Awake responses suggest inefficient dense coding in the mouse retina

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Author contributions: T.B. and H.A. designed the study; T.B. and M.T. performed experiments; T.B. analyzed the results; and T.B. and H.A. wrote the manuscript.

Competing interests: The authors declare no competing financial interests.

Key words: retinal ganglion cells; in vivo recordings; awake; anesthesia; efficient coding.

Acronyms: CMOS, complementary metal-oxide semiconductor; DS, direction-selectivity; dLGN, dorsal lateral geniculate nucleus; DLP, digital light processing; FMM, fentanyl, medetomidine and midazolam; GABA, gamma-aminobutyric acid; LED, light emitting diode; OS, orientation-selectivity; OT, optic tract; PCA, principal component analysis; PFA, paraformaldehyde; RGC, retinal ganglion cells; SC, superior colliculus; STA, spike-triggered average; UV, ultraviolet.

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1 Abstract

2 The structure and function of the vertebrate retina have been extensively studied across species with an isolated, ex vivo preparation. Retinal function in vivo, however, remains 3 elusive, especially in awake animals. Here we performed single-unit extracellular recordings 4 5 in the optic tract of head-fixed mice to compare the output of awake, anesthetized, and ex vivo 6 retinas. While the visual response properties were overall similar, we found that awake retinal 7 output had 1) faster kinetics with less variability in the response latencies across different cell 8 types; and 2) higher firing activity, by ~20 Hz on average, for both baseline and visually evoked 9 responses. Notably, unlike the other conditions, many awake ON cells did not increase firing 10 in response to light increments due to high baseline activity near saturation. Instead, they encoded light intensity fluctuations primarily by decreasing firing upon light decrements. In 11 either condition, the visual message remains the same: the more spikes, the higher light 12 13 intensity. The awake response patterns, however, violate efficient coding principles, predicting 14 that sensory systems should favor firing patterns minimizing energy consumption. Our findings suggest that the retina employs dense coding *in vivo*, rather than sparse efficient coding as 15 16 suggested from previous *ex vivo* studies.

17 Introduction

18 The vertebrate retina is one of the best characterized parts of the central nervous system (Gollisch and Meister, 2010; Masland, 2012). It consists of ~100 cell types in total (Shekhar et 19 20 al., 2016; Yan et al., 2020), including ~30 types of retinal ganglion cells (RGCs) that send the retinal output signals to the brain via the optic nerve (Sanes and Masland, 2015; Baden et al., 21 22 2016). Each of these RGC types forms distinct neural circuits within the retina to extract 23 specific features of the visual image coming into the eye, such as color, contrast, and motion. 24 The retina thus performs parallel and dynamic processing as the first stage of the visual 25 pathway.

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26 Most of our knowledge on retinal function has been obtained from ex vivo studies because isolated retinal tissues are nevertheless functional, i.e., responsive to light (Barlow et 27 al., 1964). While powerful, however, ex vivo physiological approaches have certain limitations. 28 First, one cannot perform long-term recordings (Meister et al., 1994). Second, one cannot 29 30 avoid artifacts due to retinal dissection, such as the effect of cutting RGC axons (Vidal-Sanz et al., 2017) or retinal epithelial detachment (Strauss, 2005). Neuromodulatory effects of 31 32 retinopetal pathways are also difficult to study in an isolated retinal preparation (Repérant et 33 al., 2006; Esposti et al., 2013). In vivo studies are thus indispensable for clarifying retinal 34 function thoroughly.

35 Previous physiological studies on the retina in vivo were conducted mostly under anesthetized—and often paralyzed—conditions. To monitor RGC activity in vivo, for example, 36 single-unit recordings were made directly from the retina (Kuffler, 1953), at the optic nerve or 37 38 tract fibers (Hartline, 1938; Lettvin et al., 1959; Enroth-Cugell and Robson, 1966; Mastronarde, 1983, 1985; Sagdullaev and McCall, 2005), or in the form of "slow-potential" in the dorsal 39 lateral geniculate nucleus (dLGN; Bishop et al., 1962; Kaplan and Shapley, 1984). Optical 40 methods were also developed to image the activity of retinal neurons directly through the pupil 41 42 of a live animal (Geng et al., 2012; Yin et al., 2013, 2014). In contrast, thus far only a handful of studies have reported awake recordings from the retina (Esposti et al., 2013; Hong et al., 43 44 2018) or its outputs (Weyand, 2007; Liang et al., 2018, 2020; Schröder et al., 2020; Sibille et 45 al., 2021). Thus, despite a long history of research on the retina, it still remains unclear what exactly the eye tells the brain in awake animals. 46

As recordings from awake behaving animals became routine for many brain areas (Dombeck et al., 2007; Jun et al., 2017), growing attention has been paid to the roles of an animal's behavior and internal brain states in the function of the sensory systems (Niell and Stryker, 2010; Lee and Dan, 2012). For example, systematic studies on the early visual pathway showed higher firing activity and faster response dynamics in both dLGN (Durand et al., 2016) and the superior colliculus (SC; De Franceschi and Solomon, 2018) of awake

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animals than those under anesthesia. A critical question that was left unanswered is to what
extent such differences originate in the retina.

55 To clarify differences in the retinal visual response properties between awake and 56 anesthetized conditions, here we employed single-unit extracellular recording techniques from head-fixed mice. Specifically, the electrodes were placed in the optic tract (OT), a bundle of 57 nerve fibers composed of RGC axons as they project from the eye to their main targets: dLGN 58 and SC. These recordings are superior to direct in vivo retinal recordings (e.g., with epiretinally 59 implanted mesh electrodes; Hong et al., 2018) because the retinal circuits and the eye optics 60 61 remain intact, and also to those extracellular recordings in SC (Sibille et al., 2021) or dLGN (Weyand, 2007) because RGC axonal signals do not need to be disambiguated from those of 62 local axons or somata. This advantage also exists for calcium imaging recordings of the retina 63 directly in the eye of immobilized zebrafish larvae (Esposti et al., 2013) or those of RGC axon 64 65 terminals in dLGN (Liang et al., 2018, 2020) or SC (Schröder et al., 2020). These imaging approaches, however, lack the temporal precision as in the electrophysiology, which is an 66 important aspect of the information processing in the retina (Gollisch and Meister, 2008). 67

From our OT recordings, we examined the visual responses to a set of visual stimuli 68 widely used for probing retinal function ex vivo (Baden et al., 2016; Jouty et al., 2018). 69 70 including moving gratings, white-noise stimuli, and full-field flickering stimuli at different temporal frequencies. We used two different anesthetics that are commonly used in 71 neuroscience research: isoflurane gas and an intraperitoneal combination of fentanyl, 72 medetomidine and midazolam (FMM). In both cases, we found that the temporal dynamics of 73 74 the retinal outputs were slower than in awake recordings, consistent with the previous studies on the effects of anesthesia in retinorecipient areas (dLGN, Durand et al., 2016; SC, De 75 76 Franceschi and Solomon, 2018). We also found that the retinal outputs in an awake condition 77 had higher baseline firing rates than in anesthetized or ex vivo conditions. As expected from 78 previous ex vivo studies (Masland, 2012; Sanes and Masland, 2015; Baden et al., 2016; Jouty 79 et al., 2018), anesthetized ON cells encoded light increments by increasing firing from their

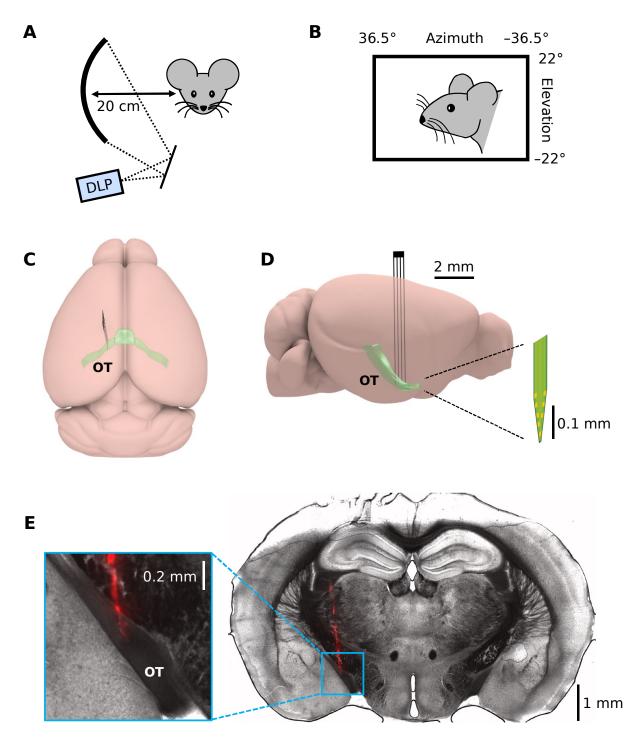
80 low baseline firing rates. In contrast, many awake ON cells encoded light decrements by decreasing firing from their high baseline firing rates, but not light increments due to saturation. 81 They convey the same information in either condition: the more spikes, the higher light 82 intensity. However, the amount of information transmitted per spike is lower in the awake 83 84 responses. This disagrees with sparse efficient coding (Attneave, 1954; Barlow and Rosenblith, 1961) or minimum energy principles (Laughlin, 2001) that are widely used as a 85 86 model of the early visual processing (Atick and Redlich, 1990; Gjorgjieva et al., 2019). A new 87 theoretical framework based on dense coding principles will thus be needed to explain retinal 88 function in vivo.

89 **Results**

90 Characterization of retinal output responses in vivo

To monitor retinal output *in vivo*, we established extracellular single-unit recording methods from axons of retinal ganglion cells (RGCs) in the optic tract (OT) of head-fixed mice (Figure 1). In total, we made 17 chronic (75 cells) and 52 acute recordings (298 cells with isoflurane; 103 cells with FMM), where a standardized set of visual stimuli were presented to the subject animal to characterize the visual response properties of the recorded cells (for ~1 hour; Figure 1A,B; see Methods for details).

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Figure 1: in vivo extracellular recordings from the mouse optic tract. A,B: Schematic 98 diagram of the experimental set-up. We presented visual stimuli to a head-fixed mouse using 99 a digital light processing (DLP) device projecting images onto a spherical screen placed 100 101 laterally to the subject animal (A, front-view; B, side-view). See Methods for details and specifications. *C*,*D*: Schematic diagram (C, top-view; D, side-view) of the brain and electrode 102 103 location to target the optic tract (OT). E: Histological image of a representative brain sample 104 (coronal section, 150 µm thick) showing the electrode trace (red, Dil stain deposited on the electrode). 105

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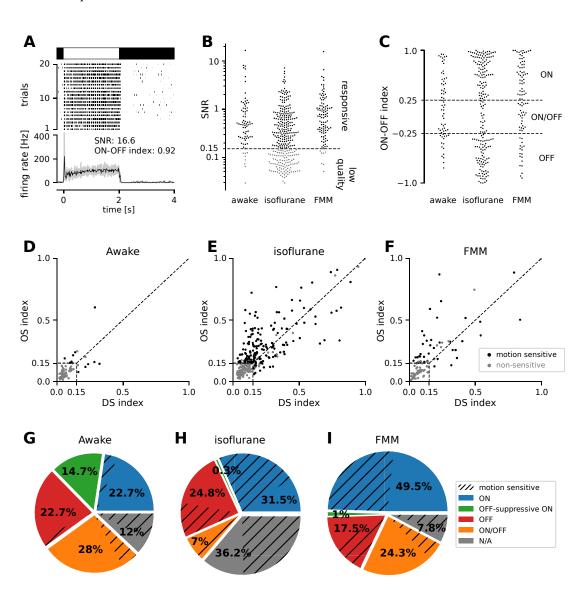
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106 We performed physiological cell-type classification of the recorded cells (see Methods for details) and identified most major RGC types in our data sets (Figure 2; Sanes and Masland, 107 2015; Baden et al., 2016; Jouty et al., 2018). Specifically, we first identified reliably responsive 108 cells based on the visual responses to full-field contrast-inverting stimuli (Figure 2A,B), and 109 110 categorized their response polarity into ON, ON/OFF, OFF types (Figure 2C). In both anesthetized and awake conditions, we found around 30-50% of ON cells, 10-30% of ON/OFF 111 cells, and around 20% of OFF cells in our data sets. We then further classified the cells from 112 the viewpoint of motion sensitivity, based on the responses to moving gratings in eight different 113 directions (Figure 2D-F). In the anesthetized conditions, about a half of the cells (42-56%) 114 115 were motion sensitive regardless of their response polarities or anesthetics. In contrast, we 116 found much less motion sensitive cells (15%) in the awake condition. This is consistent with the previous results in the superior colliculus (SC; Kasai and Isa, 2021), and presumably due 117 118 to the consequence of optokinetic nystagmus (Kretschmer et al., 2017). When a motion in a wide visual field is presented, such as moving gratings, mice show compensatory eye 119 movements to stabilize the image on the retina (Tabata et al., 2010). As a result, motion 120 sensitive RGCs might have been driven less in the awake condition. 121

Our approach cannot obtain some RGC types that do not send their axons to OT, such as the one projecting to the suprachiasmatic nucleus via the retinohypothalamic tract (Li and Schmidt, 2018). Nevertheless, the fact that we obtained diverse types of visual responses, better than previous *in vivo* studies (Hong et al., 2018; Liang et al., 2018; Schröder et al., 2020; Sibille et al., 2021) if not all the ~30 RGC types observed *ex vivo* (Baden et al., 2016; Jouty et al., 2018), validates our recording methods to monitor retinal outputs *in vivo*.

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Figure 2: Physiological classification of retinal output responses in vivo. A: 129 130 Representative retinal output responses to full-field contrast inverting stimuli: top, stimulus; middle, raster graph over trials; bottom, peri-stimulus time histogram (black, mean; gray, 131 variance; signal-to-noise ratio (SNR), Eq.(1) in Methods; ON-OFF index, Eq.(2)). B: SNR of 132 the retinal output responses in different recording conditions. We set a threshold at 0.15 to 133 identify reliably responsive cells (black) and low-quality unclassifiable cells (gray). C: ON-OFF 134 index distributions from the reliably responsive cells. While no apparent clusters were 135 identified, we set a threshold at ±0.25 to categorize the response polarity into ON, ON/OFF, 136 and OFF types. Within the ON cell type, we further identified an OFF-suppressive type based 137 on the full-field flickering stimulus responses (Figure 3). D-F: Distribution of DS/OS indices 138 (Eq.(3)) in each recording condition (D, awake; E, isoflurane; F, FMM). We set a threshold at 139 0.15 (with p<0.2) to identify motion sensitive (black) and non-sensitive (gray) cells. G-I: 140 Fraction of identified cell types in vivo: ON (blue; OFF-suppressive type in green), OFF (red), 141 ON/OFF (orange), and the rest unclassifiable cells ("N/A", gray). Cells in each category were 142 143 further divided based on the motion selectivity (hatched). The OFF-suppressive ON cells were prominent in the awake condition (G, 11/75 cells), but rarely observed under anesthesia (H, 144 isoflurane, 1/298 cells; I, FMM, 1/103 cells). 145

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146 Higher firing in awake than in anesthetized mice

For characterizing the retinal output properties *in vivo*, we first analyzed the responses to fullfield sinusoidally flickering stimuli that linearly changed the amplitude over time (from 0 to 100% contrast for 10 s; see Figure 3A-C for representative responses). An even power of sine function with a sigmoid envelope generally fitted well to the responses (Eq. (6) in Methods). We then focused on the parameter values to analyze the response properties in different recording conditions.

First, we found significantly higher baseline firing rates in awake mice $(18 \pm 26 \text{ Hz})$; 153 median ± interquartile range) than in those under anesthesia (isoflurane, 2 ± 6 Hz, p < 0.001, 154 *U*-test; FMM, 2 ± 4 Hz, p < 0.001; Figure 3D). Awake ON cells had particularly high baseline 155 activity (up to ~100 Hz) and showed a prominent reduction in firing rates in response to light 156 decrements (see Figure 3B for example). In contrast, due to this high baseline activity near 157 saturation, many of them showed virtually no responses to light increments (N = 11/28), 158 except for a sharp rebound response to a full-contrast inversion (N = 8/11; see Figures 2A 159 160 and 3B for example). These ON cells had negative amplitudes in the curve fit (Figure 3E, 161 green) with the same response phase as OFF cells (Figure 3F; see Figure 3A for a representative OFF cell's responses). This indicates that they primarily encode light 162 decrements by decreasing firing from their high baseline firing rates (61 ± 27 Hz, mean \pm 163 standard deviation), rather than light increments by increasing firing as conventional ON cells 164 165 do (Masland, 2012; Sanes and Masland, 2015; Baden et al., 2016; Jouty et al., 2018). We thus categorized these cells independently as an "OFF-suppressive" ON type (Figure 2G). 166 167 This is a new response type likely emerged due to high baseline firing in awake mice. Indeed, such responses were barely observed in anesthetized animals (isoflurane, 1/298 cells; FMM, 168 1/103 cells; Figure 2H,I) where the baseline firing rate was generally low (Figure 3D). As 169 expected from previous ex vivo studies (Masland, 2012; Sanes and Masland, 2015; Baden et 170 al., 2016; Jouty et al., 2018), anesthetized ON cells increased firing upon light increments (see 171 Figure 3C for a representative response). Positive amplitudes in the curve fit (Figure 3E) with 172

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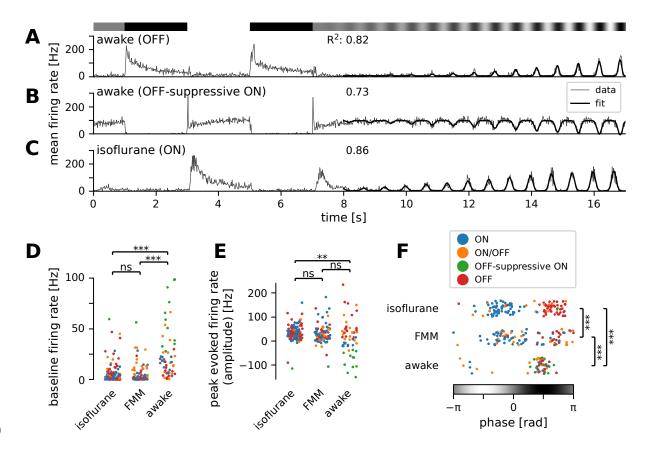
an opposite response phase from OFF cells (Figure 3F) further support that these ON cells
encode light increments. Taken together, these data suggest that the retinal coding depends
on the baseline firing level of RGCs.

To characterize contrast sensitivity, we next examined the estimated response 176 magnitude at 10% contrast from the sigmoid function used in the curve fit (Eg.(6)), and found 177 no significant differences across the recording conditions (awake, 4 ± 10 Hz, median \pm 178 179 interquartile range; isoflurane, 6 ± 13 Hz; FMM, 3 ± 10 Hz; p = 0.13, Kruskal-Wallis test). Nevertheless, the midpoint of the sigmoid was larger in awake cells $(67 \pm 43\%)$ contrast, 180 median ± interguartile range) than in anesthetized ones (isoflurane, $45 \pm 44\%$, p < 0.001, 181 Mann-Whitney U-test; FMM, $43 \pm 38\%$, p = 0.002) so was the plateau (absolute value of peak 182 evoked firing rate, Figure 3E; awake, 52 ± 68 Hz, median \pm interquartile range; isoflurane, 183 37 ± 33 Hz, p = 0.03, Mann-Whitney U-test against awake data; FMM, 35 ± 34 Hz; p =184 185 0.007). This indicates a larger dynamic range in the awake condition, while contrast sensitivity itself remains largely unchanged. 186

187 Finally, we found a significant phase shift in the responses between the recording conditions (Figure 3F). This phase parameter in the curve fit represents the position of the 188 response peak relative to the sinusoidal stimulus intensity patterns (see Methods for details), 189 190 and we identified two clusters in each data set: the one with negative phase for ON cells (Figure 3F, blue) and the other with positive phase for OFF and OFF-suppressive ON cells 191 (Figure 3F, red and green, respectively). ON/OFF cells were found in either cluster, depending 192 on the relative strength of their responses to light increments versus light decrements (Figure 193 194 3F, orange). In both clusters, we found that the phase was on average smallest for the awake condition $(-2.4 \pm 0.3 \text{ and } 1.5 \pm 0.3 \text{ radian}, \text{ respectively}; \text{ mean } \pm \text{ standard deviation}; \text{ isoflurane},$ 195 -0.8 ± 0.5 and 2.0 ± 0.5 radian; p < 0.001 for both cases, *t*-test), while largest for the FMM 196 anesthesia (-0.2 + 0.8 and 2.6 + 0.6 radian; p < 0.001 for both cases against corresponding 197 isoflurane data). This implies that the response dynamics are faster in awake mice than those 198 199 under anesthesia, especially with FMM.

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201 Figure 3: Many ON retinal ganglion cells showed suppressive OFF responses in awake condition. A-C: Mean firing rate of representative cells in response to a sinusoidally-flickering 202 203 stimulus with increasing contrast in the awake (A, OFF; B, OFF-suppressive ON, the same cell as in Figure 2A) or anesthetized conditions (C, ON). Overlaid with the peri-stimulus time 204 histogram (gray) is the model fit (black, Eq.(6) in Methods). The number on top indicates the 205 fit quality (explained variance R^2 in Eq.(5)). *D-F*: population data of the model parameters (D, 206 baseline B; E, amplitude A; F, phase ϕ) across different conditions: isoflurane anesthesia 207 (N = 103), FMM anesthesia (N = 92) and awake (N = 51). The sinusoidal stimulus pattern 208 relative to the response peak is also indicated at the bottom of F. Cell types are color-coded 209 210 as in Figure 2 (blue, ON; green, OFF-suppressive ON; red, OFF; orange, ON/OFF). Note high 211 baseline with negative amplitude and positive phase for the OFF-suppressive ON cells, which were predominantly found in the awake condition: ***, p < 0.001; **, p < 0.01; ns, non-212 213 significant (D, U-test; E, F-test; F, t-test).

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Faster response kinetics in awake than in anesthetized mice

To better characterize the kinetics of retinal output in vivo, we next analyzed the responses to 215 216 full-field sinusoidal flickers at different temporal frequencies (Figure 4). In awake mice, most 217 cells responded faithfully to all the stimulation frequencies we tested from 1.875 to 15 Hz (see Figure 4A for example). Some awake cells showed the largest responses to the 15 Hz 218 stimulation (Figure 4A; curve fit in violet, Eq. (4)), suggesting that they were possibly tuned to 219 even higher frequencies. In the anesthetized conditions, in contrast, retinal output responses 220 221 typically followed the stimulation frequencies up to 7.5 Hz, but failed to do so at 15 Hz (see Figure 4B for example). For quantification, we fitted an even power of sine function to the 222 responses (Eq.(4) in Methods) and set a threshold of the curve fit quality (defined as the 223 explained variance; Eq.(5)) at 0.2 to select cells with robust responses (Figure 4C,D). In the 224 225 awake condition, a larger number of cells responded well at medium frequencies (3.75 Hz, 75%; 7.5Hz, 82%) than at a low frequency (1.875 Hz, 60%); and the majority of the awake 226 cells remained responsive to a high frequency stimulus (15 Hz, 58%). Under anesthesia, in 227 contrast, the fraction of responsive cells was the largest at a low frequency (1.875 Hz; 228 isoflurane, 85%; FMM, 67%). Fewer cells responded robustly at faster flicker rates (3.75 Hz 229 and 7.5 Hz; isoflurane, 73% and 65%, respectively; FMM, 63% and 59%), and only a small 230 fraction of the anesthetized cells were able to follow the stimulation frequency at 15 Hz 231 (isoflurane, 9%; FMM, 3%). Consistent with the phase analysis results described above 232 233 (Figure 3F), these outcomes indicate that the retinal output dynamics are faster in awake animals than those under anesthesia, especially for FMM. 234

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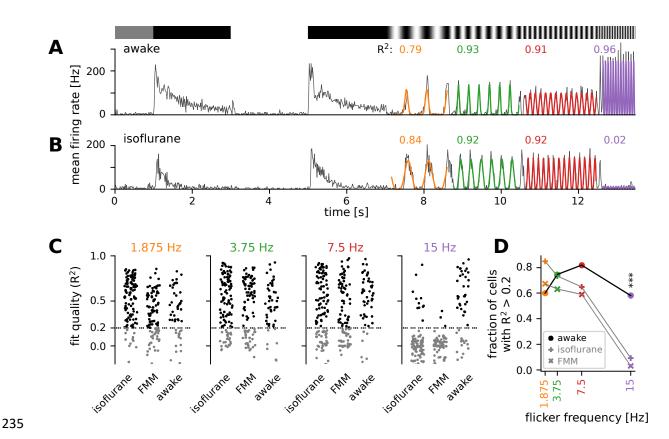


Figure 4: Retinal output showed higher temporal frequency sensitivity in awake than in 236 anesthetized mice. A: Representative retinal output (black, mean firing rate over 10 trials) in 237 238 an awake condition in response to full-field sinusoidally flickering stimuli at different temporal 239 frequencies (1.875, 3.75, 7.5 and 15 Hz), following full-field contrast inversions. Overlaid is 240 the curve fit (Eq.(4) in Methods) in different colors. The number on top is the explained variance of the curve fit (R^2 , Eq. (5) in Methods) in corresponding colors, representing the fit 241 quality. B: Representative retinal output responses under isoflurane anesthesia (shown in the 242 same format as in A). C: Population data of the fit quality at four different stimulus frequencies 243 in the awake (N = 51) or anesthetized conditions (isoflurane, N = 103; FMM, N = 92). The fit 244 quality threshold was set to be 0.2 (black, $R^2 \ge 0.2$; gray, $R^2 < 0.2$). D: Fraction of the cells 245 with the fit quality above the threshold across different conditions (awake, black line with 246 circles; isoflurane, gray line with vertical crosses; FMM, gray line with diagonal crosses), 247 representing the frequency tuning of the retinal output at the population level. A significantly 248 249 larger fraction of cells was responsive at 15 Hz in the awake condition than in the anesthetized conditions (***, p < 0.001 for both isoflurane and FMM; two-proportion *z*-test). 250

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Comparison of retinal output properties between *in vivo*

and ex vivo

We have thus far focused on the retinal output properties *in vivo*, and showed higher baseline 253 firing rates (Figure 3) and faster response kinetics (Figure 4) in awake mice than in those 254 255 under anesthesia. We next asked if RGC responses differ between in vivo and ex vivo conditions. This is a critical comparison because retinal physiology has been mostly studied 256 and best characterized in an isolated preparation (Gollisch and Meister, 2010; Sanes and 257 Masland, 2015), but little is known about it in awake animals (Weyand, 2007; Liang et al., 2018, 258 259 2020; Schröder et al., 2020; Sibille et al., 2021). Here we exploited stimulus ensemble statistical techniques ("reverse correlation"; Meister et al., 1994; Chichilnisky, 2001) to 260 261 systematically characterize the visual response properties and make a direct comparison across different recording conditions in the linear-nonlinear cascade model framework (see 262 Methods for details). Specifically, using full-field white-noise stimuli, we analyzed 1) the linear 263 temporal filter (Figure 5), estimated by the spike-triggered average (STA) stimulus, i.e., the 264 mean stimulus that triggered spiking responses; and 2) the static nonlinear gain function 265 (Figure 6), i.e., an instantaneous mapping of the STA output to the neural responses (Eq. (7) 266 in Methods). Here we reanalyzed the existing data sets for ex vivo recordings (696 cells from 267 18 isolated mouse retinas; Vlasiuk and Asari, 2021). 268

Faster response kinetics in awake condition than ex vivo

We identified a good quality STA in more than two-thirds of the cells recorded *in vivo* (e.g., Figure 5A). To compare the temporal dynamics of the STAs across different recording conditions, we used the following two measures: 1) the first peak latency of the STA estimated from a difference-of-Gaussian curve fit (Figure 5A); and 2) spectral peak frequency calculated by the Fourier transform of the fitted curve (Figure 5B). Consistent with the results measured by the flickering stimuli at different frequencies (Figure 4), we found faster kinetics in awake animals than in anesthetized ones (Figure 5C,D): i.e., significantly shorter peak latencies

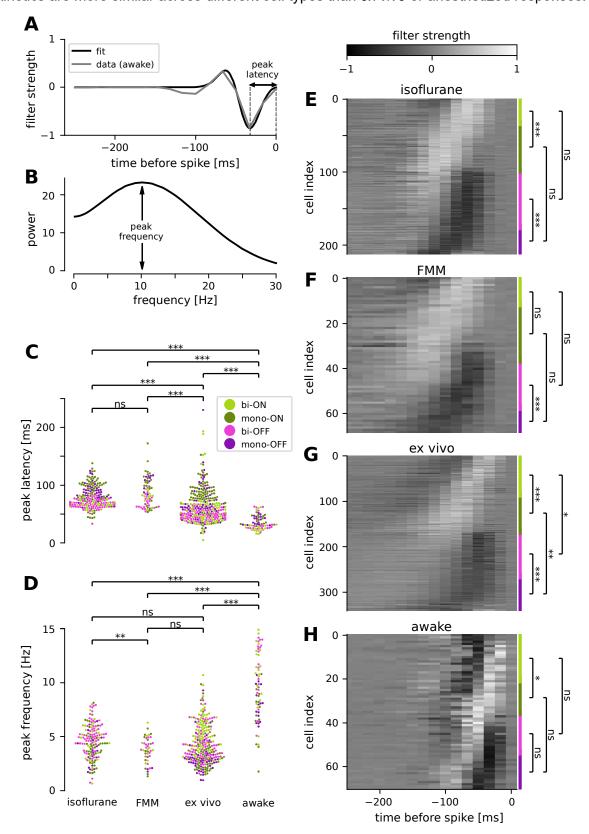
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277 (awake, 35 ± 12 ms, mean \pm standard deviation; isoflurane, 79 ± 18 ms, p < 0.001, *t*-test; FMM, 87 + 24 ms, p < 0.001; Figure 5C) and higher peak frequencies (awake, 9.6 + 3.0 Hz; 278 isoflurane, 4.6 ± 1.6 Hz, p < 0.001; FMM, 3.7 ± 1.2 Hz, p < 0.001; Figure 5D). Interestingly, 279 we identified that the ex vivo data lied in-between. The ex vivo STAs had significantly longer 280 peak latencies $(64 \pm 28 \text{ ms}, p < 0.001)$ and lower peak frequencies $(4.3 \pm 1.8 \text{ Hz}, p < 0.001)$ 281 than the awake ones. In contrast, the peak latencies were significantly shorter in an isolated 282 retinal preparation than in the anesthetized conditions (isoflurane, p < 0.001; FMM, p < 0.001), 283 while the peak frequencies were comparable between these conditions (isoflurane, p = 0.7; 284 FMM, p = 0.052). 285

We further analyzed the STA dynamics across different cell types. For clustering the 286 STAs obtained in each recording condition, we used the principal component analysis (PCA; 287 see Methods for details). As in previous ex vivo studies (Gollisch and Meister, 2008; Asari and 288 289 Meister, 2014), the first two principal components accounted for most of the variance (78-86%, collectively), and the four quadrants of the PCA biplot generally represented distinct filter 290 shapes, corresponding to monophasic OFF (mono-OFF), biphasic OFF (bi-OFF), monophasic 291 ON (mono-ON), and biphasic ON (bi-ON) response types, respectively. In all recording 292 293 conditions, no apparent cluster was found in this feature space, leading to a continuum of the STA shape patterns across populations (Figure 5E-H). Nevertheless, we identified two 294 features that were different between ex vivo and in vivo, especially distinct in the awake 295 condition. First, while the monophasic types were generally slower than the biphasic types, 296 297 differences in the peak latencies were much larger in the ex vivo (Figure 5G; mono-ON $83 \pm$ 24 ms versus bi-ON 58 \pm 31 ms, p < 0.001, *t*-test; mono-OFF 67 \pm 29 ms versus bi-OFF 48 \pm 298 8 ms, p < 0.001) or anesthetized conditions (Figure 5E, isoflurane: mono-ON 91 ± 22 ms, bi-299 ON 67 ± 6 ms, p < 0.001; mono-OFF 89 ± 14 ms, bi-OFF 68 ± 8 ms, p < 0.001; Figure 5F, 300 FMM: mono-ON 97 \pm 30 ms, bi-ON 78 \pm 11 ms, p = 0.051; mono-OFF 103 \pm 13 ms, bi-OFF 301 $70 \pm 11 \text{ ms}, p < 0.001$) than in the awake condition (Figure 5H; mono-ON $40 \pm 7 \text{ ms}$, bi-ON 302 30 ± 13 ms, p = 0.03; mon-OFF 39 ± 7 ms, bi-OFF 34 ± 14 ms, p = 0.2). Second, we found 303

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that ON cells were significantly slower than OFF cells *ex vivo* (mono-ON versus mono-OFF, p = 0.002; bi-ON versus bi-OFF, p = 0.03), but not *in vivo* (p > 0.2 in all the conditions examined). Taken together, our results suggest that awake responses are faster and their kinetics are more similar across different cell types than *ex vivo* or anesthetized responses.



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308 Figure 5: Retinal ganglion cells showed faster response dynamics in awake condition 309 than in anesthetized or ex vivo conditions. A: Temporal filter of a representative awake cell 310 (gray, spike-triggered average (STA) of the full-field randomly flickering stimulus) and a difference-of-Gaussian curve fit (black) for estimating the latency of the first peak. B: Power 311 spectra of the example filter in A, based on the curve fit, for estimating the peak frequency. 312 C.D: Population data of the peak latencies (C) and frequencies (D) across different conditions 313 (light green, biphasic ON; dark green, monophasic ON; pink, biphasic OFF; violet, monophasic 314 OFF). Here and thereafter, ***, p < 0.001; **, p < 0.01; *, p < 0.05; ns, non-significant (*t*-test). 315 The filter types were identified by the quadrants of the PCA biplot (see Methods for details). 316 *E-H*: Population data of the temporal filters across different conditions: from top to bottom, 317 isoflurane anesthesia (E, p < N = 213), FMM anesthesia (F, N = 69), ex vivo (G, N = 342) 318 319 and awake (H, N = 71). The four filter types are indicated on the right with corresponding 320 colors.

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322 Higher spiking activity in awake condition than ex vivo

How does a recording condition affect the firing properties of RGCs? The mean firing rate 323 during the white-noise stimulus presentation was significantly higher in awake $(35.0 \pm 27.3 \text{ Hz})$; 324 mean \pm standard deviation) than in all the other recording conditions (isoflurane, 11.0 ± 10.2 325 Hz; FMM, 10.9 ± 10.7 Hz; ex vivo, 6.9 ± 6.6 Hz; all with p < 0.001, t-test in the logarithmic 326 327 scale; Figure 6A). Importantly, this is not due to differences in the stimulus condition because the light intensity level was overall comparable between the recording setups (in vivo, ~16 328 mW/m^2 on average at the eye; ex vivo, ~18 mW/m² on the isolated retina; see Methods for 329 330 details).

For a further analysis, we examined the static nonlinear gain function of the recorded cells (Eq. (7) in Methods). This gain function accounts for nonlinearity associated with spike generation, such as spike threshold and firing rate saturation, and is generally well explained by a sigmoid function (see Figure 6B for example). For quantification, we assessed the neutral firing rate of the cells where the input to the gain function is zero, i.e., the firing rate in the presence of "neutral" stimuli that are orthogonal to the cell's STA. Consistent with the results

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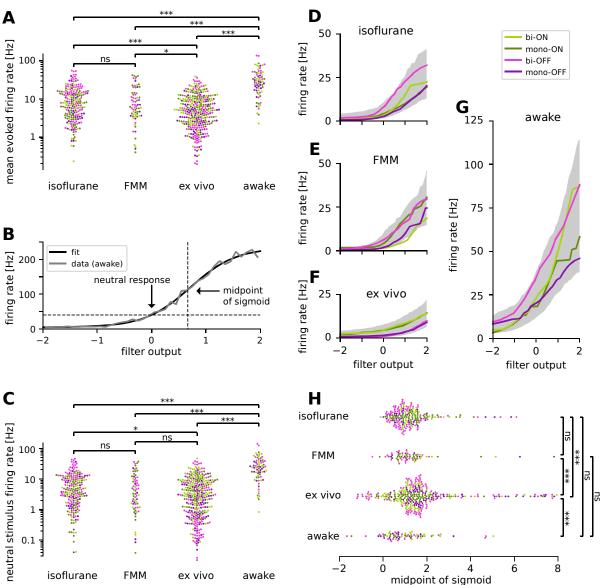
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337	on the baseline firing rates measured by the sinusoidally flickering stimuli (Figure 3), the
338	neutral firing rate was significantly higher in the awake condition (29.5 \pm 25.4 Hz, mean \pm
339	standard deviation) than those under anesthesia (isoflurane, 7.6 \pm 8.4 Hz, p < 0.001, t -test on
340	a log scale; FMM, 7.5 \pm 9.3 Hz, p < 0.001; Figure 6C). We also found that the neutral firing
341	rates ex vivo (5.5 \pm 7.1 Hz) were as low as those in the anesthetized conditions (isoflurane,
342	p = 0.02; FMM, $p = 0.1$), and significantly lower than those in the awake condition ($p < 0.001$).

343 We further identified two distinct features in the gain function properties between ex 344 vivo and in vivo responses. First, ON cell types generally had a higher gain than OFF cell types ex vivo (Figure 6F), whereas such cell-type specific differences were not observed in 345 vivo (isoflurane, Figure 6D; FMM, Figure 6E; awake, Figure 6G). Second, the midpoint of the 346 sigmoid fitted to ex vivo responses (1.6 \pm 1.4, median \pm interquartile range) was significantly 347 348 higher than that for *in vivo* responses (isoflurane, 1.1 ± 0.9 ; FMM, 1.1 ± 0.8 ; awake, 0.9 ± 1.2 ; all with p < 0.001, Mann-Whitney U-test; Figure 6H). Taken together with the outcomes 349 obtained with the sinusoidally flickering stimulus (Figure 3), this suggests that in vivo 350 responses are more linearized to cover a larger dynamic range, especially in the awake 351 condition due to high neutral responses (Figure 6G). 352

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353 Figure 6: Retinal ganglion cells showed higher firing activity in awake condition than in 354 anesthetized or ex vivo conditions. Cell types are color-coded as in Figure 5 (light green, 355 biphasic ON; dark green, monophasic ON; pink, biphasic OFF; violet, monophasic OFF). A: 356 Population data of the mean firing rates during the stimulus presentation period in four different 357 recording conditions (isoflurane, FMM, *ex vivo*, and awake): ***, p < 0.001; **, p < 0.01; *, p < 0.01; 358 0.05; ns, non-significant (*t*-test on the logarithm of firing rates). *B*: Static nonlinear gain function 359 of a representative awake cell (the same one as in Figure 5A), estimated by the stimulus 360 ensemble statistical techniques applied to the responses to a full-field randomly flickering 361 stimulus (gray, Eq.(7) in Methods; black, sigmoid curve fit with the midpoint at 0.71). Note a 362 high neutral stimulus response (40 Hz) defined as the firing rate at zero filter output (i.e., in 363 the presence of stimuli orthogonal to the cell's STA). C: Population data of the neutral stimulus 364 responses in each recording condition (in the same format as in A). D-G: Population data of 365 the static nonlinear gain function (median for each cell type in corresponding colors; gray, 366 interquartile range of all cells) across different conditions: isoflurane anesthesia (D, N = 213), 367 FMM anesthesia (E, N = 69), ex vivo (F, N = 342), and awake condition (G, N = 71). H: 368 Population data of the midpoint of the sigmoid nonlinearity in each recording condition: ***, 369 370 p<0.001; Mann-Whitney U-test.

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371 **Discussion**

372 Here we established optic tract recordings in head-fixed mice (Figure 1) and systematically analyzed the retinal output properties in vivo using a standardized set of visual stimuli for 373 characterizing retinal functions (Baden et al., 2016; Jouty et al., 2018). We found that awake 374 375 response properties were overall similar to those under isoflurane or FMM anesthesia (Figures 2-4) or ex vivo (Figures 5 and 6); however, we identified two distinct features in the awake 376 condition: higher firing rates (Figures 3 and 6) and faster response dynamics (Figures 4 and 377 378 5). The change in the kinetics likely arose as a direct consequence of the high baseline activity 379 in awake animals. When cells are on average more depolarized, it is faster to reach the spike 380 threshold upon stimulation, hence leading to a shorter response latency (Zohar et al., 2011). High firing activity in awake animals has been widely observed in many brain areas across 381 species (Greenberg et al., 2008; Sellers et al., 2015; Durand et al., 2016; Wright et al., 2017; 382 383 De Franceschi and Solomon, 2018; Chen and Song, 2019). Therefore, the retinal response 384 characteristics we observed in vivo could be a general feature of the brain in an awake state.

385 In awake animals, both the baseline and visually-evoked firing rates of RGCs were much higher—on average by ~20 Hz—than in those under anesthesia or in an isolated 386 preparation (Figures 3 and 6). As a result, many awake ON cells showed OFF-suppressive 387 responses, a new response type observed only in those cells with high baseline firing rates 388 389 (~60 Hz). Here we classified these cells separately from the other ON cells in our clustering analysis (Figure 2); however, it is unlikely that they form a distinct "cell type" in the retina. 390 Instead, these cells likely belong to a known cell type, and altered their response properties 391 due to an increased baseline activity in the awake condition. Possible candidate cell types are: 392 393 transient ON alpha cells (although they have a low baseline firing rate ex vivo; Krieger et al., 2017), ON contrast suppressive cells (although a sharp rebound response is missing in the 394 calcium dynamics ex vivo; Baden et al., 2016), or suppressed-by-contrast cells (although their 395 high baseline activity is suppressed by both ON and OFF stimuli; Mastronarde, 1985; Tien et 396

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al., 2015; Jacoby and Schwartz, 2018). It is interesting to identify the exact cell type of these
RGCs and further characterize their function *in vivo* in future studies.

What are the mechanisms underlying such differences between in vivo and ex vivo 399 retinal responses? One possibility is the difference in the physiological states of the retina. 400 Even if *ex vivo* recordings are made under a proper temperature using a perfusion medium 401 specifically formulated to support isolated retinal tissues (Ames and Nesbett, 1981), there are 402 certain unavoidable differences to the physiological condition in vivo. In particular, the retinal 403 pigment epithelium, a key player for the visual cycle and spatial buffering of ions, is often 404 405 removed in an isolated retinal preparation. A lack of retinal supply can then alter the physiological states of the retinal neurons, potentially leading to a change in their visual 406 407 response properties.

Differences in the input stimulus properties, in contrast, cannot explain our results, 408 409 even though retinal responses depend a lot on stimulus conditions. For example, the higher 410 the light intensity level is, the higher the temporal frequency sensitivity becomes for ex vivo RGC responses (threshold at around 20-30 Hz; Wang et al., 2011) and so does the critical 411 flicker-fusion frequency at the behavioral level (15-40 Hz; Umino et al., 2018; Nomura et al., 412 2019). Response latencies depend also on the spatial patterns of stimuli as well as their 413 414 contrast (Bolz et al., 1982; Baccus and Meister, 2002; Sagdullaev and McCall, 2005; Pearson and Kerschensteiner, 2015; Tikidji-Hamburyan et al., 2015). Here we used full-field stimuli at 415 slightly lower light intensity level for *in vivo* recordings than for *ex vivo* ones (see Methods for 416 details). Therefore, higher baseline activity and faster dynamics observed in awake animals 417 cannot be simply attributed to the difference in the stimulus conditions. 418

Finally, when comparing retinal responses across different studies, one cannot ignore a possible effect of sampling bias because visual response dynamics are cell-type specific (van Wyk et al., 2009; Krieger et al., 2017; Ravi et al., 2018; Tengölics et al., 2019). In an extreme case, delayed ON cells have the response latency slower than other RGC types by hundreds of milliseconds in an isolated mouse retina (Mani and Schwartz, 2017). Response

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424 dynamics are also species-specific. For example, ON RGCs show higher baseline activity and faster responses than OFF cells in the macaque (Chichilnisky and Kalmar, 2002) and guinea 425 pig (Zaghloul et al., 2003) retinas, whereas slower in the salamander retina (Gollisch and 426 Meister, 2008), and such asymmetry between ON and OFF dynamics is pathway-specific in 427 428 the rat retina (Ravi et al., 2018). Moreover, kinetics can vary even for the same cell type, depending on the retinal location (Warwick et al., 2018) or light-adaptation state (Chang and 429 He, 2014; Tengölics et al., 2019). Sampling bias can then skew the results in many different 430 ways. In this study, however, we recorded a wide variety of cell types (Figure 2), and no 431 432 apparent difference was found in the STA distributions across different recording conditions (Figure 5). We thus expect that the effects of sampling bias should be minimal on the observed 433 differences between in vivo and ex vivo retinal response characteristics. 434

Taken together, our findings indicate that clear differences exist in retinal physiology between *in vivo* and *ex vivo*. This highlights the importance of studying retinal function *in vivo*, especially in the awake condition.

438 Implications on retinal coding *in vivo*

439 The optic nerve fiber forms an information bottleneck in the early visual system. The human retina, for example, contains $\sim 10^8$ input neurons (photoreceptors) but only $\sim 10^6$ output 440 neurons (RGCs) whose axons make up the optic nerve (Masland, 2012; Sanes and Masland, 441 442 2015). The retina is then expected to optimize the channel capacity by compressing the visual information as much as possible and conveying signals to the brain using as few spikes as 443 possible (Attneave, 1954; Barlow and Rosenblith, 1961; Laughlin, 2001). Such an efficient 444 coding hypothesis is well supported by both ex vivo experimental data and theoretical 445 analyses. Under ex vivo conditions, RGCs are silent most of the time and fire spikes at high 446 rates only when their selective stimulus features are presented (Gollisch and Meister, 2010; 447 Baden et al., 2016; Jouty et al., 2018). This sparse RGC response, ensured by low 448 spontaneous activity and strong nonlinearity (Pitkow and Meister, 2012), helps achieve high 449

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efficiency and low redundancy in the visual representation of the retina (Doi et al., 2012). Furthermore, efficient coding principles can explain various physiological properties of the retina, such as separation of retinal outputs into multiple cell types (Gjorgjieva et al., 2019).

The retinal output characteristics we observed *in vivo*, however, provide a completely 453 different view on the retinal code. First, unlike ex vivo conditions, RGCs in awake mice showed 454 a high baseline activity with more linearized responses (Figures 3 and 6). Consequently, many 455 awake ON cells primarily encoded light decrements by suppression from high baseline, rather 456 than light increments by activation from low baseline. These cells convey the same information 457 458 as conventional ON cells do-the more spikes, the higher light intensity-but using much more spikes. Thus, the amount of information transmitted per spike is much lower in vivo than ex 459 vivo, violating the efficient coding principles. Second, we found less variability in the visual 460 response dynamics across different RGC types in vivo (Figure 5E-H). This suggests that 461 462 temporal coding framework based on spike timing patterns may not be readily applicable in vivo. Latency coding, for example, will not work well in vivo as it requires noticeable differences 463 in the response latencies between two or more channels, such as ON and OFF pathways 464 converging onto ON-OFF RGCs (Gollisch and Meister, 2008). Our results thus favor dense 465 466 rate coding in the retina, rather than sparse temporal coding.

467 What are the advantages of such energy-inefficient retinal coding? As shown in our awake recordings, one can gain faster response kinetics (Figure 5) and wider bandwidths 468 (Figure 6). In addition, redundancy in the dense code helps transmit signals accurately even 469 with intrinsically noisy spike trains. These features are all highly beneficial from a behavioral 470 471 viewpoint—e.g., to detect predators robustly and promptly—and thus worth achieving for survival at an expense of energy cost. Interestingly, dense coding can be a general feature of 472 early sensory processing, as suggested by high baseline firing in vestibular and cochlear 473 nuclei (Fuchs and Kimm, 1975; Rhode and Smith, 1986; Warchol and Dallos, 1990; Beraneck 474 475 and Cullen, 2007), tonic activity in hair cells (Sachs and Abbas, 1974; Wu et al., 2016), and dark current in vertebrate photoreceptors (Hagins et al., 1970; Okawa et al., 2008). In fact, the 476

energy cost of dense retinal coding may not be so problematic with a relatively small number of neurons, as opposed to the total energy required for operating $\sim 10^9$ neurons in the cortex where sparse coding has certain advantages from the viewpoints of both energy efficiency and sensory processing (Olshausen and Field, 1996; Asari et al., 2006). Further characterizations of the retinal code *in vivo* will be needed to clarify what exactly the eye tells the brain.

483 Effects of anesthetics in early visual system

Anesthetics generally lower the excitability of nerve cells: e.g., isoflurane acts on the gamma-484 aminobutyric acid (GABA) type A receptors to silence the brain (Jenkins et al., 1999). It thus 485 makes sense that the retinal outputs were reduced under anesthesia (Figures 3 and 6) and 486 showed slower dynamics (Figures 4 and 5) than in awake animals. It is, however, difficult to 487 generalize the effects of anesthesia because multiple mechanisms of action are involved, 488 exerting complex effects on the sensory systems in anesthetic- and dose-dependent manners 489 490 (Populin, 2005). For example, while visual cortical responses are reduced under anesthesia 491 (Haider et al., 2013; Vaiceliunaite et al., 2013), auditory responses are enhanced (Raz et al., 2014; Sellers et al., 2015) and the response latency becomes shorter in the auditory pathway 492 (Ter-Mikaelian et al., 2007). 493

Our results are nevertheless consistent with previous studies on the effects of 494 495 anesthesia in the early visual system. Specifically, anesthesia reduces the overall activity of both SC and dLGN neurons, and leads to multiple changes in temporal processing of these 496 two major retinorecipient areas, such as reduced sensitivity to high temporal frequencies and 497 longer response latencies (Zhao et al., 2014; Durand et al., 2016; De Franceschi and Solomon, 498 2018). While different anesthetics were used in these studies (urethane as opposed to 499 isoflurane and FMM), our consistent findings suggest that such changes in the response 500 dynamics arise largely from the retina. In contrast, the effects of anesthesia on spatial 501 502 response properties seem more complex. While spatial processing remains largely intact in

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503 dLGN (Durand et al., 2016), lower contrast sensitivity and larger receptive field sizes were reported in SC under urethane anesthesia (De Franceschi and Solomon, 2018). Moreover, 504 SC neurons show increased orientation selectivity under isoflurane anesthesia (Kasai and Isa, 505 2021). Here we also found a larger fraction of motion sensitive cells under both isoflurane and 506 507 FMM anesthesia (Figure 2D-F). Due to confounding effects of eye movements in awake animals, however, we were not able to fully analyze spatial response properties of retinal 508 509 outputs in vivo. It is a future challenge to develop algorithms to compensate for the eve motion 510 at a spatial resolution well below the RGC receptive field size (as small as 3 degrees; Zhang 511 et al., 2012) for fully characterizing spatiotemporal processing of the retina in vivo.

512 Materials and Methods

No statistical method was used to predetermine the sample size. The significance level was
0.05 (with Bonferroni correction where appropriate) in all analyses unless noted otherwise. All
experiments were performed under the license 233/2017-PR from the Italian Ministry of Health.
The data analyses were done in Python.

517 Animals

A total of 43 female C57BL/6J mice were used (chronic, 3; acute, 23; failures, 17, including 10 initial unsuccessful attempts to record from the optic chiasm) at around three months of age at the time of the surgery. Mice were kept on a 12-h light / 12-h dark cycle and given water and food *ad libitum*. After the chronic implantation of electrodes, the animals were kept singlehoused.

523 Chronic recordings

524 For implanting electrodes, animals were anesthetized (induction, 4% isoflurane; maintenance, 525 1-2%) and placed inside a stereotaxic apparatus (Neurostar). Throughout the surgery, 526 temperature was maintained at 37°C using a heating pad (Supertech Physiological), and eye 527 ointment (VitA-POS) was used to prevent the eyes from drying. After positioning the mouse

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528 head, the scalp skin was disinfected (Betadine) and removed with scissors. Soft tissue was removed from the skull surface with a round scalpel, and ethanol and acetone were applied to 529 the skull for disinfection and removal of any residual compounds. The skull was glazed with a 530 drop of cyanoacrylate adhesive (Loctite 401) to secure in place the surrounding skin, and then 531 532 registered in the stereotaxic controller software (NeuroStar). A dental drill (WPI) was used to leave three marks on the skull to label the entry point for targeting the optic tract: [-1.34, +1.87, 533 +4.74], [-1.70, +1.87, +4.74], and [-1.82, +2.35, +4.07] in [Anterior-Posterior, Medial-Lateral, 534 535 Dorsal-Ventral] coordinates, respectively. A hole was drilled for a reference silver wire (A-M 536 Systems) above the cerebellum, and the wire was inserted sideways to avoid excessive brain damage. After covering the hole and wire with Vaseline, the wire was attached to the skull 537 with cyanoacrylate adhesive and dental cement (Paladur, PALA). Subsequently, a custom-538 designed titanium head-plate was attached to the skull with dental cement, followed by a 539 540 craniotomy (diameter, 1-2 mm) and durotomy. A chronic silicone probe (Buzsaki32L, NeuroNexus) was then inserted with the stereotaxic controller (75 µm/min) first to a depth of 541 2 mm, retracted by 1 mm to release pressure created by the initial brain entry, and then to a 542 depth of 4.5 mm from the skull surface. After reaching the desired depth, a microdrive (dDrive, 543 544 NeuroNexus) was attached to the skull with dental cement, and the probe was removed from its mount and covered with a protective cap. The cables and connectors were cemented to 545 the cap and covered with paraffin film (Bemis, Parafilm) to prevent the mouse from damaging 546 the implant. 547

After the surgery, the animals were kept on a heating pad (Sera, Thermo comfort mat S) until they recovered from anesthesia. During the next four days, the mice received an antiinflammatory/antibiotic cocktail (Rimadyl/Baytril; 0.5 mg/mL each, 0.01 mL/g). The antibiotic (Baytril) was given for an additional three days through drinking water (0.17 mg/mL).

After a recovery period of five days, the mice were placed on a custom-made rotary treadmill (diameter, 20 cm) with their head fixed for the recordings (at most two times a day, each for <2 hours). During the initial sessions, we moved the probe until visual responses

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were observed (Figure 1A-D). The electrophysiology data were recorded at 30 kHz from each recording site (SmartBox, NeuroNexus) together with synchronization pulses from the visual stimulation device (see below). In total, we made 17 recording sessions from 3 out of 6 animals, where up to 10 cells were simultaneously recorded in each session (4.4 ± 2.4 cells/session, mean \pm standard deviation).

After all the recording sessions, the electrode position was verified histologically (e.g., 560 Figure 1E). The mice were anesthetized (2.5% Avertin, 16 µL/g, intraperitoneal injection) and 561 perfused with paraformaldehyde (PFA; 4% in phosphate buffer solution). The animal's head 562 563 with the electrode left in position was collected without the skull base, and stored in fixative solution (4% PFA) at 4°C for at least four days. This helped the brain tissue harden around 564 the silicon probe, hence leaving a visible mark after removing the probe. Harvested brain 565 tissue was then coronally sliced with a vibratome (Leica, VT1000S; thickness, 150 µm) and 566 567 imaged under a bright-field microscope (Leica, LMD7000).

568 Acute recordings

Animals were anesthetized and placed inside a stereotaxic apparatus with a heating pad as 569 570 described above. A contact lens (diameter, 3 mm; Ocuscience) was used for the target eye to prevent it from drying. The scalp was removed, registered in the stereotaxic controller, and 571 572 the three entry points for targeting the optic tract were marked with the stereotaxic drill. A well 573 was made with dental cement around the marks later to hold saline solution on top of the brain. After a craniotomy (diameter, 2 mm), an acute silicone probe (Buzsaki32L, Neuronexus) 574 575 coated with a fluorescent dye (Dil stain, Invitrogen, D282) was slowly inserted into the brain 576 (100 µm/min) with a micromanipulator (Sensapex, SMX) attached to the stereotaxic apparatus. While approaching the target depth, visual stimuli were presented (full-field contrast-inverting 577 578 stimulus at 0.5 Hz; see below). The probe was moved until a maximum number of visually responsive cells were seen at once (up to 20 cells; 7.7 ± 5.3 cells/session, mean \pm standard 579 580 deviation; 52 sessions in total from 23 out of 27 animals).

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581 Throughout the recordings, the mouse was kept under anesthesia with 1% isoflurane. The depth of anesthesia was monitored by the breathing rate (~1 breath/s). Alternatively, we 582 used a cocktail of fentanyl, medetomidine and midazolam (FMM) during the recordings. In this 583 case, once the electrode was in position, an FMM solution (fentanyl, 0.05 mg/kg; 584 585 medetomidine, 0.5 mg/kg; midazolam, 5 mg/kg; in 0.9% NaCl saline) was intraperitoneally administered, and the isoflurane dose was progressively decreased to 0%. Buprenorphine 586 (0.1 mg/kg) was injected 20 minutes after the termination of isoflurane, and the recording 587 session was initiated 10 minutes after the buprenorphine injection. The depth of anesthesia 588 589 was monitored through the heart rate (below around 300 beats per minute) and supplemental 590 FMM anesthesia was provided when required. The electrophysiology data and the visual stimulation signals were recorded at 30 kHz/electrode (SmartBox, NeuroNexus). 591

At the end of the recording session, the electrode location was verified histologically. After retracting the silicone probe, the animal was perfused as described above. The brain tissue was harvested and post-fixed overnight in 4% PFA at 4°C. Coronal sections of the brain tissue (thickness, 150 μm) were then examined under a fluorescence microscope (Leica, LMD7000 with N2.1 filter cube) to visualize the trace left by the Dil stain on the probe.

597 Visual stimulation

598 Visual stimuli were presented by a custom gamma-corrected digital light processing (DLP) device (Texas Instruments, DLPDLCR3010EVM-LC) where the original green and red light-599 emitting diodes (LEDs) were replaced with ultra-violet (UV; 365 nm; LZ1-00UV00, LED 600 Engine) and infrared (IR; 950 nm; SFH 4725S, Osram) LEDs, respectively. The UV and blue 601 602 (465 nm) lights were projected onto a spherical screen (radius, 20 cm) with UV-reflective white paint (waterfowl store) placed ~20 cm to the contralateral side of an animal's eye from the 603 604 implanted probe (Figure 1A), whereas the IR light was used as synchronization pulses, recorded via a photodiode with a custom transimpedance amplifier. The visual stimuli (1280-605 by-720 pixels; frame rate, 60 Hz) covered 73° in azimuth and 44° in altitude from the mouse 606

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eye position (Figure 1B). The maximum light intensity at the eye position was 15.4 mW/m² and
 15.9 mW/m² for the UV and blue LEDs, respectively, leading to mesopic to photopic conditions.
 Using this DLP setup and QDSpy software (Franke et al., 2019), we presented the

following set of visual stimuli: a randomly flickering full-field stimulus (5 min; 60 Hz), a moving 610 grating stimulus (spatial frequencies of square waves, 3° or 20°; moving speed, 7.5°/s or 15°/s, 611 in eight different directions), a full-field stimulus whose intensity followed a sinusoid (1.5 Hz) 612 with a linearly increasing amplitude from 0% to 100% contrast over 10 s (10 trials; Figure 3), 613 and a full-field sinusoidally flickering stimulus (maximum contrast) at different temporal 614 615 frequencies (1.875, 3.75 and 7.5 Hz, each for 2 s; 15 Hz for 1 s; 10 trials; Figure 4). The last two full-field stimuli were preceded by a sequence of "OFF-ON-OFF" stimulation at maximum 616 contrast (full-field contrast inversion; 2 s each) and interleaved by a 1-s-long gray screen 617 across trials. These stimuli were equivalent to those used for differentiating ~30 RGC types 618 619 ex vivo (Baden et al., 2016; Jouty et al., 2018).

620 Data analysis

Spike sorting was performed with SpykingCircus (Yger et al., 2018) for semi-automatic cluster 621 622 detection and Phy (Rossant, 2020) for data curation. In total, we obtained 75 cells for chronic recordings, and 298 and 103 cells for acute recordings under isoflurane and FMM anesthesia, 623 624 respectively. Not all cells responded to the entire stimulus set, but cells responding to any of the presented stimuli were included in the analysis. For ex vivo recordings, we reanalyzed the 625 data sets in Vlasiuk and Asari (2021). Specifically, the ex vivo data sets included the activity 626 of 696 cells recorded with a multi-electrode array (from 18 isolated mouse retinas) in response 627 628 to a randomly flickering full-field visual stimulus projected from a gamma-corrected cathoderay tube monitor (frame rate, 100 Hz) or a DLP device (60 Hz). The maximum light intensity 629 on the isolated retinas was 36 mW/m² (Vlasiuk and Asari, 2021). 630

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631 **Response quality**

We assessed the cell's response quality based on the trial-to-trial reliability of the response r(t) during the "ON-OFF" period of the OFF-ON-OFF stimulus sequence (see Figure 2A for example). Specifically, the signal-to-noise ratio was calculated for each cell as follows:

635
$$SNR = \frac{\operatorname{var}[\langle r(t) \rangle]_t}{\langle \operatorname{var}[r(t)]_t \rangle}, \tag{1}$$

where $\langle \cdot \rangle$ indicates the mean over trials, and $var[\cdot]_t$ the variance over time *t* (bin size, $\Delta t = 16.6 \text{ ms}$). We set a threshold at 0.15 to select reliably responsive cells for further analyses (Figure 2B).

639 **Response polarity**

To characterize the cell's preference to stimulus polarity, we defined an ON-OFF index usingthe responses to the full-field contrast inversion:

642 ON-OFF index =
$$\frac{r_{\rm ON} - r_{\rm OFF}}{r_{\rm ON} + r_{\rm OFF}}$$
, (2)

643 where r_{ON} and r_{OFF} are the mean firing rate during the ON and the second OFF periods of the 644 OFF-ON-OFF stimulus sequence, respectively. Positive and negative ON-OFF index values 645 indicate stronger responses to ON and OFF stimuli, respectively (Figure 2C).

646 **Motion sensitivity**

Direction-selectivity (DS) and orientation-selectivity (OS) indices were calculated by projecting
 the responses to the moving grating stimuli onto a complex exponential:

where ω_k and r_k are the angle of the *k*-th direction and the cell's corresponding responses, respectively; and $\alpha = 1$ and 2 for the DS and OS indices, respectively. Cells were considered motion-sensitive when at least one of these indices was higher than 0.15 and p < 0.2 calculated by bootstrap methods (1,000 repetitions; Figure 2D-F).

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654 **Temporal frequency sensitivity**

Temporal frequency sensitivity was assessed by fitting an even power of sine function to the responses to the full-field sinusoidally flickering stimulus at different frequencies h (1.875, 3.75, 7.5, or 15 Hz; Figure 4):

658
$$s(t) = A \cdot \sin^q \left(\pi ht - \frac{\phi}{2}\right) + B, \tag{4}$$

where *A* and $B \ge 0$ are the response amplitude and baseline activity, respectively; and q = 2nwith $n \in \mathbb{N}^+$ is the exponent of the sine function. The phase $\phi \in [-\pi, \pi)$ indicates the relative position between the response peak and the sinusoidal stimulus patterns. For example, $\phi = -\pi/2$ and $\pi/2$ are obtained if the response reaches its peak when the stimulus is brightest and darkest, respectively.

The fit quality was then assessed by the explained variance:

$$R^{2} = 1 - \frac{\operatorname{var}[\operatorname{Data} - \operatorname{Fit}]}{\operatorname{var}[\operatorname{Data}]}.$$
(5)

We set a threshold at 0.2 to select cells with a good fit hence responsive to the stimulus (Figure 4C), and compared the proportions of the responsive cells across different recording conditions (two-proportion *z*-test; Figure 4D).

669 **Contrast sensitivity**

670 We used a sigmoid-weighted sine-power function to characterize the responses to the 671 flickering stimulus (h = 1.5 Hz) with increasing contrast (Figure 3):

672
$$S(t) = \frac{A}{1 + e^{-\lambda(t - t_0)}} \cdot \sin^q \left(\pi ht - \frac{\phi}{2}\right) + B,$$
 (6)

where t_0 and $\lambda > 0$ are the midpoint and the steepness of the sigmoid, respectively; and the other free parameters are the same as s(t) in Eq.(4). The fitted parameter values were then compared across different recording conditions (Mann-Whitney *U*-test for the baseline *B*, Figure 3D; Levene *F*-test for the amplitude *A*, Figure 3E; and *t*-test for the phase ϕ , Figure

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3F). As a measure of contrast sensitivity, we used an estimated response magnitude at 10%contrast from Eq.(6).

Temporal filters and static nonlinear gain functions

680 For systematically characterizing the response dynamics, we used stimulus ensemble statistical techniques ("reverse correlation" methods; 500 ms window) to calculate the linear 681 filter (Figure 5) and static nonlinear gain function (Figure 6) of the recorded cells in response 682 683 to a randomly flickering visual stimulus (Meister et al., 1994; Chichilnisky, 2001). First, we obtained the linear filter of each cell by calculating a spike-triggered average (STA) of the 684 685 stimulus with ± 1 being "white" and "black," respectively. As a quality measure, p-value was computed for each time bin against a null hypothesis that the STA follows a normal distribution 686 with a mean of zero and a variance of 1/C, where C is the total number of spikes. As a 687 measure of the cell's temporal frequency tuning, we then estimated the peak latency by fitting 688 a difference-of-Gaussian curve to the linear filter (e.g., Figure 5A); and the spectral peak 689 frequency by the Fourier analysis on the fitted curve (e.g., Figure 5B). The curve fitting quality 690 was assessed by the explained variance R^2 as in Eq. (5). We discarded the cells if $p > 10^{-18}$ 691 for all time bins or $R^2 < 0.8$. We ran a *t*-test to compare the temporal frequency tuning 692 properties at the population level across recording conditions (Figure 5C,D) or across different 693 cell types in each recording condition (Figure 5E-H). Spatial response properties were not 694 695 examined in this study because complex nonlinear kinematics of eye movements in the awake condition precluded the analysis at a high enough spatial resolution; and because it has been 696 shown that anesthesia has no effect on the spatial processing in dLGN, a direct downstream 697 of the retina (Durand et al., 2016). 698

699 Static nonlinear gain function P(response|stimulus) of each cell was computed by 700 taking the ratio between the distribution of spike-triggered stimulus ensembles 701 N(stimulus|response) projected onto the *L*2-normalized STA (bin size, 0.1) and that of the 702 entire stimulus ensembles N(stimulus) (e.g., Figure 6B):

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703
$$P(\text{response}|\text{stimulus}) = \frac{N(\text{stimulus}|\text{response})}{N(\text{stimulus})} / \Delta t.$$
(7)

A sigmoid function was fitted to P(response|stimulus) for smoothing. The neutral stimulus response was then defined as the vertical-intercept of the sigmoid function at the horizontal axis value of zero: i.e., the firing rate when the stimulus is orthogonal to the STA. We ran a *t*test to compare the neutral stimulus responses and the average firing rates during the stimulus presentation at the population level across conditions (Figure 6A,C); and Mann-Whitney *U*test to compare the midpoint of the sigmoid (Figure 6H).

710 Cell-type classification

In this study, we were not able to perform a morphological analysis of individual cells as we
employed blind *in vivo* recording methods (Figure 1). We thus focused on the visual response
properties for classifying cell-types in the following two ways.

714 First, we classified cells in vivo using the response quality, response polarity, and 715 motion sensitivity (Figure 2). Specifically, we first divided the cells into two groups: reliably 716 responsive ones with SNR > 0.15 (Eq. (2)) and the other low quality ones ("N/A" type; Figure 717 2B). We then set thresholds at ± 0.25 for the ON-OFF index (Eq. (3)) to identify ON, OFF, and ON/OFF types within the reliably responsive cells that increased firing in response to light 718 increments, light decrements, and both, respectively (Figure 2C). For some cells where these 719 720 measures were not available, we used the responses to the full-field sinusoidally flickering stimuli to calculate the response quality and polarity in a similar manner. Within the ON cells, 721 we further identified an "OFF-suppressive" type if they had a significant negative amplitude in 722 Eq. (6) with 95% confidence intervals in the parameter estimation. Independently, we also 723 724 labeled cells as motion sensitive or not, based on the DS/OS indices as described above 725 (Eq.(3); Figure 2D-F).

Second, because these measures are not available for the *ex vivo* data sets (Vlasiuk and Asari, 2021), we performed cell-type classification using the temporal filter properties to make a fair comparison between the *ex vivo* and *in vivo* data sets (Figures 5 and 6).

729 Specifically, we first ran a principal component analysis (PCA) on the temporal filters (L2normalized STA) obtained in each condition (Gollisch and Meister, 2008; Asari and Meister, 730 2014). The first two principal components (PC1, monophasic filter; and PC2, biphasic filter) 731 were largely sufficient to fit all the temporal filter dynamics, accounting for 78-86% of the total 732 733 variance in each condition. Each temporal filter is a point in the PCA biplot (i.e., the twodimensional space spanned by PC1 and PC2), and we grouped its shape into four subtypes 734 based on its position: monophasic OFF, biphasic OFF, monophasic ON, and biphasic ON from 735 736 the first to the fourth quadrants, respectively.

737 Acknowledgments

This work was supported by research grants from EMBL (H.A.). The EMBL Histology Facility and the Advanced Light Microscopy Facility are acknowledged for support in sample preparation and image acquisition for histological analyses, respectively. EMBL IT Support is acknowledged for provision of computer and data storage servers. We thank Dmitry Molotkov for his help in setting up the recording rig, and all the Asari lab members as well as Cornelius Gross and Santiago Rompani for many useful discussions.

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