1

Functional architecture of motion direction in the mouse superior colliculus

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Abstract

Motion vision is important in guiding animal behavior. Both the retina and the visual cortex process object motion in largely unbiased fashion: all directions are represented at all locations in the visual field. We investigate motion processing in the superior colliculus of the awake mouse, by optically recording neural responses across both hemispheres. Within the retinotopic map, one finds large regions of ~500 μm size where neurons prefer the same direction of motion. This preference is maintained in depth to ~350 μm. The scale of these patches, ~30 deg of visual angle, is much coarser than the animal's visual resolution. A global map of motion direction shows approximate symmetry between the left and right hemispheres and a net bias for upward-nasal motion in the upper visual field. Unlike other parts of the early visual system, the superior colliculus develops a locally biased representation of object motion.

Introduction

The connection between the ecology of natural scenes and the neurobiology of vision has been a topic of enduring interest. To first approximation natural scenes are translation-invariant, meaning that any given visual feature or event is equally likely to happen anywhere in the image. This principle predicts that the neural representation of visual images should be approximately uniform everywhere in the visual field. Closer inspection suggests some departures from translation invariance. The upper visual field is often occupied by sky, which differs in content from the lower visual field. Also animals direct their eyes to salient points in the scene, which selects for certain image features at the center of gaze.

The first station of the visual system seems to follow the principle of uniform coverage. In the mammalian retina, each of ~30 distinct types of retinal ganglion cells (RGCs) conveys information about a specific visual feature[1,2]. Each cell type tiles the entire retina in a "mosaic" arrangement, ensuring a representation of its special feature at every point in the visual space. The primary visual cortex continues this pattern. Individual neurons there are often tuned to one line orientation or motion direction, but all the possible orientations and directions are represented at every point, or at least within 1-4 degrees of visual angle[3–9],[10].

An evolutionarily older visual pathway leads from the retina to the superior colliculus. In the superior colliculus the principle of uniform coverage appears to be broken. Some of the earliest recordings in cat and rabbit already suggested a preference for visual motion in specific directions depending on location in the visual field[11,12]. In mouse superior colliculus one finds large regions of the visual field, ~30° across, where neurons prefer stimuli with a specific line orientation[13–16]. Whether the representation of visual motion is

similarly biased in a coarse map remains debated[13,17,18]. Most of the studies to date were performed in anesthetized animals with an acute cortical lesion to uncover the underlying superior colliculus. Both of these perturbations are known to affect direction-selectivity of neurons in the superior colliculus[16,19,20].

The goal of the present work is to reveal how the direction of visual motion is represented in the superior colliculus of awake mice at a large-scale population level. To this end, we applied two complementary approaches. Two-photon calcium imaging was used to record neuronal responses at single-cell resolution in the posterior-medial SC of behaving mice, leaving the cortex intact. To reveal the functional organization on a larger scale over both hemispheres we applied a wide-field imaging method in an acortical mutant mouse.

Results

Single-cell imaging reveals a coarse map for direction of motion

To investigate the tuning of SC neurons to the direction of motion, we imaged neuronal calcium responses to dots and bars moving in different directions using two-photon microscopy in awake mice (Fig. 1a). To maintain the integrity of the overlying cortex, one is limited to the posterior-medial sector of the mouse SC that corresponds to the upper lateral visual field[14] (Fig. 1b-c). Direction-selective (DS) SC neurons in this region responded robustly to both moving dots and moving bars with a strong direction preference (Fig. 1d). We defined an index of direction selectivity (DSI, see Methods) and focused further analysis on neurons with DSI larger than 0.1 (Fig. 1e-f). Among these cells, the response to preferred direction motion was ~3 times larger on average than that to the null direction.

The moving-bar stimulus will drive feature detectors that are tuned to either motion

direction or line orientation, leading to possible confounds, whereas a field of moving dots

has no orientation signal. Therefore, we focused on results from moving dot stimuli. Figure

2 illustrates the direction tuning of neurons in the left posterior-medial SC of three different

animals. In each case, neurons located near each other tend to have the same preferred

direction of motion. That preferred direction varies only gradually across the surface of the

SC (Fig. 2a-d), or remains constant over distances of several 100 μm (Figs 2e-h, 2i-l). At

times, neurons that prefer two opposite directions are intermingled (Fig. 2i-l). None of

these arrangements of preferred direction resembles the salt-and-pepper organization in

rodent primary visual cortex (V1)[10] (see more examples in Supplementary Fig. 1). Instead,

the preferred direction changes only slowly with the location on the SC, if at all. The

regions of constant direction bias range ~500 μm in size, which corresponds to ~30 degrees

of visual angle or 4 receptive-field diameters. Furthermore, in all 3 animals the preferred

direction is the same, suggesting that the posterior-medial SC has a systematic bias for

upward-nasal image motion.

To summarize the results across many recordings, we calculated for each field of

neurons both a measure of the local scatter of preferred directions as well as the systematic

gradient in the spatial map of preferred direction (Fig. 2m). The resulting distribution

diverged dramatically from the null model in which each cell has an independent preferred

direction (Fig. 2m). In more than half of the cases the preferred direction showed a bimodal

distribution (Fig. 2n). Across all samples, the preferred direction was strongly biased

towards ~220° (upward/nasal) (Fig. 2o). This biased representation of motion direction was

also observed in the responses to moving bars (Supplementary Fig. 2).

To explore the organization of preferred direction in the vertical dimension, we imaged

neuronal responses up to ~350 μm deep in steps of 20-30 μm. We projected the direction

maps from different depths onto the same plane (Fig. 3a). This revealed that neurons with

short horizontal separation preferred a similar direction independent of depth (Fig. 3a-b).

Further analysis over 11 animals confirmed that preferred direction has a columnar

organization, in that it varies little in the vertical dimension (Fig. 3c).

The preferred direction is orthogonal to the preferred orientation

Early work on monkey and cat visual cortex discovered an orthogonal relationship

between preferred orientation and preferred direction[6,21]. We examine whether this claim

can be generalized to the mouse SC. To probe these two maps independently, we measured

the direction preference with moving dots that carry no orientation signal and the

orientation preference with flashed gratings that carry no motion signal (Fig. 4a). Analysis

of direction- and orientation-selective neurons in an entire window of cells spanning 580

μm revealed that the angle between their preferred direction and preferred orientation is

about 90° (Fig. 4b-c, Supplementary Fig. 3a-b). The orthogonal relationship was confirmed

by histogramming the difference between preferred direction and orientation for neurons

across many animals (Fig. 4d, 532 neurons from 14 animals).

Wide-field imaging reveals the direction maps of two entire hemispheres

The bias in the preferred direction towards upward motion among neurons in the

posterior-medial SC (see Fig. 2o) motivated us to explore the functional organization of

motion direction on a larger scale. To this end, we recorded from the entire SC using a

wide-field imaging technique that sacrifices single-cell resolution but promised a global

view of the gradual variations in direction tuning. We first validated the approach by

imaging responses in the same brain using both two-photon and wide-field microscopy.

Figure 5a-b illustrates the direction map in the posterior-medial segment of the SC obtained

by both techniques, with very similar results. For broader coverage, we imaged the SC of

mutant mice whose cortex remains undeveloped[22], leaving almost the entire SC directly

accessible for optical recording. By repeatedly moving the narrow window of the 2-photon

microscope, we accumulated single-cell recordings of the preferred motion direction for

~600 neurons over much of the collicular surface (Fig. 5c-d). A subsequent repeat of the

same stimuli using the wide-field microscope yielded essentially the same map of preferred

direction (Fig. 5e). Furthermore, the direction map in the posterior-medial segment is the

same in cortex-less mutant and normal animals (compare to Fig. 5a-b). These results show

that wide-field imaging is a promising approach to reveal the functional organization of

direction preference at a large scale.

The patchy anatomy of preferred direction on the SC suggests that large parts of the

visual field experience a bias for certain motion directions. To investigate this functional

map, one needs to represent each neuron at the location of its receptive field, along with its

direction preference in visual field coordinates. The need to represent motion directions

throughout the entire visual field brings up an interesting challenge for graphic display.

The conventional spherical coordinate system for visual space has singularities at the

"north" and "south" poles (elevation = +90° and -90°) where the direction of motion cannot

be expressed with respect to the coordinates (at the North Pole all directions point south).

But the north pole of the spherical coordinate system is well within the visual field of the

mouse[23]. To eliminate these pathologies, we chose to represent the sphere with a "unipolar"

coordinate system that has only one singularity. That special point can be placed dead

behind the animal, outside of the visual field (Fig. 6a, Supplementary Fig. 4, see **Methods**).

In the following, we will use these unipolar coordinates for large-scale maps of the mouse

visual field.

For the sample recording of Fig. 5c we mapped the receptive fields and preferred

directions of all neurons into visual space (Fig. 6b). As predicted, the preferred direction

varies with location in the visual field. Patches of approximately constant bias, ranging

from 10° to 40° in size, are separated by regions with sharp changes. The gradient of

preferred direction varies across the visual space. Wide-field imaging performed across

both sides of the brain confirmed the patchy organization and the net bias for upward

motion. Furthermore, neurons representing the left and right visual fields appear to prefer

mirror-symmetric directions (Fig. 6c, Supplementary Fig. 5).

To identify the systematic aspects of direction-sensitivity, we analyzed these global

maps across many animals. The simplest overarching feature is the overall bias for certain

directions of motion, slightly nasal of upward, which is mirror-symmetric across the two

sides of the visual field (Fig. 7a). To quantify the size of the patches of constant direction,

we calculated the autocorrelation function for each map, which yielded a full width at half

maximum of 30° (Fig. 7b, Supplementary Fig. 6a). As might be expected this patch size is

the same in the left and right half of the SC (Fig. 7c). The direction patterns in left and right

visual fields do not align perfectly: A cross-correlation between the two sides has a

somewhat wider peak of ~40° (Fig. 7c). This concordance is similar to that observed across

different animals (Fig. 7c, Supplementary Fig. 6b-c).

One possible interpretation of the global inhomogeneity is that it relates somehow to

the optic flow pattern created by self-motion of the animal. To evaluate this notion, we

compared the experimental preferred-direction maps to optic flow maps predicted from the

six basic modes of self-motion (Supplementary Fig. 7). By projecting the optic flow map

onto the direction map one gains an estimate of how strongly the stimulus activates the

superior colliculus. For those self-motions without a lateral component, the two sides of

the SC are tuned in the same way. In particular, they are more strongly activated by forward

translation, down translation, and downward pitch (Fig. 7d). For those motions with a

lateral component, the two sides are tuned in the opposite way. In particular, the left SC

prefers translation to the right, clockwise roll, and yaw to the right; *vice versa* for the right

SC. Most of these biases are highly significant and consistent across animals.

Discussion

This study extends our understanding of the functional architecture of visual features

in the brain. We showed that the mouse superior colliculus represents visual motion with a

bias that depends on location in the visual field. Nearby neurons prefer a similar direction

of motion even over distances of ~500 μm on the collicular surface, corresponding to ~30

degrees of visual angle (Fig. 2). The direction bias extends vertically over several 100 μm

to form columns of preferred direction (Fig. 3). For neurons that are selective both for

direction and orientation, the preferred direction is orthogonal to the preferred orientation

(Fig. 4). Large-scale wide-field imaging revealed a global map of preferred direction with

coarse symmetry between two sides of the superior colliculus and a strong bias for upward-

nasal motion in the upper visual field (Figs. 5–7). Here, we briefly discuss these

conclusions and their implications.

Relation to prior work

Some of the features reported here have been described before: For example, de Malmazet et al[17] report that nearby neurons in certain regions of the retinotopic map tend to prefer the same direction of motion, and that this local preference also extends in depth. There has been controversy on those points[16,18], but our results reliably confirm the observation of a local direction bias. Building on this prior work, we here present a global analysis of direction coding in the SC. We extend the measurements to a larger visual field, especially in the superior elevations ignored in previous studies. We also record from both sides of the brain, covering almost the entire surface of the SC accessible from above. We established that the global map consists of multiple iso-direction patches and measured their size. Furthermore, we assessed the symmetry of these patches across the two sides of the SC and evaluated how the global direction map interacts with the global optic flow fields that result from locomotion during natural behavior.

Our results differ from prior claims on the topic of orientation tuning and how it relates to direction tuning. The present observation that preferred orientation systematically lies perpendicular to the preferred direction is consistent with the relationship reported in neurons of the visual cortex[5,6,21]. This contrasts with a prior report[17] which argued that direction maps and orientation maps in mouse superior colliculus are independent. That conclusion may have been affected by the choice of stimuli, which precluded an independent measurement of orientation and direction tuning in the same neuron (Supplementary Fig. 8). In the present study, tuning to line orientation vs object motion was assessed by different stimulus probes.

Functional anatomy in different species

The functional organization of visual processing has been reported in the brains of many species. The visual cortex of cat[10], monkey[6], and ferret[5] shows a functional map, where a neuron's response features – such as preferred orientation and direction – depend systematically on its location in the brain. In the rodent cortex there is less organization, and neurons preferring different orientations are intermingled in a "salt-and-pepper" pattern. Despite this difference, the common point is that neurons of all preferred orientations (or directions) are represented within a visual region smaller than the receptive field of a single neuron. In the primary visual cortex (V1) of the monkey, the orientation columns measure about 0.1° on average, only one-tenth of the receptive field size[24]. In V1 of the tree shrew, all orientations are represented within a 4° visual angle, again smaller than the average receptive field size[9]. By contrast, in the mouse superior colliculus, the patches with uniform preferred orientation span ~30°, which greatly exceeds the RF size of ~10°[16], or the visual acuity of 2°[14]. The results reported here show that the representation of object motion in the superior colliculus is similarly dominated by such local biases. An intriguing new feature is that the iso-direction patches contain a minority of neurons tuned to the diametrically opposite direction (Fig. 2i,j,k,l). It will be important to understand the relationship of these two neural populations within the local circuitry.

How does the patchy direction map in the SC arise?

Several explanations can be contemplated: (1) The local direction bias may exist already in the neural projections from the retina. (2) It may result from selective connectivity between the retinal inputs and the target neurons in the SC. (3) Or it may be constructed by postsynaptic circuitry within the SC. It has been shown that much of the direction

selectivity in the mouse SC arises already in the excitatory synaptic inputs from retinal

ganglion cells[25], which argues for a diminished role of collicular interneurons in the

phenomenon. The mouse retina contains 8 types of direction-selective ganglion cells

(DSGCs). Their global distribution across the retina has been analyzed, and there is no

indication of local inhomogeneities that could explain the patchy organization in the

direction map of the SC[26–28]. Furthermore, the projections of DSGCs to the superficial SC

appear to form a layer of uniform density, with no indication that one subtype dominates

over the others in any local region[29,30]. This prior work suggests that each retinotopic

location on the SC receives an equally balanced input of direction-selective signals from

the retina, quite unlike what occurs in the optic tectum of the zebrafish[31]. If so, then the

local bias observed in iso-direction patches must result from selective connectivity between

SC neurons and specific subtypes of DSGCs, and that connectivity bias must somehow be

coordinated among nearby neurons. Conceivably the local circuitry of interneurons

contributes to this lateral coordination.

Behavioral relevance

Is there an intelligible purpose to the direction architecture in the mouse superior

colliculus? On a coarse scale, cells in the upper visual field systematically prefer motion in

the upward and nasal direction. Because activity in the upper visual field is generally

associated with defensive reactions[32,33], one may speculate that the direction tuning is

adapted to those functions. Note that an aerial predator approaching at a constant height

from the horizon will indeed follow an upward trajectory in the visual field that eventually

bends in a nasal direction towards the north pole, in line with the average direction tuning

of the SC (Supplementary Fig. 9).

In addition, the global bias in the upper visual field also predicts a selectivity for certain optic flows produced by self motion. For example, the superior colliculus as a whole should respond more strongly to forward motion of the animal than to backward motion, whereas horizontal turns left or right should produce excess activity in the right and left colliculus respectively. Such strong global signals may play a role in rapid feedback during the control of locomotion.

The other characteristic scale of the direction architecture is the smaller patches that deviate from the average tuning, measuring ~30° of visual angle in diameter. The meaning of these specializations is harder to discern. The effects are substantial: For a direction-selective neuron in such a patch, the median ratio between preferred and null direction response is about 2.2. Thus, differently tuned patches may differ by a factor of 4 in their relative response to two moving objects. This should produce noticeable regional gradients in the animal's perceptual sensitivity to motion, a prediction to be tested in future experiments.

Methods

Visual field coordinate systems. During experiments with visual stimulation, the animal

was head-fixed with the lambda-bregma plane horizontal in the laboratory frame. To report

locations in the visual field, we use either spherical coordinates

$(\text{azimuth, elevation}) = (\varphi, \theta)$ or unipolar coordinates (α, β). The lambda-bregma plane is

at $\theta = 0°$ and $\beta = 0°$.

Unipolar Coordinates. We introduce this coordinate system to avoid the singularities

occurring at the poles of spherical coordinates. Suppose the observer sits at the origin of a

Cartesian system facing in the z-direction. The horizontal plane is (x, z) and the y-axis

points up. A unit sphere is centered on the origin. For a given point $\vec{r} = (x, y, z)$ on the

sphere, spherical coordinates $(\text{azimuth, elevation}) = (\varphi, \theta)$ are defined as

281
$$\varphi = \arctan\frac{x}{z}, \theta = \arctan\frac{y}{z} \tag{1}$$

282 and unipolar coordinates (α, β) as

283
$$\alpha = 2\arctan\frac{x}{1+z}, \beta = 2\arctan\frac{y}{1+z} \tag{2}$$

284 Note the only singular point of the unipolar system is directly behind the observer at

285 $\vec{r} = (0, 0, -1)$. The transformation from spherical coordinates to unipolar coordinates is:

286
$$\alpha = 2\arctan\frac{\cos\theta\sin\varphi}{1+\cos\theta\cos\varphi}, \beta = 2\arctan\frac{\sin\theta}{1+\cos\theta\cos\varphi} \tag{3}$$

287 The direction of motion on the sphere in unipolar coordinates is defined as

288
$$\rho = \arctan\frac{d\beta}{d\alpha} \tag{4}$$

where $d\alpha$ and $d\beta$ are increments of motion along α and β respectively.

Visual stimulation. For 2-photon imaging experiments, an LED screen was placed 15 cm

away from the mouse's right eye. The center of the monitor was at 95° azimuth and 25°

elevation in the laboratory frame, and the monitor covered a visual field of 106° x 79°. The

monitor was strobed for 12 μs at the end of each laser scan line to minimize interference of

the stimulus with fluorescence detection. For measuring neuronal tuning to orientation and

motion direction we applied three types of stimuli. (1) A 2-d array of moving dots with a

diameter of 5° spaced at 54°. The array moved in 12 possible directions. This stimulus

contains no orientation signal. (2) Square gratings with a spatial frequency of 0.08 cycles

per degree were flashed at 6 orientations and 4 phases. This stimulus contains no motion

signal. (3) A moving dark bar with 5° width moving in 12 possible directions. The sequence

of directions or orientations was pseudorandomized.

For the wide-field imaging setup, a large LED screen was placed 15 cm away from the

mouse's eye covering a visual field of 145° x 121°. The center of the monitor was at 25°

elevation and either 0° azimuth (covering both eyes), 45° azimuth (mostly right eye) or -45°

azimuth (mostly left eye). To avoid excessive fisheye distortion in these wide-field

experiments, we applied a spherical correction to the images on the monitor [34].

Viral injection. We injected adeno-associated virus (AAV) expressing non-floxed

GCaMP6 (AAV2/1.hSyn1.GCaMP6f.WPRE.SV40) into the SC of C57BL/6J and the SC

of mutant mice with the largely undeveloped cortex. After 2–3 weeks, we implanted a

cranial window coupled to a transparent silicone plug that rested on the surface of the SC

and exposed its caudomedial portion. This portion of the SC corresponds to the up-temporal

part of the visual field. The optics remained clear for several months, which enabled long-

term monitoring of the same neurons. Two-photon microscopy was applied to image

calcium signals in the SC of head-fixed awake mice 3 weeks to 2 months after viral injection.

2-photon calcium imaging and analysis.

Two-photon imaging was performed on a custom-built microscope with a $16\times$, 0.8 NA,

3mm WD objective (Nikon) and controlled by custom software written in Labview

(National Instruments). A Ti:Sapphire laser with mode-locking technique (Spectra-Physics

Mai Tai HP DeepSee) was scanned by galvanometers (Cambridge). GCaMP6f was excited

at 920 nm and laser power at the sample plane was typically 20-80 mW. A 600 μm $\times$ 600

μm field of view was scanned at 4.8 Hz as a series of 250 pixel $\times$ 250 pixel images and the

imaging depth was up to 350 μm. Emitted light was collected with a T600/200dcrb dichroic

(Chroma), passed through a HQ575/250m-2p bandpass filter (Chroma), and detected by a

photomultiplier tube (R3896, Hamamatsu). Artifacts of the strobed stimulus were

eliminated by discarding 8 pixels on either end of each line.

Brain motion during imaging was corrected using SIMA[35] or NoRMCorre[36]. Regions

of interest (ROIs) were drawn manually using Cell Magic Wand Tool (ImageJ) and fitted

with an ellipse in Matlab. Fluorescence traces of each ROI were extracted after estimating

and removing contamination from surrounding neuropil signals as described previously[14,37].

Slow baseline fluctuations were removed by subtracting the eighth percentile value from a

15-s window centered on each frame[38].

Two criteria were applied to interpret ROIs as neurons: 1) The size of ROI was limited

to 10 – 20 μm to match the size of a neuron; 2) ROIs with a signal-to-noise ratio (SNR)

smaller than 0.4 were discarded from further analysis[39].

$$334 \qquad SNR = \frac{Var\left[\langle C \rangle_r\right]_t}{\langle Var[C]_t \rangle_r} \qquad (5)$$

335   Where C is the $T \times R$ response matrix (time samples $\times$ stimulus repetitions), $\langle \ \rangle$ and

336     $Var[\ ]$ is the mean and variance.

337   For any given stimulus, the response of a neuron was defined by the fluorescence trace

338   in its ROI during the stimulus period

$$339 \qquad R = \frac{\text{peak fluorescence - baseline}}{\text{baseline}} \qquad (6)$$

340   where the baseline is derived from a 0.5-s period prior to stimulation.

341   To quantify the tuning of a neuron to motion direction, we computed the preferred

342   direction as the argument of the response-weighted vector sum of all directions:

$$343 \qquad \rho_{pref} = \arg(\sum_k R(\rho_k) \times e^{i\rho_k}) \qquad (7)$$

344   where $R(\rho_k)$ is the response amplitude at the kth direction ρ_k. The direction selectivity

345   index (DSI) was calculated as the normalized amplitude of the sum:

$$346 \qquad DSI = \frac{\left| \sum_k R(\rho_k) \times e^{i\rho_k} \right|}{\sum_k R(\rho_k)} \qquad (8)$$

347   Similarly, for orientation tuning, the preferred orientation was calculated as the argument of

348   the response-weighted vector sum of all orientations:

$$349 \qquad \theta_{pref} = \arg(\sum_k R(\theta_k) \times e^{2i\theta_k}) \qquad (9)$$

350   where $R(\theta_k)$ is the response amplitude at the kth orientation θ_k. The orientation selectivity

351   index (OSI) was calculated as the normalized amplitude of the sum:

$$OSI = \frac{\left| \sum_k R(\theta_k) \times e^{2i\theta_k} \right|}{\sum_k R(\theta_k)} \qquad (10)$$

We assessed the statistical significance of DSI and OSI using a permutation test[40]: Surrogate trials were generated by randomly shuffling the trial labels and recomputing the DSI or OSI. This procedure was repeated 1000 times to generate a null distribution. Neurons were classified as direction-selective if $DSI > 0.1$ and $p < 0.05$, and as orientation-selective if $OSI > 0.1$ and $p < 0.05$.

The direction map was generated by linearly interpolating the single-cell-resolution data and then applying a mean filter over a 200-μm square region. To calculate the gradient of the map, the map of the preferred direction was fitted by:

$$\rho(x, y) = dx \times x + dy \times y + b \qquad (11)$$

where x and y are the anatomical coordinates. The gradient was calculated as:

$$gradient = \sqrt{dx^2 + dy^2} \qquad (12)$$

The artificial random arrangement of preferred direction (Fig. 2m) was simulated as 26×26 neurons, each of which prefers a random direction, evenly distributed on a $500\mu m \times 500\mu m$ anatomy space.

To find the optimal number of Gaussians to fit the preferred direction distribution (Fig. 2n), we evaluated the Bayesian information criterion (BIC)[41]:

$$BIC = -2\log L + M \log N \qquad (13)$$

where L is the maximized likelihood, M is the number of parameters in the model, and N is the number of neurons.

The center of the receptive field (RF) of each neuron was calculated based on the

moving-bar responses. For each direction of motion, the time of peak response depends on

the location of the RF and the neuron's response latency. By evaluating responses to all

directions, one can extract the response latency and determine the best-fit location of the

RF.

Wide-field imaging and analysis. The wide-field microscope was built with a 50-mm /

105-mm tandem lens[42]. Illumination was from a blue LED with an excitation filter (469 nm

± 35 nm) and the camera used an emission filter (525 nm ± 39 nm). Images were acquired

using a CMOS camera (Basler ace acA2000-165um NIR USB 3.0 Camera) at an acquisition

rate of 10 Hz. The camera covers an area of 5.36 mm x 2.85 mm at a spatial resolution of

2.63 μm. Each acquired image was convolved with a normalized box filter and down-

sampled to 1/10 of the original size. An ROI was drawn manually over the SC to exclude

signals from the surrounding areas. For each pixel in the image, the response was defined

as described above for ROIs in 2-photon experiments. The RF center of each pixel was

calculated from moving bar responses as described above.

To measure the size of direction-tuned patches in a direction map, we calculated the

normalized 2-D autocorrelation of the map. Similarly to evaluate the correspondence

between maps on the left and right SC or across different mice, we calculated the normalized

2-D cross-correlation of two maps. Suppose a direction map is given by $\vec{u}(\mathbf{x})$, where at each

location $\mathbf{x}$ in the visual field $\vec{u}(\mathbf{x})$ is a vector that points in the preferred direction ρ with

length proportional to the DSI. For two such direction maps $\vec{u}(\mathbf{x})$ and $\vec{v}(\mathbf{x})$ we define the

cosine correlation as

$$c(\mathbf{y}) = \frac{\int \vec{u}(\mathbf{x}) \cdot \vec{v}(\mathbf{x} + \mathbf{y}) \mathrm{d}^2 x}{\sqrt{\int \vec{u}(\mathbf{x}) \cdot \vec{u}(\mathbf{x}) \mathrm{d}^2 x \int \vec{v}(\mathbf{x}) \cdot \vec{v}(\mathbf{x}) \mathrm{d}^2 x}} \qquad (14)$$

For every possible shift vector $\mathbf{y}$ this computes the normalized dot product of one map with

the shifted version of the other map. We averaged this correlation map over all shift vectors

of the same distance $|y| = r$ to obtain a radial profile $C(r)$. The full width at half maximum

(FWHM) of the correlation map (Fig. 7) was defined as twice the radius where this profile

dropped to half of its maximum.

Statistical methods. No statistical method was used to predetermine the sample size. A

permutation test was used to assess the statistical significance of DSI and OSI as described

above. The Shapiro-Wilk test was applied to assess whether data were normally distributed.

In the case of a normal distribution, a t-test was applied; otherwise, a nonparametric test

(Mann–Whitney U-test or One-sample Wilcoxon signed-rank test) was applied.

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Author Contributions Y.L. designed the study, performed all experiments, interpreted results, and wrote the manuscript. Z.T. provided acortical mutant mice and validated their brain anatomy. M.M. helped design the study, interpret results, and write the manuscript.

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Figure Legends

Figure 1 | Two-photon calcium imaging reveals direction tuning in awake mouse superior colliculus. a, Schematic of the experimental setup. Mice were head-fixed and free to run on a circular treadmill. Visual stimuli were presented on a screen. Neuronal calcium activity was imaged using two-photon microscopy. PMT, photomultiplier tube. **b**, Schematic of mouse brain anatomy after insertion of a triangular plug to reveal the posterior-middle part of the SC. **c**, A standard deviation projection of calcium responses to moving dots. **d**, Calcium responses of a sample neuron to moving dots and moving bars at twelve directions. Gray shade indicates the standard deviation across identical trials. Small wiggles in the moving dot response reflect individual dots crossing the receptive field. Bottom, polar graphs of normalized peak responses. **e**, Histogram of direction selectivity index of neurons responding to moving dots. Dashed line indicates the threshold applied for direction selectivity analysis. Arrowhead marks the cell in (d). **f**, Histogram of direction selectivity index of neurons responding to moving bars, displayed as in (e).

Figure 2 | Locally uniform direction tuning. a, All direction-selective neurons in a sample field of view from left SC. Arrows are plotted at the anatomical location of the neurons and indicate the preferred direction in monitor coordinates. Dots are neurons with low direction-selectivity. Dashed lines divide the image into three regions. **b**, Histograms of preferred direction for the three regions. Red lines mark the mean. **c**, A smoothed version of the direction map in (a) where the hue encodes the preferred direction and the intensity varies inversely with the local variance of preferred directions. Note the systematic color gradient across the image. **d**, A 2-D histogram of the absolute difference in preferred directions of two neurons versus their horizontal distance (41 cells, 820 pairs). The red line

indicates the mean. (**e**, **f**, **g**, **h**) and (**i**, **j**, **k**, **l**) are single fields of view from two different mice represented in the same way as (**a**, **b**, **c**, **d**) with (88 cells, 382 pairs) and (124 cells, 7626 pairs) respectively. The dark regions in **k** indicate large local variance. **m**, The gradient of the map plotted against the absolute difference in preferred directions for pairs within 50 μm for all fields of view (42 images from 14 animals). Blue triangles are from the three sample images in (c), (g), (k). Red star indicates the mean of 1000 samples from a simulated random arrangement of preferred directions; error bar indicates SD. **n**, Histogram of the difference of Bayesian information criterion (BIC) between one-Gaussian and two-Gaussian fitting for all fields of view (42 images from 14 animals). Dashed line indicates the boundary between unimodal and bimodal. Arrows mark the three sample images. Inset, the number of Gaussians that gives the minimal BIC. **o**, Histograms of preferred direction for all direction-selective neurons (n = 2279 cells from 14 animals).

Figure 3 | Direction columns extend in depth. a, Horizontal plane projection of arrow plots (as in Fig. 2a) at five different depths in the same field of view (229 cells). **b**, 2-D histogram of the absolute difference in the preferred direction versus vertical separation for this volume (236 pairs). Red line indicates mean. **c**, 2-D histogram of the absolute difference in the preferred direction versus vertical separation for all recorded neurons (2323 pairs from 11 animals).

Figure 4 | Direction maps are orthogonal to orientation maps. a, Calcium responses to moving dots and flashed gratings for a sample neuron exhibiting both direction- and orientation-selectivity. Polar plot shows peak response to dots (blue) and gratings (red). Here the preferred direction and orientation differ by 86°. **b**, Overlay of maps for preferred direction (arrows) and orientation (lines) in a sample field of view, displayed as in Fig. 2a.

c, Histogram of the absolute difference between preferred direction and preferred orientation for the sample in (b) (60 cells). **d**, Same histogram for all direction- and orientation-selective neurons (532 cells from 14 animals).

Figure 5 | Direction maps from wide-field imaging and two-photon imaging agree. a and b, Direction maps generated from two-photon data and wide-field imaging data in the posterior-medial left superior colliculus of the same mouse. Hue represents the preferred direction (a) and value codes the local variance (a) or the DSI (b). **c**, All direction-selective neurons in the SC of a mutant mouse with undeveloped cortex presented in the anatomy space with preferred direction in monitor coordinates as in Fig. 1a. Dashed line separates images that were acquired with the monitor at two different azimuth coordinates: 95° for the left and 45° for the right. **d**, A smooth direction map from interpolating the data in (c). **e**, Direction map from wide-field imaging data from the same animal as in (d).

Figure 6 | Large-scale direction maps in visual space. a, Schematic illustrating the correspondence of spherical coordinates and unipolar coordinates. **b**, All direction-selective neurons in the SC of an acortical mouse presented in the visual space using unipolar coordinates. Same recording as Fig. 5c, but the arrows are plotted at receptive field locations. **c**, Direction map obtained from both left and right SC of a different mouse, plotted in visual space with unipolar coordinates. Hue codes the preferred direction; value codes the amplitude of responses; saturation codes the DSI.

Figure 7 | Orientation bias in the direction map. a, Distribution of preferred directions encountered in both visual hemifields (9 animals). Error bars represent one standard error across animals. Bottom: The histogram for the left hemifield was flipped about the vertical

and overlaid on the histogram for the right hemifield. **b**, The radial profile of

autocorrelation for a sample direction map. Full-width at half maximum (FWHM) is

indicated. **c**, Box plots of the FWHM for the autocorrelation, the cross-correlation between

left and right SCs, and the cross-correlation between individuals for the same side of the

SC (9 animals). The box plots 25th to 75th quartiles, the band inside the box is the median,

and the square inside the box is the mean. The ends of the whisker indicate one standard

deviation above and below the mean. **d**, Projections of preferred-direction maps from

experimental data onto motion maps representing different optic flows (9 animals). Error

bars represent one standard error. Wilcoxon signed-rank test or one-sample *t*-test were

applied to test the significance of the difference from 0; the p-values are 1.5e-3, 4.3e-6,

3.1e-5, 0.043, 3.9e-3, and 0.14 for the left SC; 0.098, 0.039, 0.027, 0.019, 1.5e-4, and 0.08

for the right SC. Mann-Whitney U-test or two-sample *t*-test were applied to test the

significance of the difference between left and right SCs, and the p-values are 1.8e-3, 2.2e-

6, and 0.022 for the right half figure.

Supplementary Figure 1 | Additional examples of arrow plots and smooth maps of preferred direction. Data from 4 animals stimulated with moving dots, presented as in Figs 2a and 2c.

Supplementary Figure 2 | Organization of motion direction measured by moving bars. (**a**, **b**, **c**, **d**) Data from 4 animals stimulated with moving bars, presented as in Figs 2a and 2c. **e**, Gradients of the map plotted against the absolute difference in preferred directions for pairs within 50 μm (33 images), displayed as in Fig. 2m. **f**, Analysis of bimodality in the distributions of preferred direction (33 images), displayed as in Fig. 2n. **g**, Histograms of preferred direction for all direction-selective neurons (1754 cells).

Supplementary Figure 3 | Another sample showing the orthogonal relationship between preferred direction and orientation. a. Overlay of arrow plots for direction-selective neurons and line plots for orientation-selective neurons. **b**, Histogram of the absolute difference between preferred direction and orientation (25 cells).

Supplementary Figure 4 | Introduction of unipolar coordinates. a, Schematic of the definition of unipolar coordinates (see **Methods**). **b and c**, Relationship between spherical coordinates and unipolar coordinates.

Supplementary Figure 5 | Direction maps including both sides of the SC. a, A sample direction map plotted in visual space with unipolar coordinates. Hue codes the preferred direction. Value codes the amplitude of responses. Saturation codes the DSI. The horizontal component of the direction in the left field has been flipped to better reveal left-right symmetry. **b**, Average direction map combined over 9 animals.

Supplementary Figure 6 | Autocorrelation and cross-correlation of global direction

maps. a. Left, the autocorrelation of a sample direction map. Right, the corresponding

radial profile. **b.** Left, the cross-correlation between direction maps of the left and right

SCs of an example animal. Right, the corresponding radial profile, centered on the peak of

the correlation map. **c.** Left, the cross-correlation between direction maps of the same-side

SCs of two different animals. Right, the corresponding radial profile.

Supplementary Figure 7 | Motion maps corresponding to optic flows from self-motion.

For each of the 6 basic modes of translation and rotation, this plots the direction of the optic

flow vectors in the visual field using unipolar coordinates. Note these graphs assume that

the axis of forward translation and roll rotation equals the lambda-bregma axis. In actuality,

an ambulating mouse carries the lambda–bregma axis at a typical downward pitch of 29°[43].

Supplementary Figure 8 | Comparison of preferred direction or orientation measured

by different stimuli. a. Preferred direction measured by moving bars plotted against that

by moving dots (1085 neurons from 14 animals). **b.** Histogram of difference between

preferred directions measured by these two stimuli. **c.** Preferred orientation measured by

moving bars plotted against that by flashed gratings (680 neurons from 14 animals). **d.**

Histogram of difference between preferred orientations measured by these two stimuli.

Supplementary Figure 9 | The global bias of direction map is tuned to the detection

of approaching aerial predators. a. Arrow plots of the preferred direction in the SC,

averaged over 9 animals, and plotted across the visual field in unipolar coordinates. **b**. The

motion vectors in the mouse's visual field produced by an aerial predator approaching at

constant height from various directions.

Figure 1

Figure 2

Figure 3

Figure 4

Figure 5

Figure 6

a

100 µm

b

Supplementary Figure 3

a

b

Translation

Forward　　Back

Up　　Down

Left　　Right

Rotation

Roll_cw　　Roll_ccw

Pitch_up　　Pitch_down

Yaw_left　　Yaw_right

Supplementary Figure 7

Supplementary Figure 8

a

b