

# Direction Selectivity in the Retina Is Established Independent of Visual Experience and Cholinergic Retinal Waves

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DOI 10.1016/j.neuron.2008.03.013

## SUMMARY

Direction selectivity in the retina requires the asymmetric wiring of inhibitory inputs onto four subtypes of On-Off direction-selective ganglion cells (DSGCs), each preferring motion in one of four cardinal directions. The primary model for the development of direction selectivity is that patterned activity plays an instructive role. Here, we use a unique, large-scale multielectrode array to demonstrate that DSGCs are present at eye opening, in mice that have been reared in darkness and in mice that lack cholinergic retinal waves. These data suggest that direction selectivity in the retina is established largely independent of patterned activity and is therefore likely to emerge as a result of complex molecular interactions.

## INTRODUCTION

Direction-selective circuitry in the retina extracts motion information from the visual field and initiates reflexive eye movements, stabilizing the visual image on the retina when the animal is in motion (Faulstich et al., 2004; Stahl, 2004). Direction-selective ganglion cells (DSGCs), first characterized in the rabbit retina over 40 years ago (Barlow and Hill, 1963), fall into two populations. On DSGCs project to the accessory optic system (Simpson, 1984) and mediate the slow component of the optokinetic reflex (OKR) (Oyster et al., 1972). On-Off DSGCs project to the thalamus (Stewart et al., 1971) and superior colliculus (Vaney et al., 1981) and are thought to mediate the fast component of the OKR (Oyster et al., 1972). DSGCs show robust firing to stimuli moving in the preferred, but not the null, direction of their receptive fields. On-Off DSGCs, which have been studied most extensively, form four subtypes, each preferring motion in one of the cardinal directions: nasal, temporal, dorsal, or ventral (Oyster and Barlow, 1967). Each subtype of On-Off DSGC forms an independent mosaic that tiles the retina with little dendritic overlap (Amthor and Oyster, 1995). Thus, in the rabbit, each point on

the retina falls within the receptive fields of DSGCs sensitive to motion in each of four cardinal directions.

How does direction selectivity emerge during development? The generation of direction-selective responses in the retina requires asymmetric wiring of inhibitory starburst amacrine cells (SBACs) onto the On-Off DSGC dendritic arbor (Barlow and Levick, 1965; Fried et al., 2002; Yoshida et al., 2001; for reviews see Demb, 2007; Taylor and Vaney, 2003; Vaney and Taylor, 2002). There are two primary models for how this asymmetric wiring might emerge. In the first model, patterned neural activity, such as correlated activity in the retina originating from either vision or spontaneous bursts known as retinal waves, provides an instructive cue for the establishment of direction selectivity. In the second model, direction selectivity is “hardwired,” arising from molecular matching between subsets of processes of starburst amacrine cells and DSGCs.

Four recent lines of evidence suggest that patterned activity, rather than molecular cues, is required for the establishment of direction selectivity. First, the establishment of direction selectivity in primary visual cortex requires visual experience during a critical period of development immediately following eye opening (Li et al., 2006). This distinguishes direction selectivity from other cortical maps, such as ocular dominance and orientation tuning, which are both present at eye opening and are relatively insensitive to dark rearing (White et al., 2001). Second, work on spike-timing-dependent learning rules has indicated that direction-selective responses can emerge spontaneously from training with directional moving stimuli (Mehta et al., 2002). Indeed, intensive training with directional stimuli artificially induces direction tuning in tectal neurons, which are not normally direction selective (Engert et al., 2002). Third, the development of sensory-motor reflexes generally requires sensory experience. In the optokinetic reflex, the gain of the visually driven eye movement must be tuned to minimize the extent of “retinal slip” in order to stabilize the visual scene. The optokinetic reflex is first observed in a mouse at postnatal day 21 (P21), ~8 days after eyes open (Faulstich et al., 2004), and is diminished after a period of dark rearing (McMullen et al., 2004). Fourth, no molecular-based mechanism has yet been identified that could mediate the asymmetric wiring pattern of inhibitory inputs onto an

individual DSGC along one of the four distinct cardinal axes. Though molecular gradients that uniquely determine location along the dorsal-ventral (D-V) and nasal-temporal (N-T) axes exist in the retina (Flanagan, 2006; McLaughlin and O'Leary, 2005), DSGCs at the same D-V, N-T location would need to respond differently to the gradients in order to wire the null-side inhibition along all four cardinal axes.

The development of direction selectivity in the retina has not been fully explored. Older studies reported that retinal ganglion cells (RGCs) with asymmetric responses to moving stimuli were detected around the time of eye opening in rabbit (Bowe-Anders et al., 1975; Masland, 1977) and that the distribution of preferred directions was not biased by repeated presentations of moving gratings during development (Daw and Wyatt, 1974). Here, we directly test the hypothesis that patterned activity induced by early visual responses is necessary for the establishment of On-Off DSGCs.

## RESULTS AND DISCUSSION

First, we characterize direction-selective circuits in adult mice using multielectrode arrays that record simultaneously from hundreds of RGCs (Frechette et al., 2005; Litke et al., 2004; Shlens et al., 2006). Isolated retinas were stimulated with drifting gratings, and On-Off DSGCs were identified based on strict criteria (see [Experimental Procedures](#) and [Figure S1](#) available online). In agreement with previous studies (Weng et al., 2005), we found robust On-Off DSGCs in the adult mouse. An example of the On-Off DSGCs recorded simultaneously from a single adult mouse retina (postnatal day 45 [P45]) is shown in [Figure 1B](#). The polar plot in [Figure 1A](#) summarizes the raw spike trains recorded from a single cell in response to a drifting grating stimulus that moved across the retina in 16 directions. For each cell, we computed the vector sum of the response, with the length of the vector representing the strength of tuning and the angle of the vector defining the preferred direction of motion (see [Experimental Procedures](#)). Similar to what has been observed in the rabbit retina using *in vivo* single-unit recordings (Oyster and Barlow, 1967), On-Off DSGCs in the mouse retina respond most strongly to motion along each of four roughly perpendicular cardinal directions ([Figure 1B](#)).

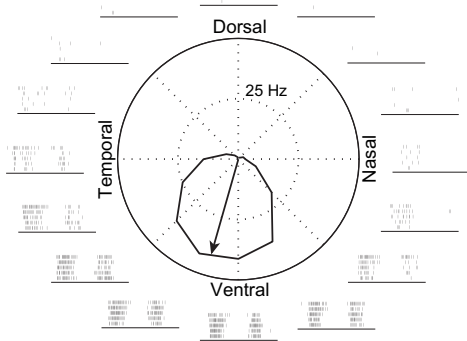
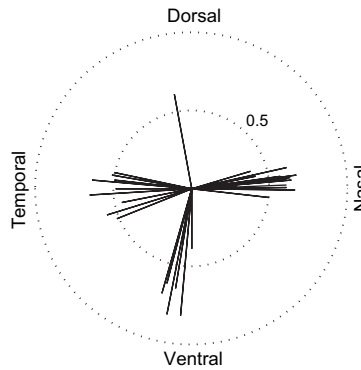
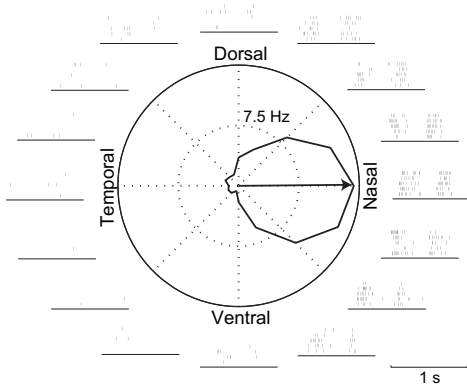
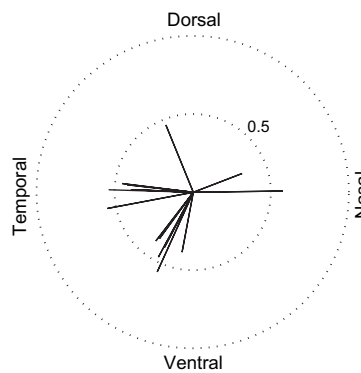
Next, we determined the earliest age at which On-Off DSGCs could be identified. The first light-evoked responses are detected in mouse retina at P10 (Demas et al., 2003; Tian and Copenhagen, 2003), which is 2 to 3 days before the eyes open. These early responses require strong light flashes and are much weaker compared to responses at older ages. The earliest age at which we could elicit robust RGC firing by both increasing and decreasing the illumination was P14 ([Figure S2](#)). These On and Off responses were still not at the adult level, consistent with previous studies concluding that the anatomy and physiology of RGCs are not fully mature in mice until P28 (Tian and Copenhagen, 2001, 2003), similar to the retinal development in rabbit (Bowe-Anders et al., 1975; Masland, 1977), ferret (Wang et al., 2001), and cat (Rusoff and Dubin, 1977; Tootle, 1993). However, we found that, at P14, which is 1 or 2 days after the eye opening, On-Off DSGCs were already present in the retina.

To test the role of visual experience in establishing On-Off DSGCs, we repeated the recordings in P14 dark-reared mice. Despite the weakness of the light responses prior to eye opening, previous studies indicate that light coming through the closed eyelids may provide a relevant pattern of activity for the development of visual circuits. Indeed, visual deprivation by dark rearing during this period alters the refinement of circuits within the retina and in the dorsal LGN (Sernagor et al., 2001; Sernagor and Grzywacz, 1996; Tian and Copenhagen, 2003; Grubb and Thompson, 2004). To test whether limited vision, either through closed eyelids or from the brief visual experience between eye opening and the P14 experiments, was necessary to establish direction selectivity, we assayed direction-selective responses in mice that were dark reared from P7 to the time of the experiments. We detected a large number of DSGCs in P14 dark-reared mice ([Figures 1C](#) and [1D](#)), indicating that direction selectivity is established early in development and independent of visual experience.

Robust direction-selective responses were detected despite the observation that P14 DSGCs had significantly lower firing rates in their preferred directions compared to adult DSGCs ( $p < 0.01$ ; [Figure S3](#)). In contrast, there was no difference between the adult and P14 DSGCs in the null direction firing rates. We would therefore expect P14 DSGCs to have more uniform response curves and, consequently, broader tuning widths. To quantify the tuning width of each cell, we used a fit to its direction-selective response curve (see [Experimental Procedures](#); [Figure 2A](#), insets). In the adult retina, tuning widths varied between 70 and 150 degrees, with the more broadly tuned cells exhibiting a more uniform distribution of firing rates across stimulus directions ([Figure 2A](#)). As expected, the tuning width distributions for both the P14 and P14 dark-reared mice were shifted to broader values compared to the adult distribution ([Figure 2B](#)). Most importantly, though, both normal and dark-reared P14 mice exhibited DSGCs with well-defined null directions.

In summary, the presence of directional tuning at P14 indicates that there is sufficient null-side inhibition at the time of eye opening for robust direction selectivity. The null-side firing rate is dependent on the strength of the inhibitory inputs onto DSGCs, whereas firing rate for stimuli moving in the preferred direction is determined primarily by the strength of the excitatory inputs. Therefore, the lower preferred direction firing rates at P14 compared to adult suggest that effective null-side inhibition onto DSGCs is established before the maturation of the excitatory pathways and/or the spike-generating mechanisms in DSGCs.

We have excluded the role of visual experience in the establishment of direction selectivity and concluded that the null-side inhibition provided by SBACs onto DSGCs is wired very early in development. Could some form of patterned activity other than vision instruct this early wiring? One strong candidate is retinal waves: spontaneous bursts of correlated activity that spread across the ganglion cell layer of the retina prior to eye opening (for reviews see Firth et al., 2005; Torborg and Feller, 2005; Wong, 1999). In particular, cholinergic retinal waves, which appear during the first postnatal week, are generated by the same starburst amacrine cells that underlie the null-side inhibition in DSGCs (Zheng et al., 2006, 2004). SBACs and DSGCs

**A Adult - light reared****B****C P14 - dark reared****D****Figure 1. Responses of On-Off DSGCs to Moving Gratings Reveal Strong Direction Selectivity in the Adult and P14 Dark-Reared Mouse**

(A and C) Polar plot of mean spike rate response to motion in 16 directions across five repetitions. Spike traces for all directions are shown for one period of the moving grating. The tuning curve was obtained using the mean firing rate in response to each direction (see *Experimental Procedures*). The arrow indicates mean preferred direction of the example cell.

(B and D) The preferred directions of all On-Off DSGCs within one adult preparation (B) fall clearly into four groups along the cardinal directions. The cardinal directions were more variable at P14 (see also *Figure 3*). The preferred direction of each cell is shown as the normalized vector sum of the response, so that the length of each line indicates the normalized response magnitude.

Adult:  $n = 31$  cells; P14 dark reared:  $n = 15$  cells.

costratify early in development (Stacy and Wong, 2003) and show tightly correlated activity during this stage of retinal waves (Zheng et al., 2006, 2004; Zhou, 1998). This evidence suggests that cholinergic retinal waves, which are directional in their propagation properties, could provide instructions for the asymmetric wiring between SBACs and DSGCs during the first week after birth (Demb, 2007; Weng et al., 2005).

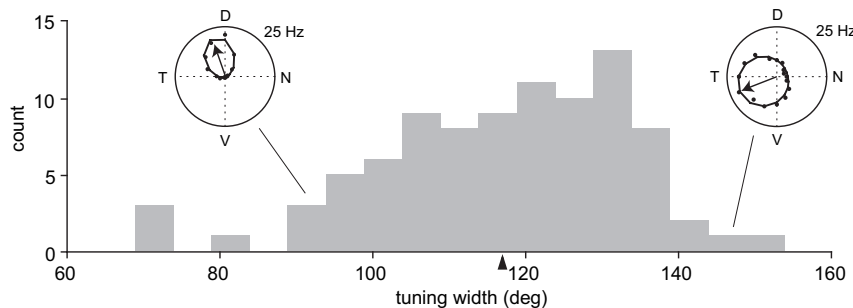
To determine whether cholinergic retinal waves are necessary for establishing direction selectivity, we examined mice lacking the  $\beta 2$  subunit of the nicotinic acetylcholine receptor ( $\beta 2^{-/-}$ ). These mice lack normal propagating correlated activity during the first postnatal week (Bansal et al., 2000; McLaughlin et al., 2003; Cang et al., 2005), though there is evidence that  $\beta 2^{-/-}$  mice exhibit noncholinergic propagating activity under some conditions (Singer et al., 2001; J.M. Ballesteros, C. Sun, A.V. Golshchapov, H.J. Cheng, and L.M. Chalupa, 2007, poster D23, Society for Neuroscience; D. Feldheim, personal communication). Even though significant local correlations persist in  $\beta 2^{-/-}$  mice, these mice lack the propagating waves that correlate the firing of SBACs and DSGCs in a sequential manner (Torborg et al., 2004). Characterizing DSGCs in  $\beta 2^{-/-}$  mice therefore allows us to directly test whether cholinergic retinal waves play an instructive role in the establishment of direction selectivity.

If patterned activity in the form of cholinergic waves were necessary for establishing DSGCs, we would expect direction

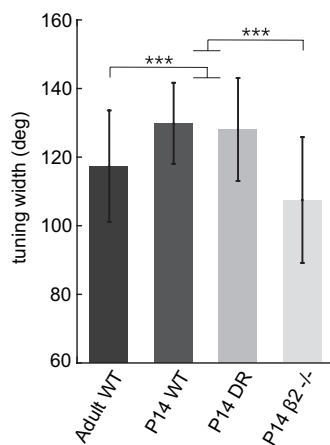
selectivity in  $\beta 2^{-/-}$  mice to be grossly disrupted. However, we found well-tuned DSGCs in  $\beta 2^{-/-}$  mice at P14 (Figure 2C). This was despite the fact that the DSGCs in P14  $\beta 2^{-/-}$  mice were fewer in number compared to the P14 WT, consistent with the observation that signaling via nicotinic acetylcholine receptors (nAChRs) strongly modulates the amplitude of DSGC responses in adult mice (Weng et al., 2005) and rabbits (Kittila and Massey, 1997). Indeed, we found that acute blockade of  $\beta 2$ -containing nAChRs with dihydro- $\beta$ -erthroidine (8  $\mu$ M) significantly reduced the firing rate of DSGCs in P14 WT mice ( $n = 3$  cells, data not shown). Despite the relative sparseness of detected DSGCs,  $\beta 2^{-/-}$  mice showed narrow directional tuning that was not significantly different from adult WT mice (Figure 2B). The presence of strong direction-selective responses with complete null-side inhibition in  $\beta 2^{-/-}$  mice indicates that the asymmetric wiring underlying the generation of direction selectivity can occur independent of cholinergic retinal waves.

The finding that visual experience and cholinergic retinal waves are not necessary for the establishment of direction selectivity does not completely eliminate a role for neural activity in the process. First, there may be a role for glutamatergic retinal waves, which appear between P11 and P14 (Torborg and Feller, 2005). Glutamatergic retinal waves coexist with visual responses and are thought to be mediated by bipolar cells, whose inputs are symmetrically distributed onto DSGCs (Jeon et al., 2002). Whether SBACs and DSGCs are correlated by glutamatergic waves is not known. Second, spontaneous activity that locally correlates the firing between SBACs and DSGCs but does not propagate across the retina may still be critical for the establishment of the inhibitory synapses that shape the final light responses of DSGCs (Huang et al., 2007; Maffei et al., 2006; Tao and Poo, 2005).

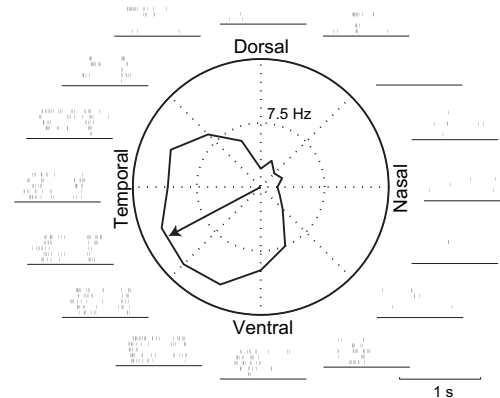
### A Adult tuning widths



### B



### C P14 β2<sup>-/-</sup>



**Figure 2. Population Tuning Widths Change during Development**

(A) Histogram shows the distribution of tuning widths (full width at half height of a von Mises fit, see [Experimental Procedures](#)) of all adult WT cells (90 cells from 11 mice). Arrowhead shows mean value. Insets show the average responses (dots) and the von Mises fits (lines) for two cells. The arrow indicates the preferred direction for each cell. (B) A comparison of tuning widths across groups (adult n values same as above: P14 WT, n = 75 cells from 11 mice; P14 dark reared, n = 50 cells from 4 mice; P14 β2<sup>-/-</sup>, n = 13 cells from 4 mice). The adult WT and P14 β2<sup>-/-</sup> mice showed significantly narrower tuning than both the P14 WT and P14 dark-reared mice (p < .0001; one-way ANOVA with Tukey post hoc test). Data are presented as mean ± SD. (C) An example On-Off DSGC from a P14 β2<sup>-/-</sup> mouse.

Thus far we have shown that the establishment of direction selectivity does not require patterned activity in the form of early light responses or cholinergic retinal waves that correlate the firing of starburst amacrine cells and DSGCs. These findings indicate that molecular markers rather than correlated activity are likely to be critical for establishing DSGCs. We would thus predict that the alignment of the DSGC preferred directions along the four cardinal axes would also be established independent of visual experience.

To assess the development of the cardinal axes, we first characterized the axes in adult mice. By pooling across preparations, we were able to count the fraction of total DSGCs belonging to a 90 degree bin centered at each cardinal direction. Though we were careful to align the retinas in a consistent manner on the array (see [Experimental Procedures](#)), we deliberately chose a large bin size to account for the variability in placement of about ±10 degrees. In the adult, the preferred directions of the DSGCs formed four clear clusters corresponding to the four cardinal directions (Figures 1B and 3A). Similar to previous studies of rabbit DSGCs (Oyster, 1968), the fraction of cells belonging to each cardinal direction was not uniformly distributed (Figure 3A; p < 0.05, χ<sup>2</sup> test of uniformity). However, the distributions along the temporal-nasal and ventral-dorsal axes were roughly symmetric, in that the cells that prefer two opposite directions of mo-

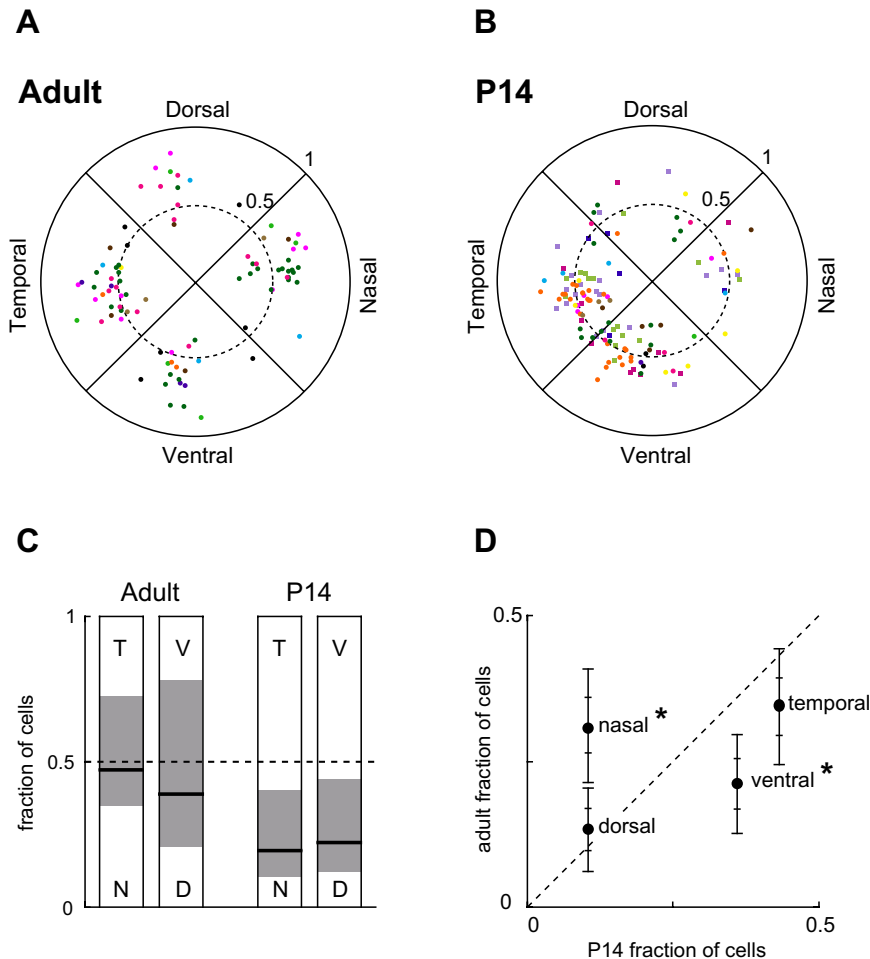
tion were roughly the same in number (ratio of temporal to nasal quadrant count: 1.107, p = 0.3281; ventral to dorsal: 1.583, p = 0.0887; see [Experimental Procedures](#)).

The pooled P14 WT data also showed a nonuniform distribution of cells among the four cardinal directions (Figure 3B; p < 0.001, χ<sup>2</sup> test of uniformity). In addition, the representation of opposite directions along the same axis was strongly biased, with temporal and ventral quadrants being significantly overrepresented

compared to their opposites (ratio of temporal to nasal quadrant count: 4.154, p = 0.0001; ventral to dorsal: 3.461, p = 0.0001). Figure 3C illustrates this asymmetry along both temporal-nasal and ventral-dorsal axes at P14 by showing the fractions of cells belonging to the two quadrants along each axis.

To further quantify the differences in the distribution of preferred directions of On-Off DSGCs at P14 and in the adult, we compared the relative abundance of cells on a quadrant-by-quadrant basis. We constructed 95% confidence intervals for each adult cardinal direction by resampling the adult data (see [Experimental Procedures](#)) and found that the relative representation of the nasal and ventral directions was significantly changed between P14 and adult (Figure 3D). To exclude the influence of a sampling bias, we verified that this effect was robust to variations of the cell selection criteria (see [Experimental Procedures](#)).

What could explain the biases in the distributions of DSGC preferred directions seen at P14? Because RGC differentiation is largely completed by the time of eye opening (Sernagor et al., 2001), the On-Off DSGC mosaics corresponding to the four preferred directions are likely to be formed at P14. It is possible, however, that the four cell types are not equally responsive to light at this age. Indeed, the synaptic contacts between RGCs and bipolar cells only start to form around the time of eye



**Figure 3. Distributions of Preferred Directions for On-Off DSGCs in Adult and P14 Mice**

(A and B) Scatter plot shows the preferred directions and normalized magnitudes of the responses of adult and P14 cells pooled across experiments (adult,  $n = 90$  cells from 11 mice; P14,  $n = 125$  cells from 15 mice). Each color represents data from a single experiment. At P14, squares are dark-reared mice; circles are normal mice.

(C and D) The fraction of cells belonging to each cardinal direction was calculated by grouping the data shown in (A) and (B) into 90 degree bins. (C) The symmetry of preferred directions along a given axis (temporal-nasal or ventral-dorsal) was tested by calculating the fraction of cells falling in one quadrant along the axis (e.g., temporal) versus the fraction of cells in the opposite quadrant (e.g., nasal). A perfectly symmetric axis would have 50% of cells in opposite quadrants. The thick black bars show the actual distribution of cells along the axes for adult and P14. The shaded gray regions show the 95% confidence interval around each value based on resampling of the adult and P14 distributions (see [Experimental Procedures](#)). (D) A comparison of adult and P14 distribution of preferred directions on a quadrant-by-quadrant basis. In the case of a uniform distribution, each quadrant would encompass 25% of cells. The error bars show  $\pm 1$  SD (inner ticks) and  $\pm 2$  SD (outer ticks) based on resampling the adult distribution (see [Experimental Procedures](#)). Directions whose error bars lie beyond the dashed line have P14 values significantly different from adult values.

opening (Sherry et al., 2003). It is therefore possible that the bipolar cell inputs onto the four On-Off DSGC mosaics mature in a stereotyped order during development, starting with the temporal and ventral directions of motion.

In summary, at the time of eye opening, we observed well-established DSGCs in the mouse retina, with nearly normal tuning and an organized but asymmetrical distribution of the preferred directions. These findings indicate that patterned activity containing directional information, either from visual experience or from cholinergic retinal waves that correlate the firing of starburst amacrine cells and DSGCs, is not necessary to establish the retinal circuits that mediate direction selectivity, though it may be involved in the refinement of these circuits. This is in sharp contrast to the primary visual cortex, where dark rearing during an early critical period prevented the establishment of direction-selective cells (Li et al., 2006) and to On-Off segregation in the retina, where dark rearing disrupted the normal development of the dendritic stratification and the receptive fields of On and Off RGCs (Tian and Copenhagen, 2003). In addition, our data suggest that the excitatory drive, presumably from bipolar cell contacts, to the four subtypes of DSGCs emerges in a stereotyped order beginning with DSGCs preferring temporal and ventral motion. Together, these results have implications

for understanding how neural circuits are wired during development to perform behaviorally relevant computations, and they show that some components of sensory-motor reflexes are established independent of visual activity.

## EXPERIMENTAL PROCEDURES

### Animals

Mice with heterozygous alleles of the  $\beta 2$  subunit of the nicotinic acetylcholine receptor ( $\beta 2^{+/-}$ ) were originally provided by Dr. Art Beaudet from Baylor College of Medicine (Xu et al., 1999). These mice were bred after backcrossing onto a C57BL/6 strain for many generations. The genotypes were determined according to the published protocol (Xu et al., 1999). C57BL/6 mice obtained from Harlan labs were used for all WT recordings. Dark-reared litters (mothers and pups) were raised in darkness from P7 to P14 and monitored using infrared goggles. Mice not used for dark-rearing experiments were maintained on a 12 hr light/dark cycle. Adult mice used in the recordings ranged in age from P28 to P45. All procedures were approved by the University of California, San Diego Institutional Animal Care and Use Committee and conformed to Salk Institute guidelines.

### Acute Retina Preparation

All dissections were performed using dim red ambient light and infrared illumination on the dissection scope to prevent bleaching of the retinas. All mice were dark adapted for at least 60 min before the experiment. Animals were

anesthetized with an i.p. injection of 100 mg/kg ketamine and 10 mg/kg xylazine prior to decapitation. After enucleation of the right eye, the eye was transferred to buffered Ames medium. Next, the eye was hemisected posterior to the ora serrata, and the cornea, lens, and vitreous were removed with forceps. We used blood vessel landmarks visible through the retina on the choroid to mark the ventral axis of the eyecup prior to removing the pigment epithelium with forceps. Next, we hemisected the isolated retina along the nasal-temporal axis, as indicated by the landmarks. For all recordings, we used retina from the dorsal region of the right eye to minimize the variability across preparations. Stimulus motion was defined in the coordinates of an isolated retina, e.g., dorsal motion moved toward the dorsal part of the retina. These directions are flipped for the intact animal due to the optics of the lens.

Once a piece of dorsal retina had been isolated, it was placed ganglion-cell-side down onto a custom-built multielectrode array. Three types of arrays were used: 61 electrode arrays with 5  $\mu\text{m}$  diameter electrodes and 60  $\mu\text{m}$  spacing, 61 electrode arrays with 5  $\mu\text{m}$  diameter electrodes and 30  $\mu\text{m}$  spacing, and 512 electrode arrays with 5  $\mu\text{m}$  diameter electrodes and 60  $\mu\text{m}$  spacing (Frechette et al., 2005; Litke et al., 2004; Shlens et al., 2006). The piece of retina was aligned so that the nasal-temporal axis was parallel to the bottom of the array, with a variability of roughly  $\pm 10$  degrees. Once the piece had been aligned, a dialysis membrane was used to hold the retina in place on the array (Spectra/Por 6 RC dialysis tubing, MWCO 25,000). The array was superfused with Ames solution ( $\sim 220$  ml/hr) bubbled with 95%  $\text{O}_2$  and 5%  $\text{CO}_2$  and maintained at 34°C–35°C, pH 7.4.

### Light Stimulation

The photoreceptor layer of the isolated piece of retina was stimulated from above with an optically reduced image of a CRT monitor focused with a microscope objective, centered on the array, and refreshing at 120 Hz (gray screen intensity = 1623 491 nm equivalent photons/ $\mu\text{m}^2/\text{s}$ ). For most experiments, the retina was stimulated with five repetitions of full-field square wave gratings moving in one of 16 randomly interleaved directions, with each presentation lasting 10 s, followed by 3 s of gray screen (800  $\mu\text{m}/\text{period}$ , 1.066 s/period, velocity = 25 deg/s for the adult mouse; Remtulla and Hallett, 1985). In some 61 electrode recordings, full-field sinusoidal gratings were used (400  $\mu\text{m}/\text{period}$ , 0.533 s/period, velocity = 25 deg/s for the adult mouse).

### Data Analysis

The voltage trace recorded on each electrode was sampled at 20 kHz and stored for off-line analysis. Spikes that crossed threshold were sorted according to the principal components of their voltage waveforms on individual electrodes (for arrays with 60  $\mu\text{m}$  electrode spacing) or on a set of neighboring electrodes (for arrays with 30  $\mu\text{m}$  spacing). Spikes were first projected into the first five principal component dimensions, where an expectation maximization algorithm was used to group spikes based on a mixture of Gaussians model (Litke et al., 2004). All resulting spike clusters were inspected manually in the principal component space.

To verify that each cluster came from a single cell, the rate of refractory period violations was estimated using the number of interspike intervals between 0.5 and 1.2 ms. Only the clusters where refractory period violations represented less than 10% of all spikes were used for the subsequent analysis. In addition, cells with an average firing rate of less than 1 Hz and cells with unstable background firing (a larger than 75% decrease, as measured in a 260 s window in the beginning and at the end of the recording) were excluded from consideration.

For a given cell, the response to motion in each of the 16 stimulus directions was measured as the mean firing rate during a 10 s stimulus presentation, averaged across stimulus repetitions. The shape of the resulting tuning curve did not change when median interspike intervals were used instead of the mean firing rates. The tuning curves were fit with the von Mises distribution (Oesch et al., 2005):

$$R = R_{\max} e^{k \cos(x-\mu)} / e^k, \quad (1)$$

where  $R$  is the response to motion in a given stimulus direction  $x$  in radians,  $R_{\max}$  is the maximum response,  $\mu$  is the preferred direction in radians (defined below), and  $k$  is the concentration parameter accounting for tuning width. The

tuning width of each cell was estimated as the full width at half height (fwhh) of the von Mises fit using the following equation derived from (1):

$$fwhh = 2\theta, \quad (2)$$

where

$$\theta = a \cos \left[ \frac{\ln \left( \frac{1}{2} e^k + \frac{1}{2} e^{-k} \right)}{k} \right]. \quad (3)$$

The preferred direction of every cell was determined by a vector sum of the normalized responses to motion in all 16 stimulus directions. Before the summation, the response to motion in each direction on a given repetition was normalized by dividing by the total number of spikes elicited during that repetition across directions. Averaging the resulting vector sums across repetitions yielded the preferred direction vector. For a given cell, the magnitude of the response in the preferred direction could vary from 0 (no direction preference) to 1.

On-Off direction-selective cells were isolated based on two criteria. First, the direction-selective index was calculated for each cell:

$$D.I. = \frac{(\text{pref} - \text{null})}{(\text{pref} + \text{null})},$$

where *pref* is the average response in the preferred direction, defined as the stimulus direction closest to the vector sum, and *null* is the stimulus direction 180 degrees opposite *pref*. Cells with a *D.I.* > 0.6 were classified as direction selective. Next, the On-Off sensitivity of these cells was quantified based on the power spectra of responses to drifting square wave or sinusoidal gratings (Figure S1). Cells with a prominent f1 component ( $f_2/f_1 < 1$ ) were classified as On DSGCs and excluded from the analysis.

To verify that the distribution of preferred directions among the On-Off DSGCs was not biased by cell selection, we varied independently each of the five selection parameters: the minimum average firing rate, maximum firing rate instability, maximum rate of refractory period violations, minimum value of the direction selectivity index, and the minimum  $f_2/f_1$  ratio. Depending on the parameter, it could be varied between 25% and up to 300% of its original value without changing the relative fraction of On-Off DSGCs that fall into each of the four quadrants in Figures 3A and 3B.

To compute the 95% confidence intervals (shaded gray in Figure 3C) for the ratio of cells in opposing quadrants, sample distributions were created by drawing from either an adult or P14 distribution with replacement and calculating the fraction of cells in each quadrant for each sample. This procedure was repeated 10,000 times, resulting in four non-Gaussian distributions of axis ratios (one for the adult temporal-nasal axis, another for adult ventral-dorsal axis, and same for P14). We identified the confidence intervals based on the upper and lower 2.5% boundaries of these distributions. A similar procedure was used to calculate the error bars in Figure 3D. Here, the samples were drawn only from the adult distribution, resulting in Gaussian distributions of possible values for each cardinal direction, centered at the actual value. The standard deviations of these distributions were used as the error bars for each direction.

### SUPPLEMENTAL DATA

The Supplemental Data for this article can be found online at <http://www.neuron.org/cgi/content/full/58/4/499/DC1/>.

### ACKNOWLEDGMENTS

We thank J. Gauthier for working on the initial development of mouse multielectrode array recordings. We thank W. Dabrowski, A. Grillo, M. Grivich, D. Gunning, S. Kachiguine, K. Mathieson, D. Petrusca, and J. Shlens for technical development. We thank G. Field for assistance with light intensity measurements, C. Hulse for technical assistance, and J. Bonaguro for figure suggestions. This work was supported by the McKnight Foundation (A.M.L. and E.J.C.), NSF Grant PHY-0417175 (A.M.L.), NIH Grant EY018003 (E.J.C.), NIH Grant R01EY13528 (M.B.F.), a NSF Graduate Research Fellowship (J.E.), German Academic Exchange Service (DAAD) and German Research

Foundation (DFG) (M.G.), and a Career Award at the Scientific Interface from the Burroughs Wellcome Fund (A.S.).

Received: October 29, 2007

Revised: January 28, 2008

Accepted: March 18, 2008

Published: May 21, 2008

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