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Permalink
https://escholarship.org/uc/item/0692q5c2

Journal
iScience, 23(10)

ISSN
2589-0042

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Publication Date
2020-10-01

DOI
10.1016/j.isci.2020.101629

Peer reviewed
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HIGHLIGHTS

- The transcriptome switches after the first cell cycle and during MDCKII lumenogenesis
- The transcriptome switch is linked to β-catenin translocation and HNF1B activation
- Chromatin accessibility decreases during MDCKII cystogenesis
- Active mitochondria are maintained in 3D, but not 2D, epithelial morphogenesis
A Qualitative Change in the Transcriptome Occurs after the First Cell Cycle and Coincides with Lumen Establishment during MDCKII Cystogenesis

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SUMMARY

Madin-Darby canine kidney II (MDCKII) cells are widely used to study epithelial morphogenesis. To better understand this process, we performed time course RNA-seq analysis of MDCKII 3D cystogenesis, along with polarized 2D cells for comparison. Our study reveals a biphasic change in the transcriptome that occurs after the first cell cycle and coincides with lumen establishment. This change appears to be linked to translocation of β-catenin, supported by analyses with AVL9- and DENND5A-knockdown clones, and regulation by HNF1B, supported by ATAC-seq study. These findings indicate a qualitative change model for transcriptome remodeling during epithelial morphogenesis, leading to cell proliferation decrease and cell polarity establishment. Furthermore, our study reveals that active mitochondria are retained and chromatin accessibility decreases in 3D cysts but not in 2D polarized cells. This indicates that 3D culture is a better model than 2D culture for studying epithelial morphogenesis.

INTRODUCTION

Madin-Darby canine kidney (MDCK) cells represent a well-established cell line model for epithelial morphogenesis research (Dukes et al., 2011; Elia and Lippincott-Schwartz, 2009; Datta et al., 2011; McRae et al., 2017; Sottocornola et al., 2010; Pillman et al., 2018). Indeed, tens of thousands of papers have been published on using MDCK cells to study epithelial cell polarity, epithelial-mesenchymal transition (EMT) and cancer, tissue engineering, and other subjects. There are multiple strains of MDCK (Dukes et al., 2011). Among them, MDCKII is the most widely used and has been recommended for most studies (Dukes et al., 2011). We have been using MDCKII cells to validate our cancer driver candidates identified by dog-human comparisons (Tang et al., 2014; Li et al., 2014).

MDCKII can be cultured in both 3D and 2D conditions. In both cases, epithelial cell apico-basolateral polarity is established. However, 3D morphogenesis is a process of cystogenesis, forming a cyst that consists of a central lumen surrounded by a single layer of polarized cells (Li et al., 2014). 2D morphogenesis simply forms a monolayer of polarized cells, without lumenogenesis (Li et al., 2014).

Previous research has indicated the importance of both intracellular trafficking and cell cycle in MDCK 3D epithelial morphogenesis. Specifically, de novo lumen formation is regulated by Rab11a- and Cdc42-directed networks, which control mitotic spindle orientation and apical transport (Bryant et al., 2010; Rodriguez-Fraticelli et al., 2010). Modulation of cell proliferation rate contributes to the maintenance of the single-lumen phenotype of normal cysts (Cerruti et al., 2013).

Resembling cell differentiation at late stages (e.g., transit-amplifying cells to terminally differentiated cells in colonic crypt development when epithelial cell polarity is establishing [Sheaffer and Kaestner, 2012; Snippert et al., 2010]), gene expression plays a key role in MDCKII epithelial morphogenesis. A deep understanding of changes in the transcriptome over the course is thus important. Our literature search finds several relevant microarray studies. Two studies identify differentially expressed genes between 3D and 2D cells at 36 h (Galvez-Santisteban et al., 2012) and at 8 days after seeding (Wells et al., 2013), indicating the importance of synaptotagmin-like proteins in de novo lumenogenesis and interleukin-8 in 3D epithelial morphogenesis, respectively. Three additional studies investigate gene expression changes induced by...
hepatocyte growth factor (HGF) in 3D, 2D, or 2.5D culture conditions (Balkovetz et al., 2004; Kwon et al., 2011; Chacon-Heszele et al., 2014). HGF plays a role in epithelial tubulogenesis, where the cells initially undergo a partial EMT (Chacon-Heszele et al., 2014; O’Brien et al., 2004).

Although these microarray studies provide insightful information, several fundamental questions remain unanswered. For example, during 3D cystogenesis, does the transcriptome gradually change over the course or suddenly switch at a certain point? 3D cystogenesis can be divided into three stages: lumen establishing, lumen enlarging, and lumen maintenance (Li et al., 2014). What are the gene expression changes at each stage?

To answer these questions, we set out to perform full time course RNA sequencing (RNA-seq) analysis of MDCKII cystogenesis in 3D culture. Cells were seeded as a sparse single cell suspension to capture de novo lumenogenesis, which initiates during the first cell division (Li et al., 2014). Fully polarized MDCKII cells in 2D culture were also included in the study for comparison.

RESULTS

Time Course RNA-Seq Analysis of MDCKII Cystogenesis

We conducted full time course analysis of MDCKII cystogenesis. Samples were taken at the time of seeding (0h), as well as culturing on top of Matrigel for 24 h, and 3, 5, 8, and 14 days after seeding (Figures 1A and S1). This design captures the three stages of cystogenesis established by our previous work (Li et al., 2014). These include: (1) lumen establishing, from seeding to the two- or more-cell stage (24 h to day 3); (2) lumen enlarging, with active oriented cell divisions (primarily from day 3 to day 8); and (3) lumen maintenance, with most cells ceasing to divide (after 8 days).

Once the lumen is established, apico-basolateral cell polarity is also built. This is illustrated with E-cadherin staining, which marks the lateral membrane, and F-actin staining, which marks the apical region (Figure 1A). Once built, the cell polarity is maintained throughout cystogenesis.

For comparison purposes, we also studied fully polarized MDCKII 2D cells. Specifically, MDCKII cells were cultured on Transwell filters (Figure 1B) until they reached over-confluence, where and when apico-basolateral polarity is well established (Figure 1B).

We included three biological repeats, which consist of three separate experiments starting with cells cultured at different times (Tables S1A and S1B), and performed quality control (QC) of each sample. First, we conducted qRT-PCR experiments with a panel of genes that include proliferation markers MYC and CCND1, apoptosis marker BAX, transcription factor and polarity marker CTNNB1, and cytoskeleton marker ACTB, as well as PTEN and ERBB2, which are important to lumen formation (Muthuswamy et al., 2001; Martin-Belmonte et al., 2007) (Figure 1C; Table S1C). Samples with expected expression patterns (e.g., higher MYC expression but lower CTNNB1 expression for early time course samples but the opposite for late time course samples) were then subjected to RNA-seq analysis. Second, we performed a comprehensive QC of the RNA-seq data (Table S1B; Figure S1B), including examination of sequencing amount, base quality, GC content, sequence duplication, mapping rate and quality, rRNA and mitochondria contamination, and gene expression distribution. A total of 19 samples have passed our QC measures, with which we quantified the expression level of each gene and performed the analysis below.

RNA-Seq Analysis Reveals a Qualitative Change in the Transcriptome during Lumen Establishment

We first performed a principal component analysis (PCA) with all 19 samples. This was done using only genes with FPKM (fragments per kilobase of transcript per million mapped) > 0 in all samples (making the expression distribution more normal) and FPKM >1 (expressed) in at least one sample (Table S2A), which yield 11,246 genes in total. The 19 samples are unambiguously (p < 0.001) grouped into three clusters, which are conveniently named early, 2D, and 3D (Figure 2A). The “early” cluster consists of all the early-stage samples, including the cells at seeding (0h) and 3D culture at 24 h afterward (3D24h). All other 3D samples make up the “3D” cluster, and all 2D samples constitute the “2D” cluster (Figure 2A). The PCA result is supported by two clustering analyses. First, the non-negative matrix factorization (NMF) strategy (Brunet et al., 2004) identifies three metagenes, with which the samples are unambiguously grouped into the same three clusters (Figure 2A). Second, unsupervised hierarchical clustering using the top-most
variably expressed genes among the samples consistently identifies the same three clusters with high stability (Figures 2A and S2).

The results indicate a biphasic, rather than a linear, change among the 3D time course samples (Figure 2A). To further confirm this, we performed the same analysis but excluding all 2D samples. The aforementioned three methods (PCA, hierarchical, and NMF clustering) all group the time course samples into two clusters (Figure 2B), namely, the same early and 3D clusters as described above (Figure 2A).

To determine when the observed biphasic event takes place (Figure 2B), we identified genes that are differentially expressed (DE) between any two adjacent time points during 3D cystogenesis. Remarkably, 10 times more DE genes (>1,000 each for up- and down-regulation) were found between the 24 h and the day 3 samples, compared with other time intervals (Figure 2C; Table S2B). Moreover, the transcriptome
is largely stable before 24 h and after day 3 (Figure 2C). As the 24 h to day 3 period is when the lumen is becoming established (Figures 1A and S1), our data indicate that a qualitative change, which remodels the transcriptome, occurs during early lumenogenesis and immediately following the first cell division (Li et al., 2014).

Each of the Early, 2D, and 3D Sample Clusters Harbors Distinct Molecular Features

To determine molecular features that characterize each of the three sample clusters indicated in Figure 2, we performed single sample gene set enrichment analysis (ssGSEA) with known cell polarity gene sets compiled from published studies (Bryant et al., 2010; Bryant and Mostov, 2008; Assemat et al., 2008; McCaffrey and Macara, 2012) (Table S3A). We noted that many are significantly up-regulated in 2D cells, including genes of cell-cell junctions and cell polarity complex (Figure 3A; Table S3A). Exceptions are cytoskeleton genes, which are up-regulated in early samples (likely due to very active cell division), and apical trafficking, which are up-regulated in 3D cells (likely because of lumen formation).

We also performed ssGSEA with major pathways and functions of epithelial morphogenesis compiled from databases (Table S3A) and publications (Kosinski et al., 2007; Fevr et al., 2007; Van der Flier et al., 2007; Benita et al., 2009; Koinuma et al., 2009; Mjelle et al., 2015). These include cell cycle, intracellular trafficking,
metabolism, redox regulation, and signaling (Table S3A). The analysis indicates that each cluster has distinct molecular features (Figure 3B). Early samples are marked by up-regulation of pathways and functions that promote cell cycle, as well as by down-regulation of the pentose phosphate pathway and the metabolism of sugars, amino acids, and fatty acids (Figure 3B). 2D samples are characterized by up-regulation of trafficking-related functions and down-regulation of mitochondria-associated genes (Figure 3B). 3D samples feature more down-regulated functions, including glycolysis, hypoxia, TGF-β signaling, and chromatin remodeling (Figure 3B). However, oxidative phosphorylation and redox-related functions are up-regulated in 3D samples.
Cell Cycle Genes Are Transcriptionally Down-Regulated, whereas Genes of More Diverse Functions Are Up-Regulated during Epithelial Morphogenesis

To determine transcriptomic change-associated functions that contribute to epithelial morphogenesis, we identified DE genes between early and 3D or 2D sample groups, among 12,056 genes with FPKM >1 in at least one sample. Among ~2,000 DE genes found (Table S4A), the most prominent feature is down-regulation of cell cycle genes in both 3D and 2D samples, compared with early samples (Figure 4A). Specifically, ~63.5% of down-regulated genes overlap between 3D and 2D clusters (Figure 4B). Among them, ~50% are associated with cell cycle, many being targets of E2F and/or MYC (Figure 4B; Table S4B). These observations are consistent with the molecular characteristics of early samples (Figure 3B).

We identified ~1,000 up-regulated genes in each of the 3D and 2D groups (Figure 4A; Table S4A), among which 71% overlap (Figure 4B). These genes are, however, more diverse in their enriched functions. Among these functions are cell projection, trafficking, and others related to organ morphogenesis, none of which is, however, as prominent as down-regulation of cell cycle genes (Figure 4B).

We validated several up- or down-regulated genes at the protein level. These include MYC (Figure 5A), VIM (encoding the mesenchymal marker vimentin) (Figure S4E), and DENND5A (encoding a Rab11-interacting intracellular trafficking protein) (Figure S4F).

Lastly, down-regulated genes are more likely to be located in the nucleus and to be MYC targets, compared with up-regulated genes. However, we found no differences in the fraction of genes with miRNA or transcriptional factor-binding sites (Figure 4C; Table S4C).

Our analysis indicates that during MDCKII epithelial morphogenesis, cell cycle genes are down-regulated while trafficking-related genes are up-regulated (Figures 3 and 4), occurring in the same time frame (Figures 1 and 2) when a Rab11a-directed network regulates de novo MDCK lumenogenesis (Bryant et al., 2010). To test if our qualitative transcriptomic change is related to this intracellular trafficking, we investigated knockdown (KD) clones of AVL9 and DENND5A, which encoded Rab11-interacting proteins and participate in intracellular trafficking in MDCKII cells (Li et al., 2014). Indeed, these KD clones display abnormal trafficking starting at the first cell cycle, as shown by diffused E-cadherin staining (Figure 4D), and accelerated cell proliferation after the first cell cycle when compared with the wild-type cells, resulting in abnormal lumenogenesis (Li et al., 2014). Thus, investigating the transcriptomic changes in these KD clones will be informative.

We performed RNA-seq analysis of two AVL9-KD clones and two DENND5A-KD clones, 10 samples total consisting of cells before seeding (0h) and over-confluent 2D cells (D4 and D7) that were cultured under the same condition as the wild-type cells (Figures S3 and S4B–S4D; Tables S1B and S3B). The results are consistent with their phenotype described above. First, a direct comparison between KD cells and wild-type cells indicates that, in KD cells, intracellular trafficking genes are significantly down-regulated, whereas cell
Figure 4. Cell Cycle Genes are Transcriptionally Down-Regulated, whereas Genes of More Diverse Functions, Including Intracellular Trafficking, are Up-Regulated during Epithelial Morphogenesis

(A) Heatmaps indicate the expression levels of up- and down-regulated genes (FDR < 0.01 and > 2-fold change), in red and green, respectively, between early and 3D (left) or 2D (right) sample groups. Their enriched functions and associated p values, identified with the GSEA web tool (see Transparent Methods), are also shown.

(B) Venn diagrams indicate significant overlap between 3D and 2D samples for down- (left) and up-regulated (right) genes shown in (A), as indicated by p values obtained via permutation tests. Enriched functions among overlapped genes and their log10 transformed p values are also shown, identified with the GSEA web tool.

(C) Down-regulated genes overlapping between 3D and 2D samples (the same genes as in B) are significantly more enriched in nuclear location and MYC targets but are similarly enriched in miRNA and transcriptional factor (TF) binding sites, compared with up-regulated genes. p Values were calculated with Fisher’s exact tests.

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Figure 4. Continued

(D) During epithelial morphogenesis, wild-type (WT) cells have more cell cycle genes down-regulated and more intracellular trafficking genes up-regulated, compared with AVL9- and DENNDSA-knockdown (KD) clones (Li et al., 2014). Confocal images (left) indicate abnormal intracellular trafficking of E-cadherin (E-cad) in KD cells. Scale bar, 10 μm. Venn diagrams (middle and right top) indicate the overlap of down- or up-regulated genes during epithelial morphogenesis between WT and KD cells (with AVL9-KD and DENNDSA-KD samples combined). p Values were calculated with Fisher’s exact tests. Plots below show enriched functions of down- or up-regulated genes unique to WT cells (165 and 230 genes) or to KD cells (221 and 359 genes). See Figure S4 and Table S4.

β-Catenin Is Depleted in the Nucleus and Accumulated at the Cell-Cell Junctions upon the Completion of the First Cell Cycle

β-Catenin is a transducer of the WNT signaling pathway. When located in the nucleus, β-catenin is a transcription factor, regulating the expression of MYC and other target genes. When located in the cell-cell junctions, β-catenin is a component of adherens junctions, contributing to epithelial cell polarity establishment and maintenance (Baum and Georgiou, 2011). Importantly, our analysis reveals that, during MDCKII epithelial morphogenesis, β-catenin targets, including MYC, are down-regulated, whereas cell polarity genes, including those of adherens junctions, are up-regulated (Figures 3 and 4). Hence, we investigated β-catenin.

Resembling its transcript level change (Figure S5A), the amount of the MYC protein is significantly decreased during MDCKII epithelial morphogenesis (Figure 5A). Meanwhile, the amount of β-catenin remains relatively constant throughout the process (Figure 5A), despite differences in the levels of transcripts (Figure S5A). We did, however, observe a change in the cellular location of β-catenin. In both 3D and 2D culture, using E-cadherin as a reference (as it is not known to locate in the nucleus), our analysis indicates that β-catenin is located in the nucleus before the first cell division (Figure 5B) but depleted from the nucleus after the first cell cycle (Figure S5B). β-Catenin is mostly concentrated at the cell-cell junctions after the first cell division (Figure 5B). This differential distribution is statistically significant after examining >40 cells in each condition (Figure 5B).

To determine if intracellular trafficking affects β-catenin localization, we investigated an AVL9-KD clone of MDCKII, in which early intracellular trafficking and lumenogenesis are disrupted (Li et al., 2014). We noted several differences, compared with wild-type cells. First, in AVL9-KD cells, β-catenin is clearly visible near the nucleus and in the cytoplasm after the first cell division, with smaller amount of β-catenin accumulating at the cell-cell junctions (Figure 5B). Second, during 3D cystogenesis of AVL9-KD cells, the total amount of β-catenin increases (Figure 5A), which is accompanied by mostly constant levels of the MYC transcript (Figure S5A) and protein (Figure 5A). Indeed, MYC target genes are significantly up-regulated in AVL9-KD cells, compared with wild-type cells (Figure S5B). Similar observations were made for DENNDSA-KD clones (Figure S5C).

In an attempt to assess if WNT signaling contributes to the observed depletion of nuclear β-catenin in normal morphogenesis (Figure 5B), we divided WNT signaling genes into three groups: (1) WNT ligands and receptors, (2) β-catenin degradation complex, and (3) β-catenin targets (Table S5). We performed ssGSEA of each group with RNA-seq data. Interestingly, we observed no significant changes for either WNT ligand and receptor genes or β-catenin degradation complex genes during 3D cystogenesis (Figure S5C). This differs from 2D epithelial morphogenesis, where WNT signaling appears to be up-regulated (Figure S5C). As expected, β-catenin targets (and MYC targets) are down-regulated for both 3D and 2D (Figure S5C). Hence, it is possible that no significant change occurs to WNT signaling during 3D cystogenesis.
Figure 5. β-Catenin is Depleted in the Nucleus and Enriched at the Cell-Cell Junctions, whereas MYC is Down-Regulated, upon the Completion of the First Cell Cycle

(A) In WT cells, β-catenin stays constant, whereas MYC is significantly reduced in both 3D and 2D samples, compared with the early group. In AVL9-KD cells, β-catenin increases significantly, whereas MYC stays constant during 3D cystogenesis. Bar plots quantify western blot experiments shown on the left, with p values of Wilcoxon tests indicated. Data are represented as mean ± SD with three biological replicates.

(B) Depletion of β-catenin in the nucleus and enrichment of β-catenin at the cell-cell junctions occur during the first cell division in WT cells. These changes are, however, less clear in AVL9-KD cells. Representative confocal images are shown at the top. Scale bar, 5 μm. Bar plots below indicate the relative amount of nuclear β-catenin normalized by E-cadherin, and of cell junction β-catenin normalized by non-junction β-catenin, quantified from at least 40 cells for each condition specified and with p values of Wilcoxon tests shown.

(C) ssGSEA scores (calculated with RNA-seq data) indicate no significant change for WNT ligands and receptors, and β-catenin degradation complex during 3D cystogenesis, unlike β-catenin targets and MYC targets. All four functional groups are significantly changed in 2D epithelial morphogenesis. p Values are from Wilcoxon tests. **, p < 0.01; n.s., p > 0.05. See also Figure S5 and Table S5.
These observations support that intracellular trafficking may possibly play a role in depleting β-catenin from the nucleus and enriching β-catenin at the cell-cell junctions during early 3D epithelial morphogenesis. This in turn may down-regulate MYC transcription and the MYC network.

Active Mitochondria Are Maintained in 3D, but not 2D, Epithelial Morphogenesis

Besides shared features between 3D and 2D epithelial morphogenesis described above, we also investigated their differences. By identifying DE genes between 3D and 2D cells, we found that trafficking-related genes are up-regulated in 2D cells, whereas mitochondria-related genes are up-regulated in 3D cells (Figure 6A; Table S6). These are consistent with up-regulated genes unique to 3D or 2D epithelial morphogenesis (Figure S4A). To validate this finding, we quantified active mitochondria in 3D, 2D, and 0h cells via MitoTracker staining. We found that active mitochondria are maintained in 3D, but not 2D, epithelial morphogenesis (Figure 6B).

We also analyzed published MDCKII microarray data (Wells et al., 2013; Chacon-Heszele et al., 2014) for 2D and 3D cell difference. Surprisingly, the results are inconsistent, with no significant overlap in DE genes and no significant matches in enriched functions between our study and the microarray data (Figure S6C). This may be due to different 3D culture conditions, as type 1 fibrillar collagen gel was used in these microarray studies, unlike ours where Matrigel was used.

Chromatin Becomes Less Accessible during 3D Epithelial Morphogenesis, Especially at Intergenic Regions

To test if the qualitative transcriptomic change (Figures 2C and 4A) is associated with chromatin remodelling, we performed ATAC-seq experiments with 3D, 2D, and 0h samples. We generated 120–200 million paired-end reads of 36 bp per sample and investigated the open chromatin with reads aligned to the nuclear genome (Table S7A).

Our analysis reveals that the chromatin becomes less accessible during 3D epithelial morphogenesis. First, 3D samples contain nearly 15,000 fewer open chromatin regions (OCRs), identified as ATAC-seq peaks, compared with 0h samples (Figure S7A; Table S7B). As a comparison, the corresponding number is only ~1,000 for 2D samples (Figure S7A). Supporting this, differential peak analysis reveals that OCRs have...
shrunken or disappeared in 3D samples by ~3-fold, compared with 0h samples (Figure 7A; Table S7B). The corresponding number is significantly smaller for 2D samples (Figure 7A; Table S7B). Moreover, 3D samples harbor more de novo changes (i.e., newly emerged or disappeared OCRs) than 2D samples (Figure 7A), indicating that 3D epithelial morphogenesis involves more extensive chromatin remodeling. This may be related to the lumen, which harbors a microenvironment that differs from the culture media and could restrict the cell’s access to growth factors from the culture media.

To determine the functional implication of the OCRs, we examined their distribution in the genome. About 15%–16% of OCRs are located within the promoter regions (Figure S7B; Table S7B), defined as 2 kb upstream or downstream of each transcription start site (TSS) and with many validated via H3K4me3 enrichment analysis (Villar et al., 2015) (Figure S7B). The remaining OCRs are located in exons (15%–16%), introns (34%–35%), and intergenic regions (34%–36%) (Figure S7B; Table S7B), with the majority within 20 kb upstream or downstream of the TSS (Figure S7B). These numbers are similar to those reported in human ATAC-seq studies (Pastor et al., 2018; Corces et al., 2018; Ackermann et al., 2016).

We also noted that OCRs in 3D samples are more likely to reside in promoters and exonic regions and less likely to reside in intergenic regions, compared with OCRs in 0h samples (Figure S7B). No such difference was observed for 2D samples (Figure S7B). For OCRs that are changed during epithelial morphogenesis, 3D and 2D samples follow the same trend. Specifically, expanded or newly emerged OCRs tend to locate in promoter or exonic regions, whereas shrunken or disappeared OCRs tend to locate in introns and intergenic regions (Figures 7A and S8).

To determine if any OCRs are enhancers, we identified genomic regions that are enriched in H3K27 acetylation, an active enhancer marker (Villar et al., 2015). The putative enhancers discovered are mostly concentrated within 5 kb upstream or downstream of the TSS (Figure S7B), consistent with findings in human studies (Villar et al., 2015). We noted that, in all three groups of samples, a substantial fraction of OCRs, especially those located in exons and introns, are putative enhancers (Figure S7B; Table S7B). For OCRs that are changed during epithelial morphogenesis and within non-promoter regions, those expanded or newly emerged contain more putative enhancers, compared with those that are shrunken or disappeared, for both 3D and 2D culture (Figures 7A and S8).

**Transcriptomic Changes during MDCKII Epithelial Morphogenesis Are Associated with Chromatin Remodeling**

Among up- or down-regulated genes during 3D or 2D epithelial morphogenesis, a significant portion of promoters contain OCRs that are expanded or shrunken accordingly (Figure 7B). This is exemplified by the following genes. CDC6, which functions in DNA replication and cell cycle checkpoints (Borlado and Mendez, 2008), is down-regulated and has promoter OCRs shrunken during both 3D and 2D epithelial morphogenesis (Figure 7C). The opposite was observed for SLC12A2 (Figure 7C), which encodes a basolateral Na^+·K^+·2Cl^− cotransporter participating in cation reabsorption in kidney (Manohar and Leung, 2018). Other examples are provided in Figure S9A. These observations support that chromatin remodeling underlies the observed transcript abundance changes for a significant fraction of genes (Figures 2C, 4A, and 7B).

To identify what transcription factors are important for epithelial morphogenesis, we analyzed motif enrichment in changed OCRs and observed the same trend in both 3D and 2D cells. Specifically, among shrunken OCRs, the most enriched motifs are the binding sites for Fra1, Atf3, and other bZIP (basic leucine zipper) transcription factors (Table S7C), all of which have proliferative function. Among expanded OCRs, the HNF1B-binding motif is the most significantly enriched (Figures 7D and S9B; Table S7C). HNF1B is a transcription factor required for nephron development. Its binding motif is distributed in OCR-located promoters, exons, introns, and intergenic regions, with a substantial fraction being putative enhancers (Figure S9B). Note that HNF1A/B-binding sites are also among the top-most enriched motifs amid up-regulated genes during 3D and 2D epithelial morphogenesis (Figures 7D and S9B; Table S7C). Importantly, a significant overlap was observed between genes with either type of enrichment (Figures 7D and S9B). HNF1B expression also increases during the course of epithelial morphogenesis (Figures 7D and S9B). These results indicate that HNF1B is likely a key transcription factor for up-regulated genes during MDCKII epithelial morphogenesis, which is consistent with the importance of mitotic bookmarking by HNF1B in kidney development (Lerner et al., 2016; Verdeguer et al., 2010).
Figure 7. Transcriptomic Changes during MDCKII Epithelial Morphogenesis are Associated with Chromatin Remodeling

(A) Decrease in chromatin accessibility is more extensive during 3D epithelial morphogenesis, compared with 2D. The bar plot (top) indicates increased/decreased (existing) or emerged/disappeared (de novo) ATAC-seq peaks in 3D and 2D samples, when compared with 0h samples. p Values were calculated with Fisher’s exact tests. Pie charts below indicate that increased or emerged open chromatin regions in 3D and 2D samples are likely to be located in promoter and exonic regions, compared with those that decreased or disappeared. Regions with dashed lines are putative enhancers identified by H3K27ac enrichment.

(B) Significant fractions of down- and up-regulated genes during 3D and 2D epithelial morphogenesis have undergone chromatin remodeling. Venn diagrams show the overlaps between differential expressed genes and genes with differential ATAC-seq peaks at their promoter regions. p Values were calculated with permutation tests.

(C) Two genes exemplify the corresponding changes between gene expression and promoter chromatin accessibility. Of note is that CDC6 is a target of MYC, whereas SLC12A2 is a target of HNF1B.

(D) HNF1B-binding sites are among the topmost enriched motifs in increased ATAC-seq peaks and the promoters of up-regulated genes during 3D epithelial morphogenesis. The analysis was performed using HOMER and Enrichr. Venn diagram indicates significant overlap between up-regulated genes and genes that harbor expanded/emerged and HNF1B motif-containing ATAC-seq peaks in their gene body and 20-kb flanking regions. p Values were calculated with permutation tests. Bar plot shows up-regulation of HNF1B.

See also Figures S7–S10 and Table S7.
DISCUSSION

A Qualitative Change in the Transcriptome Is Linked to the First Cell Cycle and Lumen Establishment

MDCKII is widely used to study epithelial morphogenesis and cell polarity establishment. Thus, it is important to understand transcriptomic changes during these processes. Our time course analysis of MDCKII 3D cystogenesis has revealed for the first time a single qualitative transcriptomic change, which consists of >1,000 up- or down-regulated genes each. The change occurs during the 24 h to day 3 transition time of MDCKII cystogenesis, coinciding with cell polarity establishment and lumen formation.

3D cystogenesis undergoes lumen-establishing, lumen-enlarging, and lumen-maintenance stages (Li et al., 2014). Our study reveals that the transcriptome switches during the lumen-establishing stage but stays largely the same during the other two stages. However, a significant fraction of the changes that contribute to this transcriptomic switch also occurs in 2D culture. As 2D culture lacks lumenogenesis, the shared changes, which include down-regulation of cell cycle genes and up-regulation of trafficking genes, are most likely related to cell polarity building. Note that the transcriptomic switch also consists of changes unique to 3D, as the transcriptome significantly differs between polarized 2D and 3D cells (which will be discussed later).

We propose that β-catenin and HNF1B may contribute to this qualitative transcriptomic change (Figure S10). During MDCK lumenogenesis, β-catenin is likely transported to the newly formed cell-cell junctions via a Rab11a-directed network (Bryant et al., 2010; Lock and Stow, 2005; Chen et al., 1999). Our data indicate the possibility that translocation of β-catenin from the nucleus to the cell-cell junctions takes place during the first cell cycle of MDCK epithelial morphogenesis. This down-regulates MYC transcription and in turn the MYC network that consists of many cell cycle genes (Valenta et al., 2012), thereby decreasing cell proliferation. HNF1B is a transcription factor required for kidney development and its target genes include those functioning in epithelial cell polarity building. Previous studies have shown mitotic bookmarking of HNF1B in MDCKII cells (Lerner et al., 2016; Verdeguer et al., 2010). We hypothesize that, because of HNF1B mitotic bookmarking and nuclear β-catenin depletion (Chan et al., 2019), the HNF1B-regulated transcriptional network is immediately activated upon the first cell cycle completion, leading to the establishment of cell polarity and the lumen. Of course, our model (Figure S10) needs experimental validation.

The qualitative change reported here may have implications for in vivo tissue development. For example, colonic crypts develop via two major differentiation steps: (1) colonic stem cells to transit-amplifying (TA) cells and (2) TA cells to terminally differentiated (TD) cells (Sheaffer and Kaestner, 2012; Snippert et al., 2010). The second differentiation (TA cells to TD cells) resembles our MDCKII epithelial morphogenesis, with cell proliferation decreasing and cell polarity being established. Furthermore, similar signatures, such as MYC network down-regulation, are also reported in this differentiation (Merlos-Suarez et al., 2011; Kosinski et al., 2007; Wang et al., 2018a, 2018b). However, two questions remain. First, is the transcriptomic change during the differentiation qualitative, as in our MDCKII system, or quantitative, i.e., gradual change? Second, more β-catenin molecules accumulate at the adherens junctions of TD cells, which have well-established apico-basolateral cell polarity, unlike TA cells. Is translocation of β-catenin also possibly responsible for the nuclear β-catenin depletion, besides WNT signaling regulation (Schepers and Clevers, 2012; Di Cecilia et al., 2016)?

Addressing these questions is also important in disease development. Loss of cell polarity is a driver of carcinogenesis of epithelial tissues including colon and breast (Tang et al., 2014; Li et al., 2014; Royer and Lu, 2011). Our MDCKII 3D epithelial morphogenesis is the reverse of epithelial carcinogenesis, i.e., a tumor suppression process. Enhancing the trafficking of β-catenin from the nucleus to the adherens junction and maintaining β-catenin at the junction will result in tumor suppression.

3D Culture Is a Better Model Than 2D Culture in Studying Mitochondria in Kidney

Our study indicates that mitochondria-related genes, e.g., those functioning in oxidative phosphorylation, are up-regulated in 3D cells, compared with 2D cells. Our study also reveals that active mitochondria are maintained in 3D, but not 2D, epithelial morphogenesis. The kidney has high mitochondrial abundance to support ATP generation via oxidative phosphorylation (Pagliarini et al., 2008). Particularly, proximal tubule cells, one of the major cell types in MDCKII cells, contain the most mitochondria and use the majority of
oxygen in the kidney to support physiological functions, including reabsorption of ions and glucose (Forbes, 2016). Our work indicates that 3D culture better resembles physiological conditions and therefore serves as a better cell model to study kidney biology, especially mitochondria and metabolism. We thus envision a wider use of MDCKII 3D culture in related studies.

Limitations of the Study
Our study reveals that, during MDCKII epithelial morphogenesis, numerous genes are significantly changed at the transcript level, including down-regulation of many cell cycle genes (Figures 4A and 4B). However, we have not validated these changes at the protein level. Moreover, our study indicates that down-regulation of MYC and cell cycle genes may be caused by the translocation of β-catenin from the nucleus to the cell-cell junctions during the first cell cycle of MDCKII epithelial morphogenesis (Figures 5 and S10). However, we lack experimental data to support this. Future studies, such as those that disrupt β-catenin translocation, are needed to test this hypothesis. Our study, in combination with findings by others (Lerner et al., 2016; Verdeguer et al., 2010), indicates that mitotic bookmarking of HNF1B during the first cell division of MDCKII epithelial morphogenesis may lead to up-regulation of HNF1B target genes (Figures 7 and S9). However, experimental data are lacking to test this hypothesis. Functional studies, including HNF1B knockdown or knockout, may illustrate the mechanism through which HNF1B contributes to MDCKII epithelial morphogenesis. Our study also reveals that active mitochondria are maintained in 3D culture but not in 2D culture (Figure 6). However, the mechanism of this finding remains unknown, and future studies are required.

Resource Availability
Lead Contact
Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Shaying Zhao (szhao@uga.edu).

Materials Availability
This study did not generate new unique reagents.

Data and Code Availability
The accession number for the ATAC-seq and RNA-seq data reported in this paper is GEO: GSE129824. Custom scripts ATAC-seq and RNA-seq data analysis are available from the Lead Contact upon request.

METHODS
All methods can be found in the accompanying Transparent Methods supplemental file.

SUPPLEMENTAL INFORMATION
Supplemental Information can be found online at https://doi.org/10.1016/j.isci.2020.101629.

ACKNOWLEDGMENTS
We thank Ms. Yaping Li for her contributions for this study, Mr. Roger Nelson and Mr. Jeff Wagner at Georgia Genomics and Bioinformatics Core and BGI for sequencing, Dr. Muthugapatti K. Kandasamy at UGA Biomedical Microscopy Core and Ms. Jin Qian for their helps with confocal microscopy, Ms. Julie Nelson at UGA Cytometry Shared Resources Laboratory for her help with flow cytometry, Dr. Kevin Dobbin for his help with statistical analysis, and Mr. Josh Watson and Mr. Max Colonna for their help with manuscript proofreading. This work was funded by NCI R01 CA182093 to S.Z., NIDDK R01 DK091530 to K.E.M., and NIDDK R01 DK120510 to S.-H.K.

AUTHOR CONTRIBUTIONS
Conceptualization, S.Z. and K.E.M.; Methodology, T.W., Z.L., S.Z., P.X., S.-H.K., and S.U.; Investigation, T.W. and S.Z.; Writing, S.Z., T.W., K.E.M., and R.J.S.; Visualization, T.W.; Resources, R.J.S. and S.D.; Supervision, S.Z. and K.E.M.; Funding Acquisition, S.Z., K.E.M., and S.-H.K.
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Supplemental Information

A Qualitative Change in the Transcriptome Occurs after the First Cell Cycle and Coincides with Lumen Establishment during MDCKII Cystogenesis

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Supplemental Figures and Legends

A

B

FastQC: Mean base quality scores

FastQC: Per read GC content

FastQC: Sequence duplication levels

FastQC: Mapping quality score

Density vs. TPM

PC2 vs. PC1
Figure S1. Time-course RNA-seq experiments. Related to Figure 1.
(A) Bright-field images of time course MDCKII 3D epithelial morphogenesis. Scale bar, 20 μm.
(B) Quality control for MDCKII wild type (WT) and knockdown (KD) RNA-seq samples. Top: mean base quality scores at each base position and distributions of per read GC content for 31 samples (21 WT and 10 KD) determined by FastQC. Arrow indicates a peak corresponding to ~60% GC content for samples sequenced in one batch. Middle: sequence duplication levels determined by FastQC, and distribution of mapping quality score of all the reads of each sample. Arrow indicates the AVL9-KD 0h sample that was sequenced twice and the data was pooled. Bottom: distributions of TPM values of 31 samples, and the PCA plot of 21 WT samples. Highlighted samples are distant from other samples of the same group (outliers) and are thus excluded from downstream analysis.
Figure S2. Hierarchical clustering with top variably expressed genes across samples supports three sample clusters (3D, early and 2D). Related to Figure 2.

Bootstrapping was performed with permutations (see Transparent Methods). Approximately unbiased (au) and bootstrap probability (bp) values are shown in red and green, respectively.
Figure S3. The molecular characterization of MDCKII WT, AVL9- and DENND5A-KD cells with RNA-seq data. Related to Figures 3 and 6.
Heatmap shows ssGSEA enrichment scores of MDCKII WT, AVL9- and DENND5A-KD cells, indicating intracellular trafficking and other functions related to cell polarity are suppressed in KD cells. The stars indicate gene sets with enrichment scores significantly different between WT and KD cells, with p < 0.05, identified by Wilcoxon tests. The same gene sets are used as in Figure 3.
**Figure S4.** Comparison between MDCKII WT and KD cells indicates the downregulation of intracellular trafficking genes and upregulation of cell proliferation genes in KD cells. Related to Figure 4.

(A) Functional enrichment of up- or down-regulated genes unique to 3D and 2D epithelial morphogenesis.

(B) t-SNE analysis (11,090 genes) of MDCKII WT and KD samples shows three clusters: 3D, 2D and early.

(C) t-SNE analysis (11,090 genes) of MDCKII WT and KD 2D over-confluent cells shows KD samples cluster distinctly from WT samples.

(D) Heatmap shows expression of DE genes (FDR<0.01 and >2-fold change) between MDCKII WT and KD over-confluent cells, with their enriched functions and associated p-values also shown.

(E) Protein level validation of transcriptional downregulation of VIM in both 3D and 2D samples. Top heatmap shows RNA-seq data, with red denoting up-regulation and green denoting down-regulation. Bar plot quantifies western blot experiments shown on the left, with p-values of Wilcoxon tests indicated. Data are represented as mean ± SD with three biological replicates.

(F) Protein level validation of transcriptional upregulation of DENND5A in 2D samples. Top heatmap shows RNA-seq data, with red denoting up-regulation and green denoting down-regulation. Bottom confocal images indicate MDCKII cells at 2D 24h and 2D day4, stained for DENND5A and DAPI. Scale bar, 10 μm.
A

73/156 genes upregulated in AVL9 KD
14/156 genes upregulated in WT

B

C

20x

WT 0h

AVL9 KD 0h

DENN5A KD 0h

WT 2D 24h

AVL9 KD 2D 24h

DENN5A KD 2D 24h

β-catenin

DAPI

Merge

40x

β-catenin

DAPI

Merge

63x z-stack

Merge
Figure S5. MYC target genes are more abundantly expressed during epithelial morphogenesis of AVL9-KD cells, with β-catenin detected in the nucleus and cytoplasm after the first cell cycle, unlike WT cells. Related to Figure 5.

(A) At the transcript level, CTNNB1 is upregulated while MYC is downregulated in both 3D and 2D samples, compared to the early group, in WT cells. In AVL9-KD cells, MYC stays relatively constant. Heatmaps show RNA-seq data, with red denoting up-regulation and green denoting down-regulation, while bar plots show qRT-PCR data. Data are represented as mean ± SD with three biological replicates.

(B) Heatmap shows expression of MYC target genes grouped based on their functions, up-regulation in red and down-regulation in green. Right plot indicates the MYC target enrichment scores and p-value of AVL9-KD cells compared to WT cells, calculated from GSEA.

(C) Representative confocal images of WT, AVL9- and DENND5A-KD cells at 0h and 2D 24h, stained for β-catenin and DAPI. Scale bar, 20 μm.
Figure S6. We found consistence between our study and previous microarray work for transcriptomic changes during epithelial morphogenesis, but not for transcriptomic differences between 2D and 3D culture. Related to Figures 4 and 6.

(A) Comparison with DE genes (FDR< 0.05 and >2-fold change) between 36h and day8 samples from two microarray studies (Wells et al., 2013, Galvez-Santisteban et al., 2012). The analysis was performed using limma R package. Venn diagrams show overlap between these microarray DE genes and up-/down-regulated genes during 3D or 2D epithelial morphogenesis from our study (Figure 4A). Fractions of overlap and p-values (calculated with 10,000 permutations) are indicated. Bar plots on the right show the enriched functions of the microarray DE genes and associated p-values, identified with the GSEA web tool.

(B) Comparison with DE genes (FDR<0.05 and >1.5-fold change) between with and without HGF treatment from another microarray study (Chacon-Heszele et al., 2014). The analysis was performed using limma R package. The findings are presented as described in panel A. Fractions of overlap and p-values (calculated with 10,000 permutations) are indicated. Bar plots on the right show the enriched functions of the microarray DE genes and associated p-values, identified with the GSEA web tool.

(C) Comparison with 3D-2D DE genes from two microarray studies: 1) between day8 3D and 2D cells (FDR<0.05) (Wells et al., 2013); and 2) between 3D (day10) and 2D (day6) cells (FDR<0.05 and >1.5-fold change) (Chacon-Heszele et al., 2014). The analysis was performed using limma R package. DE genes for our study are indicated Figure 6A. Venn diagrams indicate the overlap. Fractions of overlap and p-values (calculated with 10,000 permutations) are indicated. Bar plots indicate enriched functions of the microarray DE genes and associated p-values, identified with the GSEA web tool.

Note: Different selection cutoffs were used for DE gene identification among the microarray studies, in order to keep the number of DE genes comparable to our study for each corresponding change for statistic tests.
Figure S7. Chromatin accessibility decreases during MDCKII 3D epithelial morphogenesis, revealed by ATAC-seq analysis. Related to Figure 7.

(A) Left bar plot indicates that 3D cells have the fewest ATAC-seq peaks, identified with the software MACS2 (Feng et al., 2012) at FDR<0.05 and ≥1 to 4-fold enrichment (the ratio of the ATAC-seq peak signal versus the background signal). Right plots show the distribution of ATAC-seq fragment size and peak size, indicating that 0h cells have more but smaller open chromatin regions, compared to 3D and 2D samples. Data are represented as mean ± SD with biological replicates (see Table S7).

(B) Top left bar plot and pie charts show the distribution of ATAC-seq peaks in the genome. P-values were calculated with paired t-test using the total numbers of ATAC-seq peaks detected in each genomic region (intergenic, etc.) between 0h and 3D or 2D cells. Bottom left plots indicate the locations of canine cell H3K4me3 and H3K27ac ChIP-seq peaks (Villar et al., 2015) relative to TSSs used for our analysis. Right plots show the locations of ATAC-seq peaks or differential peaks relative to TSSs.
Figure S8. Genomic regions with increased chromatin accessibility during MDCKII epithelial morphogenesis are more likely to be found in promoters and exonic regions. Related to Figure 7.

Venn diagram at the top left shows the number of shared and unique ATAC-seq peaks in different samples, while the pie charts beneath indicate the distribution of shared or unique ATAC-seq peaks in the genome. Pie charts and bar plots at the top right show genomic locations of existing and de novo differential ATAC-seq peaks. Bar plots at the bottom indicate the number of DE genes that have differential ATAC-seq peaks located at their TSS and TTS regions as specified.
Figure S9. Examples of chromatin accessibility correlating with gene expression, and upregulation of HNF1B target genes during MDCKII epithelial morphogenesis. Related to Figure 7.

(A) SNX13, up-regulated in both 2D and 3D samples, and TGFB2, down-regulated in 3D but not in 2D samples, both have corresponding chromatin accessibility changes in their promoter, revealed by ATAC-seq. P-values of Wilcoxon tests are indicated.

(B) Top plots show the genomic distribution of expanded and HNF1B motif-containing ATAC-seq peaks in 3D samples. Plots below are for 2D samples. HNF1B binding sites are among the top-most enriched motifs in expanded ATAC-seq peaks and the promoters of upregulated genes during 2D epithelial morphogenesis. The analysis was performed using HOMER and Enrichr. Venn diagram indicates significant overlap between genes upregulated and genes with expanded and HNF1B-containing ATAC-seq peaks detected in their gene body or 20kb flanking regions. P-value for the overlap was calculated via 10,000 permutations. Bar plot shows upregulation of HNF1B, and the p-value of Wilcoxon test is indicated.
Figure S10. Our model proposes that the qualitative change in the transcriptome during MDCKII 3D cystogenesis is a result of the redistribution of transcription factors during the first cell cycle. Related to Figures 2, 4, 5 and 7. Our model is exemplified by β-catenin, which translocates to the cell-cell junctions, and HNF1B, which remains chromatin-bound via mitotic bookmarking, during the first cell cycle.
Transparent Methods

MDCKII cell culture
MDCKII cells (Li et al., 2014) were maintained in Eagle’s minimal essential medium (Corning, #10-010-CM) with 5% fetal bovine serum (Atlanta Biological, #S11550), 10 mM HEPES, 2 mM glutamine, 100 U/ml penicillin, and 100 mg/ml streptomycin, at 37°C in an incubator with 5% CO2. The media was changed every other day. Only cells that are healthy and when fully polarized, display well-defined cell-cell junction, pentagon shape and uniform size were used for experiments as below.

Cells grown at <70% confluence were harvested via trypsinization. Then, 1x10^6 cells were seeded on 100 mm plates until reaching ~10% confluence (e.g., single cell stage). The cells were harvested via trypsinization, with a portion used as 0h samples and the rest used for seeding 3D and 2D cultures. For 3D cultures, cells were grown on top of growth factor-reduced Matrigel (Corning, #354230) and in media containing 2% Matrigel, with seeding density at 60 cells/mm² and daily media change. For 2D cultures, cells were seeded on Transwell filters with 0.4 μm pore size (Corning) with the same seeding density as 3D cultures and grown for 11 days, or with seeding density of 3400 cells/mm² and grown for 4 days, to reach over-confluence.

Immunofluorescence and confocal microscopy
MDCKII cells were fixed with 4% PFA, then permeabilized with 0.5% Triton X-100 in PBS and blocked with 10% normal donkey serum and 0.1% Triton X-100 in PBS. Primary and secondary antibodies incubations were in 1% donkey serum and 0.1% Triton X-100. MDCKII cysts were stained as previously described (Li et al., 2014). The antibodies used include Goat polyclonal anti-E-cadherin (R&D Systems, #AF648), Rabbit polyclonal anti-β-catenin (Santa Cruz, #sc-7199), Rabbit polyclonal anti-DENND5A (Sigma-Aldrich, #HPA052923), Alexa Fluor 488 Donkey anti-goat IgG (Jackson ImmunoResearch, #705-545-147), and Alexa Fluor 647 Donkey anti-rabbit IgG (Jackson ImmunoResearch, #711-605-152). MitoTracker staining was performed using MitoTracker Red CMXRos (Thermo Fisher, #M7512) according to manufacturer’s instruction. Confocal images were taken on Zeiss LSM 710 confocal microscope with 20x, 40x, 63x or 100x oil objectives. Bright-field images were taken using Leica DFC320.

Imaging analysis was performed using the software Fiji. To quantify the intensity of β-catenin and E-cadherin staining (Figure 5B), nuclei and cell-cell junctions were outlined based on the DAPI staining and bright-field images. After region of interest (ROI) selection, the Intermode Mode was used to choose a threshold of each image to adjust the intensity of ROI. Then, the Measure function was used to quantify the intensity of ROI. Similar procedures were performed to quantify MitoTracker staining intensity (Figure 6B).

Western blot analysis
3D cysts were isolated and collected from Matrigel using cold PBS and 2D cells were collected using cell scraper. Protein lysate of MDCK cells was prepared in RIPA buffer. Protein extracts were separated by SDS-PAGE (Bio-Rad) for 60 min at 100V, then transferred onto PVDF membranes (Bio-Rad) for 30 min at 100V, and blocked with 5% non-fat milk in 0.05% TBST for 2 hr. The membranes were then incubated with primary antibodies at 4°C overnight, and incubated with secondary antibodies after washing with TBST. The antibodies used include Rabbit monoclonal anti-MYC (Abcam, #ab32072), Rabbit monoclonal anti-Vimentin (Abcam, # Ab92547), Mouse monoclonal anti-α-Tubulin (Sigma-Aldrich, #T6199), Rabbit polyclonal anti-β-catenin (Santa Cruz, #sc-7199), Goat anti-rabbit IgG-HRP (Santa Cruz, #sc-2030), and Goat anti-mouse IgG-HRP (Santa Cruz, #sc-2031). The western ECL blotting substrate (Bio-Rad) was applied on the membrane before film exposure.

Paired-end RNA-seq
Cysts grown for 24 hours, 3, 5, 8, 14 days in 3D condition, cells for seeding (0h) and over-confluent cells grown in 2D condition were collected and their RNA was extracted using the AllPrep DNA/RNA Mini Kit (Qiagen, #80204). Only samples with ratio of absorbance at 260 nm and 280 nm of ~2.0 were subjected to further analyses. qRT-PCR of selected genes were performed for quality control. cDNA was made using iScript cDNA synthesis kit (Bio-Rad, #1708890) and qRT-PCR was performed with iQ SYBR Green Supermix (Bio-Rad, #1708880) and the primers previously described (Liu et al., 2014). RNA-seq libraries were constructed using KAPA Stranded mRNA-
The samples were subjected to 75 or 125 bp paired-end sequencing using Illumina HiSeq 2500 at BGI (the first biological replicate) or NextSeq 500 at Georgia Genomics Facility (the other biological replicates).

**ATAC-seq**

ATAC-seq was performed as previously described (Lu et al., 2017). 2D cells were grown on 100 mm plate for 4 days, and 3D cysts were cultured on Matrigel for 19 days. 0h and 2D cells were collected using a cell scraper, and 3D cysts were isolated from Matrigel with cell recovery solution (Corning, #354253). After washing with cold PBS, the cells were dissociated in lysis buffer (1% NP40, 10mM Tris pH 7.5, 10 mM NaCl, 3 mM MgCl₂, 1mM EDTA) using a syringe. The samples were filtered with miracloth. Crude nuclei were sorted by flow cytometer (Beckman Coulter MoFlo XDP) with DAPI. The nuclei were pelleted and resuspended in the transposase reaction mix (25 μL 2XTagmentation buffer, 2.5 μL transposase and 22.5 μL nuclease-free water; Nextera Kit, Illumina, #FC-121-1030), and incubated at 37°C for 30 min. Immediately following transposition, transposed DNA was purified with MinElute Reaction Cleanup Kit (Qiagen, #28204), and amplified using Phusion DNA polymerase (NEB, # M0530S) for 10-13 cycles, with sequencing indexing primer for ATAC library preparation described previously (Buenrostro et al., 2013). Amplified libraries were purified with AMPure beads. The libraries were subjected to 36 bp paired-end sequencing using Illumina NextSeq 500.

**RNA-seq data analysis**

RNA-seq data analyses were performed as previously described (Wang et al., 2018a, Wang et al., 2018b). Read pairs were aligned to the dog reference genome canFam3 with TopHat v2.0.14 or HISAT v2.1.0 (Pertea et al., 2016, Trapnell et al., 2012). Cufflinks v2.2.1 and canine gene annotation canFam3.1.84 were used to quantify gene expression as FPKM values using only uniquely mapped read pairs. Clustering of the samples were performed using hierarchical clustering and NMF (Brunet et al., 2004). For hierarchical clustering, the pvclust R package was used with top variably expressed genes and the centroid method. Bootstrapping was performed with a total of 1,000 permutations. The NMF R package was used with 30 runs for the rank determination and 200 runs for the final results. DE genes were identified by using the DESeq R package, and their enriched functions were identified using the GSEA webtool at https://www.gsea-msigdb.org/gsea/index.jsp. ssGSEA was performed with predefined genes (see Table S3 and Figure 3) using GenePattern (Reich et al., 2006). Motif enrichment analysis was performed using the software Enrichr (Kuleshov et al., 2016).

**ATAC-seq data analysis**

ATAC-seq data were analyzed as previously described (Milani et al., 2016). Sequencing reads were mapped to the canFam3 genome using BWA v0.7.10 (Li and Durbin, 2009). ATAC-seq peaks were identified using MACS v2.1.1 with FDR < 0.05 (Zhang et al., 2008). The differential open chromatin regions were identified using the bdgdiff option of MACS. Peaks were mapped to TSS±2kb and other regions using Bedops v2.4.30. Peaks were visualized by uploading the data to the UCSC genome browser. Motif enrichment analysis was performed using Homer v4.10 (Heinz et al., 2010).

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