in *Nipbl*^{+/-} embryos represent true biological differences and are not a consequence of technical issues in cell classification.

Nipbl^{+/-} mice overexpress *Nanog* during and after gastrulation

To uncover developmental processes that might be the most broadly affected in *Nipbl*^{+/-} embryos, we used the large, significant, changes in gene expression (greater than twofold up or down) as input data for STRING (*108*), a database and algorithm that constructs a network of potential gene interactions (data S35), in this case, limiting predictions to those informed by experiments demonstrating coexpression or protein-protein interactions. The outcome of this analysis (Fig. 7, A and B) revealed that many genes with substantial expression changes in *Nipbl*^{+/-} embryos are predicted to interact either directly or indirectly with *Nanog. Nanog* itself was overexpressed across all three germ layers in *Nipbl*^{+/-} embryos, with a more pronounced overexpression, exceeding twofold, in the mesoderm and endoderm (Fig. 7B).

Nanog, which encodes a transcription factor, is notably expressed at two junctures during mouse embryonic development. Initially, it appears at the blastocyst stage, where it plays an essential role in sustaining the pluripotency of the inner cell mass cells (109). Subsequently, during gastrulation, Nanog expression temporarily surges, only to be silenced as cells transition out of the primitive streak (110). This expression pattern could be observed directly in our data: In Fig. 7C, we ordered mesodermal cell populations from LBstage embryos by their stage in gastrulation, as inferred from their RNA velocity positions (Fig. 4A). In WT NMPs, Nanog is expressed at a relatively high level. As cells move through successive stages of gastrulation within WT embryos, Nanog's expression exhibits a consistent decline (Fig. 7C and data S36), reaching near zero in cells of the FHF and SHF. An exception to this trend occurs in PGCs, which are known to maintain elevated Nanog expression (111). In contrast, in Nipbl^{+/-} embryos (Fig. 7C), Nanog expression remained elevated across all cell populations. Although expression still falls after the NMP stage in *Nipbl^{+/-}* cells, *Nanog* never falls to WT levels. This is evident even in PGCs. Moreover, the overexpression of Nanog in Nipbl^{+/-} embryos is sustained up to the CC stage (Fig. 7D and table S10), where it reaches a 10-fold increase over WT levels. These observations indicate that Nipbl haploinsufficiency leads to a marked failure of Nanog down-regulation.

Another transcription factor that plays a role in maintaining pluripotency is *Pou5f1* (*Oct4*). From studies in embryonic stem cells (ESCs), it is known that *Pou5f1* promotes the expression of *Nanog* and, conversely, *Nanog* promotes the expression of *Pou5f1* (112). Given this, we were curious about whether $Nipbl^{+/-}$ embryos might also overexpress of *Pou5f1*. Despite the fact that *Pou5f1* is more highly expressed than *Nanog*, we did not observe any statistically significant difference in *Pou5f1* expression across mesodermal cell types or throughout LB-stage $Nipbl^{+/-}$ embryos (Fig. 7, E and F, data S37, and table S11). However, a more than twofold elevation in *Pou5f1* expression was detected in $Nipbl^{+/-}$ embryos at CC stage (Fig. 7F).

We sought to determine whether elevated Nanog expression in Nipbl^{+/-} embryos during gastrulation might reflect some sort of nonspecific overactivity of the Nanog gene. To investigate this hypothesis, we looked at Nanog expression in WT and Nipbl^{+/-} ESCs, as ESCs are known to express Nanog (as do to the blastocyst inner cell mass cells from which ESCs are derived). We generated WT and Nipbl^{+/-} ESCs by treating Nipbl^{Flex/+} (Nipbl^{+/-}) ESCs with Flp recombinase (which inverts a gene trap in Nipbl-Flex ESCs in such a way that reverses gene trapping) to produce Nipbl^{Flrt/+} (WT) ESCs (Fig. 7G) (24). We assessed Nanog expression in nine independent clones from each genotype, using reverse transcription quantitative polymerase chain reaction (RT-qPCR). We observed no discernible difference in Nanog expression between Nipbl^{+/-} and WT ESCs, a pattern that was also observed for *Pou5f1* (Fig. 7H and data S38). As a control, we showed that Nipbl^{+/-} ESCs exhibit the expected reduced expression of Nipbl, as also seen in Nipbl^{+/-} embryos. Collectively, these findings support the conclusion that the overexpression of Nanog in Nipbl^{+/-} LB-stage and CC-stage embryos is result of a specific failure to appropriately suppress Nanog following gastrulation, rather than unusually elevated Nanog expression persisting from early embryogenesis.

Nanog overexpression accounts for many of the gene expression changes in *Nipbl*^{+/-} mice

As a critical regulator of pluripotency in early embryonic development, Nanog directly influences the expression of a multitude of other genes. This relationship prompted us to ask how many of the gene expression differences in $Nipbl^{+/-}$ embryos might be attributable to the overexpression of Nanog. To address this question, we took advantage of data from a recent study, by Tiana et al. (113), in which mice were engineered to express Nanog under doxycycline (Dox)-inducible control. In that study, bulk RNA sequencing was performed on untreated (Nanog Dox-) and Dox-treated (Nanog Dox+) embryos at stages E7.5 and E9.5, with E7.5 corresponding closely to the LB-stage embryos analyzed here. The E7.5 Nanog Dox+ embryos that were sequenced had been treated with doxycycline from E4.5 to E7.5, while E9.5 Nanog Dox+ embryos were treated with doxycycline from E6.5 to E9.5. DGEA, performed in that study, found hundreds of gene expression changes between Nanog Dox- and Nanog Dox+ embryos at both stages (113). We subsequently analyzed the results of their analysis in four ways.

First, we plotted the fold change in expression of genes in *Nipbl*^{+/-} embryos, as a whole, from that of WT embryos, concentrating on LB stage (Fig. 8A and data S39). (CC-stage comparisons are shown in fig. S15, A and B, and data S40.) In Fig. 8A, genes significantly overexpressed in *Nipbl*^{+/-} embryos are colored pink and those significantly underexpressed, light blue. DEGs in *Nipbl*^{+/-} embryos that are also significantly overexpressed or underexpressed in E7.5 *Nanog* Dox+ embryos are colored red and blue, respectively. The results are summarized in Fig. 8B. At LB stage, 68.8% of overexpressed and 61.5% of underexpressed genes in *Nipbl*^{+/-} embryos



Fig. 7. *Nipbl*^{+/-} **mice overexpress** *Nanog* **during and after gastrulation.** (**A**) DEGs (greater than twofold up-regulated or down-regulated) between the germ layers of WT and *Nipbl*^{+/-} embryos predicted by STRING to interact with each other. (**B**) Fold change in expression of DEGs (Q < 0.05, Mann-Whitney U test) in germ layers of LB-stage *Nipbl*^{+/-} embryos showing large changes in expression (>2-fold) from that of WT embryos along their average expression in WT embryos that are predicted by STRING to interact with *Nanog*. (**C**) Expression of *Nanog* in mesodermal cell populations of LB-stage WT and *Nipbl*^{+/-} embryos from LB to CC stages. Error bars show SEM. *P* values from *t* test. (**E**) Expression of *Pou5f1* in mesodermal cell populations of LB-stage WT and *Nipbl*^{+/-} embryos ordered from left (earlier) by their RNA velocity positions in Fig. 4A. Error bars show SEM. (**D**) Expression of *Nanog* in WT and *Nipbl*^{+/-} embryos ordered from left (earlier) to right (later) by their show SEM. (**F**) Expression of *Pou5f1* in WT and *Nipbl*^{+/-} embryos from LB to CC stages. Error bars show SEM. *P* values from *t* test. (**G**) Monoclonal generation of *Nipbl*^{Firt/+} (WT) and *Nipbl*^{+/-}) ESCs. (**H**) Expression of *Nipbl*, *Nanog*, and *Pou5f1* in WT and *Nipbl*^{+/-} ESCs as measured by RT-qPCR and normalized to the housekeeping gene, *Rpl4*. Error bars show SEM. *P* values from *t* test.



Fig. 8. LB-stage *Nipbl^{+/-}* **mice replicate the gene expression changes of** *Nanog* **overexpression.** (**A**) Fold change in expression of DEGs in LB-stage *Nipbl^{+/-}* embryos (Q < 0.05, *K* test) (*113*). (**B**) Percentage of DEGs in LB-stage *Nipbl^{+/-}* embryos that are also DEGs in E7.5 *Nanog* Dox+ embryos (Q < 0.05, *K* test) (*113*). (**B**) Percentage of DEGs in LB-stage *Nipbl^{+/-}* embryos that are also DEGs in E7.5 *Nanog* Dox+ embryos (*113*). (**C**) Fold change in expression of DEGs in the germ layers of LB-stage *Nipbl^{+/-}* embryos. DEGs in E7.5 *Nanog* Dox+ embryos (*113*). (**D**) Fold change in expression of genes in LB-stage *Nipbl^{+/-}* embryos versus their fold change in E7.5 *Nanog* Dox+ embryos. DEGs in E7.5 *Nanog* Dox+ embryos (*113*) are colored pink and light blue. (**E**) Heatmap of the fold change in expression of DEGs from E7.5 *Nanog* Dox+ embryos (lowest *Q* values from t test) (*113*) in the germ layers of LB-stage *Nipbl^{+/-}* embryos. (**F**) ChIP sequencing for Nanog in mESCs from (*119*) identified 3646 genes with one or more Nanog binding sites within ±250 nt of their TSSs. (**G**) Fold change in expression of DEGs in LB-stage *Nipbl^{+/-}* embryos with one or more Nanog binding sites from (*119*). Fold change in expression of DEGs in mesoderm cells of (**I**) FHF and (**J**) PM lineages of LB-stage *Nipbl^{+/-}* embryos (*113*). Transcription factor genes are labeled. (**K**) Reduction of *Nipbl* levels leads to the up-regulation of *Nanog* in LB-stage *Nipbl^{+/-}* embryos and down-regulation of FHF drivers and PM antidrivers, resulting in the misallocation of mesoderm cells to PM at the expense of FHF.

were also overexpressed or underexpressed, respectively, in E7.5 Nanog Dox+ embryos. A binomial test confirmed that Nanog Dox+ DEGs are highly overrepresented in $Nipbl^{+/-}$ embryos (Fig. 8B).

Second, we again plotted the fold change in expression of genes in LB-stage Nipbl^{+/-} embryos from that of WT embryos, but this time separately by germ layer, rather than across whole embryos (Fig. 8C). Genes colored red and blue are DEGs in *Nipbl*^{+/-} embryos that are also overexpressed or underexpressed in Nanog Dox+ embryos. When we manually curated genes that were expressed with more than twofold change (Fig. 8C), we found that all germ layers showed up-regulation of genes involved with Nodal signaling (Tdgf1, Lefty2, Eomes, Lhx1, and Ffg5) (96-99, 114) and downregulation of Hox genes (Hoxb8 and Hoxb6). In addition, the mesoderm of Nipbl+/- embryos underexpressed genes associated with primitive erythropoiesis (Hbb-bh1, Klf1, and Gata1) (74, 100) and hedgehog signaling (Pax2 and Sox9) (103, 104). (CC-stage gene expression changes are discussed in fig. S15C.) These findings are consistent with the idea that many of the largest changes in gene expression that occur in Nipbl+/- embryos, as well as the developmental pathways they regulate, could be attributable to overexpression of Nanog.

Third, we analyzed how closely Nipbl^{+/-} embryos mirrored the gene expression alterations of Nanog Dox+ embryos in terms of magnitude and direction. To do this, we generated a plot illustrating the fold changes in expression of individual genes in Nipbl^{+/-} embryos compared to their fold change in Nanog Dox+ embryos (Fig. 8D). We colored genes that were significantly overexpressed in Nanog Dox+ embryos pink and those significantly underexpressed light blue. In addition, we calculated the regression line depicting the relationship between fold changes in gene expression in Nipbl^{+/} versus Nanog Dox+ embryos. At LB stage, the slope of the regression line between Nipbl^{+/-} and E7.5 Nanog Dox+ embryos was 0.8, implying that, on average, the fold changes in gene expression in Nipbl^{+/-} embryos are quantitatively similar to those in Nanog Dox+ embryos (Fig. 8D). Figure 8D also depicts that, at LB stage, *Nipbl*^{+/-} embryos up-regulate 46% of the same genes that were overexpressed in E7.5 Nanog Dox+ embryos and down-regulate 93% of the same genes that were underexpressed in E7.5 Nanog Dox+ embryos. (Similar analysis was performed at CC stage and is described in fig. S15D.) These findings highlight a remarkable similarity in gene expression changes between Nipbl^{+/-} and Nanog Dox+ embryos.

Fourth, we examined the magnitudes of fold changes in individual gene expression in Nipbl^{+/-} embryos and Nanog Dox+ embryos, focusing on the 50 most highly up- and down-regulated genes in Nanog Dox+ embryos. As shown in Fig. 8E, we categorized genes into two groups at each stage: those overexpressed in Nanog Dox+ embryos (ranked from top to middle) and those underexpressed in Nanog Dox+ embryos (ranked from bottom to middle), ordering them by ascending Q value. Next, we constructed a heatmap that visually captures the fold changes in gene expression within Nanog Dox+ whole embryos, contrasting them with the corresponding fold changes in the individual germ layers of Nipbl^{+/-} embryos (Fig. 8E). E7.5 Nanog Dox+ embryos overexpressed genes linked with the Nodal signaling pathway (Tdgf1, Eomes, Fgf5, Lhx1, Foxd3, Lefty2, and Nodal) (96-99, 114-116) and those integral to maintaining pluripotency (Nanog and Pou5f1) (Fig. 8E) (112). Concurrently, they underexpressed genes associated with primitive erythropoiesis (Hbb-bh1, Tal1, and Lmo2) (117, 118) and specific

Hox genes (*Hoxa1*, *Hoxb3os*, and *Hoxb1*). Notably, this pattern of fold changes was mirrored, to a remarkable degree, in the germ layers of LB-stage *Nipbl^{+/-}* embryos (Fig. 8E). (The corresponding analysis for CC-stage embryos is given in fig. S15E.)

DEGs from *Nipbl^{+/-}* embryos are enriched for nanog binding sites

Given the large overlap between the gene expression changes observed in LB-stage Nipbl^{+/-} embryos and E7.5 Nanog Dox+ embryos, we wondered how many DEGs in Nipbl+/- embryos might be direct targets of Nanog. Although genome-wide patterns of Nanog binding have not been characterized for embryos at this stage, many groups have used chromatin immunoprecipitation sequencing (ChIP-seq) to define Nanog binding sites in mouse ESCs (mESCs). We turned to a recent study (119), in which Avsec et al. captured 52,456 Nanog binding sites in the genome of mESCs, and reported that 3645 genes showed one or more Nanog binding sites located within 250 nucleotides (nt) on either side of their transcription start sites (TSSs) (Fig. 8F). On comparing these genes with those up- and down-regulated in LB-stage Nipbl^{+/-} embryos, we found that 25% of the overexpressed genes and 22% of the underexpressed genes match those genes with Nanog binding sites in mESCs (Fig. 8, G and H). This represented significant enrichment for Nanog binding sites in differentially versus non-DEGs ($P < 1 \times 10^{-12}$ and $P < 2 \times 10^{-16}$, Fisher's exact tests). These data suggest that a substantial portion of DEGs in LB-stage Nipbl^{+/-} embryos could indeed be direct targets of Nanog.

Nanog overexpression may account for the down-regulation of FHF drivers in *Nipbl*^{+/-} mice

As shown above in Fig. 3K and fig. S13, FHF drivers and PM antidrivers are down-regulated in LB-stage Nipbl^{+/-} mice. Given the large overlap between down-regulated genes in LB-stage Nipbl^{+/-} embryos and down-regulated genes in E7.5 Nanog Dox+ embryos (Fig. 8, B and D), we wondered how many of the down-regulated FHF drivers and PM antidrivers in *Nipbl^{+/-}* embryos could have their changes in expression attributed to the overexpression of Nanog. To answer this question, we compared the FHF drivers and PM antidrivers down-regulated in LB-stage Nipbl+/- embryos to those genes exhibiting down-regulation in E7.5 Nanog Dox+ embryos. We found that ~40% of the FHF drivers and 38% of the PM antidrivers that were down-regulated in Nipbl^{+/-} embryos were also downregulated in E7.5 Nanog Dox+ embryos (Fig. 8, I and J). This raises the possibility that overexpression of Nanog leads to the downregulation of FHF drivers and PM antidrivers and that this results in the misallocation of mesoderm cells to a PM fate at the expense of FHF (Figs. 3 and 8K).

Nipbl^{+/-} mice exhibit delayed expression of anterior *Hox* genes

We noticed that LB-stage $Nipbl^{+/-}$ embryos exhibited a significant underexpression, exceeding twofold, in *Hox* genes across all germ layers, especially genes within the *Hoxb* cluster (Figs. 6D and 8C). As *Hox* genes are integral to spatial patterning in development, we compared the expression of all *Hox* genes in $Nipbl^{+/-}$ embryos with their WT counterparts. The results, shown in Fig. 9 (A and B), revealed extensive misexpression at both LB and CC stages. At LB stage, any *Hox* gene that was significantly differentially expressed was underexpressed in $Nipbl^{+/-}$ embryos in every germ layer where



Fig. 9. *Nipbl^{+/-}* mice show a delay in the expression of anterior Hox genes. Expression of Hox genes in germ layers of WT and *Nipbl^{+/-}* embryos at (**A**) LB and (**B**) CC stages. Expression of Hoxb genes in mesoderm (**C**) and ectoderm (**D**) of WT embryos from LB to CC stages ordered from left (5') to right (3') by their chromosomal position. Expression of Hoxb genes in mesoderm of WT embryos at (**E**) LB and (**F**) CC stages ordered from left (5') to right (3') by their chromosomal position.

expression was detectable (Fig. 9A). At CC stage, we observed a trend of underexpression across all germ layers for the majority of misexpressed *Hox* genes (Fig. 9B), but exceptions were found in the mesoderm and ectoderm, where a select few *Hox* genes were over-expressed. These included *Hoxb1* and *Hoxb2* in the mesoderm and *Hoxa1* in the ectoderm, all of which are characterized as anterior *Hox* genes.

Hox genes are organized into chromosomal clusters that turn on expression in a wave-like temporal pattern, producing highly structured and sequential activation during development. Specifically, genes at the 5' end of the cluster, known as anterior Hox genes, are activated early in development and progressively silenced as genes further forward the 3' end (posterior Hox genes) are turned on (120). To investigate whether our data reflected this known pattern, we examined the Hoxb genes, as they were the most prominently expressed Hox genes at both LB and CC stages. After ordering them according to their chromosomal positions, we plotted their expression within the mesoderm and ectoderm of WT embryos at the corresponding developmental stages. In the mesoderm of LB-stage embryos, anterior Hoxb genes were actively expressed, while posterior Hoxb genes were only faintly detectable, if at all (Fig. 9C and data S44). At CC stage, the expression of anterior Hoxb genes decreased from their LB-stage levels, accompanied by the emergence of posterior Hoxb gene expression (Fig. 9C). This dynamic shift in expression aligns closely with the established understanding of Hox gene regulation during development. In contrast, the ectoderm exhibited a less pronounced pattern, with both anterior and posterior Hoxb genes expressing at minimal levels (Fig. 9D and data S45). No discernible difference in the expression of anterior Hoxb genes was detected in the ectoderm between LB- and CC-stage embryos (Fig. 9D).

Next, we looked at the expression of Hoxb genes in the mesoderm of Nipbl^{+/-} embryos. As in WT embryos, anterior Hoxb genes were actively expressed at LB stage, while posterior Hoxb genes were silent (Fig. 9E). However, Hoxb1 and Hoxb2 were expressed at levels that were conspicuously lower than in WT (Fig. 9E). At CC stage, *Nipbl*^{+/-} embryos reflected the general trend found in WT embryos, with anterior Hoxb genes waning in expression as the posterior Hoxb genes began their ascent (Fig. 9F, note axis scale). The two most anterior Hox genes, Hoxb1 and Hoxb2, did not decline as much, proportionally, as they did in WT embryos, with the outcome being that, by CC-stage, expression of Hoxb1 and Hoxb2 in Nipbl^{+/-} embryos was actually higher than that in WT (Fig. 9F). These results collectively provide evidence for a temporal disruption in the Hox gene expression program in Nipbl^{+/-} embryos. Specifically, Hox genes appear to be delayed in initiating expression at the LB stage and similarly tardy in becoming suppressed at the CC stage.

Nipbl^{+/-} mice show anteriorization of thoracic vertebrae, with left-right asymmetry

A previous study (121) showed that a knockout of *Hoxb1-Hoxb9* in mice led to the anteriorization of the axial skeleton, characterized by an increased number of thoracic vertebrae with ribs. Since $Nipbl^{+/-}$ mice underexpress *Hox* genes and show delayed regulation of anterior *Hox* genes, we were curious if similar anteriorizations could be detected in $Nipbl^{+/-}$ mice (Fig. 9). To explore this, we analyzed the vertebrae and ribs of 15 WT and 12 littermate $Nipbl^{+/-}$ embryos at E18.5, using Alizarin red and Alcian blue stains. In WT embryos, we confirmed the presence of the normal count of 13 ribs (Fig. 10A). In

contrast, many Nipbl^{+/-} embryos displayed 14 thoracic vertebrae, the 14th of which bore a range of rib growths, often displaying leftright asymmetry (Fig. 10A). We classified the growths of these 14th vertebrae based on severity, ranking them from low (ss1) to high (ss5), and documented left-right differences (Fig. 7B). Three of seven Nipbl^{+/-} embryos displayed partial growth of a 14th rib on the left side only (S1 and S2). These growths were either cartilage only or disconnected formation of rib nub with cartilage but never any whole ribs. Four of seven Nipbl^{+/-} embryos showed bilateral growth (S3 to S5). Partial growth occurred on both the left and right sides, but complete formation a whole rib only ever occurred, in one instance, on the right side (S5). In total, 58% of E18.5 Nipbl^{+/-} embryos demonstrated some form of rib growth from a 14th thoracic vertebra (Fig. 10C). These findings suggest that anteriorization of the axial vertebrae does occur in Nipbl^{+/-} embryos, possibly as a result of delayed activation (and inactivation) of anterior Hox gene expression.

DISCUSSION

The Nipbl^{+/-} mouse, a model of the multisystem birth defect syndrome, CdLS (122), offers a distinct lens through which to explore the genetic origins of birth defects. Nipbl^{+/-} mice display many of the same birth defects observed in human CdLS, and a key feature of Nipbl deficiency across various organisms is quantitative alterations in gene expression, including both up-regulation and downregulation, affecting at least hundreds of genes in every tissue (18, 24, 123). Previous research into animal models of Nipbl deficiency suggested that the root causes of birth defects in CdLS likely manifest during a period when progenitor cell populations are being formed for all major tissue and organ lineages (22, 24). Therefore, to elucidate how early, cell type-specific changes in gene expression might contribute to the onset of birth defects, we used scRNA-seq to conduct a comparative analysis between Nipbl^{+/-} embryos and their WT littermates at key developmental stages, focusing on the conclusion of gastrulation, LB stage (approximately E7.5) to early CC stage (approximately E7.75) (25).

Changes in the sizes of different mesodermal cell populations in *Nipbl^{+/-}* embryos foreshadow pathological changes in tissue composition and patterning in CdLS

In Fig. 1, we showed that $Nipbl^{+/-}$ embryos do not lack any cell populations found in WT embryos. However, LB-stage $Nipbl^{+/-}$ embryos have fewer total mesoderm cells and, within the mesoderm, have fewer PEs and FHF cells and more PM cells (Fig. 2). These changes, while not always large, are likely to be of physiological importance. For example, the observation that PEs are reduced in number is consistent with defects in blood formation and circulation observed in *Nipbl*-morphant zebrafish (*22*) and thrombocytopenia in CdLS (*124*).

In addition, the reduction in FHF cell number could contribute to the presence of CHDs in $Nipbl^{+/-}$ mice and individuals with CdLS (24, 125). In a prior study in $Nipbl^{+/-}$ mice, most CHDs observed were in heart regions (right ventricle and atrial/ventricular septa) considered to be derivatives of the SHF (24). Although FHF cells are not thought to give rise directly to "SHF structures," they likely exert indirect effects on the development of SHF derivatives. This echoes the conclusions of Santos *et al.* (24), who found that complex interactions between different cell types (even between

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Fig. 10. *Nipbl^{+/-}* mice show anteriorization of thoracic vertebrae with left-right asymmetry. (A) Dorsal view of bone (Alizarin red) and cartilage (Alcian blue) stained rib cage of E18.5 WT and *Nipbl^{+/-}* embryos. WT embryos only show 13 ribs. *Nipbl^{+/-}* embryos show incomplete asymmetric growth of 14th rib. ss1 to ss5 refers to severity score in (B). 13, 13th thoracic vertebra; L1, first lumbar vertebra; C, cartilage; N, rib nub; R, whole rib. (B) Table categorizing range of incomplete asymmetric growth of 14th rib observed in E18.5 *Nipbl^{+/-}* embryos and ranking them by their severity (low, ss1; high, ss5). (C) Table quantifying numbers of WT and *Nipbl^{+/-}* embryos in which incomplete asymmetric growth of 14th rib was observed per severity score. *P* value from chi-square test.

noncardiogenic and cardiogenic cell types) influence the incidence of CHDs in $\mathit{Nipbl^{+/-}}$ mice.

The increased number of PM cells at LB stage is intriguing, as it correlates with observed defects in PM derivatives, including the axial skeleton (Fig. 10) and limb digits in $Nipbl^{+/-}$ mice (126). Notably, both such deficits are features of CdLS (127). How an overabundance of PM cells could contribute to limb defects is not obvious. Nevertheless, these findings suggest that birth defects in *Nipbl*-deficient organisms arise not only from the absence of specific progenitor cell populations but also from progenitor cell misallocation events that alter the relative proportions of cell types.

Progenitor cell misallocation in *Nipbl*^{+/-} correlates with changes in the expression of cell fate driver genes

Nipbl^{+/-} embryos at LB stage did not exhibit global changes in apoptotic activity, cell proliferation, developmental timing, or overall lineage trajectories (Figs. 3 and 4 and figs. S11 and S12). However, we

produced evidence that nascent mesoderm cells in $Nipbl^{+/-}$ embryos differentiated more frequently into PM than FHF, compared to WT (Fig. 4, C to I). This led us to conclude that misallocation of mesoderm cells in $Nipbl^{+/-}$ embryos is driven by alterations in early cell fate choices that occur along the main pathways of otherwise unaltered lineage trajectories. These findings suggest that some types of structural birth defects, such as heart defects, arise from quantitative alterations to cell fate determination, rather than a complete disruption of an entire lineage pathway.

In Fig. 5, we presented evidence that reduced differentiation of mesoderm cells into FHF in $Nipbl^{+/-}$ embryos could be attributed to the underexpression of genes predicted to drive FHF differentiation. Underexpressed FHF driver genes show strong enrichment for genes associated with EMT (Fig. 5, J and K). EMT not only occurs during the emergence of mesenchymal mesoderm and FHF cells during gastrulation but also plays a role in the contribution of later cell lineages (SHF cells, endocardial cells, and neural crest cells) to

various cardiac structures. SHF cells undergo EMT as they participate in the elongation of the heart tube and outflow tract (*128*), and endocardial cells undergo EMT as they form structures such as the cardiac cushion (*129*). Later in development, migratory neural crest cells, which arise from neural epithelium by EMT, contribute to the aorticopulmonary septum and parts of the outflow tract (*130*). Together, these observations suggest that dysregulation of EMT genes may play an important role in the development of heart defects in *Nipbl*^{+/-} mice.

Is *Nanog* overexpression responsible for gene expression changes in *Nipb1*^{+/-} embryos?

In contrast to our prior studies of Nipbl+/- mice, in which differences in gene expression were invariably found to be small (less than twofold) (18), the present study demonstrated that, in gastrulation stage embryos, some genes show much larger shifts in expression (as high as eightfold) (Figs. 6D and 8H). One of the largest of such changes was in Nanog, which displayed overexpression in LB-stage $Nipbl^{+/-}$ embryos and which persisted to CC stage (Figs. 7 and 8). Using data from Tiana et al. (113), we demonstrated that many of the gene expression changes in Nipbl^{+/-} embryos mirror those seen in embryos with induced Nanog overexpression (Fig. 8, A to E, and fig. S15, A to E). Moreover, many $Nipbl^{+/-}$ DEGs are likely to be direct Nanog targets, as the corresponding genes display enrichment for Nanog binding sites (Fig. 8, F and H). Comparisons of our data with those of Tiana et al. (113) also suggest that misallocation of mesoderm cells to a PM fate at the expense of FHF, resulting from down-regulation of FHF drivers/PM antidrivers, may be a consequence of Nanog overexpression (Figs. 3 and 8K).

A question that arises from these observations is whether all gene expression alterations observed in Nipbl^{+/-} embryos might be due to Nanog overexpression. For a number of reasons, we do not think that this is the case. First, for the largest gene expression shifts (greater than twofold over- or underexpressed), only 39% at LB stage and 18% at CC stage were misexpressed in the same direction as DEGs in embryos in which Nanog was overexpressed (Fig. 8 and fig. S15) (113). Second, although Nanog continues to be overexpressed in $Nipbl^{+/-}$ embryos from LB to CC stages, the magnitude of its expression decreases substantially by CC stage (Fig. 7). Third, Nipbl haploinsufficiency itself causes significant, large expression changes in other genes not implicated as consequences of Nanog overexpression. For instance, we observed reduced expression of genes linked to the Notch signaling pathway in the mesoderm and increased expression of adult hemoglobin genes in the endoderm (Fig. 6). Therefore, we conclude that the extensive gene expression changes in Nipbl^{+/-} embryos are unlikely to be due to Nanog overexpression alone.

Skeletal anomalies in *Nipbl^{+/-}* mice reflect earlier delays in anterior *Hox* gene expression

In Figs. 4D and 8G, we showed that large decreases in *Hox* gene expression occur across all germ layers of LB-stage $Nipbl^{+/-}$ embryos. While only a subset of *Hox* genes is underexpressed by more than twofold, many *Hox* genes across all germ layers show small (less than twofold) but significant decreases in expression (Fig. 9A). We also provide evidence for a temporal disturbance in anterior *Hox* gene expression in $Nipbl^{+/-}$ embryos, whereby *Nipbl* haploinsufficiency postpones the onset of anterior *Hox* gene expression at LB stage and delays their subsequent deactivation at CC stage (Fig. 9, C

to F). These shifts in *Hox* gene expression dynamics mirror those in a previous study of *nipbl*-morphant zebrafish, in which genome location–specific misexpression of *hox* genes was also observed (*131*). In Fig. 10, we showed that anteriorization of thoracic vertebrae occurs in E18.5 *Nipbl*^{+/-} mice (Fig. 9). These alterations in axial skeletal development parallel skeletal anomalies that have been identified in individuals with CdLS, including fused, absent, or misshapen ribs (*132*). Since *Nipbl* deficiency is the dominant form of CdLS, it is interesting to speculate that these skeletal anomalies might originate from underexpression of and delayed anterior *Hox* gene activity during gastrulation.

Overexpression of Nodal signaling pathway genes may contribute to left-right patterning defects in CdLS

In Fig. 4D, we showed that Nipbl^{+/-} embryos at LB stage show large overexpression of genes associated with the Nodal signaling pathway across all germ layers. Nodal signaling, pivotal for left-right patterning (133), ensures the appropriate positioning and morphogenesis of the musculoskeletal system and internal organs (134). In Fig. 10, we showed that growth of a 14th vertebra in E18.5 Nipbl^{+/-} embryos displayed left-right asymmetry, with the growth of a whole 14th rib only occurring on the right side of the embryo. These patterning alterations are consistent with the heightened incidence of right-sided skeletal anomalies in CdLS (127). Changes in left-right patterning are also consistently associated with intestinal malrotation and some types of cardiac anomalies observed in Nipbl^{+/-} mice, nipbl-morphant zebrafish, and CdLS (18, 24, 135). These data suggest that left-right patterning defects in CdLS might be due to overexpression of Nodal signaling genes as early as gastrulation.

Gene expression changes observed in early *Nipbl*^{+/-} embryos are likely driven by Nipbl's effects on chromatin topology

The results of this study, together with prior studies of mouse and zebrafish models, reinforce the notion that the chromosomal location of genes is an important factor in their sensitivity to variations in *Nipbl* levels. For example, our prior studies of *Nipbl*^{+/-} embryonic brain demonstrated that the largest expression changes among genes in the 22-gene protocadherin beta (Pcdhb) cluster were found in those genes situated at the 5' and 3' ends of the cluster (18), where CTCF sites are located (136). In developing pectoral fins of nipblmorphant zebrafish, hox genes located near the 3' end of three separate hox clusters (hoxa, hoxc, and hoxd) show a position-dependent pattern of overexpression (131). Similarly, in the present study, we showed that anterior Hoxb genes-located at the 3' end of the Hoxb cluster-are preferentially underexpressed in the mesoderm of *Nipbl^{+/-}* embryos at gastrulation (Fig. 8E). Thus, we consistently observe a strong influence of chromosomal location on gene sensitivity to Nipbl levels, particularly within gene clusters, and this influence is already apparent at gastrulation.

Recent studies suggest that changes in gene expression due to *Nipbl* deficiency may be the result of global alterations to chromosomal structure and organization. For instance, marked reduction of *Nipbl* expression in mouse hepatocytes resulted in genome-wide depletion of topologically associated domains (TADs) and Hi-C interaction peaks (137), both of which require chromatin looping (138). Recent studies have demonstrated that both the formation and rate of chromatin loop extrusion were reduced in vitro when a CdLS pathogenic mutation was introduced into *NIPBL* (139).

Chromatin looping within TADs is thought to bring distant cisregulatory elements, such as enhancers, into proximity with target promoters. Nipbl has been reported to preferentially bind to enhancers and promoters (140), and ChIP-seq studies show reduced enhancer-promoter interactions in $Nipbl^{+/-}$ mouse embryonic fibroblasts (141). Since chromatin looping is essential for gene activation, impaired loop extrusion as a consequence of reduced Nipbl levels may provide an explanation for why Nipbl haploinsufficiency causes more genes to be down-regulated than up-regulated in gastrula-stage mouse embryos (e.g., >80% of mesodermal genes; Fig. 6A), a trend that has been observed in studies of other tissues (141).

In light of these observations, it is interesting that overexpression of *Nanog* and its target genes emerged from the present study as particularly likely to play important roles in causing CdLS phenotypes. During normal gastrulation, *Nanog* expression falls to very low levels in most cell types, so what occurs in *Nipbl^{+/-}* embryos is perhaps best viewed as a failure of gene repression. Although it is possible that *Nipbl^{+/-}* haploinsufficiency leads to down-regulation of a gene encoding a *Nanog* repressor, no obvious candidate stands out within the gene expression changes identified in the present study. We speculate, instead, that *Nipbl-*sensitive loop formation is required for the silencing of *Nanog* gene expression during gastrulation and, thus, that changes in chromatin architecture play a key role in timing the termination of this critical embryonic event.

MATERIALS AND METHODS

Statement on care and use of animals

All animals were handled in accordance with approved procedures as defined by the National Institutes of Health, and all animal work was approved by the Institutional Animal Care and Use Committee of the University of California, Irvine. For collection of mouse tissues, pregnant dams were humanely killed by CO₂ anesthesia, followed by cervical dislocation.

Generation of WT and *Nipbl^{+/-}* mice

WT and *Nipbl^{+/-}* mouse littermates were generated by mating *Nanog*^{Cre/+} mice (26) and *Nipbl*^{Flox/Flox} mice (24). *Nipbl*^{Flox/Flox} mice have an inverted gene trap cassette encoding β -geo that is flanked by Cre recombinase target sites in intron 1 of Nipbl alleles (Fig. 1A) (24). In this inverted orientation, referred herein as Flox, there is no trapping of the Nipbl gene, and Nipbl is expressed normally. However, when this cassette is exposed to Cre recombinase, the gene trap cassette gets inverted into a noninverted orientation that we call FIN (Fig. 1A). In this noninverted orientation, trapping of the Nipbl gene occurs, and β -geo is expressed as a reporter of successful gene trapping. Therefore, the *Nipbl*^{FIN} allele is a null allele. *Nanog*^{Cre/+} mice carry a transgene encoding a Cre recombinase downstream of a promoter of the Nanog gene and initiate recombination in the earliest cells of the embryo (26). Consequently, mating Nanog^{Cre/+} mice with Nipbl^{Flox/Flox} mice results in littermates that are either Nipbl^{Flox/+} or Nipbl^{FIN/+}, entirely. Nipbl^{Flox/+} mice express Nipbl at WT levels (Fig. 1A) and show no defects, making them essentially WT (24). *Nipbl*^{FIN/+} mice express *Nipbl* at levels ~50% lower than WT (fig. S3) and show defects similar to those observed in CdLS, making them essentially $Nipbl^{+/-}$ (24).

Timing of mouse pregnancies

To generate female mice that were pregnant on the same day, male mice were singly housed, and female mice were group-housed in groups of five for a minimum of 1 week to synchronize their estrous cycles, thus taking advantage of the Lee-Boot effect (142). At the beginning of the night cycle, the bedding from female cages were discarded, and the bedding from at least two male cages were transferred into each of them. At the beginning of the third night cycle after which the females were exposed to male bedding, all females were transferred into male cages, resulting in two females per male, thus taking advantage of the Whitten effect (143). At the end of the third night cycle, the females were inspected for vaginal plugs. Those that had vaginal plugs were considered potentially pregnant. To time the dissection of embryos from potentially pregnant females, we considered the end of the 12-hour night cycle after which the vaginal plug was discovered as E0 and dissected the embryos at the following times after E0: E7.5 (7 days +12 hours) for LB stage, E7.75 (7 days +18 hours) for CC stage, E7.41 (7 days +10 hours) for EB stage, E7.58 (7 days +14 hours) for EHF stage embryos, and E18.5 (18 days +12 hours).

Dissection of mouse embryos

Pregnant female mice were euthanized by CO₂ inhalation, followed by cervical dislocation. The uterine horns were dissected out of their abdomens with dissection forceps and scissors and placed in a petri dish with 1× diethyl pyrocarbonate (DEPC) phosphate-buffered saline (PBS) on ice. Individual deciduae were separated from one another and transferred into their own petri dishes with 1× DEPC PBS on ice. Embryos were dissected out of each deciduae under a dissection microscope as described in (144). The Reichert's membrane was removed from each embryo. The ectoplacental cone was separated from embryos collected for scRNA-seq and tr4ansferred by forcep into microcentrifuge tubes, where they were kept on ice or stored at 20°C as tissue for PCR genotyping. The exocoelom was separated from embryos collected for scRNA-seq and transferred into a welled plate by wide bore pipette tip with fixative on ice as tissue for genotyping by X-galactosidase (X-gal) stain. Embryos for scRNA-seq were transferred by wide bore pipette tip with $1 \times DEPC$ PBS into microcentrifuge tubes and kept on ice until dissociation. Tails were separated from E18.5 embryos collected for Alcian blue-Alizarin red staining. Embryos for Alcian blue-Alizarin red staining were transferred by forcep into 10% neutral buffered formalin in scintillation vials and kept at 4°C for 24 hours.

Genotyping of mouse embryos and ESCs *X-gal stain*

Since *Nipbl*^{FIN/+} (*Nipbl*^{+/-}) mouse embryos express β -geo (β -galactosidase), their tissues will turn blue when they are treated with X-gal, a substrate that releases a blue chromophore when enzymatically acted on by β -galactosidase. The exocoeloms from embryos were transferred into welled plates containing fixative [0.2% glutar-aldehyde, 5 mM EGTA, and 2 mM MgCl₂ in 0.1 M phosphate buffer (pH 7.5)] and kept on ice for a minimum of 15 min. After fixation, the exocoeloms were rinsed with a detergent rinse [0.02% Igepal, 0.01% sodium deoxycholate, and 2 mM MgCl₂ in 0.1 M phosphate buffer (pH 7.5)] before they were treated with X-gal stain [0.02% Igepal, 0.01% sodium deoxycholate, 5 mM potassium ferricyanide, 5 mM potassium ferrocyanide, and 2 mM MgCl₂ in 0.1 M phosphate

buffer (pH 7.5)]. The exocoeloms were incubated in X-gal stain at 37° C in the dark for a minimum of 1 hour after which they were inspected for coloration under a dissection microscope. Those that turned blue were considered *Nipbl*^{+/-} (*Nipbl*^{FIN/+}), and those that did not were considered WT.

Polymerase chain reaction

Ectoplacental cones were treated with 50 µl proteinase K (60 µg/ml) in PBND [50 mM KCl, 10 mM tris-HCl, 2.5 mM MgCl₂, gelatin (0.1 mg/ml), 0.45% NP-40, and 0.45% Tween 20], for 1 hour at 55°C to extract DNA for PCR. To deactivate proteinase K so that it does not interfere with DNA amplification, they were then incubated at 95°C for 10 min. To genotype mouse embryos as either Nipbl^{Flox/+} (WT) or $Nipbl^{FIN/+}$ ($Nipbl^{+/-}$) and ESCs as either $Nipbl^{Flrt/+}$ (WT) or $Nipbl^{FLEX/+}$ (Nipbl^{+/-}), standard Taq PCR was performed on the extracted DNA using the primers and thermocyling protocol previously described in (24): Primer 1, 5'-CTCCGC CTCCTCTTCCTC-CATC-3'; primer 2, 5'-CCTCCCCGTGCCTTCCTTGAC-3'; primer 3, 5'-TTTGAGGGGACGACGACGACAGTCT-3'. Thermocycling conditions are 1 cycle a 95°C for 30 s; 30 cycles of 95°C for 1 min, 59°C for 30 s, and 68°C for 1 min; and 1 cycle at 68°C for 5 min and hold at 4°C. PCR products were treated with loading dye and electrophoresed in agarose gel stained with SYBER Safe DNA Gel Stain (Invitrogen, S33102) without cleanup and visualized under ultraviolet light. Flox conformation is 782 base pairs (bp), FIN conformation is 518 bp, Flrt conformation is 735 bp, and FLEX conformation is 652 bp.

Single-cell RNA sequencing

Embryos were transferred by wide bore pipette tip in 20 μ l of 1× DEPC PBS into microcentrifuge tubes. A total of 200 µl of 1× TrypLE Express Enzyme with phenol red (Gibco, 12605010) prewarmed to 37°C was added to each embryo. Embryos were triturated 4× with a wide bore pipette tip. Embryos were incubated at 37° C and triturated 4× with a wide bore pipette tip every minute (4 to 8 min) until no tissue aggregates were visible under a dissection microscope. TrypLE Expres Enzyme activity was inactivated with the addition of pre-ice-chilled 200 µl of 0.04% (m/v) nonacetylated bovine serum albumin in Dulbecco's PBS (Sigma-Aldrich, B6917-100MG; Gibco, 14190144). The resulting cell suspension was underlayed with 200 µl of 1% nonacetylated bovine serum albumin in Hanks' balanced salt solution (Sigma-Aldrich, 55021C-1000ML) using a gel-loading pipette tip. The suspension was centrifuged in a swing bucket centrifuge at 300 rcf for 5 min at 4°C. Supernatant (600 µl) was removed without disturbing the cell pellet. Hanks' balanced salt solution (600 µl) was added to the cell pellet, and the cell pellet was resuspended in it using a wide bore pipette tip. The resulting cell suspension was centrifuged in a swing bucket centrifuge at 300 rcf for 5 min at 4°C. Supernatant (600 µl) was removed without disturbing the cell pellet. The cell pellet was resuspending in the remaining 20 µl of supernatant using a wide bore pipette tip.

Single-cell suspensions (20 μ l) were submitted to the Genomics High-Throughput Facility (GHTF) at the University of California, Irvine (145) for scRNA-seq using 10x Genomics' Chromium Next GEM Single Cell 3' Kit v3.1 (10x Genomics, 1000268), Chromium Next GEM Chip G Single Cell Kit (10x Genomics, 1000120), and Chromium Controller. Passage through the Chromium Controller resulted in sample, cell, and transcript-barcoded cDNA, which GHTF-amplified by PCR. GHTF assessed the quality and quantity of the amplified cDNA by electrophoresis using Agilent's Agilent High Sensitivity DNA Kit (Agilent, 5067-4626) and Bioanalyzer before library construction. Constructed libraries, representing embryonic samples, were multiplexed and sequenced by GHTF on the Illumina HiSeq 4000 to a minimum depth of 20 million read pairs per cell. GHTF demultiplexed Illumina's raw binary base call (BCL) files and returned FASTQ files as deliverables.

Read mapping and cell calling

Cell Ranger v3.0 was used to map reads onto the GRCm38/mm10 C57BL/6J *Mus musculus* genome/transcriptome assembly and call cells. Cell Ranger does this using a read mapper called STAR (*146*), which performs splicing-aware mapping of reads to the genome. Reads are considered confidentially mapped to the genome with a mapping quality (MAPQ) of 255. Exonic reads are further mapped to annotated transcripts. A read that is compatible with the exons of an annotated transcript and, aligned to the same strand, is considered mapped to the transcriptome. Cell Ranger called cells using the EmptyDrops method described in (*147*).

Normalization of library depth

Cell Ranger v3.0 was used to normalize the read depth between libraries of the same stage. Cell Ranger does this by subsampling reads from higher-depth libraries until all libraries of the same stage had an equal number of reads.

Removal of low-quality cells and doublets

Cells exceeding three median absolute deviations in any one of the following criteria among cells of the same stage were considered either low-quality cells or doublets (*148*) and removed (i) percentage of mitochondrial genes expressed,(ii) number of genes expressed, and/or (iii) number of transcripts detected (figs. S2 and S8).

Normalization of cell depth

Seurat v3.0 was used to normalize the read depth between cells of the same stage using the SCtransform method, which is described in (149). SCtransform does this by modeling the read counts in a regularized negative binomial model to determine the variation due to read depth and then adjusting that variance according to genes of similar abundances. SCtransform was also used to normalize the read depth between cells when cells were subset from the whole embryo into germ layers and clusters.

Batch effect correction

Seurat v3.0 was used to correct for batch effects among libraries of the same stage and genotype. Seurat does this by identifying a set of shared variable genes among the libraries being considered and, using these genes, identifies pairs of cells between any two libraries whose expression of these genes is similar to other. These pairs of cells act as anchors between libraries for batch effect correction and integration (*30*).

Clustering of WT cells

Seurat v3.0 was used to cluster WT cells. Seurat does this by first performing principal components analysis on the shared variable genes identified during batch effect correction and integration. Principal components whose explained variances exceeded two median absolute deviations were used to calculate *k*-nearest neighbors and construct a shared nearest-neighbor graph. Clusters were

determined by optimization of the modularity function using the Louvain algorithm. The number of clusters was controlled by modulating the resolution function.

The optimal number of clusters was determined by clustering cells at increasing consecutive numbers of clusters and generating a clustering tree (fig. S5) visualizing how cell cluster identities change as the number of clusters consecutively increase. Clusters are stable when a large proportion of cells are derived from a single preceding cluster rather than multiple preceding clusters. We adopted Shannon entropy as a measure of these proportions as a measure of intracluster stability. A low Shannon entropy represents high intracluster stability. We visually inspected the clustering tree to determine which number of clusters maximized the number of clusters while, at the same time, minimizing the total Shannon entropy across all clusters at that number of clusters.

We further performed DGEA between clusters and visualized the expression of the top DEGs in a heatmap. We visually inspected the heatmap to confirm that the number of clusters that was selected for intracluster stability also displayed intercluster differences in gene expression.

DGEA between clusters

Seurat v3.0 was used to perform DGEA between clusters. For each cluster, Seurat performs the Mann-Whitney *U* test (a nonparametric test) between cells in that cluster and all other cells using normalized read counts. *P* values were corrected for false discovery using the Bonferroni correction method. Genes with *Q* values less than 0.05 were considered statistically significant and differentially expressed.

Projection of *Nipbl^{+/-}* cells onto WT clusters

Seurat v3.0 was used to project $Nipbl^{+/-}$ cells onto WT clusters. Seurat does this by identifying a set of shared variable genes among WT samples and, using these genes, identifies pairs of cells between WT cells and $Nipbl^{+/-}$ cells whose expression of these genes are similar to other. These pairs of cells act as anchors between WT cells and $Nipbl^{+/-}$ cells for projecting and sorting $Nipbl^{+/-}$ cells into WT clusters (30).

Reverse projection

Using the same method that was used to cluster WT cells (see the "Clustering of WT cells" section), cells from LB-stage $Nipbl^{+/-}$ embryos were first clustered and annotated (fig. S6A). Cells from LB-stage WT embryos were then projected onto the $Nipbl^{+/-}$ clusters (fig. S6, B to D) (see the "Projection of $Nipbl^{+/-}$ cells onto WT clusters" section).

DGEA between genotypes

Seurat v3.0 was used to perform DGEA between WT and *Nipbl*^{+/-} cells. For each cluster, Seurat performs the Mann-Whitney *U* test between WT and *Nipbl*^{+/-} cells using normalized read counts. *P* values were corrected for false discovery using the Bonferroni correction method. Genes with *Q* values less than 0.05 were considered statistically significant and differentially expressed.

Pseudo-time

URD was used to calculate the pseudo-time of cells from EB-, LB-, and EHF-stage embryos (83). URD does this by constructing a diffusion map of transition probabilities and, starting with an assigned group of root cells, performs a probabilistic breadth-first graph search using the transition probabilities. This moves step-wise outward from the root cells, until the entire graph is visited. Several simulations are run, and then pseudo-time is calculated as the average iteration that visited each cell.

Construction of lineage trajectories

Velocyto (150) was used to count the numbers of spliced and unspliced transcripts per gene, using default parameters. Reads aligning to exonic regions were counted as spliced. Reads aligning to intronic regions were counted as unspliced. Reads aligning to exonintron boundaries were considered ambiguous and excluded from downstream analyses. scVelo (84) was used estimate RNA velocities. Counts were normalized using the *pp.filter_and_normalize()* function, moments of unspliced versus spliced abundances were computed using the *pp.moments()* function, and velocities were computed using the *tl.velocity()* function, all using default parameters. Lineage trajectories were visually inferred from stream plots of computed RNA velocities.

Calculating fate probabilities

CellRank was used to calculate the fate probabilities of mesoderm cells (86). CellRank does this by performing RNA velocitydirected random walks from initial cell states to terminal cell states. Fate probabilities correspond to the fraction of walks in which a cell was a part of that that terminated in a particular terminal cell state. Terminal states were set with the *set_terminal_states()* function, absorption probabilities were computed with the *compute_ absorption_probabilities()* function, and driver genes were computed with the *compute_lineage_drivers()* function, all with default parameters.

Cell cycle phase assignment

Seurat was used to assign cells into G_1 , S, or G_2 -M phase based on the expression of markers of S phase and G_2 -M phase provided by Seurat. Using the *CellCycleScoring()* function, Seurat calculated scores for the expression of S phase and G_2 -M phase markers, while considering the expression of these marker genes to be anticorrelated to one another. When cells express neither, they are considered to be in G_1 phase.

Identification of drivers and antidrivers

CellRank was used to identify the drivers and antidrivers of FHF and PM fates. CellRank does this by calculating a correlation coefficient between the fate probabilities of cells toward their lineage fate and the expression of their genes. Those genes with positive correlation coefficients are considered drivers, since their expression increases as absorption probabilities increase, and those with negative correlation coefficients are considered antidrivers, since their expression decreases as absorption probabilities decrease. To reduce the likelihood of false discovery, we considered those genes with correlation coefficients greater than 0.25 as drivers and those less than -0.25 as antidrivers.

Gene set overrepresentation analysis

clusterProfiler (151) was used to perform gene set overrepresentation analysis. It does this by performing a Fisher's exact test on a contingency table of the genes in a gene set that match or do not match the genes of interest. P values were corrected for false discovery using the Bonferroni correction method. Gene sets with Q values less than 0.05 were considered statistically significant and over represented by the genes of interest.

Gene set enrichment analysis

Fast Gene Set Enrichment Analysis (FGSEA) (152) was used to perform GSEA.

Generation of *Nipbl^{FLEX/+}* and *Nipbl^{Flrt/+}* ESCs

ESCs were grown in Glasgow's minimum essential medium, 15% heat-inactivated fetal bovine serum (ESC-qualified; HyClone, SH30071.03E), 1× glutamine, 1× penicillin-streptomycin, 5 mM mercaptoethanol, and leukemia inhibitory factor (1000 U/ml; ESGRO Millipore). Following limited dilution single-cell cloning, a clone of EUC313f02 NipblFLEX/+ ESCs (European Conditional Mouse Mutagenesis Program) was transfected with pCAG-Cre:GFP (Addgene, #13776) using Lipofectamine 2000 (Invitrogen) to convert the Nipbl^{FLEX} allele to the Nipbl^{Flrt} conformation in vitro. Forty-eight hours after transfection, cells were plated at 1 cell per well into several 96-well plates. Clonal colonies were isolated, and the clones were stained for β-galactosidase (lacZ) activity using X-gal. For LacZ staining, the ESCs were fixed for 5 min in 2 mM MgCl₂ and 0.5% glutaraldehyde in $1 \times$ PBS, followed by three washes with $1 \times$ PBS at room temperature. X-gal staining [5 mM K₃Fe(CN)₆, 5 mM K₄Fe(CN)₆, 2 mM MgCl₂, and X-gal (1 mg/ml) in 1× PBS] was performed at 37°C until the blue precipitate was detected. Colonies positive for X-gal staining, Nipbl^{FLEX/+} ESCs, and negative for X-gal staining, Nipbl^{Flrt/+}, were verified by PCR genotyping, described above.

Reverse transcription quantitative polymerase chain reaction

Clones for both *Nipbl^{FLEX/+}* and *Nipbl^{Flrt/+}* were expanded, nine each, and RNA was extracted using the Monarch Total RNA Miniprep Kit (New England Biolabs). cDNA was made using iSCRIPT reverse transcriptase (Bio-Rad). RT-qPCR for *Nipbl, Nanog*, and *Pouf5f1* was performed using iTaq SYBR green (Bio-Rad) as per the manufacturer's instructions, *Rpl4* was used as the housekeeping gene: *Rpl4* primer 1, 5'-ATCTGGACGGAGAGAGTGCTTT-3'; *Rpl4* primer 2, 5'-GGTCGGTGTTCATCATCTTG-3'; *Nipbl* primer 1, 5'-AGTCCATATGCCCCACAGAG-3'; *Nipbl* primer 2, 5'-ACC-GGCAACAATAGGACTTG-3'; *Nanog* primer 1, 5'-AAATCCCTTC-CCTCGCCATC-3';*Nanog* primer 2, 5'-GCCCTGACTTTAAGCCCAGA-3'; *Pou5f1* primer 1, 5'-CACCCTGGGCGTTCTCTTT-3'; *Pou5f1* primer 2, 5'-GTCTCCGATTTGCATATCTCCTG-3'.

Identification of genes with Nanog binding sites

In Avsec *et al.* (119), ChIP-seq was performed for Nanog in mESCs, and 56,459 peaks were called (Fig. 8F). We considered the called peaks from that study as representing Nanog binding sites. Using the narrowPeak file from that study (which contains the called peaks), the GRCm38/mm10 C57BL/6J *M. musculus* genome annotation, and ChIPseeker v3, we identified which genes had a peak of ± 250 nt of their TSS. We identified a total of 3646 genes with a Nanog binding site at their TSS (Fig. 8F).

Alcian blue-Alizarin red staining

E18.5 embryos were fixed in 10% neutral buffered formalin in scintillation vials at 4°C overnight. Embryos were washed with H_2O twice over 2 days at room temperature. Embryos were immersed in 95% ethanol (EtOH) for 1 week. The skin was removed from embryos with forceps under dissection microscope. Embryos were stained with 0.02% Alcian blue (10 mg of Alcian blue + 80 ml of EtOH + 20 ml of glacial acetic acid) over 3 days. Embryos were washed with 70% EtOH twice in 1 day, 40% EtOH overnight, 15% EtOH in 1 day, and H₂O overnight. Embryos were washed with 1% KOH twice over 3 days until they became translucent. Embryos were stained with 0.015% Alizarin red (15 mg of Alizarin red + 100 ml of 1% KOH) over 3 days. Embryos were washed three times with 1% KOH in 1 day. Fat pads and internal organs were removed from embryos with forceps under dissection microscope. Embryos were washed with 20% glycerol + 1% KOH overnight, 50% glycerol + 1% KOH overnight, and 80% glycerol + 1% KOH overnight. Embryos were stored in 100% glycerol at room temperature.

Supplementary Materials

This PDF file includes: Figs. S1 to S15 Tables S1 to S11 Legends for data S1 to S45

Other Supplementary Material for this manuscript includes the following: Data S1 to S45

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