

Intercellular communication atlas reveals Oprm1 as a neuroprotective factor for retinal ganglion cells

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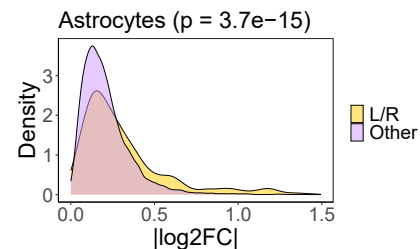
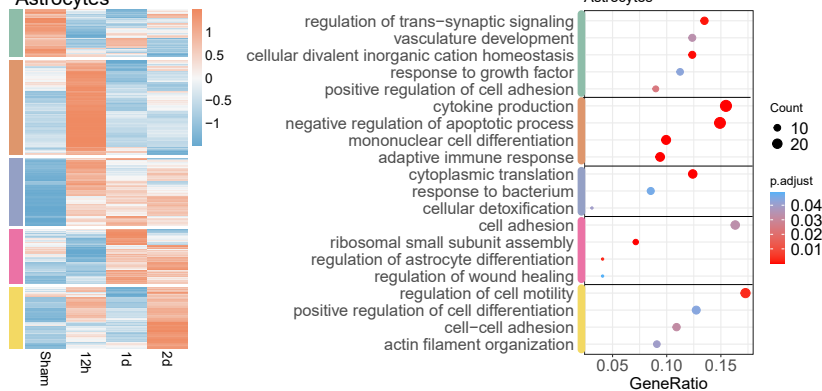
Supplementary Table 1. Numbers of retinal cells at four conditions.

	Ctrl	12h	1d	2d	
Rods	5777	2502	5258	4051	
coneBC	2840	1908	3583	3339	
RPE	373	75	302	319	
RodBC	1817	987	1871	1916	
GlyAC	493	359	823	906	
MG	1812	1174	2098	1927	
Cones	1639	519	1551	1444	
HC	386	113	368	478	
GABAAC	169	168	345	331	
Microglia	106	68	75	115	
Pericytes	42	25	35	37	
Astrocytes	97	53	108	82	
VE	164	83	180	185	
RGC	37	179	303	536	

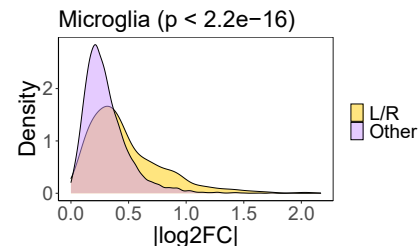
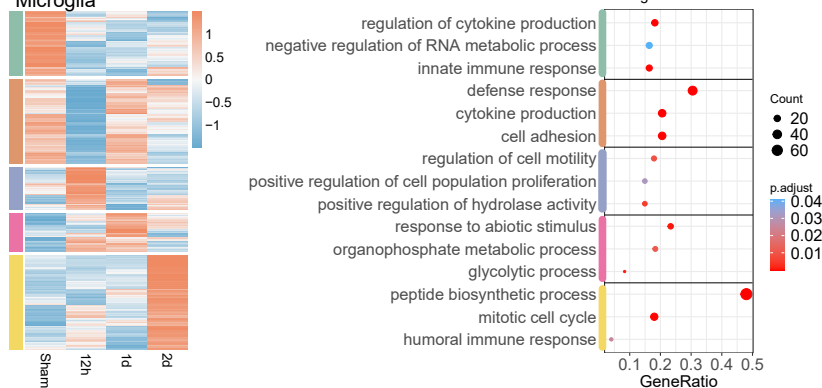
Supplementary Table 2. Predicted neuroprotective interactions. The sender cells are listed in the first line, and the receiver RGC subclasses are in the table content.

	Astrocytes	Pericytes	GABAAC	GlyAC	HC	MG	VE	ConeBC	Cones	RodBC	Rods	RPE	Microglia
Ncam1_Robo1	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;Gpr88	a;ip;Gpr88	a;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;Gpr88	a;Gpr88
Tgfb2_Tgfb2	a;ip;Gpr88	a;ip;Gpr88		a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88		a;ip;Gpr88		a;Gpr88	
Tgfb2_Tgfb3	a;ip;Gpr88	a;ip;Gpr88		a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88		a;ip;Gpr88			
Cadm1_Nectin3	a;ip;Gpr88	a	a;ip;Gpr88	a;ip;Gpr88	a	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a	a;ip;Gpr88
Ltbp1_Itgb5	a;ip;Gpr88	a;ip;Gpr88											
Mdk_Itga6	a;ip;Gpr88					ip;Gpr88						a;ip;Gpr88	
Ltbp3_Itgb5	a;ip;Gpr88											a;Gpr88	
Col2a1_Itga3	a;ip;Gpr88												
Ncam1_Gfra1	a;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;ip;Gpr88	a;Gpr88	a;Gpr88
Cadm1_Crtam	a;Gpr88	Gpr88	a;Gpr88	a;Gpr88	a;Gpr88	a;ip;Gpr88	a;Gpr88	a;Gpr88	a;Gpr88	a;Gpr88	a;Gpr88	Gpr88	a;Gpr88
Vim_Cd44	a;Gpr88	a;Gpr88				a;Gpr88	a;Gpr88	a;Gpr88					
Fn1_Cd44	a;Gpr88						a;Gpr88						
Vcan_Cd44	a;Gpr88												
Col1a2_Cd44	a;Gpr88												
Robo1_Robo1	a;Gpr88												
Bdnf_Ngfr	a;ip		a;ip	a;ip		a;ip		a;ip		a;ip;Gpr88		a;ip	
Pdyn_Oprm1	a;ip												
Penk_Oprm1	a;ip												
Tgfb1_Tgfb2	a	a;ip;Gpr88	a;Gpr88				a;ip;Gpr88						a;ip;Gpr88
Afdn_Nectin3	a	a	a	a	a	a	a	a		a	a		
Nectin3_Nectin3	a					a				a			
Fn1_Plaur	a						a						
Anxa1_Dysf	a					a;Gpr88							
Cadm3_Nectin3			a	a	a;ip			a	a				
Nectin1_Nectin3			a		a			a	a	a	a	a	
Lamb1_Itgb1		a;ip;Gpr88	a;ip;Gpr88										
Tgfb1_Tgfb3		a;ip;Gpr88	a;ip				a;ip;Gpr88						a;ip;Gpr88
Vtn_Itgb5		a;ip;Gpr88				a;Gpr88	a;ip;Gpr88					a;ip;Gpr88	
Thbs1_Itga6		a;ip;Gpr88										a;ip;Gpr88	
Lama2_Itga7		a;ip;Gpr88											
Lamb1_Itga6		ip;Gpr88	Gpr88				ip;Gpr88					ip;Gpr88	
Ngf_Ngfr		a;ip											
Vtn_Plaur		a					a						
Ntf3_Ngfr		a											
Tgfb3_Tgfb3		a											
Lamc3_Itga7		ip											
Col3a1_Ddr2		Gpr88											
Adam9_Itga6		Gpr88									ip;Gpr88	a	
Lamc3_Itga6		Gpr88											
Hbegf_Cd44			a;Gpr88										
Tnc_Itga7			a;ip										
Fgf1_Cd44					a;Gpr88								
Lgals1_Itgb1						a;ip;Gpr88							
Inhba_Tgfb3						a;ip;Gpr88							
Slit2_Robo1								a;Gpr88					
Thbs1_Itgb1												a;ip;Gpr88	
Gpc3_Igf1r												a;ip;Gpr88	

a Astrocytes



b Microglia



c GlyAC

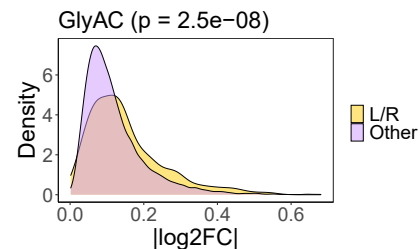
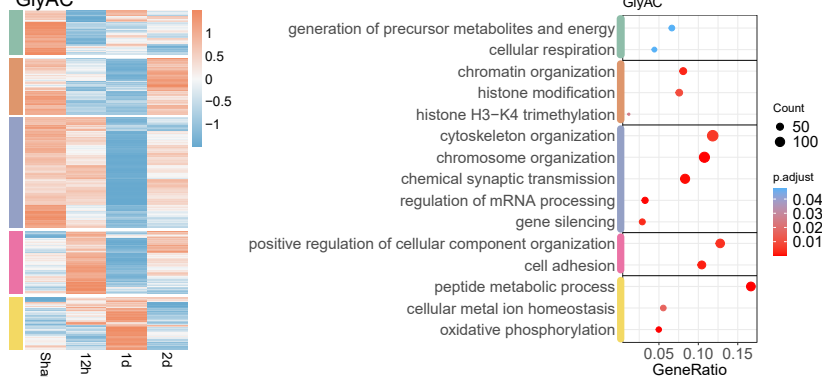


Fig. S1 Retinal cells in response to ONC.

Response in astrocytes (**a**), microglia (**b**), and glycinergic amacrine cells (**c**), as some examples, after the ONC injury on RGCs. Left panels: DEG heatmaps show dynamical patterns of DEGs at different time points after ONC. Middle panels: Gene ontology analysis reveals representative biological processes enriched by the DEGs in each pattern shown in the heatmaps. Right panel: Density plots of the absolute fold-change ($\log_2FC$) values of genes expressed (detection rate > 0.1). Ligand and receptor genes (L/R) are grouped in yellow, while the other genes are shown in light purple for comparison. For the GO analysis in the middle panels, the p-values are based on a hypergeometric test, adjusted by the Benjamini-Hochberg method. For all right panels, the p-values are based on Kolmogorov-Smirnov test (two-sided).

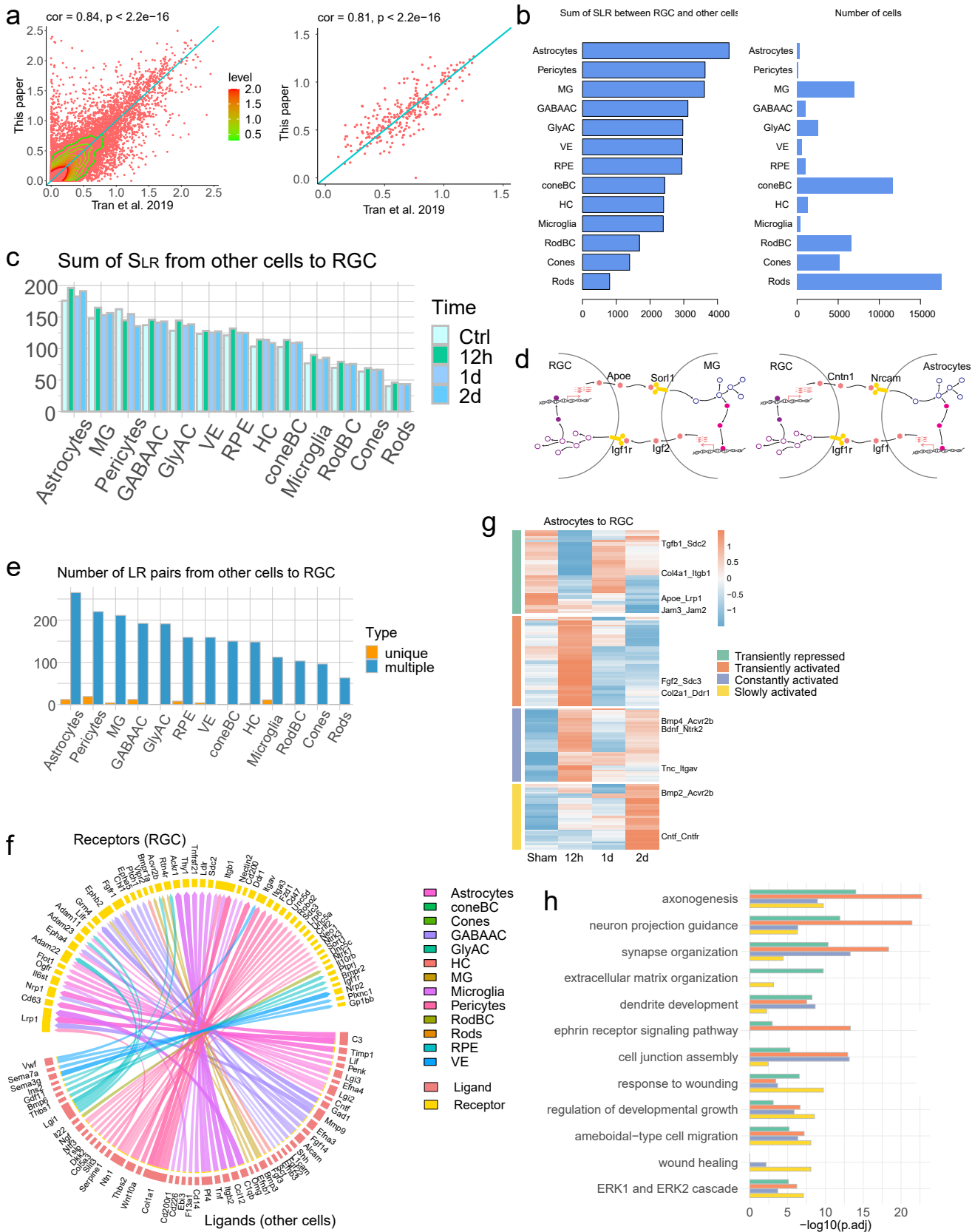


Fig. S2 Responsive interactions from other cells to RGCs.

a Correlation of gene expression between RGCs captured and sequenced in whole retina data in this paper and the RGCs in Tran. et al. Pearson's correlation coefficient: p-value calculated from t-test. **b** Sum of interaction strength and the number of cells for the retinal cell types. There is no correlation between the interactions detected and cell counts. **c** Sum of the interactions at different time points for each cell type. **d** Additional examples of cell-cell feedback loops. The ligand from the sender cell interacts with the receptor on the receiver cell, triggering gene transcription in receiver cells, in which some ligand genes are transcribed and sent back to the original sender cells. **e** The number of ligand-receptor interactions from other retinal cells to RGCs. Interactions identified in multiple and unique cell types are dark blue and orange. **f** The specific ligand-receptor interactions identified in unique retinal cell types to RGCs are shown in orange columns in panel **e**. Genes in the bottom half of the circle are the ligands secreted from other retinal cells, and the genes in the top half of the circle are the receptors in RGCs. The colors of the connecting edges represent the receiver cell types. **g** Heatmap reveals the ONC-induced temporal patterns of interactions from astrocytes to RGCs across time points (the fold change (FC) of the interaction scores between any two time points > 1.2). Four dynamical patterns were identified. **h** Gene Ontology analysis (GO) reveals representative biological processes of variable ligand-receptor interactions in patterns identified in panel **g**. The enrichment was calculated with all expressed genes in either astrocyte or RGC at any time point as the background (detection rate > 0.1). The p-values are based on a hypergeometric test, adjusted by the Benjamini-Hochberg method.

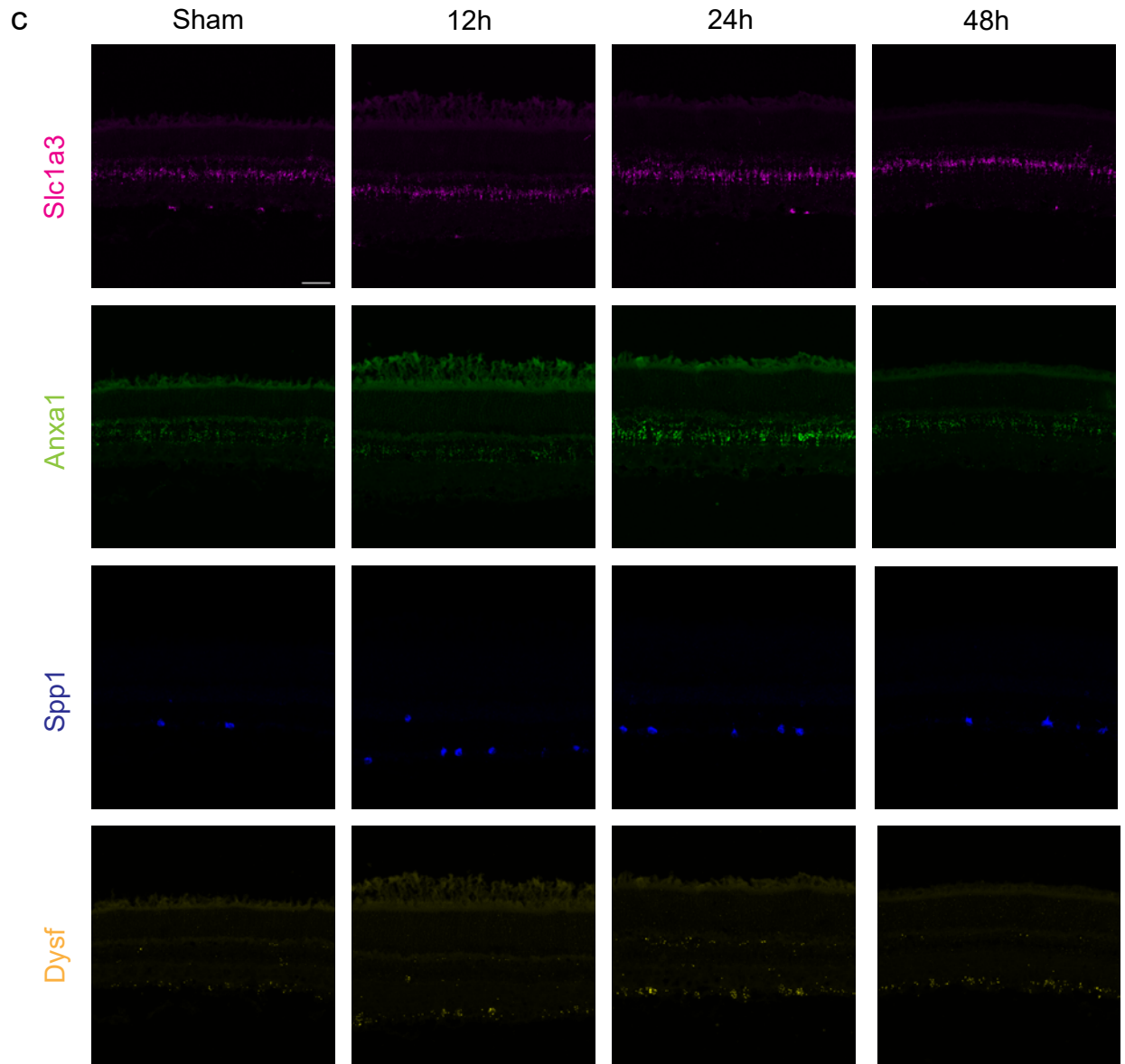
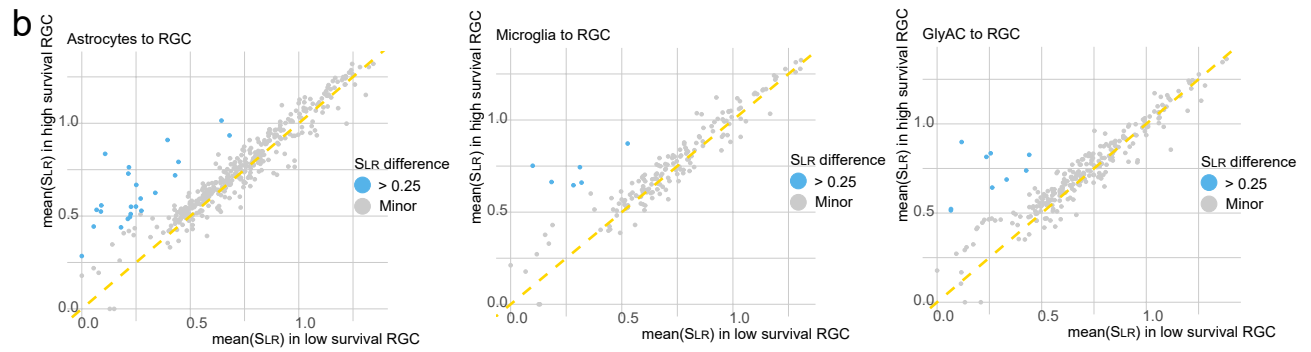
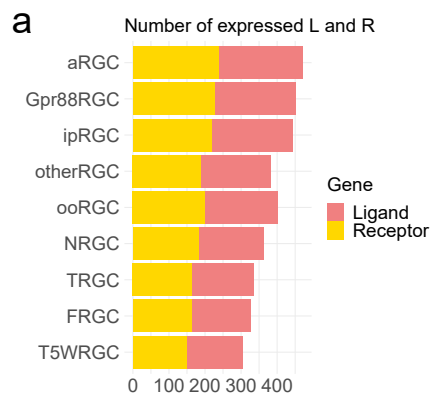


Fig. S3 Properties of high-survival vs low-survival RGC subclasses.

a Number of expressed ligand and receptor genes in RGC subclasses (detection rate > 0.1 at any time point). **b** Additional examples for calculating protective interactions in astrocytes (left graph), microglia (middle graph), and glycinergic amacrine cells (right graph). For each ligand-receptor pair, the two calculated mean values of interaction scores (y-axis) for the high- and the other (x-axis) for the low-survival RGC subclasses were plotted for comparison. Blue dots are the interactions that are stronger in high- than in low-survival RGC subclasses. Gray dots are the interactions with similar interaction scores between the two categories. **c** The single-channel images for **Fig. 3d**. Scale bar: 50 μm .

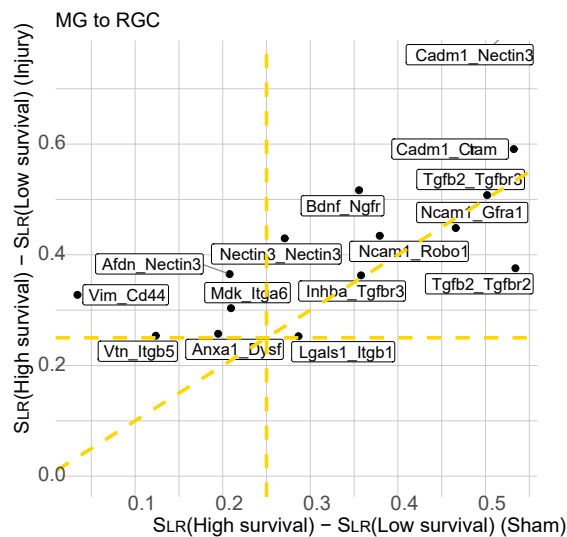
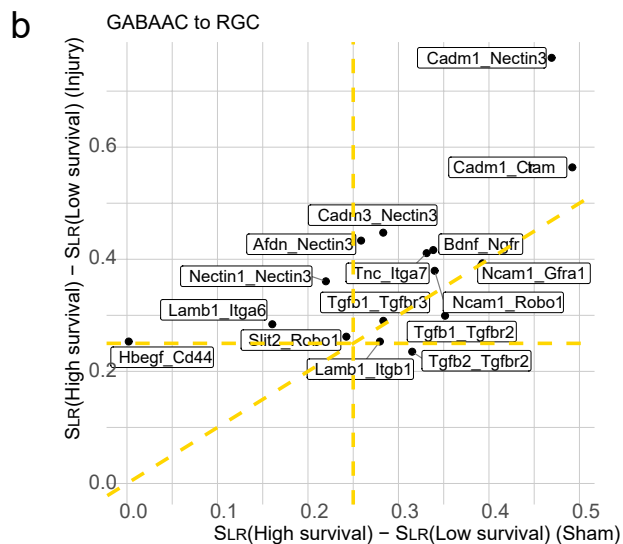
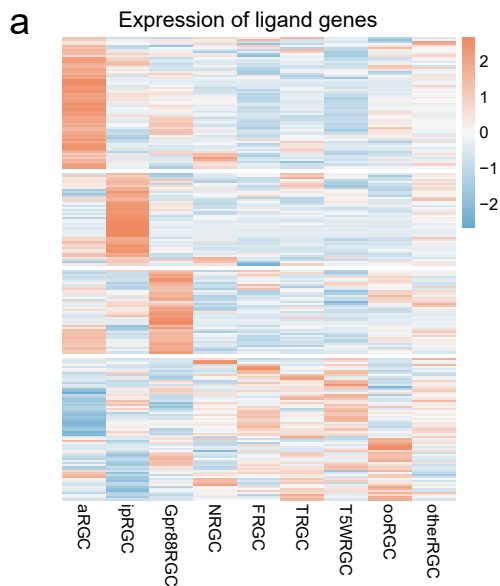


Fig. S4 Features of protective interactions.

a Average expression level of ligand genes in RGC subclasses. **b** Summary of the preset and induced protective interactions. The X-axis is the difference between interaction scores in high- and low-survival subclasses before injury, and the Y-axis is the interaction score difference after injury. Interactions from GABAergic amacrine cells to RGCs are shown in the upper graph, and the Müller glia to RGCs interactions are shown in the lower graph.

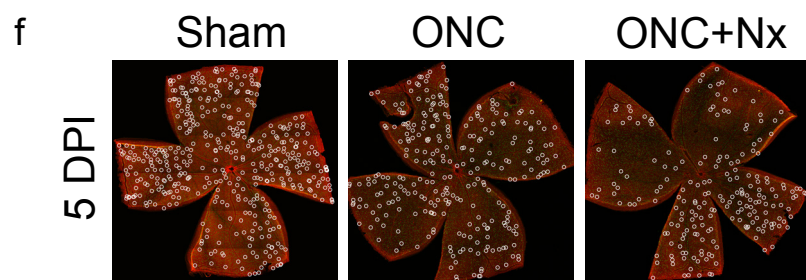
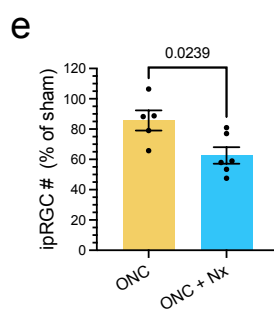
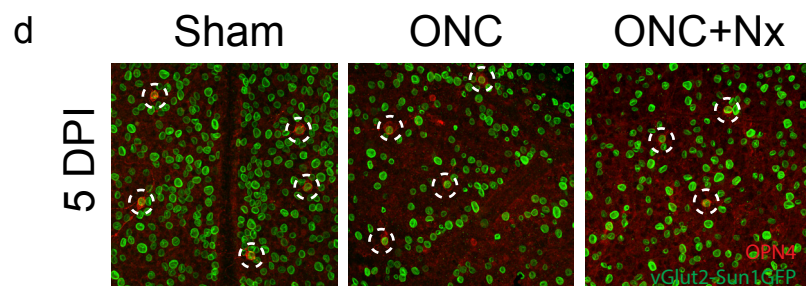
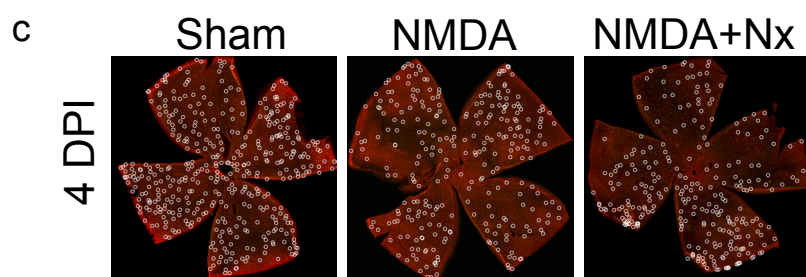
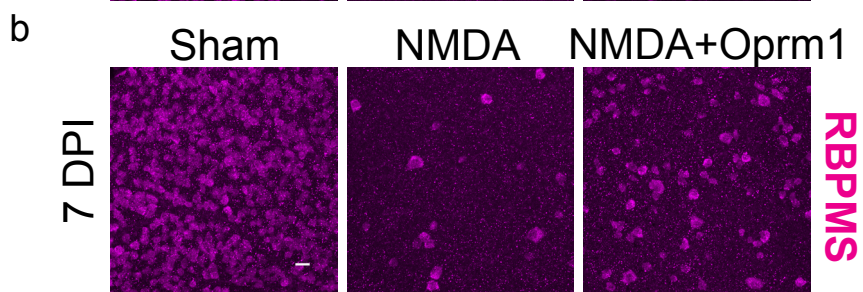
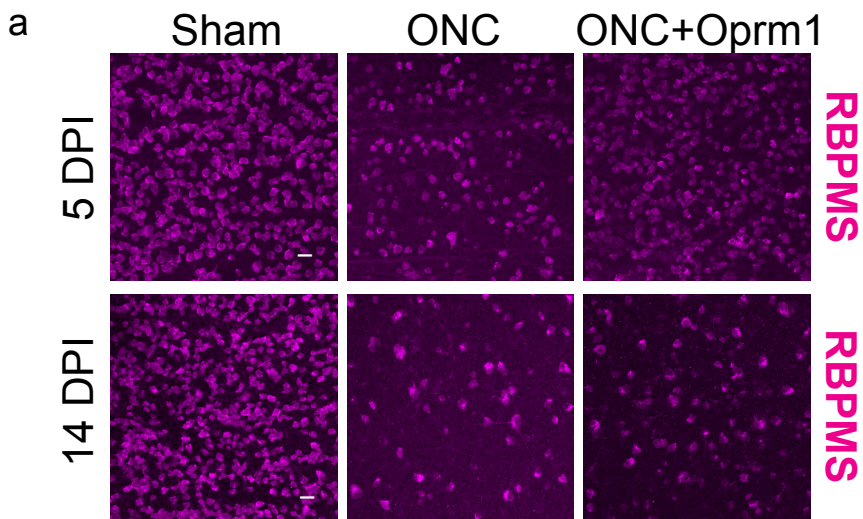


Fig. S5 Neuroprotective effect of Oprm1 on RGC survival.

a Representative images of retina whole mounts of RBPMS staining 5 days (upper row) or 14 days (lower row) post-ONC. Scale bars: 50 μ m, applies to all micrographs. **b** Representative confocal images of retina whole mounts of RBPMS staining seven days following NMDA damage. **c** Representative confocal scans of petal-shaped retina whole mounts showing the OPN4 staining of ipRGC, four days after NMDA damage, compared with co-treatment with NMDA and naloxone injection. White circles label the ipRGCs (OPN4 in red fluorescence). **d** Representative confocal images of retina whole mounts showing ipRGC numbers five days post-ONC. The red channel represents OPN4 staining, and the green fluorescence shows vGlut2-Sun1GFP as a pan-RGC marker. White dashed line circles mark the ipRGCs. **e** Numbers of ipRGC cells survived (OPN4+), as the percentages relative to the sham group. Data are presented as mean $\pm$ SEM. ONC group, n=5; ONC+ Nx group, n=6. One-way ANOVA, multiple comparisons. **f** Representative confocal scans of petal-shape retina whole mounts showing ipRGC cell survived five days post-ONC and ONC combined with naloxone injection condition. White circles label the ipRGCs (OPN4 in red fluorescence). Source data are provided as a Source Data file.

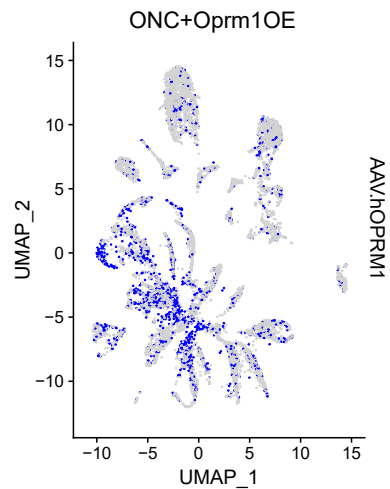
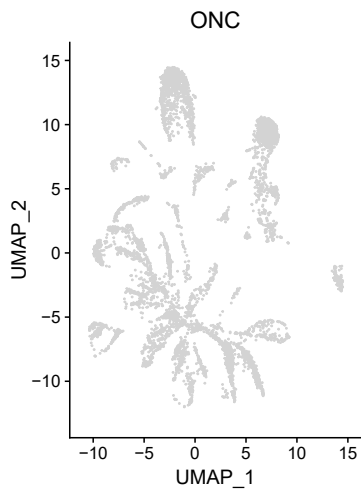
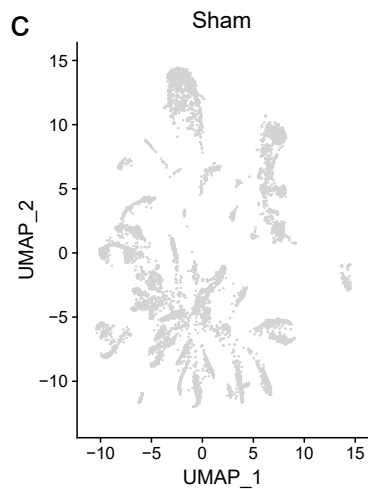
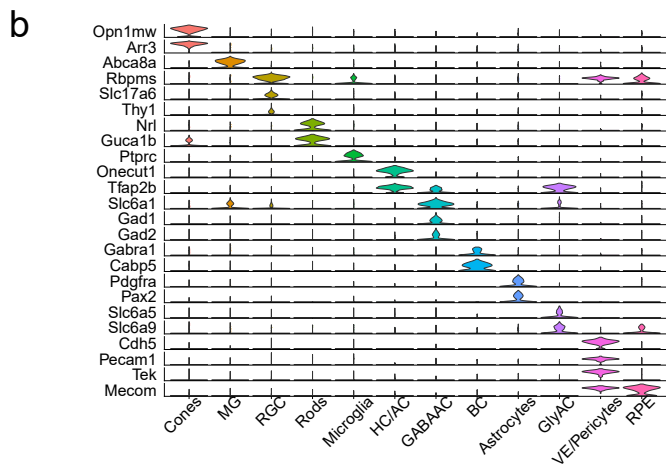
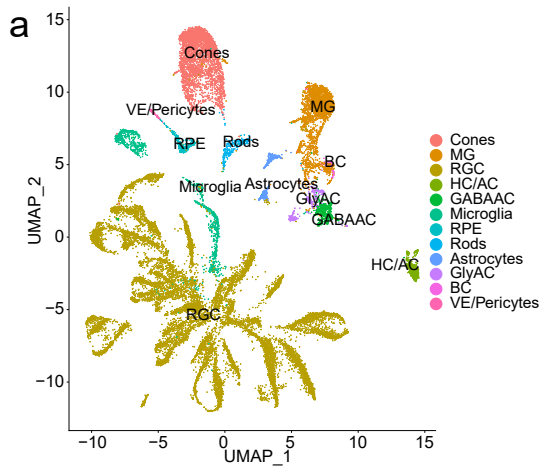
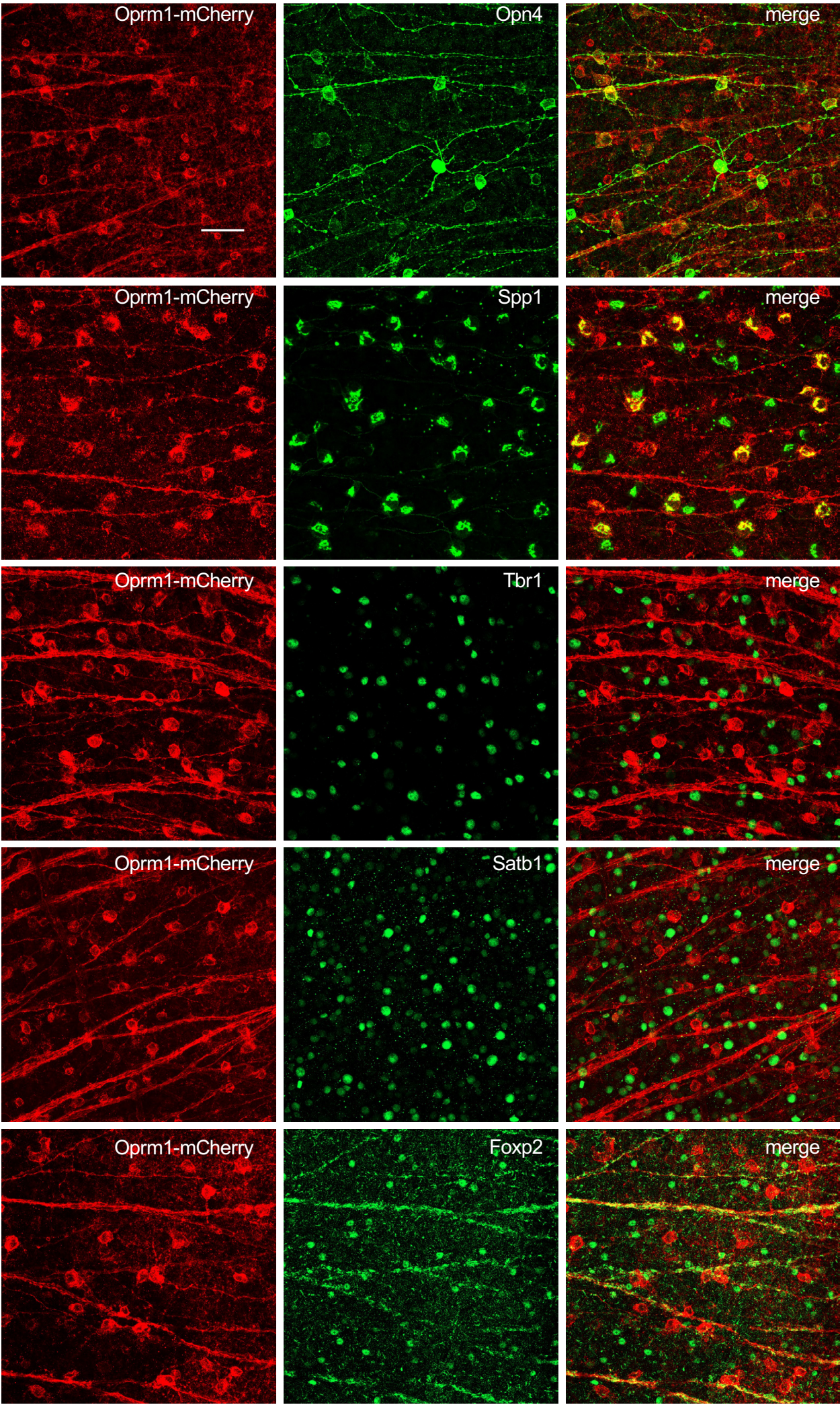


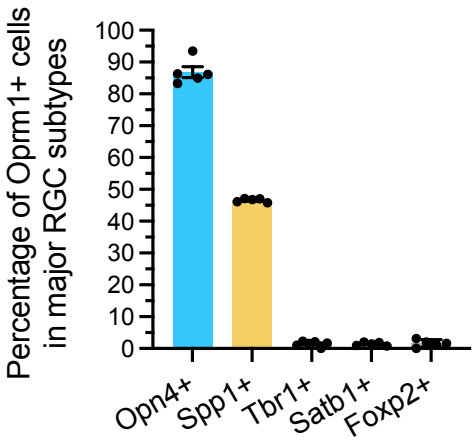
Fig. S6 snRNA-seq analysis on sorted RGC nuclei.

a Retinal cells obtained from the samples. The samples were enriched for RGCs with anti-GFP MACS for vGlut2-Sun1GFP+ pan-RGCs. **b** Expression level of representative known marker genes in retinal cell types. **c** Expression patterns of ectopic human Oprm1 (based on AAV2 WPRE detection) in retinal cells. The ectopic Oprm1 is mainly detected in RGCs.

a



b



c



Fig. S7 Representative confocal images of whole-mount retinas

a The images show the physiological expression pattern of *Oprm1* in multiple RGC subtypes labeled by marker proteins. The red fluorescent is immuno-staining of the mCherry tag in the *Oprm1*-mCherry mouse strain. The green color stands for immuno-staining of *Opn4* (ip-RGC marker), *Spp1* (α RGC marker), *Tbr1* (T-RGC marker), *Satb1* (DS-RGC marker) and *Foxp2* (F-RGC marker), respectively. Scale bars: 50 μ m. **b** Quantification of the percentage coverage of the *Oprm1* expressing cells in *Opn4*⁺, *Spp1*⁺, *Tbr1*⁺, *Satb1*⁺, or *Foxp2*⁺ major RGC subsets, respectively. **c** The schematic diagram shows the knock-in location of the mCherry tag in the *Oprm1*-mCherry reporter mouse strain. Source data are provided as a Source Data file.

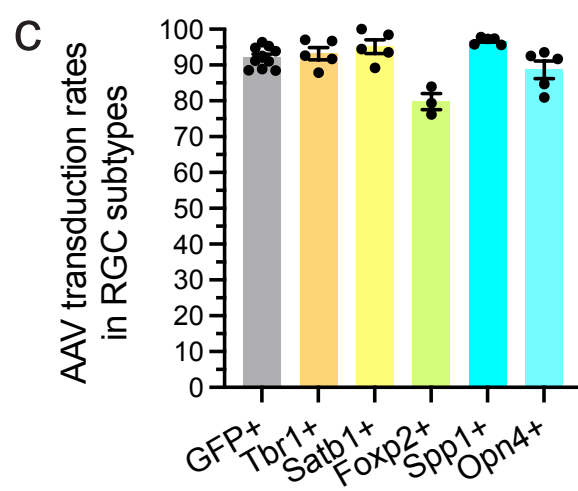
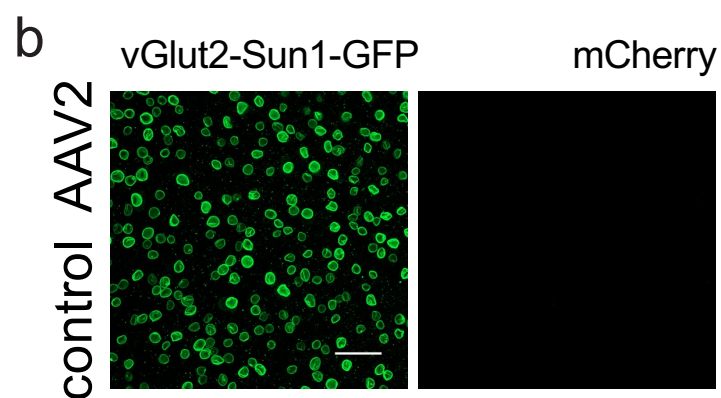
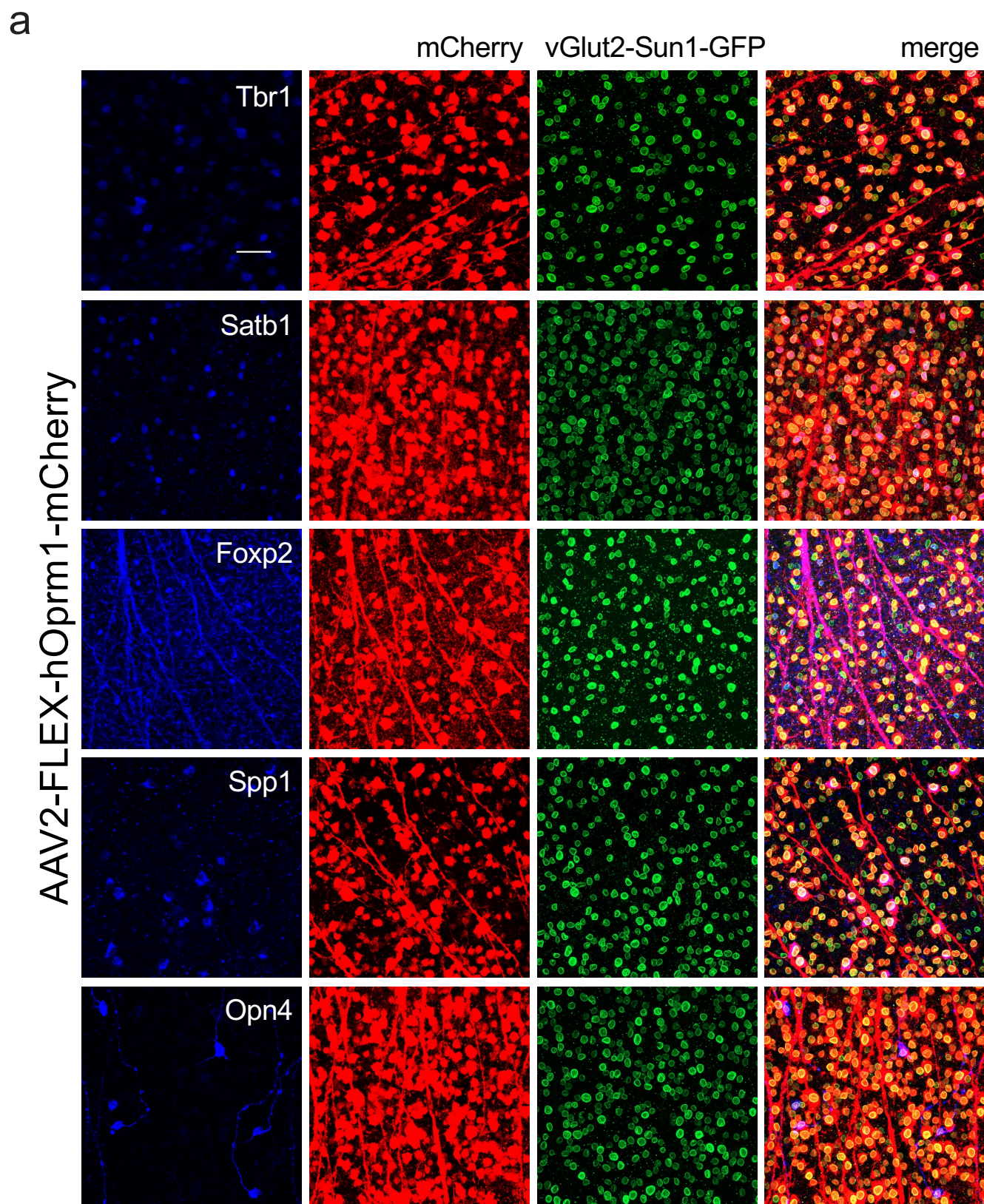


Fig. S8 Representative confocal images of whole-mount retinas with overexpression of Oprm1

a The images show the viral transduction coverage of AAV2-FLEX-hOprm1-mCherry transducing the vGlut2-IRES-Cre; LSL-Sun1-GFP mouse. The blue color stands for immunostaining of Opn4 (ip-RGC marker), Spp1 (α RGC marker), Tbr1 (T-RGC marker), Satb1 (DS-RGC marker) and Foxp2 (F-RGC marker), respectively. The red fluorescence is the immunostaining of the mCherry tag expressed by AAV2-FLEX-hOprm1-mCherry. The green fluorescence is GFP immuno-staining of Sun1-GFP to visualize pan-RGCs. Scale bars: 50 μ m. **b** Control AAV2 (AAV2-FLEX-Sun1GFP) infected vGlut2-IRES-Cre; LSL-Sun1-GFP mouse retinas did not show signal in anti-mCherry immunostaining. Scale bars: 50 μ m. **c** Quantification of viral transduction percent coverage of AAV2-FLEX-hOprm1-mCherry onto pan-RGC marker (Sun1-GFP) or other major RGC subtype markers shown in panel **a**. Source data are provided as a Source Data file.

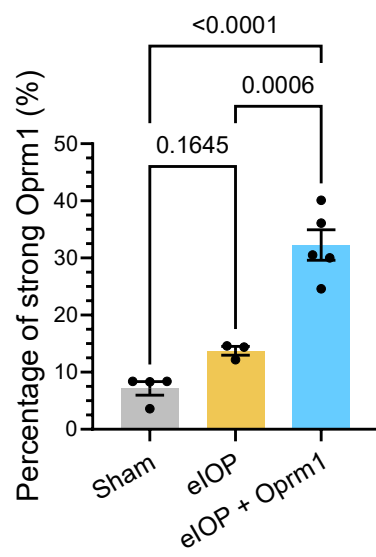
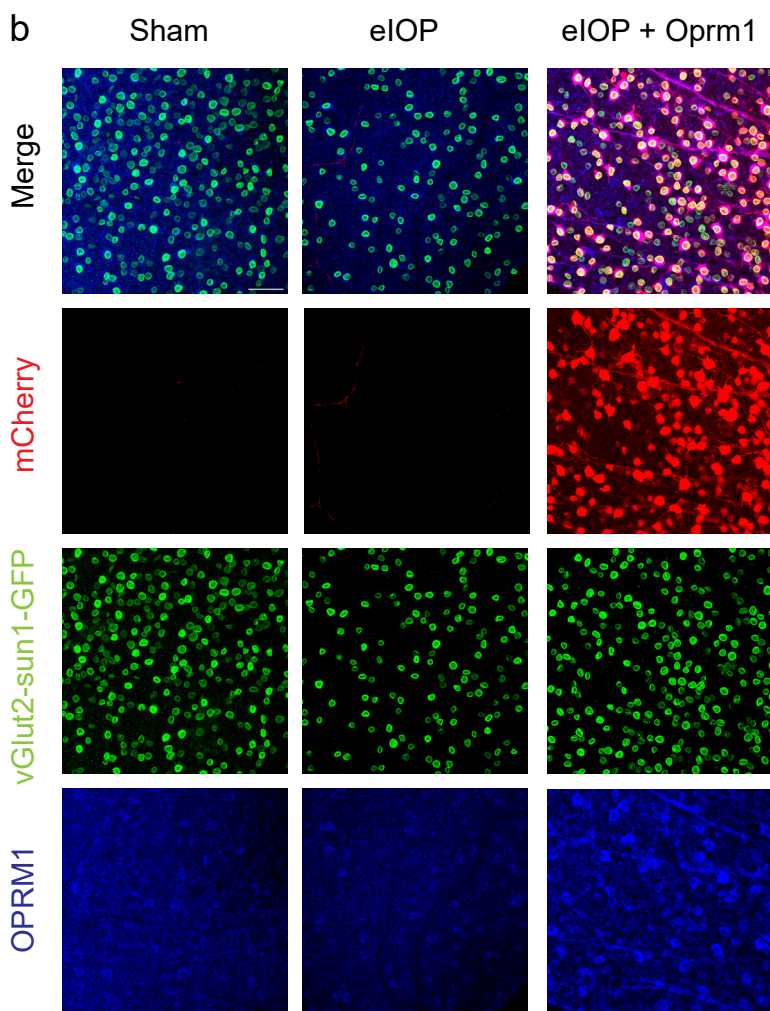
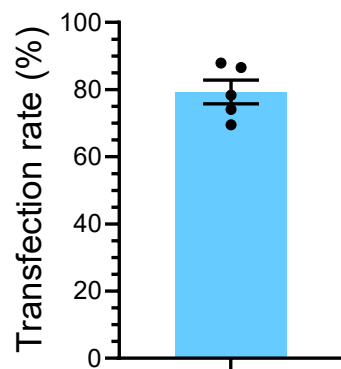
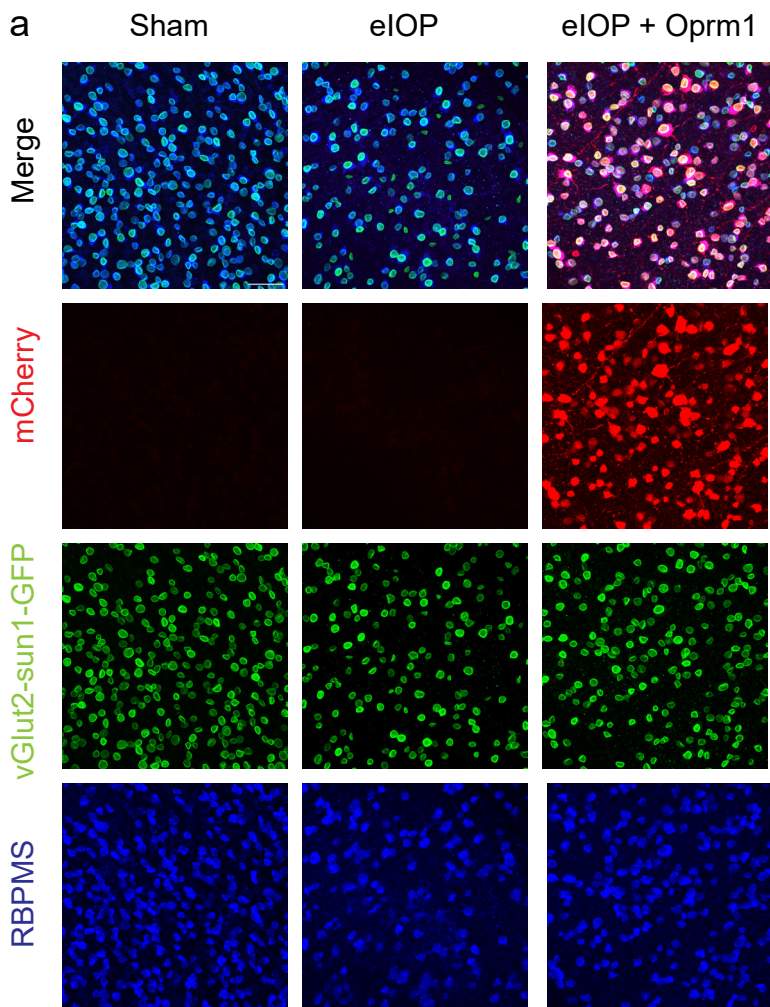


Fig. S9 AAV-mediated *Oprm1* gene transduction in eIOP glaucoma model.

a Representative confocal images of retina whole mounts showing the expression of mCherry in Oprm1 + eIOP group, which was transduced with AAV2-FLEX-mCherry-Oprm1 on vGlut2-Cre; LSL-Sun1GFP mice. The red fluorescent staining is mCherry, the green fluorescence is Sun1GFP in pan-RGCs, and the blue channel represents RBPMS staining. **b** Representative confocal fluorescent images of retina whole mounts showing the expression of mCherry in the Oprm1 + eIOP group, which was transduced with AAV2-FLEX-mCherry-Oprm1, on vGlut2-Cre; LSL-Sun1GFP mice. The red fluorescent staining is mCherry, the green fluorescence is Sun1GFP in pan-RGCs, and the blue channel represents Oprm1 staining. Scale bars: 50 μ m. Source data are provided as a Source Data file.

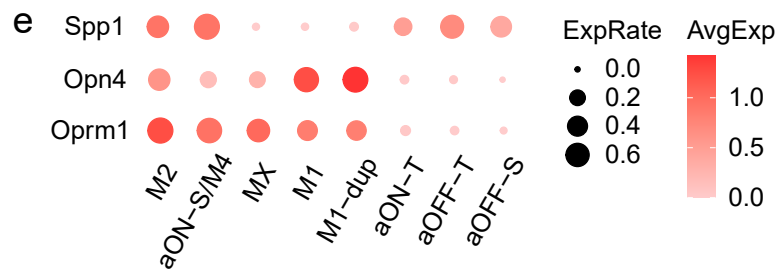
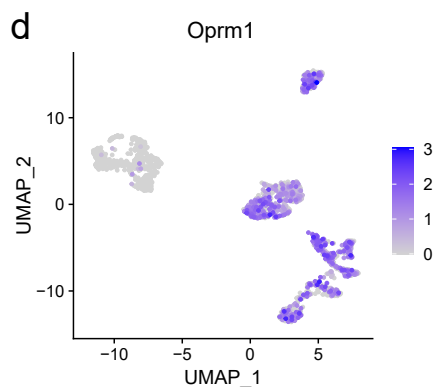
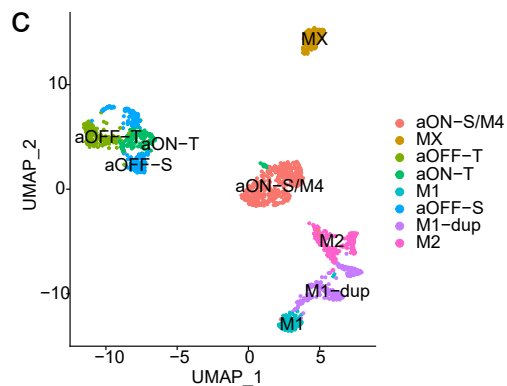
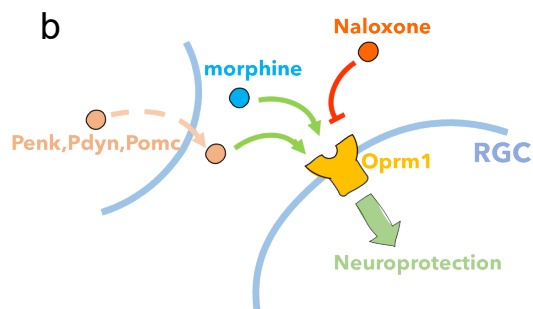
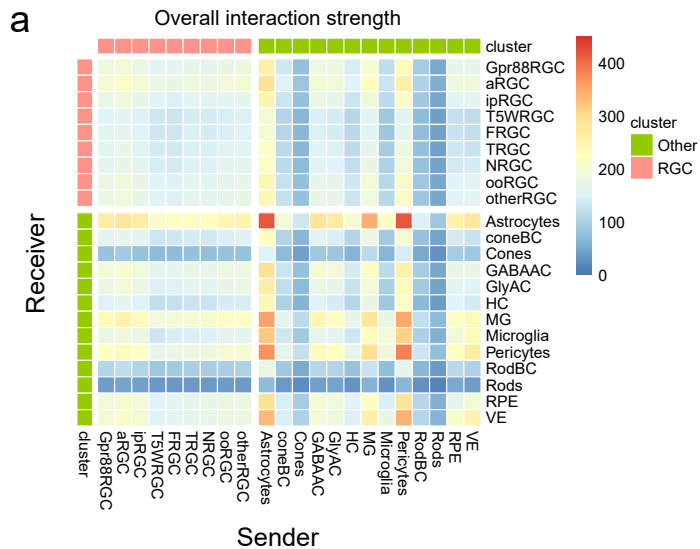


Fig. S10. Topics for discussion.

a Cell-cell interactions between retinal cell types, including those between non-RGC cell types. **b** A schematic for Oprm1 interactions. **c-e** Oprm1 expression in ipRGC and α RGC subtypes. **c** clustering and annotation of ipRGCs and α RGCs. **d** UMAP of the expression level of Oprm1. **e** Expression level of Opn4, Spp1, and Oprm1 in subtypes.