






# Single cell transcriptomics reveals lineage trajectory of retinal ganglion cells in wild-type and *Atoh7*-null retinas

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*Atoh7* has been believed to be essential for establishing the retinal ganglion cell (RGC) lineage, and *Pou4f2* and *Isl1* are known to regulate RGC specification and differentiation. Here we report our further study of the roles of these transcription factors. Using bulk RNA-seq, we identify genes regulated by the three transcription factors, which expand our understanding of the scope of downstream events. Using scRNA-seq on wild-type and mutant retinal cells, we reveal a transitional cell state of retinal progenitor cells (RPCs) co-marked by *Atoh7* and other genes for different lineages and shared by all early retinal lineages. We further discover the unexpected emergence of the RGC lineage in the absence of *Atoh7*. We conclude that competence of RPCs for different retinal fates is defined by lineage-specific genes co-expressed in the transitional state and that *Atoh7* defines the RGC competence and collaborates with other factors to shepherd transitional RPCs to the RGC lineage.

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The central nervous system has the most diverse cellular composition in the animal body. How this complexity is achieved during development has been one of the central questions of neuroscience. In the central nervous system, all neural cell types originate from a common pool of neural progenitor cells; neural progenitor cells take on different developmental trajectories to eventually assume distinct cell fates. The neural retina is an ideal model for studying neural development. All retinal cell types arise from a single population of retinal progenitor cells (RPCs) through a conserved temporal sequence, but with significant overlaps<sup>1–4</sup>. The competence of RPCs for different cell fates change over the course of development so that different cell types are produced at different time windows<sup>4–12</sup>. Several factors influencing the temporal change of RPC competence have been identified<sup>13–16</sup>. However, multiple retinal cell types are often born in overlapping time windows, yet the nature of RPC competence for individual cell types remains unknown. Considerable heterogeneity has been observed within the general RPC population, which may be related to their competence for the various retinal cell fates<sup>17–24</sup>. In agreement with this idea, many key regulators, mostly transcription factors, expressed in subsets of RPCs have been shown to regulate different retinal cell fates<sup>21,23,25–30</sup>. Several RPC subpopulations, including those expressing *Atoh7*, *Olig2*, *Neurog2*, and *Ascl1*, give rise to or are biased for certain fates<sup>17,19,31,32</sup>. However, the cell states in which these key transcription factors operate in, the actual complexity of RPC heterogeneity, the relationships between the different RPC sub-populations, and their relevance to RPC competence for individual retinal fates, have only begun to be addressed. Conventional experimental approaches have provided much insight into the genetic pathways and mechanisms underlying the formation of individual retinal cell types<sup>1,33–35</sup>. However, the traditional approach of investigating individual genes and cell types has been painstakingly slow-paced and inefficient in providing a comprehensive picture, since the genesis of many cell types often occurs in overlapping time and space. Understanding the relationships among different progenitor subtypes and the progression of individual cell lineages is often limited by the knowledge of marker genes, the availability of proper reagents, and the low throughput and resolution and low qualitative nature of conventional multiplexing assays. Recent development in transcriptomics analysis using next-generation sequencing, particularly at single cell levels, affords powerful means to survey the complexity of cell composition and progression of cell states for individual cell lineages.

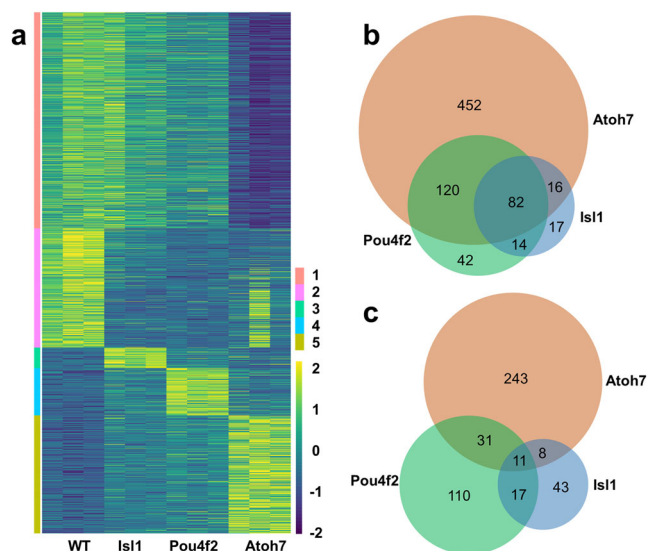
Single cell expression profiling (single cell RNA-seq, scRNA-seq) uses microfluidic devices to isolate single cells and generate barcoded cDNA libraries. The libraries are then sequenced by next-generation sequencing<sup>36,37</sup>. The sequence reads can then be decoded and attributed back to specific genes in individual cells, and expression levels of individual genes within each cell can then be determined. This approach enables the expression profiles of thousands of individual cells to be analyzed, and the cells can then be grouped (clustered) based on their similarities. The groups of cells thus identified from a developing tissue can reveal the cellular complexity of the tissue and the different cell states of individual cell lineages during development. The technology has been adopted to study many developing tissues and organs, including the retina<sup>13,36,38–45</sup>, and can thus be used to analyze the heterogeneity of RPCs and their relationships to different retinal lineages. The current study focuses on one of the early retinal cell types, retinal ganglion cells (RGCs). Three key transcription factors, *Atoh7*, *Pou4f2*, and *Isl1*, function at different stages along the RGC lineage. *Atoh7* functions before the RGC fate is determined and is believed essential, but not sufficient,

for the RGC fate<sup>22,25,30–32,46</sup>, whereas *Pou4f2* and *Isl1* function to specify the RGC fate and promote RGC differentiation<sup>47–51</sup>. *Atoh7* has thus been considered a competence factor. However, how the RGC lineage emerges in the context of whole retinal development and what specific roles *Atoh7* plays in this process is not well understood.

To further understand RGC differentiation, we first performed conventional RNA-seq on mutant E14.5 retinas of the three key transcription factors genes, *Atoh7*, *Pou4f2*, and *Isl1*, to characterize the global downstream events during RGC development. This allowed us to expand the scope of downstream genes from previous studies and obtain a global view on the functions of these key regulators. We then performed scRNA-seq on retinal cells from E13.5 and E17.5 wild-type and *Atoh7*-null retinas. At these stages, particularly at E13.5, four major early retinal cell types, RGCs, horizontal cells, amacrine cells, and cones, are being generated<sup>4</sup>. Our analysis not only identified all these retinal cell types with unique gene signatures but also revealed their relationship to the RPC groups. Importantly, we discovered that all the early cell lineages went through a shared transitional cell state before the cell fates were specified and that this state was marked by such genes as *Atoh7*, *Neurog2*, *Neurod1*, and *Otx2* that are involved in the formation of these lineages. Analysis of the *Atoh7*-null cells revealed that the RGC trajectory was truncated as expected, with major changes in gene expression in individual cell types/states, particularly in RGCs. Unexpectedly, the RGC lineage still formed and advanced substantially, indicating that other factors are involved in establishing this lineage. These results provide novel insights into the mechanisms governing the emergence of the different retinal lineages and, particularly, advance our understanding of the cellular process and genetic pathways underlying the establishment of the RGC lineage.

## Results

**Changes in gene expression in *Atoh7*-, *Pou4f2*-, and *Isl1*-null retinas.** *Atoh7*, *Pou4f2*, and *Isl1* are three key regulators in the gene regulation network controlling RGC development<sup>49,52</sup>. They function at two different stages; *Atoh7* is believed to confer competence to RPCs for the RGC lineage, whereas *Pou4f2* and *Isl1* function to specify the RGC fate and promote differentiation. Previously, downstream genes of *Atoh7*, *Pou4f2*, and *Isl1* have been identified by microarrays<sup>22,49,53,54</sup>. However, due to limitations of the technology used, those genes likely only cover small proportions of those regulated by the three transcription factors. To gain a more global view of the function of the three transcription factors, we collected total RNA samples from wild-type, *Atoh7*-null, *Pou4f2*-null, and *Isl1*-null retinal tissues at E14.5 and performed RNA-seq. The RNA-seq data from the wild-type retina provided a comprehensive list of genes expressed in the E14.5 retina with at least 1.0 average counts per million reads (CPM, see Supplementary Data 1). We then identified differentially expressed genes (DEGs) by edgeR<sup>55</sup> in each of these mutant retinas as compared to the wild-type retina using a cutoff of at least 1.5 fold change and FDR of at least 0.05 (Supplementary Data 2). In the *Atoh7*-null retina, we identified 670 downregulated genes, including *Pou4f2* and *Isl1*, and 293 upregulated genes (Supplementary Data 2); in the *Pou4f2*-null retina, we identified 258 downregulated genes and 169 upregulated genes (Supplementary Data 2); and in the *Isl1*-null retina, we identified 129 downregulated genes and 79 upregulated genes (Supplementary Data 2). Although *Atoh7* and *Pou4f2* were also identified as DEGs in the respective mutant retinas, *Isl1* showed no change in the *Isl1*-null retina, because in the *Isl1*-null retina only the small frame-shifting exon 3 was deleted, which likely did not alter the mutant mRNA levels significantly<sup>49</sup>. These DEGs not only



**Fig. 1 Conventional RNA-seq identifies differentially expressed genes (DEGs) in E14.5 *Atoh7*-null, *Pou4f2*-null, and *Isl1*-null retinas.** **a** Clustering of all DEGs across all four genotypes based on Z scores indicates the *Atoh7*-null retina is least similar, whereas the *Isl1*-null retina is most similar to the wild-type retina. Each genotype has three replicate samples. The genes were divided into five groups (1–5) based on how they are affected in the three mutants. The color scale represents cross-sample Z scores for individual genes (rows). Source data are from Supplementary Data 2. **b** A Venn-diagram showing the overlaps of downregulated genes in all three mutant retinas. **c** A Venn-diagram showing the overlaps of upregulated genes in the three mutant retinas. Source data for (**b**, **c**) are provided.

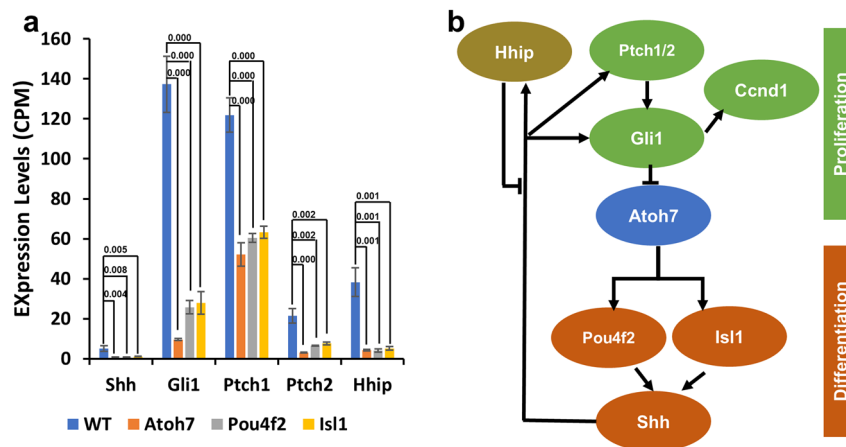
confirmed previous findings, as essentially all previously identified DEGs were included, but also provided a more complete picture by significantly increasing the numbers of DEGs for each mutant. The different numbers of DEGs in these three mutant retinas were consistent with their severity of defects in RGC development<sup>25,30,49,50,56</sup>, which was further reflected by a clustering heatmap analysis, showing that the *Atoh7*-null retina was least similar, and the *Isl1*-null retina was most similar, to the wild-type retina (Fig. 1a).

Consistent with RGCs being largely missing in the *Atoh7*-null retina, RGC-specific genes were mostly found in the downregulated DEG list, whereas RPC-expressed DEGs included both down- and upregulated genes (Supplementary Data 2). The downregulated *Atoh7* gene list also encompassed the majority of genes in downregulated *Pou4f2* and *Isl1* lists, as would be expected considering that *Pou4f2* and *Isl1* function downstream of *Atoh7* (Fig. 1b). Gene ontology (GO) analysis by DAVID<sup>57</sup> found the downregulated genes in the three mutants were highly associated with different aspects of neural differentiation and function, as demonstrated by enriched biological processes and GO terms, including nervous system development, axonogenesis, cell adhesion, and neurotransmitter secretion (Supplementary Data 3). On the other hand, the three upregulated gene lists were markedly different and much less overlapped (Fig. 1c and Supplementary Data 2). GO analysis revealed the upregulated DEGs in the three mutants were broadly involved in neural development, both negatively and positively (Supplementary Data 3). Genes negatively regulating proliferation were enriched in the *Atoh7* upregulated list, but not the *Pou4f2* or *Isl1* upregulated list (Supplementary Data 3). These results reflected that these three factors repress gene expression largely independently at two different levels of the gene regulatory hierarchy either directly or indirectly; *Atoh7* represses gene expression in

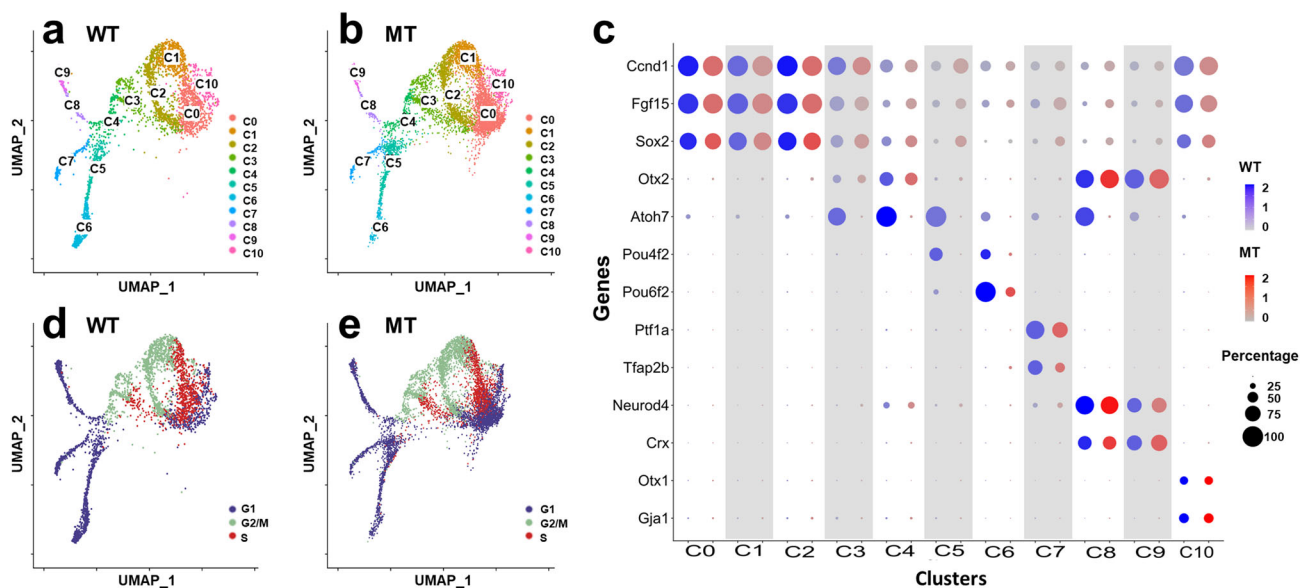
proliferating RPCs, confirming our previous analysis<sup>22</sup>, whereas *Pou4f2* and *Isl1* repress gene expression in RGCs. Independent gene repression by these factors was also demonstrated by genes with changes in different directions in these three mutant retinas (Supplementary Data 2). For example, *Nhlh1* did not change in *Atoh7*-null, was downregulated in *Pou4f2*-null (fold change  $-2.2$ ), but upregulated in *Isl1*-null (fold change 1.7), whereas its related gene *Nhlh2* was downregulated (fold change  $-2.0$ ) in *Atoh7*-null, did not change in *Pou4f2*-null, but was significantly upregulated in *Isl1*-null (fold change 1.7). We also confirmed that some marker genes for amacrine cells (e.g., *Chat*, *Th*, fold change 383.0 and 35.1, respectively) were markedly upregulated in *Pou4f2*-null retina as previously reported<sup>54</sup>, but they did not change in either *Atoh7*-null or *Isl1*-null retinas. *Dlx1* and *Dlx2*, two genes involved in RGC development<sup>58,59</sup>, were downregulated in the *Atoh7*-null retina, but upregulated in the *Pou4f2*- and *Isl1*-null retinas, indicating these genes were activated by *Atoh7* in RPCs, but repressed by *Pou4f2* and *Isl1* in RGCs (Supplementary Data 2).

The DEG lists also revealed/confirmed that key pathways were affected in the three mutant retinas and additional components with changed expression were found. For example, the Shh pathway, which is under the control of the gene regulatory network for RGC genesis, plays a key role in balancing proliferation and differentiation through a feedback mechanism<sup>49,50,53,60–63</sup>. Expanding previous findings, we found more components in the Shh pathway were affected in all three mutant retinas (Fig. 2a, Supplementary Data 2). These component genes, including *Shh*, *Gli1*, *Ptch1*, *Ptch2*, and *Hhip*, revealed a complex feedback loop of the pathway in balancing proliferation and differentiation via downstream genes such as *Gli1* and *CcnD1* (Cyclin D1) (Supplementary Data 2, Fig. 2b)<sup>49,50,53,60–66</sup>. Consistent with this model, *Gli1* and *CcnD1* expression was both reduced in all three mutants (Supplementary Data 2). Two additional signaling pathways from RGCs to RPCs exist in the developing retina. Two related BMP molecules, Gdf11 and Myostatin/Gdf8 (*Mstn*), are secreted from RGCs to balance RGC production and RPC proliferation<sup>53,67</sup>. Vegf is also involved in the feedback from RGCs to RPCs<sup>68</sup>. *Mstn* was downregulated in all three mutant retinas, but *Gdf11* exhibited no change, which might be due to *Gdf11* expression not confined to just RGCs. Unexpectedly, *Vegfa* expression increased in the *Atoh7*-null retina, although the underlying mechanism is not clear, but did not change in the other two mutants. Multiple component genes of the Notch pathway, including *Hes5*, were upregulated in the *Atoh7*-null, but not the other two mutant retinas (Supplementary Data 2). However, as discussed later with our single cell analysis, the effects of *Atoh7* deletion on the Notch pathway is complex and likely involved the Shh and Vegf pathways, as crosstalk exists between them via *Hes1*<sup>61,63,68,69</sup>. These results further demonstrated that deletion of *Atoh7* not only compromised RGC formation but also altered the properties of RPCs through multiple interacting pathways.

**Single cell RNA-seq of wild-type and *Atoh7*-null retinas at E13.5.** Whereas the RNA-seq data provided much insight into gene regulation by *Atoh7*, *Pou4f2*, and *Isl1* in the developing retina, how their absence affected different cell states could not be attained. In particular, although *Atoh7* functions in a subset of RPCs that gives rise to RGCs, the properties of these RPCs and their relationships to other cell populations have not been well characterized. To that end, we first performed single cell RNA-seq with E13.5 wild-type and *Atoh7*-null retinal cells. The choice of E13.5, instead of E14.5, was fortuitous but did not affect our overall analysis since largely the same cell types are being



**Fig. 2** The Shh pathway is regulated by the RGC gene regulatory cascade at multiple levels. **a** Multiple component genes of the Shh pathway are downregulated in the three mutant retinas. Data are presented as mean values  $\pm$  SD. CPM: counts per million.  $n = 3$  independent replicates for each genotype. Two-tailed Student's  $t$  test with equal variance was performed between each mutant and the wild-type for each gene.  $P$  values between all mutants and wild-type are provided. Source data are provided. **b** A diagram showing how the *Atoh7-Pou4f2/Is1* gene regulatory cascade regulates the Shh pathway in the developing retina in a complex manner, with multiple feedback loops.



**Fig. 3** scRNA-seq analysis of E13.5 wild-type (WT) and *Atoh7*-null (MT) retinas. **a, b** As indicated, uniform manifold approximation and projection (UMAP) clustering leads to the same 11 overlapping clusters (C0–C10) with both WT (**a**) and MT (**b**) retinal cells. **c** Expression of known marker genes as represented by a dot plot enables identity assignment of individual WT and MT clusters (see text for details). As indicated, the sizes of the dots indicate the percentage of cells expressing the gene in individual clusters and the color intensities denote average expression levels. Color scales represent natural-log transformed normalized gene expression levels as described in “Methods”. **d, e** Cell cycle analysis determines the cell cycle status (G1, S, and G2/M) of individual cells in the clusters. Note that largely the same cell cycle distribution is observed in the WT (**d**) and MT (**e**) retinas, and that the cell cycle statuses correlate with UMAP clustering.

generated in these two time points<sup>2,4</sup>. After filtering out blood cells, doublet cells, and stressed cells, we were able to obtain expression data of 3521 wild-type cells and 6534 *Atoh7*-null cells. The median sequence reads were 68,491 and 54,765 for wild-type and mutant cells, respectively. The median numbers of genes captured were 1975 and 2375 for wild-type and mutant cells, respectively. UMAP clustering was then performed on these cells using Seurat 3.1.1<sup>70</sup>, which resulted in a total of 11 clusters (C0–C10) for both wild-type and *Atoh7*-null cells, and the corresponding clusters highly overlapped (Fig. 3a, b). We first used known marker genes to assign identities to these clusters. These markers included *Ccnd1*, *Fgf15*, and *Sox2* for naive RPCs<sup>24,60,71</sup>, *Sox2*, *Atoh7*, and *Otx2* for subpopulations of RPCs<sup>18,23,72</sup>, *Pou4f2*

and *Pou6f2* for RGCs<sup>73,74</sup>, *Ptf1a* and *Tfap2b* for amacrine and horizontal precursor cells<sup>27,28</sup>, *NeuroD4* and *Crx* for photoreceptors<sup>22,75,76</sup>, and *Otx1* and *Gja1* for ciliary margin cells<sup>77,78</sup>. At this stage, horizontal cells and amacrine cells seemed not to have fully diverged yet and thus were grouped together (Fig. 3a, b). These marker genes were specifically expressed in distinct clusters as demonstrated by dot plots (Fig. 3c) and feature plot heatmaps (Supplementary Fig. 1). This allowed us to definitively designate their identities, including three clusters as naive RPCs (C0–C2), two as transitional RPCs (C3 and C4) for reasons further discussed below, two as RGCs (C5 and C6), one as horizontal and amacrine precursors (C7), two as photoreceptors (cones) (C8 and C9), and one as ciliary margin cells (C10).

Notably and as expected, *Atoh7* was absent and the two RGC markers *Pou4f2* and *Pou6f2* were markedly diminished in the *Atoh7*-null cells, but the corresponding clusters in which they were expressed in the wild-type, including the two transitional RPC clusters (C3, C4) and two RGC clusters (C5, C6), still existed (Fig. 3b, c, Supplementary Fig. 1). Marker genes for the other mutant clusters did not show overt changes in their expression (Fig. 3c, Supplementary Fig. 1). These results were consistent with previous knowledge that RGCs, horizontal cells, amacrine cells, and cones are the major cell types being generated at this developmental stage<sup>2,4</sup>, and that deletion of *Atoh7* specifically affects RGCs<sup>25,30</sup>.

We also performed cell cycle analysis following a protocol in Seurat 3 using 70 cell cycle markers<sup>79</sup> and found that, for both wild-type and *Atoh7*-null cells, the three naive progenitor cell clusters C0–C2 roughly co-segregated with their positions in the cell cycle, C0 in G1 and early S, C1 in S and G2/M, and C2 in G2/M (Fig. 3d, e). The transitional RPCs (C3, C4) were also actively proliferating as they were found in different phases of the cell cycle, C3 in S and G2/M and C4 in G1. On the other hand, clusters composed of differentiating cells (C5, C6, C7, C8, C9) were all in G1 (G0) phase, confirming that they were indeed postmitotic neurons. These results demonstrated that our clustering analysis accurately grouped the cells into different stages of differentiation and our identity assignments were all correct.

**Relationships between the clusters.** To further examine the characteristics of the individual clusters, we performed gene enrichment analysis of the wild-type cells by comparing the expression profile of each cluster with those of all the other clusters and identified genes that were specifically enriched in individual clusters (Supplementary Data 4). The numbers of enriched genes in these clusters ranged from 126 to 686 with Cluster 6 having the most enriched genes (Supplementary Data 4 and 5). The enriched genes further confirmed our initial cluster identity assignment, as many additional known marker genes specific for the cell states/types were enriched in the corresponding clusters (Supplementary Data 4). Examples of such genes included *Sfrp2*, *Lhx2*, *Zfp361l*, and *Vsx2* for RPCs (C0–C2)<sup>14,80–82</sup>, *Isl1*, *Nefl*, *Sncg*, *Gap43*, and *Ina* for RGCs (C5 and C6)<sup>22,49,53</sup>, *Thrb*, *Meis2*, *Prdm1*, and *Gngt2* for photoreceptors (C8 and C9)<sup>83–86</sup>, *Tfap2a*, *Prdm13*, and *Onecut2* for amacrine and horizontal cell precursors (C7)<sup>29,87,88</sup>, and *Ccnd2* and *Msx1* for ciliary margin cells (C10)<sup>89,90</sup>.

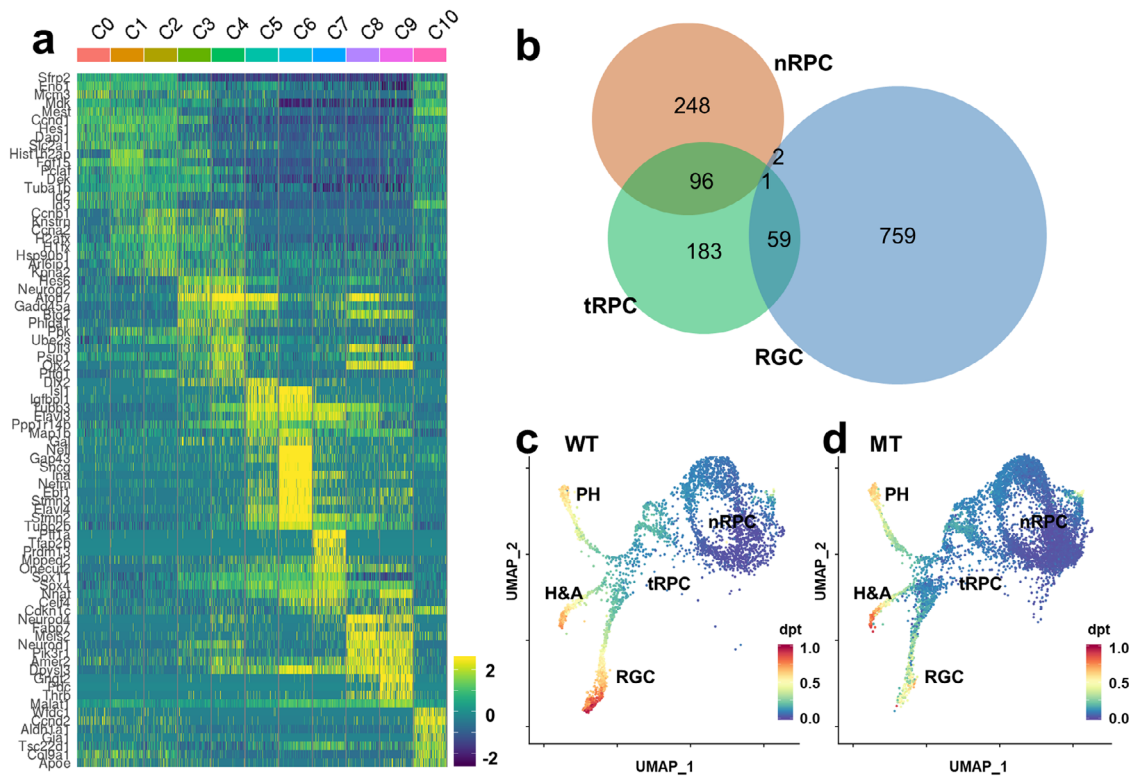
Next, we examined the expression of the top ten enriched genes as ranked by *p* values from each wild-type cluster across all the clusters and represented the data by a heatmap (Fig. 4a). This analysis did not only confirm their enrichment in the corresponding clusters but also revealed that many of these genes were expressed across several neighboring clusters, suggesting the relationships and continuity among these clusters along different developmental lineages. For example, the top ten enriched genes in C0 were also highly expressed in C1 and C2, indicating they indeed were all RPC clusters. The differences among these three clusters were likely due to their cell cycle status (Fig. 3d), as many of the cluster-specific genes are directly involved in cell cycle regulation (Supplementary Data 4). C3 and C4 were two other examples of this continuity. They continued to express many of RPC genes enriched in C0–C2, albeit at lower levels, but began to express such genes as *Atoh7*, *Dlx1*, *Dlx2*, *Neurod1*, and *Otx2*, which regulate retinal cell differentiation<sup>23,25,30,59,91</sup>. On the other hand, many of the genes in C3 and C4 trailed into the further differentiated clusters, including C5 and C6 (RGCs), C7 (horizontal and amacrine cells), and C8 and C9 (photoreceptors),

suggesting that C3 and C4 cells were intermediate transitional RPCs poised to differentiate (Fig. 4a). Although C5 and C6 were both assigned as RGC clusters, C5 continued to express many genes enriched in C3 and C4, but C6 essentially stopped expressing them (Fig. 4a). On the other hand, although C5 cells expressed the early RGC marker genes such as *Isl1* and *Pou4f2* at high levels, they had not or had just begun to express many of the RGC-specific genes encoding RGC structure and function proteins such as *Nefl*, *Sncg*, *Gap43*, *Nefm*, and *Ina*, but these genes were highly expressed C6 cells (Fig. 4a). Thus, C5 cells were nascent RGCs and C6 were further differentiated RGCs. Similarly, C8 were nascent photoreceptors and C9 were more differentiated photoreceptors based on the expression of early and later photoreceptor marker genes (Fig. 4a). As mentioned above, C7 cells were considered precursors for horizontal and amacrine cells as they expressed genes required for both lineages, such as *Ptf1a* but more specific marker genes for the two cell types were not robustly expressed yet. From these overlaps in expression the trajectories of the different cell lineages could be postulated, which all started from the naive RPCs (C0–C2), underwent the transitional RPC stage (C3, C4), and finally reached the different terminal cell fates (C5–C9).

The unidirectional trajectories were further validated by examining the overlaps of all enriched gene lists in different clusters; there were significant overlaps between the naive RPCs (C0–C2) and transitional RPCs (C3, C4), between the transitional RPCs (C3, C4) and the three terminal lineages including the RGC clusters C5 and C6, horizontal and amacrine cluster C7, photoreceptors clusters C8 and C9, but little overlaps between the naive RPCs and fate-committed neurons (Fig. 4b, and Supplementary Data 4), further confirming that C3 and C4 were in a transitional state linking naive RPCs and differentiating neurons. Of note is that C10, which was composed of the ciliary margin cells with a unique gene signature, also expressed many of the genes enriched in RPC clusters C0–C2 (Fig. 4a, Suppl Table 6), highlighting the close developmental relationship of the ciliary margin and the neural retina.

To further corroborate the relationships between the cells in these clusters, we also performed trajectory analysis using the SCANPY tool which is based on diffusion pseudotime (DPT) by measuring transitions between cells using diffusion-like random walks<sup>92</sup>. As shown in Fig. 4c and consistent with the conclusions from the heatmap with the cluster-enriched genes, three definitive trajectories representing photoreceptors, horizontal and amacrine cells, and RGCs were identified, which all originated from the transitional RPCs that were downstream of the naive RPC clusters. Not surprisingly, being the first cell types to form, the RGC trajectory advanced the furthest (Fig. 4c). All three trajectories also existed in the *Atoh7*-null cells (Fig. 4d); whereas the other two trajectories were not affected, the RGC trajectory appeared to have progressed through C5 but stalled at C6, consistent with the fact that RGCs are specifically affected in the *Atoh7*-null retina.

**Characteristics of individual cell states during retinal development.** To better understand the properties of the cell states/types represented by individual clusters, we further examined the biological function of the enriched genes in these clusters by GO analysis of each of these lists<sup>57</sup>. For simplicity, we combined similar clusters, including C0 to C2 (naive RPCs), C3 and C4 (transitional RPCs), C5 and C6 (RGCs), and C8 and C9 (photoreceptors) (Table 1). The top five GO biological processes enriched in naive RPCs were cell cycle, cell division, mitotic nuclear division, nucleosome assembly, and chromosome segregation, confirming that they were indeed actively dividing RPCs



**Fig. 4 Cluster-specific gene expression reveals the relationships among the wild-type clusters.** **a** A heatmap showing the top ten enriched genes in each cluster. Each horizontal line represents one gene and each vertical line represents one cell. Data from equal numbers (100) of cells from each cluster are shown. The heatmap demonstrates the continuity and directionality between these clusters. The color scale represents relative expression levels which were generated by averaging the normalized gene expression values in each cluster and then centering and scaling the values in each row using R bioconductor package “pheatmap” (see “Methods”). **b** A Venn diagram showing the overlaps of enriched genes between naive RPCs (nRPC, C0–C2), transitional RPCs (tRPC, C3 and C4), and retinal ganglion cells (RGCs, C5 and C6). tRPCs have substantial overlaps with both nRPCs and RGCs, but nRPCs and RGCs have very few overlapped genes, indicating the unidirectional relationship of these clusters. Source data are provided in Supplementary Data 4. **c, d** Developmental trajectories predicted by the SCANPY tool based on diffusion pseudotime (DPT), which measures transitions between cells (see “Methods” for details). The color scales represent estimated DPTs for individual cells, where 0 is the start pseudotime, and 1 is the end pseudotime. Three trajectories representing the emergence of photoreceptors (PH), horizontal and amacrine cells (H&A), and RGCs from RPCs are identified for both the wild-type (WT) (**c**) and *Atoh7*-null (MT) (**d**) cells. The direction of each lineage is clearly discernible, although the RGC lineage of the MT cells does not advance as far as the WT cells.

at different phases of the cell cycle (Table 1). Two of the top five GO terms associated with C3 and C4 included cell cycle and cell division, further implying they were still RPCs. Interestingly, the other three top GO terms were all associated with RNA processing (Table 1), indicating that this process plays a critical role in these transitional RPCs. In contrast, GO terms enriched in RGCs, horizontal and amacrine cells, and photoreceptors were all related to the various aspect of neural development and function, further confirming that their identities were correctly assigned and that the enriched genes were involved in their formation.

The enriched gene lists also included many genes with unknown expression patterns and functions in the retina. To examine how faithful these enriched genes reflected their actual expression patterns in the developing retina, we chose genes from the enriched lists whose expression and function have not been well analyzed and compared their predicted expression patterns as presented by feature plots with that reported in the Eurexpress in situ hybridization database<sup>93</sup> (<http://www.eurexpress.org/ee/>). We found that the feature plots almost always correctly predicted the actual expression patterns in Eurexpress when the data is available, often with more details than in situ hybridization, as exemplified by 5 naive RPC enriched genes and 10 RGC-enriched genes whose expression and function in the retina have not been characterized (Supplementary Fig. 2, Supplementary Data 4).

Thus, the clustering data based on scRNA-seq analysis can serve as a very useful resource for identifying novel genes as markers or candidates for further functional analysis.

The scRNA-seq data also clarified contradicting results on two genes critical in retinal development. *Sox4* and *Sox11*, which encodes two transcription factors essential for RGC development<sup>94–96</sup>, are expressed mostly in RGCs, but there have been conflicting reports regarding whether they are also expressed in RPCs<sup>52,95–97</sup>. In the *Atoh7*-null retina, since most RGCs are absent, it was indicated that *Sox4* and *Sox11* were downregulated<sup>52,95</sup>. However, we did not detect significant changes in conventional RNA-seq analysis (Supplementary Data 2). These contradicting results were resolved by comparison of their expression in corresponding clusters; both genes were extensively expressed in all the clusters (Fig. 5a, b), but were at lowest levels in naive RPCs (C0–2), began to increase in the transitional RPCs (C3, C4), and reached the highest levels in RGCs (C5, C6) and amacrine and horizontal precursors (C7) (Fig. 5c). These patterns were further confirmed by in situ hybridization with RNAscope probes<sup>98</sup> (Fig. 5d, e). In the *Atoh7*-null retina, the overall patterns of *Sox4* and *Sox11* remained and the levels were comparable in all clusters, with only moderate upregulation of *Sox4* in differentiated RGCs (C6, Fig. 5c). Therefore, despite the loss of RGCs, the overall expression levels of these two genes did not change in the *Atoh7*-null retina as detected by regular RNA-seq

**Table 1 Enriched GO terms for individual cell states/types.**

Term	Count	%	Fold enrichment	P Value
Naive RPCs (C0–C3)				
Cell cycle	64	18.66	5.84	2.63E–30
Cell division	51	14.87	7.63	2.13E–29
Mitotic nuclear division	42	12.24	8.49	6.07E–26
Nucleosome assembly	22	6.41	11.84	1.20E–16
Chromosome segregation	16	4.66	10.06	4.83E–11
Transitional RPCs (C3, C4)				
RNA splicing	35	10.42	8.42	1.85E–21
Cell cycle	51	15.18	4.81	2.52E–20
MRNA processing	37	11.01	6.66	3.06E–19
Cell division	34	10.12	5.27	1.29E–14
mRNA splicing, via spliceosome	19	5.65	9.83	7.01E–13
RGCs (C5, C6)				
Nervous system development	63	7.67	4.07	3.24E–21
Axon guidance	31	3.78	5.07	3.39E–13
Axonogenesis	25	3.05	5.69	7.00E–12
Neuron projection development	24	2.92	4.21	1.07E–08
Substantia nigra development	13	1.58	8.34	2.08E–08
Horizontal an amacrine cells (C7)				
Nervous system development	30	8.17	4.35	7.13E–11
Axon guidance	16	4.36	5.87	9.73E–08
Cell differentiation	34	9.26	2.38	6.70E–06
Neuron migration	12	3.27	5.29	1.71E–05
Multicellular organism development	38	10.35	2.02	6.55E–05
Photoreceptors (C8, C9)				
Visual perception	25	7.31	4.06	1.39E–08
Photoreceptor cell maintenance	13	3.80	5.99	1.82E–06
Synaptic vesicle exocytosis	7	2.05	10.73	4.23E–05
Negative regulation of transcription from RNA polymerase II promoter	5	1.46	16.13	2.19E–04
Positive regulation of transcription from RNA polymerase II promoter	26	7.60	2.19	3.79E–04

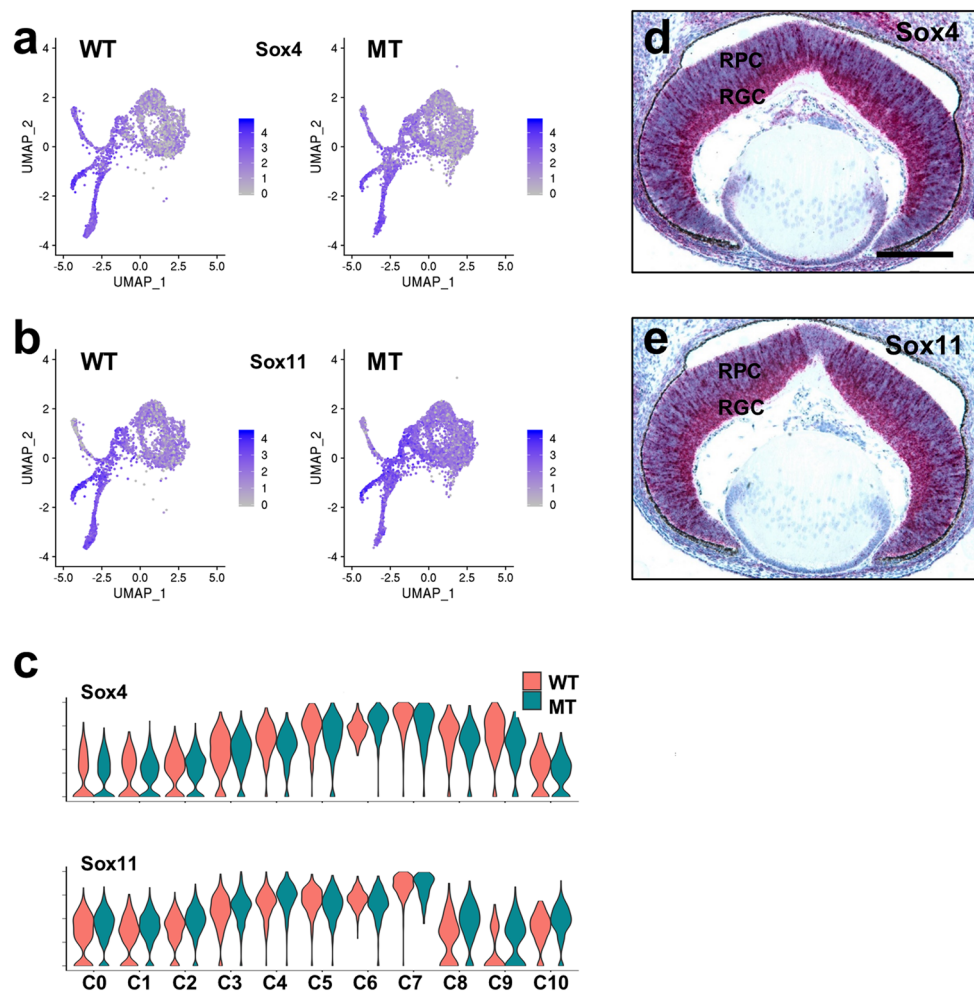
using total RNA from whole retinas. Nevertheless, as further discussed later, the differential expression levels of *Sox4* and *Sox11* along the differentiation trajectories may be related to their functions in the retina, particularly in RGC genesis.

***Atoh7* marks a transient state shared by all early differentiation cell fates.** Cells in C3 and C4 appeared to represent a critical transitional stage linking naive RPCs and differentiating neurons along individual lineage trajectories. They were considered RPCs since they still were in the cell cycle (Fig. 3d, e), expressed many RPC marker genes (Fig. 4a, b, Supplementary Data 4), and their fate was not committed (Fig. 4c). Nevertheless, the expression of many of the general RPC marker genes was significantly decreased in these cells (Fig. 3c, Fig. 4a). Close examination indicated that these cells expressed many genes involved in specific cell lineages, including *Atoh7*, *Sox4*, *Sox11*, *Neurog2*, *Neurod1*, *Otx2*, *Onecut1*, *Foxn4*, *Ascl1*, *Olig2*, *Dlx1*, *Dlx2*, and *Bhlhe22* (Fig. 6a and Supplementary Data 4). These genes have all been reported to be expressed in subsets of RPCs, and function in or mark specific lineages. For example, *Atoh7* and *Neurog2* are required for the RGC lineage<sup>31,32,99</sup>, *Otx2* and *NeuroD1* functions in the photoreceptor lineage<sup>23,91</sup>, whereas *Olig2*-expressing cells give rise to cone and horizontal progenies<sup>19</sup>. *Onecut1* and *Onecut2* function in essentially all the early retinal cell lineages<sup>26,29</sup>. Other such genes included *Foxn4* for horizontal and amacrine cells, *Dlx1* and *Dlx2* for RGCs and amacrine cells, and *Bhlhe22* (also known as *bHLHb5*) for amacrine cells and bipolar cells<sup>21,58,100–102</sup>.

The fact that these cells were clustered together and were enriched with these genes for different lineages indicated that they possessed shared properties. More interestingly, *Atoh7* was

expressed in almost all cells in C3 (86%) and C4 (99%) and trailed into all three differentiating lineages (Fig. 6a–c). Although this was consistent with previous findings that *Atoh7*-expressing cells are not fate-committed and can adopt all retinal fates<sup>31,32,46</sup>, the high percentage of transitional RPCs expressing *Atoh7* was unexpected and likely significant. Moreover, several other factors such as *Neurog2*, *Neurod1*, and *Otx2* were also expressed in substantial portions of cells in C3 (68%, 58%, and 38%, respectively) and C4 (70%, 67%, and 66%, respectively) (Fig. 6a–c). Noticeably, in the *Atoh7*-null retina, the proportions of *Neurog2*- and *Neurod1*-expressing transitional RPCs (C3 and C4) only increased slightly, and that of *Otx2*-expressing transitional RPCs did not change (Fig. 6c). *Neurog2* and *Neurod1* were essentially turned off in wild-type nascent RGCs (C5) but remained highly expressed in corresponding *Atoh7*-null cells (Fig. 6c).

As the trajectories of individual lineages progressed, the relative activities of these genes changed accordingly. In the nascent RGCs (C5), whereas *Atoh7* continued to be expressed at high levels, *Neurog2*, *Neurod1*, and *Otx2* were much reduced in expression (Fig. 6a, b, d). On the contrary, in the photoreceptor lineage (C8 and C9), *Atoh7* and *Neurog2* levels dropped significantly, but *Neurod1* and *Otx2* increased markedly (Fig. 6a, b, d). As mentioned above, *Sox4* and *Sox11* had elevated expression in the transitional RPCs (C3 and C4) and continued to be expressed in all lineages (Figs. 5a–c, 6a). Nevertheless, other factors, such as *Olig2*, *Onecut1*, *Foxn4*, *Ascl1*, seemed to be expressed in considerably fewer transitional RPCs (Fig. 6a). However, the overlaps between these genes could be more extensive as the percentage of gene expression in each cluster was likely underestimated due to sequence depth and expression levels. Nevertheless, the transitional RPCs likely remained heterogeneous.



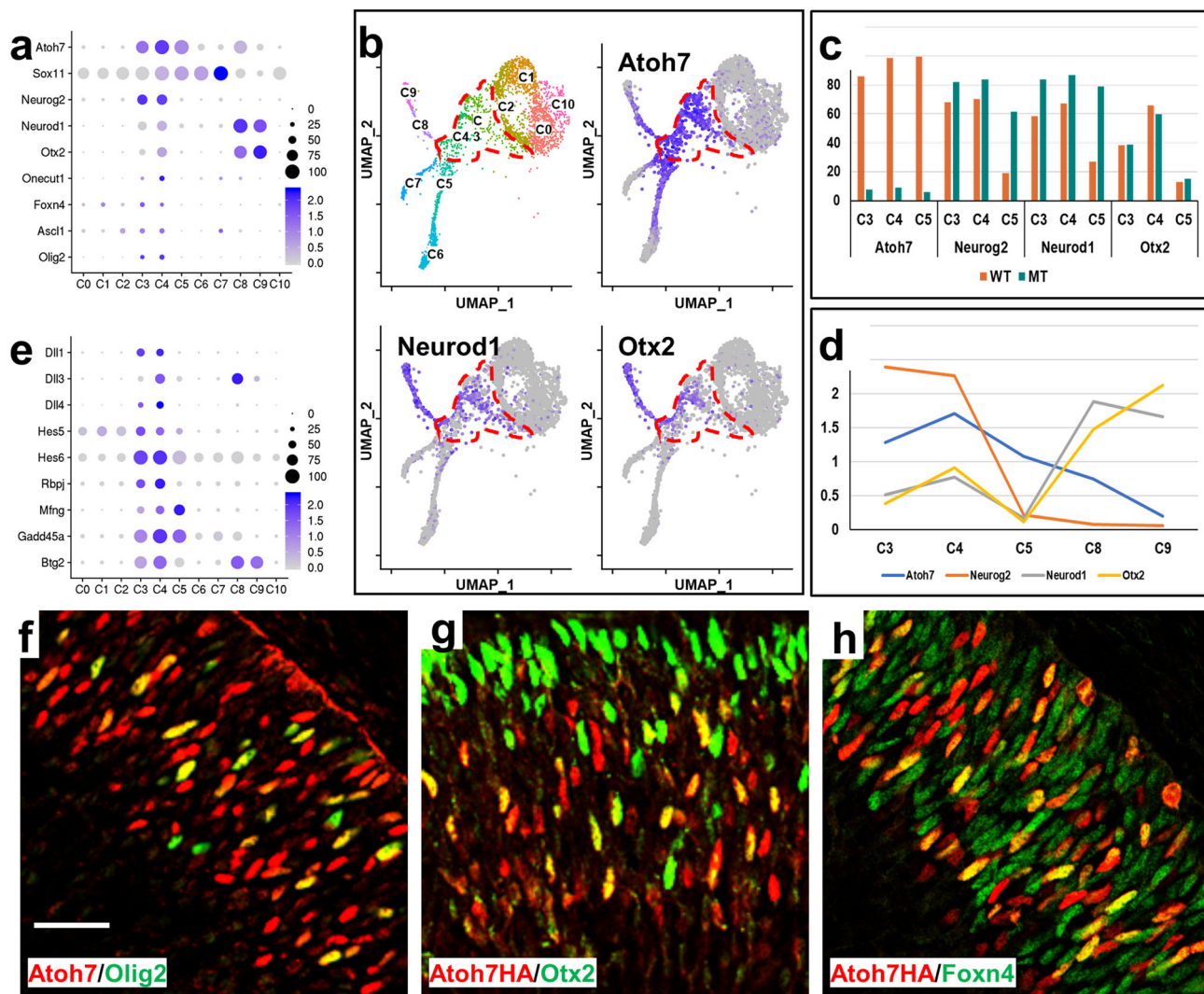
**Fig. 5 Spatial expression of Sox4 and Sox11.** **a, b** Feature plot heatmaps indicate that both genes are expressed in all clusters but at much higher levels in differentiating cells, and that their expression levels are comparable in wild-type (WT) and *Atoh7*-null (MT) cells. Color scales represent natural-log transformed normalized gene expression levels as described in “Methods”. **c** Violin plots indicate that both genes are expressed in comparable levels in corresponding WT (red) and MT (blue) clusters. The heights of the plots represent expression levels as described in “Methods” and the widths represent relative proportions of cells expressing the gene at that level. **d, e** In situ hybridization with RNAscope probes confirms that *Sox4* and *Sox11* are expressed in both retinal progenitor cells (RPCs) and retinal ganglion cells (RGCs). Note that both genes are highly expressed in a subset of RPCs in the outside part of the retina, which presumably are the transitional RPCs. Each in situ hybridization experiment was performed three times with independent retinal sections. The scale bar is 150  $\mu\text{m}$ .

Another prominent feature of the transitional RPCs is that many genes encoding components of the Notch pathway, including *Dll1*, *Dll3*, *Dll4*, *Notch1*, *Hes5*, *Hes6*, and *Mfng* were enriched, further emphasizing the critical roles of this pathway in retinal development (Fig. 6e, Supplementary Data 4). The expression of *Dll1*, *Dll3*, and *Dll4* was of particular interest; they all were only expressed highly in transitional RPCs (C3 and C4) and the differentiating clusters, but not much in the naive RPC clusters. Although *Hes5*, one of the effector genes of the pathway, was enriched, *Hes1*, another downstream effector of the pathway, was significantly downregulated in C3 and C4, as compared to the naive RPCs (Supplementary Data 4), indicating that these two genes were differentially regulated and likely had both shared and distinct functions<sup>69,103</sup>. These findings suggested that when selected RPCs were poised for differentiation and began to express *Atoh7* and genes for other fates, they also elevated the levels of ligands of the Notch pathway, which in turn modulate the Notch activities in the naive RPCs. Likely this is part of the mechanism by which the balance between proliferation and differentiation is achieved.

Many additional genes, e.g., *Gadd45a*, *Btg2*, *Penk*, *Srrm4*, and *Plk1*, *Sstr2*, and *Ccnb1*, were enriched in the transitional RPCs (Fig. 6e, Supplementary Data 4), but their roles are mostly unknown. For example, *Gadd45a* and *Btg2*, two genes involved in cell cycle arrest, DNA repair, and apoptosis<sup>104–107</sup>, were highly enriched in transitional RPCs, but they diverge in the differentiating lineages (Fig. 6e). *Gadd45a* continued to be expressed in nascent RGCs (C5), whereas *Btg2* maintained its expression in photoreceptors (C8, C9) (Fig. 6e). We further confirmed by RNAscope in situ hybridization that they each indeed were expressed in a subset of RPCs at different developmental stages examined (E12.5, E14.5, and E17.5), with patterns very similar to that of *Atoh7*<sup>18,72,108</sup> (Supplementary Fig. 3). Both genes are responsive to stress-induced growth arrest and inhibit the G1/S progression in the cell cycle. Although their roles in retinal development have not been well studied, they likely participate in establishing the transitional cell state in these cells, which are poised to exit the cell cycle and commit to distinct cell fates.

Our findings that *Atoh7* and genes for other cell lineages co-express in the transitional RPCs were consistent with previous co-



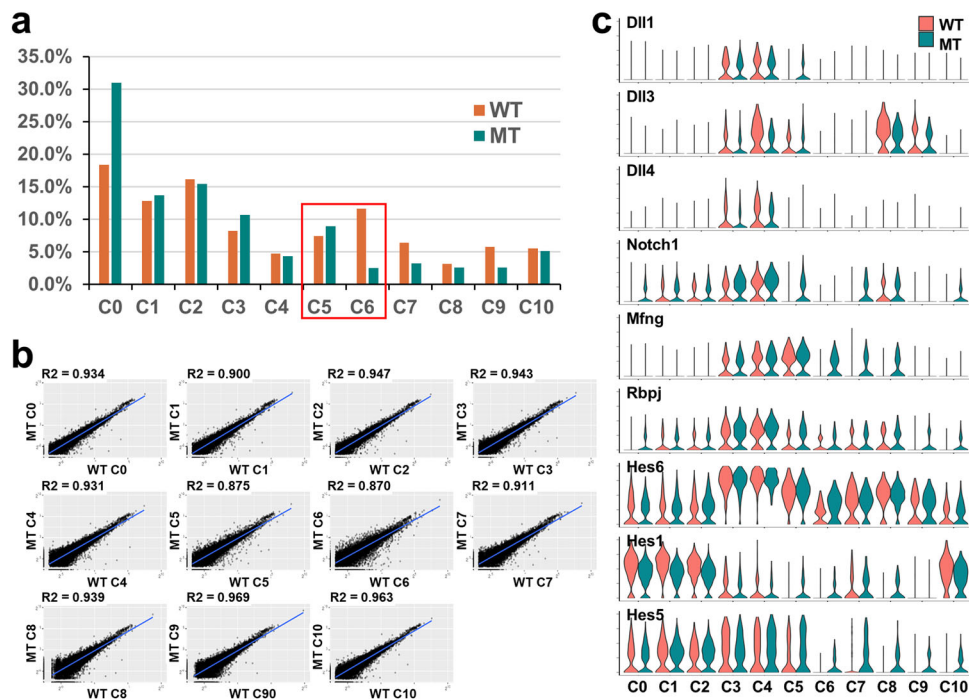


**Fig. 6 Gene expression signature of transitional RPCs (C3, C4).** **a** Genes regulating distinct lineages are expressed in a shared transitional state, namely transitional retinal progenitor cells (RPCs), as demonstrated by a dot plot. Often these genes continue to be expressed in the specific cell lineage they regulate, e.g., *Atoh7* and *Sox11* in retinal ganglion cells (RGCs) (C5), and *Otx2* in photoreceptors (C8, C9). The color scale represents natural-log transformed normalized gene expression levels. **b** Feature heatmap showing the expression of *Atoh7*, *Neurod1*, and *Otx2* in the wild-type clusters. The dotted line demarcates the transitional RPCs (C3 and C4). Consistent with the dot plot, all three genes are expressed in transitional RPCs, but *Atoh7* is expressed in more transitional RPCs than *Neurod1* and *Otx2*. Whereas *Atoh7* trails into all three lineages, *Neurod1* and *Otx2* only continue to be expressed in photoreceptors. **c** Percentage of cells expressing *Atoh7*, *Neurog2*, *Neurod1*, and *Otx2* in the transitional RPCs (C3, C4) and nascent RGCs (C5) in the wild-type (WT) and *Atoh7*-null (MT) retinas. **d** Changes in activities of *Atoh7*, *Neurog2*, *Neurod1*, and *Otx2* as cells progress into distinct lineages. For each gene, the gene activity in each cluster is derived by the expression level of that cluster divided by the mean of all clusters. **e** Additional genes, including many encoding components of the Notch pathway, are enriched in the transitional RPCs (C3, C4). The color scales represent natural-log transformed normalized gene expression levels. **f-h** Immunofluorescence staining shows substantial co-expression of *Atoh7* or *Atoh7HA* with *Olig2* (f), *Otx2* (g), and *Foxn4* (h) in RPCs. Note the yellow cells are those expressing both markers in each panel. In the case of *Otx2*, which is expressed in both RPCs and photoreceptors (g), the co-expression only occurs in the RPCs. Each of the co-staining experiments (f-h) was performed three times with sections from different animals. The scale bar is 25  $\mu$ m. Source data in (c, d) are provided.

immunofluorescence staining showing that *Atoh7* (or *Atoh7HA* from the *Atoh7<sup>HA</sup>* allele) overlaps substantially with multiple relevant factors such as *Neurog2*, *Neurod1*, *Onecut1*, and *Onecut2*<sup>20,108,109</sup>. Further, by co-immunofluorescence staining, we confirmed that large proportions of *Olig2*-, *Otx2*- and *Foxn4*-expressing RPCs ( $67.53 \pm 4.66\%$ ,  $60.43 \pm 9.47$  and  $45.03 \pm 5.39$ , respectively,  $n = 4$ ) also expressed *Atoh7* (Fig. 6f-h). The relatively low percentage of *Foxn4* positive cells expressing *Atoh7* likely was due to *Foxn4* also being expressed in naive RPCs (Fig. 6a). These results indicated that all the early retinal cell fates go through a shared cell state which is characterized by downregulation of naive RPC genes, including those for cell

cycle progression, upregulation of the Notch ligands, downregulation of the Notch pathway, and upregulation of neurogenic genes for various retinal fates. Of note is that, although *Atoh7* was expressed in essentially all transitional RPCs, deletion of *Atoh7* did not affect the formation of this cell state (Figs. 3b, 4d, 6c), indicating that *Atoh7* is not required for the establishment of this critical cell state in retinal development.

**Cell cluster-specific changes in gene expression in the *Atoh7*-null retina.** Corresponding E13.5 wild-type and *Atoh7*-null clusters almost completely overlapped in the 2D projection of the



**Fig. 7 Comparison of wild-type and *Atoh7*-null clusters.** **a** Proportions of cells in each wild-type (WT, red) and *Atoh7*-null (MT, blue) clusters. Nascent retinal ganglion cells (RGCs) (C5) and differentiated RGCs (C6) are highlighted by a red box. Note there is no major change in the proportion of cells in C5, but a marked reduction in C6. Source data are provided. **b** Scatter plots comparing gene expression in corresponding pairs of WT and MT clusters. The correlation coefficients ( $R^2$ ) are shown for each pair. The C5 and C6 pairs have the lowest  $R^2$  values, indicating the most changes in gene expression. **c** Violin plots showing cluster-specific changes in expression of the Notch pathway genes. Note the distinct expression patterns of individual genes and differential expression changes in the MT clusters (see text for details).

UMAP analysis (Fig. 3a, b). Most clusters, including the transitional RPCs (C3 and C4), contained comparable proportions of cells in the wild-type and mutant retinas (Fig. 7a). However, several clusters demonstrated marked changes. There was an about two-fold increase in the proportion of mutant C0 cells. Since most C0 cells were in G1/S of the cell cycle (Fig. 2c, d), this may reflect the reduced proliferation of the naive RPCs caused by reduced Shh signaling and the G1/S cyclin (Cyclin D1) levels (Fig. 2<sup>22,31,61,63,110</sup>), but the other pathways including the Notch pathway may also be involved. The cell number in mutant C7 reduced almost by half, which is consistent with previous reports suggesting that *Atoh7* plays a role in the genesis of horizontal cells<sup>31,52</sup>. There was also a noticeable drop in the number of nascent photoreceptor cells (C8), but no change in the more differentiated photoreceptors (C9). The significance of this observation is not known. The mutant cluster with the most significant change was C6, which were differentiating RGCs, with an ~5 fold reduction as compared to the wild-type cluster (Fig. 7a). However, the nascent RGC cluster (C5) and the transitional RPC clusters (C3 and C4) did not show obvious changes in cell numbers. As discussed earlier, deletion of *Atoh7* did not substantially affect the overall cell cycle status of each cluster except for C0 as noted above, the relationships of the different clusters, or the overall trajectories of the distinct lineages (Figs. 3a–e, 4c, d).

The same corresponding clusters observed in the *Atoh7*-null retina provided us the opportunity to probe the cell state/type-specific gene expression changes caused by deletion of *Atoh7*. Global gene expression between corresponding wild-type and *Atoh7*-null clusters were highly similar as revealed by the scatter plots; the correlation coefficients ( $R^2$ ) ranged from 0.870 to 0.969 (Fig. 7b). The high  $R^2$  values indicated that gene expression levels detected by scRNA-seq were highly robust

and reproducible. They were also consistent with the knowledge that *Atoh7* functions highly specifically in the RGC lineage. Accordingly, the two RGC clusters (C5 and C6) had the lowest  $R^2$  values (0.875 and 0.870, respectively). By comparing corresponding wild-type and *Atoh7*-null clusters, we identified a total of 1829 DEGs (Supplementary Data 6). Comparison with the DEG list from conventional RNA-seq revealed an overlap of only 290 genes (Supplementary Data 2, 6). Further examination of the none-overlapped genes indicated scRNA-seq could not effectively detect DEGs with relatively low expression levels. For example, *Shh* was readily detected as a DEG by regular RNA-seq, but not by scRNA-seq, although *Gli1*, the downstream target gene of the Shh pathway, was detected by both methods (Fig. 2a, Supplementary Data 2, 6). This was likely due to the relatively low sequencing coverage of the transcriptome in scRNA-seq. Conventional RNA-seq, on the other hand, was inefficient in detecting DEGs that were expressed in multiple clusters but the change only occurred in selected clusters (see below). These results indicated that each method had limitations in identifying DEGs, particularly in tissues with complex cellular compositions, and that the two methods were complementary in providing a more complete picture of changes in gene expression.

Nevertheless, genes identified by comparing the corresponding wild-type and mutant clusters provided further insights into the function of *Atoh7*. Our focus will be on the DEGs in naive RPCs, transitional RPCs, and RGCs (Supplementary Data 6), since they were directly related to RGC development, whereas only small numbers of DEGs were detected for other clusters (Supplementary Data 6). Consistently, GO analysis of downregulated DEGs in naive RPCs (C0–2) by DAVID revealed the top enriched biological process GO terms included protein folding, mRNA processing/RNA splicing, and cell division/cell cycle

(Supplementary Data 6, 7). These biological processes are all required for active proliferation, which is a property of naive RPCs. Example DEGs directly involved proliferation included *Ccnd1*, *Lig1*, *Mcm3*, and *Mcm7*. On the other hand, one of the prominent features of the biological processes associated with the upregulated DEGs is gene regulation associated with neural development (Supplementary Data 7). These results suggested that there was a shift in the properties of the naive RPCs from proliferation to differentiation. Since *Atoh7* is not expressed in these cells (Figs. 3c, 6b), this shift likely was caused by non-cell autonomous mechanisms, highlighting the interaction between RGCs and RPCs. DEGs in the transitional RPCs (C3 and C4) likely reflected its direct function. Downregulated genes included those implicated in the RGC lineage, such as *Dlx2* and *Eya2*, those involved in mRNA processing, and the Delta-like ligand genes (see below), but not cell cycle genes (Supplementary Data 6, 7). On the other hand, upregulated DEGs included those encoding a large number of transcription factors, many of which, such as *Foxn4*, *Neurod1*, and *Onecut2*, are involved in non-RGC lineages.

As expected, the largest number of DEGs were found between the wild-type and mutant RGC clusters (C5 and C6); 450 DEGs were found in C5, 618 DEGs were found in C6, and collectively a total of 861 DEGs were identified in these two clusters (Supplementary Data 6). These genes are directly relevant to the establishment and maintenance of the RGC identity; among them included *Pou4f2* and *Isl1* and many other previously identified genes encoding regulatory, functional, and structural proteins critical for RGC differentiation, which was further confirmed by GO analysis (Supplementary Data 7)<sup>49,50,52,53</sup>. As further discussed later, the upregulated DEGs in the mutant RGCs featured a large set of genes normally expressed in RPCs and/or other cell types, including those of the Notch pathway (Supplementary Data 6). These upregulated DEGs indicated the RGC lineage, although still formed in the *Atoh7*-null retina, was immature and likely had mixed identities.

One interesting observation from the cluster-specific comparisons of the scRNA-seq data was that the Notch pathway was affected in a complex fashion in the *Atoh7*-null retina (Fig. 7c, Supplementary Data 6). In the naive RPCs (C0–C2), *Hes1*, but not *Hes5*, was significantly downregulated (Fig. 7c, Supplementary Data 6), indicating the downregulation of the Notch pathway. Since *Hes1* is a convergent signaling node<sup>61,63,68</sup>, its downregulation likely resulted from the combined dysregulation of multiples pathways, including the Shh pathway, the Vegf pathway, and the Notch pathway its self. Consistently, in the transitional RPCs (C3 and C4), all three delta-like ligand genes, *Dll1*, *Dll3*, and *Dll4*, were markedly reduced, but other genes enriched in these cells, including *Notch1*, *Mfng*, and *Rbpj*, and *Hes6*, did not change (Fig. 7c, Supplementary Data 6). On the other hand, multiple Notch pathway genes, including *Dll1*, *Dll3*, *Notch1*, *Mfng*, *Rbpj*, *Hes1*, and *Hes5*, were upregulated in RGCs (C5 and/or C6) (Fig. 7c, Supplementary Data 6). Thus, *Atoh7*, which is expressed in the transitional RPCs, may influence the Notch pathway in multiple cell types, likely through regulating the Delta-like ligand genes directly and the other signaling pathways indirectly. As suggested above, the continued expression of Notch components in the RGCs may reflect their immaturity and stalled differentiation.

It is worth noting that the functions of many of the DEGs, both down- and upregulated, are unknown. Such examples included genes encoding members of the chaperonin containing TCP1 complex (*Cct3*, *Cct4*, *Cct5*, *Cct6A*, *Cct7*, *Cct8*), proteins involved in mRNA processing, and many transcription factors (e.g., *Insm1*, *Id1*, *Id2*, and *Id3*) (Supplementary Tables 8–17). Further investigations are needed to understand their roles in retinal development.

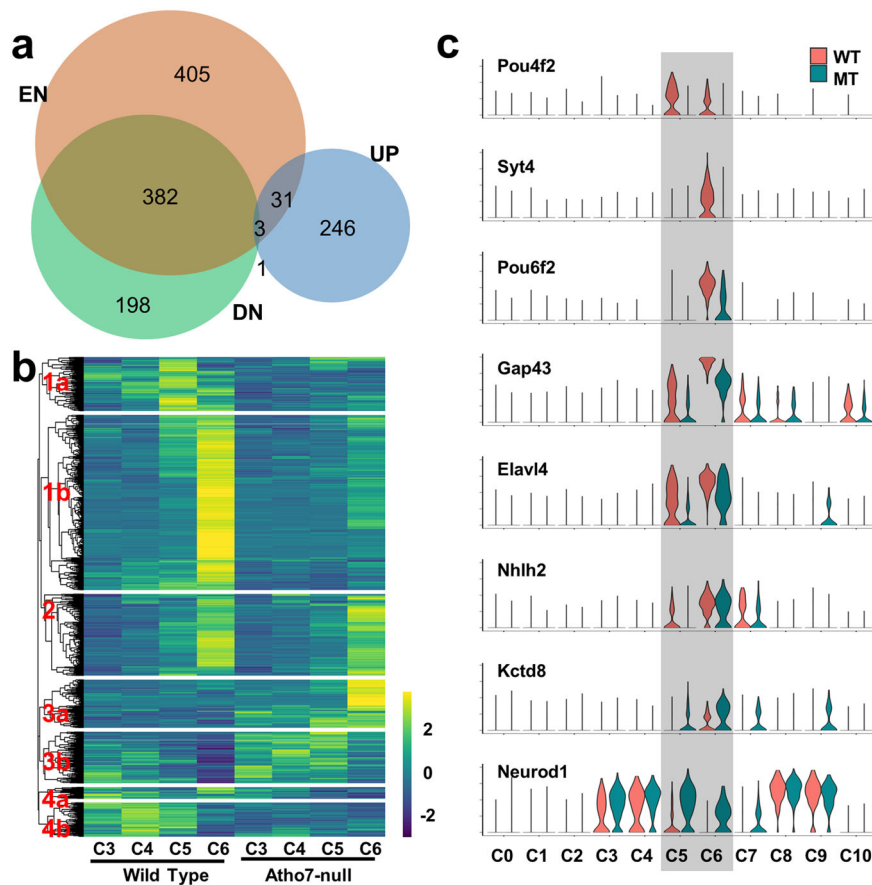
**The RGC lineage forms and advances substantially in the absence of *Atoh7*.** The two clusters representing the RGC lineage (C5 and C6) were still present in the *Atoh7*-null retina (Figs. 3b, 7a). Although a significant reduction in cell number was found in more differentiated RGCs (C6) as expected, no major change in the proportion of nascent RGCs (C5) was observed in the *Atoh7*-null retina (Fig. 7a). Thus, the RGC lineage was still formed initially, but its developmental trajectory stalked prematurely (Figs. 4c, d, 7a). These findings indicated that, contrary to the previous conclusions<sup>25,30</sup>, the RGC lineage still emerged and advanced considerably in the absence of *Atoh7*, although most cells eventually failed to differentiate into fully functional RGCs.

To better understand the underlying genetic mechanisms for the defective RGC development in the *Atoh7*-null retina, we further examined the DEGs in C5 and C6 by comparing them (861 genes, Supplementary Data 6) with the enriched genes in C5 and C6 (821 genes, Supplementary Data 4), which were mostly RGC-specific genes (Fig. 8a). Although a significant portion of the C5/C6-enriched genes (386 genes) were downregulated as expected, many of them did not change in expression (405 genes). A small number of C5/C6-enriched genes (34 genes) were upregulated. On the other hand, many downregulated DEGs (198 genes) and most upregulated DEGs (246 genes) were not enriched in C5/C6. These findings suggested these genes were regulated in different modes in the RGC lineage.

To further confirm these findings, we performed unsupervised clustering of all the 1266 genes included in the C5/C6 DEG list and RGC-enriched gene list across the clusters of wild-type and *Atoh7*-null cells. This led to 7 groups of genes with distinct expression dynamics across the clusters, including RGC-enriched and downregulated (Group 1a, b); RGC-enriched but not significantly changed (Group 2); none RGC-enriched but upregulated (Group 3a, b); and none RGC-enriched but downregulated (Group 4a, b) (Fig. 8b, only C3 to C6 are shown, and Supplementary Data 8). Example genes representing some of these distinct expression modes across different cell types/states were more clearly demonstrated by violin plots (Fig. 8c). From these analyses, it was apparent that, as expected, a large proportion of RGC-specific genes, including *Pou4f2*, *Isl1*, *Syt4*, *Pou6f2*, *Gap43*, *Elavl4*, were downregulated in the *Atoh7*-null retina (Fig. 8). Among them, some genes, such as *Pou4f2* and *Syt4* exhibited little expression in the mutant, but other genes, such as *Pou6f2*, *Gap43*, *Elavl4*, were still expressed at variable but substantial levels (Fig. 8b, c). In addition, a substantial number of RGC genes such as *Nhlh2* remained expressed at similar levels as in the wild-type retina (Fig. 8b, c). The remaining RGC-specific gene expression in the *Atoh7*-null retina, albeit often at lower levels, likely underlay the presence of nascent and differentiating RGCs.

Nevertheless, these RGCs not only failed to express a large number of genes either completely or at sufficient levels, but also aberrantly overexpressed many genes not enriched in RGCs (Groups 3a, b in Fig. 8b, c). Some of these genes, e.g., *Kctd8* (Fig. 8c), were expressed at low levels in all wild-type clusters but were significantly upregulated specifically in RGCs (Group 3a). Other genes expressed in naive and transitional RPCs but not in RGCs in the wild-type retina remained expressed in the mutant RGCs (Group 3b). As mentioned earlier, among these genes included the Notch pathway genes, *Neurod1*, and *Neurog2*. *Neurod1*, which is normally expressed in the transitional RPCs (C3 and C4) and photoreceptors (C8, and C9), but not in RGCs (C5 and C6) (Figs. 6c, d, 8c) became highly overexpressed in the *Atoh7*-null RGCs (Fig. 8c).

The collective dysregulation of genes in *Atoh7*-null cells likely led to the truncated RGC trajectory. These cells progressed to an RGC-like state by expressing many of the RGC genes, often at

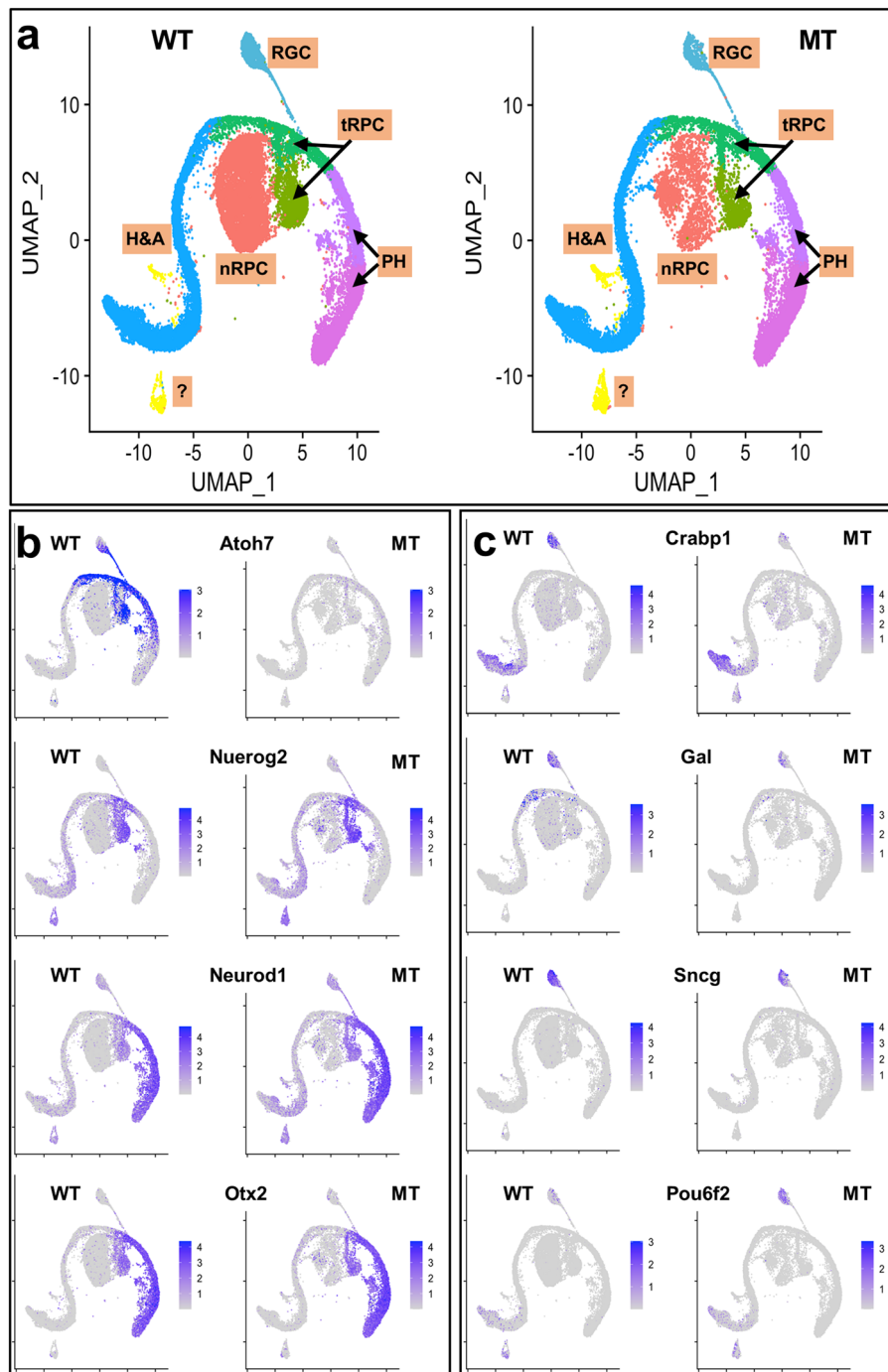


**Fig. 8 Gene expression underlying the retinal ganglion cell (RGC) lineage in the *Atoh7*-null retina.** **a** Overlaps of down- and upregulated DEGs (DN and UP, respectively) in *Atoh7*-null RGCs and RGC-enriched genes (EN) as presented by a Venn-diagram. Source data are provided. **b** Euclidean distance clustering demonstrating seven different modes of changes in gene expression in *Atoh7*-null retinal RGCs (C5 and C6, see main text for details). For comparison, expression in C3 and C4 are also presented. The color scale represents relative expression levels which were generated by averaging the normalized gene expression values in each cluster and then centering and scaling the values in each row using R bioconductor package “pheatmap” (see “Methods”). **c** Example genes with different modes of expression as demonstrated by violin plots, showing their expression levels (heights of plots, representing natural-log transformed normalized gene expression levels as described in “Methods”) across all clusters of wild-type (WT, red) and *Atoh7*-null (MT, blue) cells. *Pou4f2* is from group 1a in (**b**), *Syt4*, *Pou6f2*, *Gap43*, and *Elavl4* are from group 1b, *Nhlh2* is from group 2, *Kctd8* is from group 3a, and *Neurod1* is from group 3b.

reduced levels, but also overexpressed many genes abnormally. Because of the aberrant gene expression, they failed to fully differentiate into more mature RGCs and many of them, if not all, likely died<sup>32</sup>. Noticeably, in the *Atoh7*-null retina, we did not find increased expression of genes directly involved in apoptosis in either the regular RNA-seq or scRNA-seq. This likely was due to the relatively small number of dying cells at any given time and that very few dying cells, if any, contributed to the single cell libraries.

**Effects on retinal development at E17.5 by *Atoh7* deletion.** To further investigate what occurred to the RGCs in the *Atoh7*-null retina as development proceeded, we also compared expression profiles of the wild-type and *Atoh7*-null retinas at E17.5, a time when RGC production significantly decreased<sup>4,18</sup>. Since the proportions of cells in RGC lineage become increasingly smaller as development advances<sup>4,18</sup>, we took advantage of two knockin-mouse lines, *Atoh7<sup>zsGreenCreERT2</sup>* and *Pou4f2<sup>FlagtdTomato</sup>*, which label *Atoh7*- and *Pou4f2*-expressing cells respectively, and enriched these cells by FACS<sup>111</sup>. Due to the stability of the zsGreen protein, zsGreen cells also included progenies of *Atoh7*-expressing cells, including RGCs, horizontal and amacrine cells,

and photoreceptors. We enriched *Atoh7*-expressing cells from both heterozygous (*Atoh7<sup>zsGreenCreERT2/+</sup>*, WT) and null retinas (*Atoh7<sup>zsGreenCreERT2/lacZ</sup>*, MT), as well as RGCs from the *Pou4f2<sup>FlagtdTomato/+</sup>* (WT) retina. We used low gating thresholds to enrich the relevant cell populations, but not to exclude other cell types completely, which allowed us to profile all the cell populations at E17.5 (see below). For simplicity of our analysis, zsGreen cells from the *Atoh7<sup>zsGreenCreERT2/+</sup>* retina and RGCs from the *Pou4f2<sup>FlagtdTomato/+</sup>* retina were grouped together (28,283 cells) as they are phenotypically wild-type, and compared with *Atoh7*-null cells (17,175 cells). As done with E13.5 cells, UMAP projection clustering and marker analysis allowed us to identify cell groups with similar cell identities, including naive RPCs, transitional RPCs, horizontal and amacrine cells, and photoreceptors for both wild-type and *Atoh7*-null cells, although the exact numbers of clusters differed and the identity of one cluster could not be ascertained (Fig. 9, Supplementary Fig. 4). Similar relationships from naive RPCs to transitional RPCs, and then to fate-committed retinal cell types, were observed with both wild-type and *Atoh7*-null cells (Fig. 9a). Importantly, transitional RPCs continued to express genes for multiple cell types with high overlaps, which included *Atoh7*, *Neurog2*, *NeuroD1*, *Otx2*, *Foxn4*, and *Olig2* (Fig. 9b).



**Fig. 9** Single cell RNA-seq analysis of E17.5 wild-type (WT) and *Atoh7*-null (MT) cells. **a** Identifies of UMAP clusters of WT and MT retinal cells, including naive RPCs (nRPC), transitional RPCs (tRPC), retinal ganglion cells (RGCs), horizontal and amacrine cells (H&A), photoreceptors (PH). Note there are two transitional RPC clusters, two photoreceptor clusters, and a cluster (?) whose identity needs to be further confirmed. **b** Feature heatmaps showing genes expressed in transitional RPCs, including *Atoh7*, *Neurog2*, *Neurod1*, and *Otx2* in WT and MT retinas. **c** Feature heatmaps of a set of RGC genes in WT and MT retinas, including *Crabp1*, *Gal*, *Sncg*, and *Pou6f2*. *Crabp1*, *Gal*, and *Sncg* are downregulated, whereas *Pou6f2* is upregulated, in the MT RGCs. Color scales represent natural-log transformed normalized gene expression levels as described in “Methods”.

These genes, except *Atoh7*, were also expressed in the *Atoh7*-null transitional RPCs (Fig. 9b). The other genes expressed in the E13.5 transitional RPCs, including *Gadd45a* and *Btg2*, also continued to mark these cells at E17.5 (Supplementary Fig. 4), indicating the general properties of these cells remained, although the cell types they produced had shifted. The presence of the RGC cluster in the E17.5 *Atoh7*-null retina suggested that some of the mutant RGCs persisted for some time. We further

validated this by immunofluorescence staining for two RGC markers, *Nefm* and *Uchl1*, which showed that about 10–15% RGCs remained in the *Atoh7*-null retina at E17.5 (Supplementary Fig. 5).

Comparison of the same clusters between wild-type and *Atoh7*-null retinas revealed the changes in E17.5 naive RPCs largely followed the trend at E13.5 with many of the same genes affected in both stages (Supplementary Data 9). For example, genes

involved in cell cycle progression, including *Ccnd1*, *Mcm7*, *Mcm3*, and *Hes1*, continued to be downregulated, likely due to RGC loss and disrupted signaling from them. In the transitional RPCs, fewer genes were affected at smaller fold changes, likely reflecting the reduced activity of *Atoh7* and RGC production at this stage<sup>4,18,72</sup>, but many genes, such as *Dll3* and *Neurod1*, continued to be affected the same way as at E13.5 (Supplementary Data 9). Consistently and unlike at E13.5, both wild-type and *Atoh7*-null RGC clusters were only tenuously connected to the transitional RPC clusters at E17.5 (Fig. 9a). In contrast to E13.5, there were only a small number of DEGs identified in the mutant RGCs at E17.5, and the fold changes tended to be smaller (Supplementary Data 9). However, these DEGs indicated that the remaining RGCs still were not normal. Whereas many RGC genes such as *Pou4f2*, *Elavl4*, *Nefm*, *Nefl* were expressed at the wild-type levels, other genes, e.g., *Crabp1*, *Gal*, *Sncg*, *Gap43*, *Ebf1*, *Ebf2*, *Ebf3*, *Klf7*, *Irx3*, *Irx5*, and *Isl1*, were downregulated. Intriguingly, *Pou6f2*, which was downregulated at E13.5 (fold change  $-2.9$ ), was highly upregulated in the E17.5 *Atoh7*-null retina (fold change 2.5) (Fig. 9c, Supplementary Fig. 6, Supplementary Data 6, 9). Although the significance and mechanisms of the differential responses of the RGC genes in the *Atoh7*-null retina are unknown, they likely contributed to the eventual loss of almost all RGCs<sup>25,30</sup>.

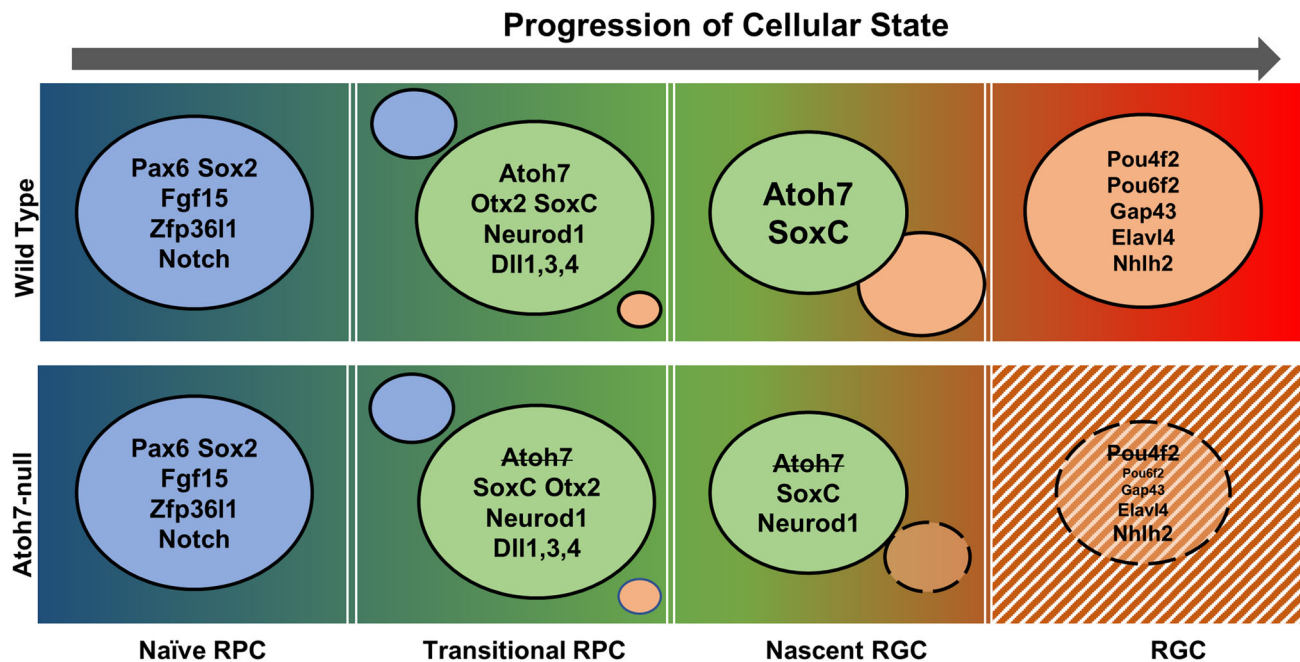
## Discussion

In this study, we first used regular RNA-seq to investigate the global transcriptomic changes in three mutant retinas, *Atoh7*-, *Pou4f2*-, and *Isl1*-null, during early development. The RNA-seq data provide a comprehensive list of genes expressed in the early developing retina (Supplementary Data 1). All genes known to function at this stage are on the list, and the gene list can be further mined for novel key regulators. Since all three mutants are defective in RGC development, this analysis provides a more complete picture and expands our knowledge of the function and hierarchical relationships of the three transcription factors in this lineage. The overlaps of downstream genes activated by the three factors confirm that *Atoh7* acts upstream, whereas *Pou4f2* and *Isl1* are dependent on *Atoh7* but only represent a part of the downstream events. Multiple signaling pathways are downstream of the three factors and functions through complex feedback mechanisms to coordinate proliferation and differentiation. Many RGC-specific genes were only dependent on *Atoh7*, but not on *Pou4f2* or *Isl1*, indicating other factors parallel to *Pou4f2* and *Isl1* are at work in the RGC lineage. On the other hand, the lists of upregulated genes, which are normally repressed by the three transcription factors, demonstrated that the three factors exert their repressive roles largely independently at two levels: *Atoh7* in RPCs whereas *Pou4f2* and *Isl1* in RGCs, although substantial crosstalk between the two levels exists.

We then performed scRNA-seq on E13.5 and E17.5 wild-type and *Atoh7*-null retinal cells. The analysis not only correctly identified known cell states/types present at the stage, but also identified enriched genes for each cluster. The cluster-specific expression provided precise expression information not available before, demonstrating the power of this technology. Specifically, genes enriched in different clusters from our scRNA-seq data define specific states along the developmental trajectories and provide highly accurate information on their cell state/type-specific expression patterns (Fig. 10). These results not only validate several recent reports of scRNA-seq analysis of both mouse and human retinas showing the presence of distinct lineage trajectories and a shared transitional but plastic (multipotent) cell state (transitional RPCs) by all the early trajectories<sup>13,38,39,44</sup>, but also significantly extend those findings by revealing that *Atoh7* is

expressed in all transitional RPCs and highly overlaps with genes involved in lineages other than RGCs. In agreement with our results, a similar finding that *Atoh7* marks transitional RPCs has also been reported with human embryonic retinal cells<sup>44</sup>. Our study provides further insights into the nature of RPC competence for different retinal cell fates and the likely mechanism by which these fates are committed. Previous studies indicated that subsets of RPCs marked by specific genes exist and that these subsets are required for or biased toward particular cell fates<sup>17,19,31,32</sup>. However, the relationship between these RPC subpopulations and its relevance to the competence of RPCs for different retinal fates have not been known. Our current study establishes that these populations highly overlap and can be considered as a shared cell state of all early retinal cell types (Fig. 10). This state is characterized by co-expression of genes essential for individual retinal cell types, such as *Atoh7* and *Neurog2* for RGCs, *Otx2* and *Neurod1* for photoreceptors, and *Foxn4* and *Onecut1/2* for amacrine and horizontal cells. The commonality of these factors is that they function before fate commitment but promote RPCs toward individual lineages. The transitional RPCs, still dividing but likely in the last cell cycle(s)<sup>18,31,32,46,108,110</sup>, are also characterized by significantly reduced expression of the naive RPC markers and proliferation genes, increased expression of ligands for the Notch pathway, and decrease in the Notch pathway activities. These aspects of transition are likely coordinated, although the underlying mechanisms are not known. The Notch pathway is essential for RPC proliferation but inhibits differentiation<sup>5,103,112–117</sup>. Promotion of proliferation by Notch may be achieved through interaction with some of the naive RPC genes such as *Sox2*, *Lhx2*, and *Pax6*<sup>71,82,118,119</sup>. Consistently, retinal cell differentiation requires the downregulation of the Notch pathway<sup>5,114,120,121</sup>. Thus, downregulation of the Notch pathway likely is a key step for establishing this transitional state, and upregulation of the Notch ligands and other components may serve as a mechanism to balance proliferation and differentiation by lateral inhibition<sup>122–124</sup>. This downregulation is likely mediated in part by transcription factors like *Atoh7*, *Ascl1*, and *Foxn4*<sup>120,125,126</sup>. Our results indicate that *Atoh7* influences the Notch pathway in a complex fashion, both directly and indirectly, in different cell states/types. Additional genes, such as *Gadd45a*, *Btg2*, *Penk*, *Srrm4*, *Plk1*, *Sstr2*, and *Ccnb1*, were found highly expressed in this transitional state; they likely also play key roles in the transition from naive RPCs to transitional RPCs.

Since all early cell types arise from these transitional RPCs, as suggested by our trajectory analysis, the long-postulated RPC competence for retinal cell fates may be determined and defined by the genes expressed in them. For example, their competence for the RGC fate is dictated at least in part by *Atoh7*, whose expression coincides with RGC production<sup>18,72,108</sup>. At later stages, when *Atoh7* is not expressed, RPCs lose their competence for the RGC fate. Consistent with the idea, deletion of *Atoh7* does not affect the establishment of this transitional state or the competence for other cell types. Since key regulators of different fates are co-expressed in these transitional RPCs, an outstanding question that arises is how the eventual outcome, i.e., adopting one particular fate versus another, is achieved. The mechanism by which *Atoh7* promotes the RGC fate serves as a point of discussion regarding how transitional RPCs take on a specific developmental trajectory. In agreement with previous findings that *Atoh7* is essential but not sufficient for the RGC lineage, we observed that *Atoh7* is expressed in all transitional RPCs and its expression trails into all three lineages being generated at E13.5. Since *Atoh7* is expressed in all transitional RPCs and thus significantly overlaps with competent factors for other fates (e.g., *Neurod1* and *Otx2* for photoreceptors), these factors likely compete with each other to steer the transitional RPCs toward



**Fig. 10 A model explaining shifts of cell states along the RGC trajectory in the wild-type and *Atoh7*-null retina.** The RGC trajectory follows four cell states, including naïve RPCs, transitional RPCs, nascent RGCs, and differentiated RGCs. The direction of the trajectory is indicated by the arrow and the progression of the trajectory is indicated by a color gradient. Each state is determined by a group of genes and example genes are given in colored circles. The transition from one state to the next is dictated by the downregulation of genes representing that state and upregulation of genes for the next state as indicated by the sizes of the colored circles. In the transitional RPCs, *Atoh7*, likely in combination with the SoxC factors, competes with other regulators to drive them to the RGC fate. In the *Atoh7*-null retina, the establishment of the transitional RPC state is not affected, and nascent RGCs still form through the expression of some, but not all, RGC genes (represented by a smaller circle with broken lines). The mutant nascent RGCs fail to reach the full RGC state and many eventually die by apoptosis (indicated by a striped background).

different directions (Fig. 10). The competition may occur at transcription levels through cross-repression as evidenced by the upregulation in the *Atoh7*-null retina of *Neurod1* and *Bhlhe22*, which are required for photoreceptors and amacrine cells, respectively, and by the distinct expression dynamics along different trajectories. However, this may not be the only or even the dominant mechanism, as other genes such as *Otx2* expressed in the transitional RPCs are not affected by the loss of *Atoh7*. Thus, *Atoh7* and the other competence factors may also compete with each other stochastically by activating distinct sets of downstream genes essential for the respective fates, e.g., *Pou4f2* and *Isl1* for the RGCs, *Ptf1a* for horizontal and amacrine cells, and *Crx* for photoreceptors. This idea is consistent with previous observations that RPCs generated different retinal cell types in a stochastic fashion<sup>7,8</sup>. Nevertheless, the eventual outcome is likely determined genetically; the proportion of different cell types produced at any given time is likely dictated by the presence of the competence factors and their relative activities. This idea is further supported by the finding that *Atoh7* gene dosage affects the number of RGCs produced and that overexpression of *Atoh7* produces more RGCs<sup>127–129</sup>. Activities of these transcription factors may also be modified posttranslationally<sup>130–133</sup>. On the other hand, the transitional RPCs are heterogeneous, as indicated by the uneven expression of many genes in these cells. This has also been demonstrated by lineage-tracing experiments; although *Olig2*, *Neurog2*, and *Ascl1* are all expressed in transitional RPCs, cells expressing these genes are biased in producing specific retinal progenies<sup>17,19</sup>. The heterogeneity of transitional RPCs may reflect their different degree of progression toward different developmental trajectories.

Our scRNA-seq analysis on the *Atoh7*-null retina leads to significant insights into RGC development by identifying specific

changes in gene expression through both direct and indirect mechanisms. Of particular significance was our observation that in the absence of *Atoh7*, the RGC trajectory still progressed considerably, but stalled prematurely. This may have been observed previously but not fully appreciated; many of the mutant *Atoh7*-expressing cells, marked by knock-in lacZ or Cre-activated reporter markers, still migrate to the inner side where RGCs normally reside<sup>25,30,31,46</sup>, but many of them likely die by apoptosis<sup>32</sup>, although some of these cells may redirect and adopt other fates. However, the status of these cells has not been well characterized. Our results indicate that these cells are on the RGC trajectory, and many, but not all, RGC-specific genes are activated in them, although often not to the wild-type levels. Some of the mutant RGCs even persist for some time but still have aberrant gene expression. Consistent with our findings, when apoptosis is inhibited, a much larger number of RGCs survived<sup>134</sup>. These new findings suggest that additional factor(s) other than *Atoh7* function in the transitional RPCs to promote them toward the RGC lineage. Whereas *Neurod1* and *Neurog2*, which are upregulated in the *Atoh7*-null retina, may be compensatory, they unlikely play major roles in the RGC lineage, as mutations of their genes lead to relatively minor RGC defects<sup>20,99,135</sup>. We propose that the SoxC family of transcription factors, including Sox4 and Sox11, fulfill this role (Fig. 10). This is based on previous reports that deletion of the SoxC genes leads to severely compromised RGC production<sup>94–96</sup>, and our finding that they are expressed at high levels in the transitional RPCs and that their expression is not dependent on *Atoh7*. The SoxC factors likely also function in differentiating RGCs and other cell types, as they continue to be expressed in fate-committed retinal neurons. Thus, activation of early RGC genes such as *Pou4f2* and *Isl1*, likely requires both upstream inputs, but in the absence of *Atoh7*, the SoxC factors still activate some of the RGC genes

(Fig. 10). Ectopic expression of Pou4f2 and Isl1 together rescues RGC formation caused by deletion of *Atoh7*, and the two factors were proposed to be part of a core group of factors determining the RGC fate<sup>52</sup>. In light of our current findings, the determination of the RGC fate is likely a gradual process over a time window without a clear boundary, and the function of Pou4f2 and Isl1 is to stabilize the developmental trajectory by activating genes essential for RGC differentiation and repressing genes for other fates. Some of the RGC genes are activated already by *Atoh7* and/or other factors independent of Pou4f2 and Isl1, but require Pou4f2 and Isl1 to reach full amplitudes of expression, whereas many other RGC genes can only be activated by Pou4f2 and Isl1 (Fig. 10). Other than activating RGC genes, *Atoh7* is also involved in other aspects of retinal cell differentiation, such as cell cycle exit, downregulation of the Notch pathway, and even generation of other cell types<sup>32,39,129</sup>. Elucidating the full function of *Atoh7* requires identification of its direct targets and the associated epigenetic status.

Our study also demonstrates that regular RNA-seq and scRNA-seq complement each other and can be used in combination to provide much richer information regarding transcriptomic changes due to genetic perturbations. Although regular RNA-seq lacks the cellular resolution, it is more sensitive in detecting genes expressed at low levels and/or in a smaller number of cells. On the other hand, scRNA-seq enables classification of cell states/types in complex tissues and provides insights into relationships among the different cell states/types. scRNA-seq also provides precise information regarding changes in gene expression in specific cell states/types. It is worth noting that, currently, likely due to limitations of sequence depth and library construction, genes expressed at low levels and/or in small numbers of cells are not always readily detectable by scRNA-seq, but this may change as the technology further matures.

In summary, we used RNA-seq and scRNA-seq to survey gene expression in the developing retina and identify changes associated with deletion of key transcription factor genes for the RGC lineage. Our results provide a global view of the gene expression, cell states, and their relationships in early retinal development. Furthermore, our study validates and further defines a transitional state shared by all early retinal cell fates (Fig. 10). *Atoh7*, likely in collaboration with other factors, functions within this cell state to shepherd RPCs to the RGC lineage by competing with other lineage factors and activating RGC-specific genes. Further analysis of the shifts in the epigenetic landscape along individual trajectories in both wild-type and mutant retinas will help elucidate the underlying mechanisms of RGC differentiation.

## Methods

**Animals.** All mice used were in the C57BL6/129 mixed genetic background. The two knockin alleles used in this study, *Atoh7<sup>z</sup>GreenCreERT2* and *Pou4f2<sup>FLAGtdTomato</sup>*, were described in detail in a recent publication<sup>111</sup>. *Atoh7<sup>z</sup>GreenCreERT2* is a null allele and *Pou4f2<sup>FLAGtdTomato</sup>* is a wild-type allele. The other alleles, including *Atoh7<sup>lacZ</sup>* (null), *Pou4f2<sup>Gfp</sup>* (null), the conditional *Isl1*-null mice (*Isl1<sup>lox/lox</sup>;Six3-Cre*), and *Atoh7<sup>HA</sup>* were reported before<sup>18,30,49,56</sup>. All procedures using mice conform to the U.S. Public Health Service Policy on Humane Care and Use of Laboratory Animals and were approved by the Institutional Animal Care and Use Committees of Roswell Comprehensive Cancer Center and University at Buffalo.

**Bulk RNA-seq.** Bulk RNA-seq was carried out as follows<sup>29</sup>. After timed mating, E14.5 retinas were dissected and stored in RNAlater (Invitrogen) while genotyping was performed. Three individual pools of four to six retinas were collected for individual genotypes, including wild-type, *Atoh7*-null (*Atoh7<sup>lacZ/lacZ</sup>*), *Pou4f2*-null (*Pou4f2<sup>Gfp/Gfp</sup>*), and *Isl1*-null (*Isl1<sup>lox/lox</sup>;Six3-Cre*). Total RNA was then isolated, and RNA-seq libraries were generated using TruSeq RNA Sample Prep Kit v2 kit (Illumina, RS-122-2001) following the manufacturer's instruction and sequenced on an Illumina HiSeq2000 sequencer. Sequence reads were mapped to the mouse genome assembly (mm10) by STAR<sup>136</sup> and differentially expressed genes (DEGs) were identified by edgeR<sup>55</sup>. The FDR cutoff was set at 0.05 and the minimum fold change imposed was 1.5.

To compare the overall gene expression changes in the three mutants, we calculated the Z-scores of sequence read counts per million (CPM) for each gene, then divided the genes into five groups based on the hierarchical clustering. We then generated a heatmap of differential genes by the "pheatmap" R package (<https://cran.r-project.org/web/packages/pheatmap/index.html>).

## Retinal cell dissociation, FACS, scRNA-seq library construction, and sequencing

Dissociation of embryonic retinas into single cell suspensions was performed using the following procedure<sup>109</sup>. E13.5 retinas with the desired genotypes were collected after timed mating. The genotypes used in this study included *Atoh7<sup>z</sup>GreenCreERT2/+* (designated as wild-type) and *Atoh7<sup>z</sup>GreenCreERT2/lacZ* (*Atoh7*-null). They were then washed with cold phosphate-buffered solution, pH 7.0 (PBS), and transferred to fresh tubes containing 200  $\mu$ l 10 mg/ml trypsin in PBS. The retinas were then incubated in a 37 °C water bath for 5 min and triturated five times with a P1000 pipette tip. 20  $\mu$ l of soybean trypsin inhibitor was then added to the tube. The cells were spun down at 300  $\times$  g, washed twice with PBS, and resuspended in PBS. The cells were then loaded onto the 10 $\times$  Genomics Chromium Controller to generate scRNA-seq libraries using the Chromium Single Cell 3' Library & Gel Bead Kit v2, following the manufacturer's instructions.

We also performed fluorescence assisted cell sorting (FACS) to enrich *Atoh7*-expressing cells and *Pou4f2*-expressing cells from E17.5 retinas carrying the *Atoh7<sup>z</sup>GreenCreERT2* and *Pou4f2<sup>FLAGtdTomato/+</sup>* alleles<sup>111</sup>. Cells from *Atoh7<sup>z</sup>GreenCreERT2/+* and *Pou4f2<sup>FLAGtdTomato/+</sup>* retinas were designated as wild-type, and those from *Atoh7<sup>z</sup>GreenCreERT2/lacZ* were *Atoh7*-null. Cell sorting was performed on a BD FACSAria Fusion Cell Sorter. Dissociated cell suspensions from E17.5 retinas obtained as described above were pre-sorted to eliminate cell debris based on their forward and side scatter properties. Then single cell gating was performed based on FSC-A  $\times$  FSC-H properties to eliminate the doublets and other aggregated cells. The *zsGreen* or *tdTomato* positive cells were then sorted based on the cell fluorescence intensities. The *zsGreen* signal was collected by a 488 laser with a 530/30 detector and a 561 laser with a 582/15 detector was used to collect *tdTomato* signal. The gating thresholds were set just above the background to ensure the continuity of cell populations (Supplementary Fig. 7). These cells were then loaded onto the 10 $\times$  Genomics Chromium Controller to generate scRNA-seq libraries. The libraries were sequenced by an Illumina HiSeq2500 rapid run using 26 $\times$ 8 $\times$ 98 sequencing and demultiplexing was performed with bcl2fastq2.

**scRNA-seq analysis.** The output from 10 $\times$  Genomics Cellranger 2.1.1 pipeline was used as input into the R analysis package Seurat version 3.1.1. Cells with high unique molecular index counts (nUMI), high mitochondrial transcript load, and high transcript counts for red blood cell markers were filtered out from the analysis. The data was then normalized, scaled, and explored using Seurat's recommended workflow. Principal component analysis (PCA), louvain clustering, and the UMAP (Uniform Manifold Approximation and Projection) were performed. Normalized gene expression was obtained by LogNormalize in Seurat using a scale factor of 10,000, in which feature counts for each cell were divided by the total counts for that cell and multiplied by the scale factor. The value is then natural-log transformed using log1p. Using the called clusters, cluster-to-cluster differential expression testing using the Wilcoxon-Rank Sum identified unique gene markers for each cluster. Differential expression between corresponding wild-type and mutant clusters was assessed using the FindMarkers function of Seurat, which also utilized the Wilcoxon-Rank Sum test. Cell cycle analysis used a protocol in Seurat with 70 cycle genes<sup>79</sup> ([https://satijalab.org/seurat/v3.1/cell\\_cycle\\_vignette.html](https://satijalab.org/seurat/v3.1/cell_cycle_vignette.html)).

To further interrogate the RGC developmental trajectory, cells belonging to C3, C4, C5, and C6 were subset from the Seurat data object. The average expression for each DEG, for each cluster, was compared between wildtype and *Atoh7*-null mice using the pheatmap package, clustering rows by euclidean distance using the hclust algorithm, and introducing cuts to the hierarchy tree using cutree = 7 for visual clarity.

**Pseudotime analysis.** To infer developmental trajectories, the python package SCANPY provides pseudotemporal-ordering and the reconstruction of branching trajectories via Diffusion Pseudotime (DPT)<sup>92</sup>. A root cell was selected at random within the progenitor cell population of called Cluster 1. The assigned pseudotime values were then mapped back to the Seurat UMAP embedding for visualization and further analysis.

## Immunofluorescence staining, in situ hybridization, and online data mining.

Immunofluorescence staining on cryopreserved retinal sections was performed as follows<sup>29,52</sup>. Embryos were obtained after timed mating at the desired stage and fixed with 4% paraformaldehyde, washed three times with PBS (pH 7.4) plus 0.2% Tween 20 (PBST), soaked in 30% sucrose, and embedded in OCT medium. They were then sectioned at 16  $\mu$ m and the sections were washed three times for 10 min with PBST and blocked with 2% BSA in PBST for 1 h. They were then incubated with primary antibodies with appropriate dilutions as listed below in 2% BSA-PBST for 1 hr and washed three times for 10 min with PBST, followed by incubation with fluorescent-dye-conjugated secondary antibodies and washing with PBST. The nuclei were stained with propidium iodide when necessary. The slides were then mounted with AquaMount (Lerner Laboratories) and



Immunofluorescence images were captured by a Leica TCS SP2 confocal microscope. Positive cells were counted manually for positive cells per arbitrary length unit on a computer screen<sup>29,52,109</sup>. Primary antibodies used in this study included: rabbit anti-Otx2 (1:200, Sigma, HPA000633), goat anti-Olig2 (1:200, R&D system, AF2418), goat anti-HA (1:100, Genscript, A00168), rabbit anti-Atoh7 (1:200, Novus, NBP1-88639), rabbit anti-Uchl1 (Pgp9.5) (1:500, Millipore, AB1761), mouse anti-Nefm (1:200, Sigma, N5264), rabbit anti-Foxn4<sup>21</sup> (Mengqing Xiang Lab).

In situ hybridization was performed using RNAscope double Z probes (Advanced Cell Diagnostics) on paraffin-embedded retinal sections. After timed mating, embryos of desired stages were collected, fixed with 4% paraformaldehyde, embedded in paraffin, sectioned at 6  $\mu$ m, de-waxed by xylene, and dehydrated by methanol<sup>29,49,52,53</sup>. The sections were then processed, hybridization was performed, and the signals were visualized using the RNAscope<sup>®</sup> 2.5 HD Detection Reagents-RED following the manufacturer's manual. In situ images were collected using a Nikon 80i Fluorescence Microscope equipped with a digital camera and Spot 5.1 analysis software.

**Statistics and reproducibility.** Identification of DEGs from bulk RNA-seq (Supplementary Data 2): DEGs were called by EdgeR using the glmLRT function which is based on Genewise Negative Binomial Generalized Linear Models<sup>137</sup>. For pair-wise comparisons between each mutant and the wild-type, the Negative Binomial parameters were estimated by conditional maximum likelihood and quantile-adjusted conditional maximum likelihood, and then an exact test (similar to Fisher's exact test) was carried out to generate *p* values for individual genes<sup>137,138</sup>. The false discovery rates (FDRs) were calculated from *p*-values through the Benjamini–Hochberg procedure. The cutoff value for FDR was set at 0.05.

Identification of cluster-enriched genes and DEGs from scRNA-seq (Supplementary Data 4, 6, 9): This was achieved using Seurat's FindMarker analysis, which reports the log fold-change of the average expression between two groups of cells. For enriched gene analysis, each cluster was compared to all the rest cells. For differentially expressed gene identification, corresponding wild-type and mutant clusters were compared. The significance of differences was determined by the Wilcoxon–Rank Sum test to obtain the *p*-values, and Bonferroni Correction was then performed to correct for multiple testing (*p* value adjustment, the cutoff was 0.05). PCT.1 and PCT.2 in these tables represent the percentage of cells in each group that a gene is detected in.

GO term enrichment analysis (Table 1, Supplementary Data 3, 7): in DAVID analysis, all the mouse genes were used as the control group to identify genes enriched in the gene lists we identified for GO terms. The significance of gene enrichment in GO terms was determined by Fisher's Exact test as described by the developer ([https://david.ncifcrf.gov/helps/functional\\_annotation.html](https://david.ncifcrf.gov/helps/functional_annotation.html)).

Other statistical analysis and reproducibility information is presented in the figure legends.

**Reporting summary.** Further information on research design is available in the Nature Research Reporting Summary linked to this article.

## Data availability

All bulk RNA-seq sequence reads were deposited into the NCBI Short Read Archive with accession numbers SAMN02614558–SAMN02614569 [<https://www.ncbi.nlm.nih.gov/bioproject/PRJNA236742>]. The scRNA-seq data were deposited into the NCBI Gene Expression Omnibus with an accession number GSE149040. The data are available to the public without restrictions. Source data are provided with this paper.

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## Author contributions

Fuguo Wu, Donald Yergeau, Darshan Sapkota, and Yichen Ge performed the experiments. Jonathan Bard and Julien Kann analyzed the single cell RNA-seq data, Zihua Hu, Jie Wang, and Tao Liu analyzed the bulk RNA-seq data. Xiuqian Mu conceived the project, obtained funding, analyzed the data, and wrote the paper.

## Competing interests

The authors declare no competing interests.

## Additional information

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