# Building an allocentric travelling direction signal via vector computation 

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#### Abstract

Many behavioural tasks require the manipulation of mathematical vectors, but, outside of computational models ${ }^{1-7}$, it is not known how brains perform vector operations. Here we show how the Drosophila central complex, a region implicated in goal-directed navigation ${ }^{7-10}$, performs vector arithmetic. First, we describe a neural signal in the fan-shaped body that explicitly tracks the allocentric travelling angle of a fly, that is, the travelling angle in reference to external cues. Past work has identified neurons in Drosophila ${ }^{\text {g,11-13 }}$ and mammals ${ }^{14}$ that track the heading angle of an animal referenced to external cues (for example, head direction cells), but this new signal illuminates how the sense of space is properly updated when travelling and heading angles differ (for example, when walking sideways). We then characterize a neuronal circuit that performs an egocentric-to-allocentric (that is, body-centred to world-centred) coordinate transformation and vector addition to compute the allocentric travelling direction. This circuit operates by mapping two-dimensional vectors onto sinusoidal patterns of activity across distinct neuronal populations, with the amplitude of the sinusoid representing the length of the vector and its phase representing the angle of the vector. The principles of this circuit may generalize to other brains and to domains beyond navigation where vector operations or reference-frame transformations are required.


Insects solve remarkable navigational tasks ${ }^{15,16}$ and, like mammals, they have head-direction-like cells, called EPG cells, with activity tuned to the angular heading of a fly in reference to external cues ${ }^{8}$. The heading and travelling angles of an insect, however, do not always align ${ }^{17-19}$, such as when walking or flying sideways (for example, due to wind) or when simply looking sideways while walking forward. Because it is the travelling direction that is most relevant for forming spatial memories via path integration, it is possible that insect brains explicitly track this variable during navigation. Here we show that a population of neurons that tiles the Drosophila fan-shaped body expresses a bump of activity at a left-right position along this structure that indicates the travelling angle of the fly, rather than the heading angle, in reference to external cues. We further describe a neuronal circuit that computes this external-cue-referenced, or allocentric, travelling direction signal by explicitly projecting the egocentric, or body-referenced, travelling vector of the fly onto four orthogonal axes, rotating those axes into the allocentric reference frame, and taking a vector sum of the four vectors.

## Beyond heading in the central complex

The Drosophila central complex includes the ellipsoid body, the protocerebral bridge and the fan-shaped body (Fig.1a,b). Single EPG neurons have a mixed, input-output, 'dendritic' terminal in one wedge of the ellipsoid body and an 'axonal' terminal in one glomerulus of the protocerebral bridge ${ }^{20,21}$ (Fig. 1b, two blue cells). In both walking ${ }^{8,11,12}$
and flying ${ }^{10,22}$ flies, the full population of EPG cells expresses a bump of calcium activity in the ellipsoid body, and copies of this bump in the left and right bridge. These three signals shift in concert along these structures, tracking the angular heading of the fly referenced to external cues ${ }^{8,11,12}$.

EPG cells represent one of a few dozen sets of columnar neurons in the central complex. Each columnar cell class tiles the ellipsoid body, the protocerebral bridge and/or the fan-shaped body. Individual columnar cells or neurite fields can be assigned an angular label between $0^{\circ}$ and $360^{\circ}$ based on their anatomical location ${ }^{20,21}$, with neighbouring neurites mapping to neighbouring angles. $\mathrm{hDeltaB}(\mathrm{h} \Delta \mathrm{B})$ cells are a columnar class whose constituent cells have a 'dendritic' arbor in layer 3 of one fan-shaped body column and a mixed, input-output, 'axonal' arbor in layers 3, 4 and 5 of another column offset by half the width of the fan-shaped body ${ }^{20}$ (Fig.1b, two red cells). We created a split-Gal4 driver line for $h \Delta B$ cells (Extended Data Fig. 1a-d) and a UAS-sytGCaMP7f responder line in which GCaMP7f is fused to the C terminus of synaptotagmin to bias GCaMP7f to presynaptic compartments ${ }^{23}$ (Extended Data Fig. 1e,f). Imaging sytGCaMP7f fluorescence in $h \Delta B$ cells of both walking (Extended Data Fig. 1n) and flying (see below) flies revealed a bump of activity that moves left-right along the fan-shaped body in coordination with the movements of the EPG bump around the ellipsoid body. Critically, however, the relative position of the $h \Delta B$ and EPG bumps were often offset (Extended Data Fig. 1n), suggesting that the position of the $h \Delta B$ bump might signal the travelling, rather than the heading, angle of the fly.

[^0]

Fig. $1 \mid h \Delta B$ neurons signal the allocentric travelling direction in
Drosophila. a, The fly brain. b, Two example EPG cells and two example h $\Delta \mathrm{B}$ cells. Each cell type tiles the central complex.c, Imaging neural activity in a flying fly with an LED arena. d, sytGCaMP7f frames of the EPG bump in the ellipsoid body and the $h \Delta B$ bump in the fan-shaped body.e, Simultaneously recorded sytGCaMP7f signal from EPG cells (blue) and $h \Delta B$ cells (red) in a flying fly. $\left[\mathrm{Ca}^{2+}\right]$ signal (top), and phase estimates and dot position (bottom) are shown. The grey regions represent the $90^{\circ}$ gap in the back of the arena. See Methods for the definition of norm. $\Delta F / F_{0} . \mathbf{f}$, Probability distributions of the EPG-h $\Delta$ B phase without and with optic flow. Grey indicates the means of individual flies; black indicates the population mean.g, Top, EPG (blue) and $h \Delta B$ (red) sytGCaMP7f signals in a sample flying fly experiencing optic flow with foci of expansion that simulate the following directions of travel (in the time period delimited by the vertical dashed lines): $180^{\circ}$ (backward), $-120^{\circ}$, $-60^{\circ}, 0^{\circ}$ (forward), $60^{\circ}, 120^{\circ}$ and $180^{\circ}$ (backward; repeated). Middle, phases of the sample $\left[\mathrm{Ca}^{2+}\right]$ signals above. Bottom, circular mean of the EPG-h $\Delta$ B phase for a fly population. Grey indicates the means of individual flies; black indicates the population mean; the dotted rectangle denotes a repeated-dat a column. $h, E P G-h \Delta B$ phase versus the egocentric travelling direction simulated by optic flow. Circular means were calculated in the final 2.5 s of presentation of the optic flow. Grey indicates the means of individual flies; black indicates the population mean $\pm$ s.e.m.; the dotted rectangle denotes a repeated-data column. $\mathrm{i}, \mathrm{h} \Delta \mathrm{B}$ phase versus the inferred allocentric travelling direction, calculated by assuming that the EPG phase indicates allocentric heading and adding to this angle, at every sample point, the angle of optic flow. Same data are shown as in panels $\mathbf{g}$ and $\mathbf{h}$. Grey indicates means of individual flies; black indicates the population mean. (Note the flipped $x$ axis indicating that the $h \Delta B$ bump tracks the negative travelling direction of the fly; see Methods.).

## $h \Delta B$ cells track the allocentric travel angle

Totest the hypothesis that the position of the $\Delta \Delta$ B bump tracks the travellingdirection of the fly, we performed most of our experiments ontethered, flying flies ${ }^{24}$ (Fig. 1c). In flight, insects rely heavily on translational visual motion toassess their direction of travel ${ }^{25}$. We could thususe visual, starfield stimulito simulate the flies translating forwards, backwards or sideways relative to their head-body while simultaneously measuring the positions of
the EPG and $\mathrm{h} \Delta$ B bumps viatwo-photonexcitation of sytGCaMP7f(Fig.1d). A bright dot at the top of the cylindrical LED arena rotated in a closed loop with the steering behaviour of the fly, simulating a static, distant cue that the fly could use to infer heading ${ }^{10}$. Under these conditions, the flies did not show a consistent, detectable preference for keeping the bright dot at any particular angular position(Extended DataFig.1k).A field of dimmer dots (starfield) in the lower visual field was either stationary or moved coherently to generate open-loop optic flow that simulated the fly translating along different directions relative to its head or body axis ${ }^{26,27}$ (Fig.1c;Methods).

The position of the EPG bump, that is, its phase, tracked the angular movements of the closed-loop dot (Fig. 1e), although with a lower correlation than in tethered walking, ${ }^{8,11}$ (Extended Data Fig. 1g-j) probably because the lack of vestibular feedback while on the tether impacts the ability of the flies to register turns more in flight than in walking. With a stationary starfield, the $\Delta$ B phase often drifted off the EPG phase (Fig.1e, left, many grey arrows). By contrast, when we presented optic flow that simulated the body of the fly moving forwards, the EPG and $\mathrm{h} \Delta \mathrm{B}$ phases became more aligned, both in a single-fly example (Fig.1e, right, one grey arrow) and across a population of 12 flies (Fig.1f, Extended Data Fig.11, m).

When we varied the expansion point of the optic-flow stimulus to simulate the fly translating along six different directions, we observed that the offset between the EPG and $\mathrm{h} \Delta \mathrm{B}$ phases matched the simulated egocentric (that is, body-referenced) angle of travel (Fig.lg, h). If we make the standard assumption that the EPG phase signals the allocentric heading angle of the fly ${ }^{8,10,22}$, this implies that the position of the $\mathrm{h} \Delta \mathrm{B}$ bump in the fan-shaped body tracks the allocentric travelling direction of the fly (Fig. 1i), which is the angular sum of the egocentric travelling and allocentric heading angles. In flies walking on an air-cushioned ball, rather than flying, we found that the $h \Delta B$ and EPG phases generally align, but deviate predictably during backward and/or sideward walking (Extended Data Fig. $1 \mathrm{n}-\mathrm{p}$ ) in a manner consistent with the $\mathrm{h} \Delta \mathrm{B}$ phase signalling the allocentric travelling direction during terrestrial locomotion, as inflight.

## Computing the travelling angle

Next, we wanted to determine how the $\mathrm{h} \Delta \mathrm{B}$ signal is built. As we show and consistent with past work in bees ${ }^{7}$, there exist sets of neurons that provide four motion-related inputs to the central complex. These inputs $-L_{1}, L_{2}, L_{3}$ and $L_{4}-$ represent the projections of the travelling vector of the fly (determined, for example, by optic flow) onto axes oriented $\pm 45^{\circ}$ (forward-right and forward-left) and $\pm 135^{\circ}$ (backward-right and backward-left) relative to the head of the fly ${ }^{7}$ (Fig. 2a). The egocentric travelling direction of the fly can be computed by adding the four vectors defined by these projection lengths and angles. To turn the egocentric into an allocentric travelling direction, a coordinate transformation must be performed, and, as we also demonstrate, this is done by referencing the four projection or basis vectors to the allocentric heading, $H$, of the fly before taking the vector sum (Fig. 2b, right). The fly then computes its allocentric travelling direction by adding these four allocentric projection vectors with lengths $L_{1-4}$ and angles $H \pm 45^{\circ}$ and $H \pm 135^{\circ}$.

This vector sum can be performed by representing 2D vectors as sinusoids-a phasor representation-where the amplitudes and phases of the sinusoids match the lengths and angles, respectively, of the corresponding vectors. In such a representation, vectors are added by simply summing their corresponding sinusoids (Fig. 2c). Theoretical models using phasors have been proposed ${ }^{2}$, including for the fan-shaped body ${ }^{7}$, but here we provide a comprehensive experimental demonstration of their operation. Connectome-inspired conceptual models in Drosophila (conducted in parallel to our work) have also proposed how phasors could compute the travelling direction and speed of a fly ${ }^{28}$.

## $\mathrm{PFN}_{\mathrm{d}}$ and $\mathrm{PFN}_{\mathrm{v}}$ cells encode vectors

The phasor model requires neuronal populations with sinusoidal activity patterns whose phases and amplitudes match the allocentric


Fig. 2 |The allocentric travelling direction can be computed by vector rotation and summation, which can be implemented by phasors. a, The travelling direction vector (green) for a fly translating at an egocentric travelling angle, $T_{\text {ego }}$, referenced to its head direction (grey line with a circle), is projected onto four axes oriented $\pm 45^{\circ}$ and $\pm 135^{\circ}$ relative to the head, yielding four scalars $L_{1-4}$. The $+45^{\circ}$ projection is shown. The head direction of the fly represents $0^{\circ}$ in this egocentric reference frame. Angles are positive clockwise. b, The allocentric travelling direction, $T_{\text {allo }}$, of the fly can be computed either by rotating the egocentric travelling angle ( $T_{\text {ego }}$ ) such that it becomes referenced to the external world (that is, the sun) (left) or, as in the fly circuit, by first referencing the $\pm 45^{\circ}$ and $\pm 135^{\circ}$ projection axes to the external world (right) and then taking the vector sum of the four projection vectors. Egocentric vectors are referenced to the external world by adding $H$, the allocentric heading angle of the fly, to them. c, 2D vectors can be represented by sinusoids, and adding sinusoids then implements addition of vectors.
projection vectors. PFN $_{\mathrm{d}}$ and $\mathrm{PFN}_{\mathrm{v}}$ cells are columnar neurons that receive synaptic input in the bridge and noduli ${ }^{21}$, while also projecting axons to the fan-shaped body where they synapse onto $\mathrm{h} \Delta \mathrm{B}$ cells ${ }^{20}$ (Fig. 3a, b). Separate arrays of PFN $_{\text {d }}$ cells (Fig. 3a) and PFN ${ }_{v}$ cells (Fig. 3b) in the left and right bridge receive extensive monosynpatic and disynaptic input from EPG cells. Co-imaging EPG and PFN cells revealed one activity bump in the left bridge and another in the right bridge for both $\mathrm{PFN}_{\mathrm{d}}$ and $\mathrm{PFN}_{\mathrm{v}}$ cells, and the phase of these PFN bumps aligned with the EPG bumps (Fig. 3c-e, Extended Data Fig. 2). Thus, PFN $_{d}$ and PFN cells in the left and right bridge together express four copies of the EPG allocentric heading signal. The activity profiles across the bridge of the four PFN populations are well fit by sinusoidal functions (Fig. 3d, e; Methods), consistent with the possibility that the activity patterns of PFN cells represent 2D vectors (Fig. 2c). The sinusoidal shape of PFN bumps in the bridge may originate from the spatially sinusoidal dendritic density in a group of bridge interneurons called Delta7 ( $\Delta 7$ ) cells ${ }^{21}$, which are interposed between EPG cells and many downstream bridge cells, including PFN cells (Extended Data Fig. 3, Supplementary Text).

The four, sinusoidal, PFN bumps in the bridge are poised to represent the four allocentric projection vectors from Fig. 2a, b, except that their phases are not offset by $\pm 45^{\circ}$ and $\pm 135^{\circ}$ relative to the EPG heading angle, H. Although PFN and EPG bumps share a common phase in the bridge, the projection anatomy of PFN cells from the bridge to the fan-shaped body provides a path for the PFN bumps to acquire $\pm 45^{\circ}$ and $\pm 135^{\circ}$ offsets from $H$. Corresponding $\operatorname{PFN}_{\mathrm{v}}$ and PFN $_{\mathrm{d}}$ cells in the left and right bridge send projections to the fan-shaped body that are offset from each other by approximately $\pm 1 / 8$ of the extent of the fan-shaped body ${ }^{21}$ (Fig. 3a, b), equivalent to $\pm 45^{\circ}$ angular offset. PFN $_{d}$ cells synapse onto both the axonal and the dendritic regions of the $h \Delta B$ cells, but the input to the axonal region is anatomically dominant ${ }^{20}$ (Fig. 3f,g). Assuming that the axonal input is thereby physiologically dominant, $\mathrm{PFN}_{\mathrm{d}}$ cells can promote $h \Delta$ B axonal output at fan-shaped body locations that are offset by $\pm 45^{\circ}$ relative to the EPG heading signal in the bridge. PFN $\mathrm{N}_{\mathrm{v}}$ cells project to the fan-shaped body with the same $\pm 45^{\circ}$ angular offset as PFN $_{d}$ cells, but PFN $_{v}$ cells target the $h \Delta$ dendrites, not axons, nearly exclusively ${ }^{20}$
(Fig. 3h, i). As described earlier, the axon terminal region of each $h \Delta B$ cell is offset from its dendrites by half the width of the fan-shaped body, equivalent to an angular displacement of approximately $180^{\circ}$ (Fig.3f-i). The result of these two sets of shifts is that the PFN $_{v}$ cells in the left and right bridge promote $\mathrm{h} \Delta \mathrm{B}$ axonal activity shifted by approximately $\pm 135^{\circ}$ relative to their common phase in the bridge. Thus, the anatomy suggests that the four PFN sinusoids in the bridge are transferred to the fan-shaped body with peaks at $H \pm 45^{\circ}$ and $H \pm 135^{\circ}$, matching the angles of the allocentric projection vectors (Fig. 2). Furthermore, these sinusoids appear to be summed at the level of the $h \Delta B$ axons.

To complete the phasor representation, the amplitudes of the PFN sinusoids should match the expected lengths of the corresponding allocentric projection vectors ( $L_{1-4}$ in Fig. 2a). We found that the amplitudes of the PFN sinusoidal bumps across the bridge were strongly modulated by the egocentric travelling direction of the fly, that is, by the direction of optic flow. Specifically, the amplitude of each PFN sinusoid matched the projection of the inferred travelling direction of the fly (from optic flow) onto the four projection axes defined in Fig. 2 b and Fig. 3f-i (Fig. 3j-o). For example, the amplitude of the $\mathrm{PFN}_{\mathrm{d}}$ sinusoid in the left bridge reaches its maximum when optic flow simulates the body travelling towards the front left (Fig. 3k, see Extended Data Fig. 4 for details), consistent with the anatomy-based prediction in Fig. 3 f for the projection axis represented by PFN $_{d}$ cells in the left bridge. Anatomical and physiological measurements strongly point to LNO1, LNO2 and SpsP neurons as the cell types that cause the modulations of PFN activity based on the egocentric travelling direction of the fly (that is, on the basis of optic flow in flight and on efference copy or proprioception of leg movements in walking) (see Supplementary Text) (Extended Data Fig. 4). By contrast, EPG bumps in the bridge show little amplitude modulation with optic flow (Fig. 3p-r; Methods).

## Model-data comparison

The phasor model predicts that the allocentric travelling direction can be determined by summing the four PFN sinusoids, because this is equivalent to summing the corresponding allocentric projection vectors (Fig. 4a-d, Supplementary Video 1). To test this notion, we modelled the input to $h \Delta B$ cells as four cosine functions shifted by the appropriate angles, representing the expected activity patterns of PFN cells across the fan-shaped body. We multiplied these cosines by the experimentally determined amplitudes measured at different angles of optic flow (Fig. 3j-o) and summed the four amplitude-modulated and shifted sinusoids. The predicted travelling angle calculated in this manner is in excellent agreement with the angular location of the $\mathrm{h} \Delta \mathrm{B}$ bump, measured experimentally (Fig. 4 e, red circles). This prediction involves no free parameters, but it relies on an assumption that all four PFN types contribute equally to the total $h \Delta B$ input. We can relax this assumption by adding the four sinusoids weighted by the average number of synapses from each PFN type onto the $\mathrm{h} \Delta \mathrm{B}$ cells ${ }^{20}$ (Methods). We can also extract the angles by which the PFN sinusoids are anatomically shifted between the bridge and the fan-shaped body from the hemibrain connectome ${ }^{20}$ (Extended Data Figs. 5, 6), rather than using exactly $\pm 45^{\circ}$ and $\pm 135^{\circ}$. The predicted bump location again agrees well with the measured position of the $\mathrm{h} \Delta \mathrm{B}$ bump (Fig. 4e, green diamonds) (see Supplementary Text for more details).

## Perturbations support the vector model

To test the vector model, we manipulated EPG, PFN ${ }_{d}$ and PFN ${ }_{v}$ activity while measuring the effect on the estimate of the travelling direction of the fly. For technical reasons, in these experiments, we imaged the bump position of PFR cells, rather than $\mathrm{h} \Delta \mathrm{B}$ cells, in the fan-shaped body; PFR cells are a columnar cell class whose numerically dominant monosynaptic input is from $\mathrm{h} \Delta \mathrm{B}$ cells ${ }^{20}$ (see Supplementary Text). We found that the position of the PFR bump aligns well with the travelling
Sinusoidally shaped activity bumps

C ERG> PEN $>$ Rotation
$f$


 $\pm 45^{\circ}$ and $\pm 135^{\circ}$ anatomical offsets
 i Inputs
to cell
Outputs
from cell
$\pm 45^{\circ}$ and $\pm 135^{\circ}$ physiological offsets



 m
 n

b


Fig. $3 \mid$ PF $_{\mathrm{d}}$ and PF N ${ }_{v}$ cells show physiological and anatomical patterns consistent with them functioning to build the travelling direction signal in $\mathbf{h} \Delta$ B cells. a, b, Sample PFN and $h \Delta B$ cells (see main text). $\mathbf{c},\left[\mathrm{Ca}^{2+}\right]$ signals and phase estimates of EPG and PFN $\mathrm{N}_{\mathrm{v}}$ (ref. ${ }^{41}$ ) bumps simultaneously imaged in the bridge of a flying fly.d, Phase-nulled and averaged EPG and PFN ${ }_{v}$ activity in the bridge. On each frame, the EPG bumps were rotated to the same position and the simultaneously imaged PF $_{v}$ signals were rotated by this EPG-defined angle; coherent PF $_{v}$ bumps in these plots thus indicate strong phase alignment to the EPG cells. The thin lines indicate individual flies; the thick lines denote population average; the grey dashed lines indicate sinusoidal fits (see Methods for details and goodness of fit).e, Same as panel d, but for EPG
and PF $_{d}$ cells. $\mathbf{f}-\mathbf{i}$, Schematics of how PFN cells promote $h \Delta B$ axonal activity with $\pm 45^{\circ}$ and $\pm 135^{\circ}$ offsets (see main text). $\mathbf{j}$, Phase-nulled PF $_{\mathrm{d}}$ activity in the bridge, averaged in the final 2.5 s of each epoch of optic flow. The dashed rectangle indicates a repeated-data column here and throughout; the grey dashed lines denote sinusoidal fits. A closed-loop bright dot was not displayed. $\mathbf{k}$, Single fly (circles) and population means $\pm$ s.e.m. (black bars) of the amplitude of PF $_{d}$ activity across the left bridge, averaged in the final 2.5 s of the epoch of optic flow. The grey line indicates the sinusoidal fit. I, Same as panel $\mathbf{k}$, but for right-bridge PF $_{d}$ cells. $\mathbf{m}-\mathbf{o}$, Same as panels j-I, but for PF $_{v}$ cells. $\mathbf{p - r}$, Same as panels j-I, but for EPG cells.

PFR phase from the angular position of a closed-loop visual cue or the EPG phase (Extended Data Fig. 7f-j). With the EPG cells silenced, we still observed a bump in PFR cells but its phase did not effectively track the angular position of the closed-loop cue (Fig. 5b-d). Thus, EPG input is indeed necessary for the travelling signal to be yoked to the external world.

Second, we expressed aK ${ }^{+}$channel, Kir2.1 (ref. ${ }^{30}$ ), in PF $_{v}$ cells, with the aim of tonically inhibiting these cells and thus decreasing the contribution of the backward-facing PFN $_{v}$ sinusoids or vectors to the computation of the travelling direction (Fig. Se). This perturbation yielded an increase in the phase alignment between the EPG and PFR bumps in tethered, flying flies in the context of no optic flow (Fig.5f-h), consistent with our model.

Third, we used the two-photon laser to ontogenetically activate GtACR1 $\mathrm{Cl}^{-}$channels ${ }^{31,32}$ in LNO 1 cells ${ }^{33}$, which are the primary monosynaptic,

sinusoid of the right bridge $\left(\mathrm{PFN}_{\mathrm{dR}}\right)$ and the $\mathrm{PFN}_{\mathrm{v}}$ sinusoid of the left bridge ( $\mathrm{PFN}_{\mathrm{vL}}$ ) have a larger amplitude than their counterparts on the opposite side of the bridge, leading the sum, that is, the $h \Delta B$ vector (red), to point rightward. d, Same as panel a-a fly moving forward-but after the fly has turned clockwise by $90^{\circ}$. This turn rotates all the vectors (that is, the reference frame) by $90^{\circ}$ inside the brain. e, Data from Fig. 1 h (black bars) and model (diamonds and circles) (see main text). The grey, dashed unity line indicates a match between the optic flow direction and the EPG-h $\Delta B$ phase.
a
Block EPG synaptic
transmission

Uncouple the system from external cues
e

i


Extend rear vectors
m


j

n


Shorten front vectors


c
g
k

0

$h^{\text {E. }}$


I


$$
\begin{array}{llllll}
\text { No. of flies } & 7 & 6 & 7 & 8 & 7
\end{array}
$$

LNO1 Gal4 $\stackrel{\bullet}{\text { VT064880 }} \stackrel{\bullet}{48 \mathrm{~A} 09}$



Fig. 5 | Perturbations of neural activity induce changes in the travelling direction signal that are consistent with the vector sum model. PFR phase was used as a proxy for the $h \Delta B$ phase here (see main text). a, Prediction. $\mathbf{b}, \mathrm{PFR}$ bump in the fan-shaped body of a fly walking with a closed-loop bright bar at $34^{\circ} \mathrm{C}$, with EPG cells expressing (right) or not expressing (left) shibire ${ }^{\text {ts }}$. c, Probability distributions of PFR phase-bar position. The thin lines represent single flies; the thick line represents the population mean (also in panels $\mathbf{g}$, $\mathbf{k}$ and $\mathbf{0}$ ). d, Circular s.d. of PFR phase-bar position distributions for different genotypes. The grey dots represent single flies; the black markers represent population means $\pm$ s.e.m. (also in panels $\mathbf{h}, \mathbf{l}$ and $\mathbf{p}$ ). $P<2 \times 10^{-4}$ comparing experimental (fourth or seventh columns) with any control group (unpaired two-tailed $t$-tests). e, Prediction.f, Simultaneous imaging of EPG and PFR bumps in the context of PFN ${ }_{v}$ cells expressing (right) or not expressing (left) Kir2.1.g, Probability distributions of EPG-PFR phase.h, Circular s.d. of PFR-EPG phase distributions for different genotypes. $P<4 \times 10^{-5}$ comparing experimental (third or fifth columns) with any control group (unpaired
two-tailed $t$-tests). i, Prediction.j, Simultaneous imaging of PFR and EPG bumps in the context of expected optogenetic activation (right) or no activation (left) of $\mathrm{PFN}_{\mathrm{v}}$ cells. The two-photon laser exciting GCaMP simultaneously excites GtACR1 in LNO1 cells, which should silence them and thus excite PFN $\mathrm{N}_{\mathrm{v}}$ cells via sign-inverting synapses in the noduli. $k$, Probability distributions of EPG-PFR phase. I, Circular mean of the PFR-EPG phase distributions for different genotypes. $P<4 \times 10^{-4}$ comparing experimental (third or fifth columns) with either control group (Watson-Williams multi-sample test). m, Prediction. $\mathbf{n}$, Simultaneous imaging of PFR and EPG bumps in the context of optogenetic activation of SpsP cells expressing (right) or not expressing (left) csChrimson. An external red laser excites csChrimson in SpsP cells, which should activate them and thus inhibit PFN $_{d}$ cells via sign-inverting synapses in the bridge. o, Probability distributions of EPG-PFR phase. p, Circular mean of the PFR-EPG phase distributions for various genotypes. $P<7 \times 10^{-4}$ when comparing the experimental group (third column) with either control group (WatsonWilliams multi-sample test). See Methods for exact $P$ values.
probably inhibitory (Extended Data Fig. 4), inputs to $\mathrm{PFN}_{v}$ cells in the noduli ${ }^{20}$. This perturbation should disinhibit the PFN $_{v}$ cells, increasing the amplitudes of their sinusoids, opposite to the previous perturbation (Fig. 5i). This manipulation drove the PFR bump to be approximately $180^{\circ}$ offset from the EPG bump (Fig. 5j-l), consistent with our model.

Last, we silenced PFN ${ }_{d}$ cells by perturbing one of their strongest inputs: the SpsPcells. There are two SpsP cells per side, each innervating all of the ipsilateral PFN ${ }_{d}$ cells, and the vast majority of SpsPoutput synapses (more than $80 \%$ ) target PFN $_{d}$ cells ${ }^{20}$. Because the tuning of SpsP cells to translational optic flow is opposite that of the $\mathrm{PFN}_{\mathrm{d}}$ cells, suggesting inhibition (Extended Data Fig. 4d-f), we optogenetically activated SpsP cells (with csChrimson ${ }^{34}$ ) to reduce the amplitude of the front-facing PFN $_{d}$ sinusoids or vectors. This perturbation drove the PFR bump to be offset by $180^{\circ}$, on average, from the EPGbump (Fig. $5 \mathrm{~m}-\mathrm{p}$ ), consistent with this manipulation effectively shortening the two front-facing vectors (Fig. 5 m ).

## Tuning for speed

If the $h \Delta B$ or PFR bumps were to accurately track the travelling vector (angle + speed) of the fly, rather than just the travelling direction,
we would expect the amplitude of their sinusoidal activity profiles to scale with speed (Extended Data Figs. 7, 8). Indeed, both the PFR cells and the $h \Delta B$ cells showed a measurable increase in bump amplitude with faster speeds of optic flow, but this modulation was focused to frontal-travel directions (Extended Data Fig. 8f-i, v-x). Different speed modulation across different travel directions complicates the interpretation of $h \Delta B$ cells as encoding a full travelling vector, but non-uniform speed tuning across travelling directions could be corrected with additional modulation between the $h \Delta B$ cells and putative downstream path integrators.

## Discussion

Whether mammalian brains have neurons that are tuned to the allocentric travelling direction of an animal as in Drosophila is still unknown. Although a defined population of neurons tuned to travelling direction has yet to be highlighted in mammals ${ }^{35,36}$, such cells could have been missed because their activity would loosely resemble that of the head-direction cells outside a task in which the animal is required to sidestep or walk backwards.

Neurons are often modelled as summing their synaptic inputs, but the heading inputs that PFN cells receive from the EPG system appear to be multiplied by the self-motion (for example, optic flow) input, resulting in an amplitude or gain modulation. Multiplicative or gain-modulated responses appear in classic computational models for how neurons in area 7 a of the primate parietal cortex might implement a coordinate transformation ${ }^{1,4,5}$, alongside similar proposals in mammalian navigation ${ }^{37,38}$. The Drosophila circuit described here strongly resembles aspects of the classic models of the parietal cortex (Extended Data Fig. 9). Units that multiply their inputs are also at the core of the 'attention' mechanism used, for example, in machine-based language processing ${ }^{39}$. Our experimental evidence for input multiplication in a biological network may indicate that real neural circuits have greater potential for computation than is generally appreciated.

We describe a travelling direction signal and how it is built; related results and conclusions appear in a parallel study ${ }^{40}$. The mechanisms that we describe for calculating the travelling direction are robust to left-right rotations of the head (Extended Data Fig.10,Supplementary Text) and to the possibility of the allocentric projection vectors being non-orthogonal (Extended Data Figs. 4-6, Supplementary Text). It is possible that the travelling signal of $h \Delta B$ cells is compared with a goal-travelling direction to drive turns that keep a fly along a desired trajectory ${ }^{9,10}$. Augmented with an appropriate speed signal (or if the fly generally travels forward relative to its body), the $h \Delta B$ signal could also be integrated over time to form a spatial-vector memory via path integration ${ }^{7,28}$ (see Supplementary Text). There are hundreds more PFN cells beyond the $40 \mathrm{PFN}_{\mathrm{d}}$ and $20 \mathrm{PFN}_{\mathrm{v}}$ cells studied here ${ }^{20}$, and thus the central complex could readily convert other angular variables from egocentric to allocentric coordinates via the algorithm described here. Because many sensory, motor and cognitive processes can be formalized in the language of linear algebra and vector spaces, defining a neuronal circuit for vector computation may open the door to better understanding of several previously enigmatic circuits and neuronal activity patterns across multiple nervous systems.

## Online content

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at https://doi.org/10.1038/s41586-021-04067-0.

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## Methods

## Fly husbandry

Flies were raised at $25^{\circ} \mathrm{C}$ with a 12 -h light and $12-\mathrm{h}$ dark cycle. In all experiments, we studied female Drosophila melanogaster that were 2-6 days old. Flies were randomly selected for all of experiments. We excluded flies that appeared unhealthy at the time of tethering as well as flies that did not fly longer than 20 s in flight experiments. This meant excluding fewer than $5 \%$ of flies for most genotypes. However, in the perturbational experiments shown in Fig. 5e-p, many flies flew poorly-perhaps because these genotypes all expressed five to six transgenes that can affect overall health and flight vigour-and we had to exclude approximately $70 \%$ of flies due to poor tethered flight behaviour (that is, would not maintain continuous flight for more than 5 -s bouts). The $30 \%$ of flies tested in these genotypes flew in bouts that ranged from 20 s to many minutes, allowing us to make the necessary EPG-PFR signal comparisons (discussed below). Flies in optogenetic experiments were shielded from green and red light during rearing by placing the fly vials in a box with blue gel filters (Tokyo Blue, Rosco) on the walls. After eclosion, 2 days or more before experiments, we transferred these flies to vials with food that contained 400 $\mu \mathrm{M}$ all-trans-retinal.

## Cell-type acronyms and naming conventions

Each cell type is described in the order of 'names in this paper (in hemibrain v1.1 if different)', 'names used in ref. ${ }^{33}$,' description of acronym', 'references in which cell type is studied or defined' and 'total cell number (in hemibrain v1.1)', separated by em dashes.

EPG-E-PG-ellipsoid body-protocerebral bridge-gall-Lin, C.etal. ${ }^{42}$; Wolff, T. et al. ${ }^{21,33}$; Seelig, J. et al. ${ }^{8}$; Green, J. et al. ${ }^{11}$; Turner-Evans, D. et al. ${ }^{12}-46$

PFR (PFR_a)-P-F-R-protocerebral bridge-fan-shaped body-fan-shaped body-round body-Lin, C. et al. ${ }^{42}$; Wolff, T. et al. ${ }^{21,33}$; Shiozaki, H. et al. ${ }^{13}-29$

PFN $_{v}($ PFNv $)-\mathrm{P}-\mathrm{FN}_{\mathrm{v}-}$ protocerebral bridge-fan-shaped body-nodulus (ventral)-Lin, C. et al. ${ }^{42}$; Wolff, T. et al. ${ }^{21,33}-20$
$\mathrm{PFN}_{\mathrm{d}}($ PFNd $)-\mathrm{P}-\mathrm{FN}_{\mathrm{d}-}$ protocerebral bridge-fan-shaped bodynodulus (dorsal)-Lin, C. et al. ${ }^{42}$; Wolff, T. et al. ${ }^{21,33}-40$
$\mathrm{h} \Delta \mathrm{B}$ (hDeltaB)-not applicable-columnar cell class with lateral projections in layer 3 of the fan-shaped body-not applicable-19

LNO1-L-N-lateral accessory lobe-nodulus-Wolff, T. et al. ${ }^{33}-4$
LNO2-not applicable-lateral accessory lobe-nodulus-not appli-cable-2

SpsP-Sps-P-superior posterior slope-protocerebral bridge-Wolff, T. et al. ${ }^{21,33}-4$
$\Delta 7$ (Delta7)-Delta7-skipping 7 glomeruli in the protocerebral bridge between two output areas-Lin, C. et al. ${ }^{42}$; Wolff, T. et al. ${ }^{21,33}$; Turner-Evans, D. et al. ${ }^{43}-42$

PEN1 (PEN_a)-P-EN1-protocerebral bridge-ellipsoid body-nodu-lus-Lin, C. et al. ${ }^{42}$; Wolff, T. et al. ${ }^{21,33}$; Green, J. et al. ${ }^{11}$; Turner-Evans, D. et al. ${ }^{12}-20$

PEN2 (PEN_b) - P-EN2-protocerebral bridge-ellipsoid body-nodu-lus-Green, J.et al. ${ }^{11}-22$

## Fly genotypes

For simultaneous imaging of EPG and $h \Delta B$ cells, in Fig. 1 and Extended Data Fig. 1, we used + (Canton S, Heisenberg Laboratory); UAS-sytGCaMP7f/72B05-AD (Bloomington Drosophila Stock Center, BDSC \#70939); 60D05-Gal4 (BDSC \#39247)/ VT055827-DBD (BDSC \#71851) flies. We created the sytGCaMP7f construct by linking the GCaMP7f and Drosophila synaptotagmin 1-coding sequences using a 33GS linker. We then used this construct to generate transgenic flies by PhiC31-based integration into the attp40 site, performed by BestGene.

For simultaneous imaging of EPG and PFN $_{d}$ cells, in Fig. 3 e and Extended Data Figs. 2a, b, 3h (top row), we used +; +; 60D05-LexA
(BDSC \#52867)/+; LexAop-GCaMP6m,UAS-jRGECO1a (BDSC \#44588 \& \#63794)/47E04-Gal4(BDSC \#50311) flies.

For simultaneous imaging of EPG and PFN $\mathrm{N}_{\mathrm{v}}$ cells, in Fig. 3c, d and Extended Data Figs. 2c-f, 3e (left column), 3h (middle row), we used +;60D05-LexA/+;LexAop-GCaMP6m,UAS-jRGECO1a/VT063307-Gal4 (Vienna Drosophila Resource Center, CDRC) flies.

For simultaneous imaging of EPG and PFR cells, in Fig. 5f-h, we used +; 60D05-LexA, LexAop-GCaMP6f (BDSC \#44277)/37G12-LexA (BDSC \#52765);UAS-Kir2.1(Leslie Vosshall Laboratory)/VT063307-Gal4 flies and +; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA; UAS-Kir2.1/67D09-Gal4 (BDSC \#49618) flies for the experimental groups. For the control groups, we used +; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA;UAS-Kir2.1/empty-Gal4 (BDSC \#68384) flies, +; 60D05-LexA,LexAop-GCaMP6f/37G12-LexA;VT063307-Gal4/ empty-Gal4 flies, and +; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA; 67D09-Gal4/empty-Gal4 flies.

In Fig. $5 \mathrm{j}-\mathrm{I}$, we used + ; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA; UAS-GtACR1-EYFP (Adam Claridge-Chang Laboratory)/VT064880-Gal4 (CDRC) flies and +; 60D05-LexA, LexAop-GCaMP6f /37G12-LexA; UAS-GtACR1-EYFP/48A09-Gal4 (BDSC \#50342) flies for the experimental groups. For the control groups, we used +; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA; UAS-GtACR1-EYFP/empty-Gal4 flies, +; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA; VT064880-Gal4/ empty-Gal4 flies, and +; 60D05-LexA, LexAop-GCaMP6f/37G12-LexA; 48A09-Gal4/empty-Gal4 flies.

In Fig. 5n-p, we used UAS-CsChrimson-mVenus (BDSC \#55134)/+; 60D05-LexA, LexAop-GCaMP6f/VT019012-AD;VT005534-LexA (Barry Dickson Laboratory)/72C10-DBD (Janelia FlyLight Split-Gal4 Driver Collection, FlyLight SS52267) flies for the experimental groups. For the control groups, we used UAS-CsChrimson-mVenus; 60D05-LexA, LexAop-GCaMP6f/empty-LexA (BDSC \#77691); VT005534-LexA/ empty-Gal4 flies, and + (Canton-S); 60D05-LexA, LexAop-GCaMP6f/ VT019012-AD;VT005534-LexA (Barry Dickson Laboratory)/72C10-DBD flies.

In Extended Data Figs. 1i, j, 7b-e, we used +; UAS-GCaMP7f (BDSC \#80906)/+; 60D05-Gal4/37G12-Gal4 (BDSC \#49967) flies.

In Extended Data Fig. 3h (bottom row), we used +; 60D05-LexA/+; LexAop-GCaMP6m, UAS-jRGECO1a/37G12-Gal4 flies.

In Extended Data Fig. 7g-j, we used +; UAS-GCaMP6m (BDSC \#42748)/+; 60D05-Gal4/37G12-Gal4 flies.

In Extended Data Fig. 7l-o, we used UAS-CsChrimson-mVenus/+; 60D05-LexA, LexAop-GCaMP6f/ 26A03-AD; VT005534-LexA/54A05-DBD (FlyLight OL0046B) flies.

For imaging single-cell types, in Fig. 3 j -land Extended Data Figs. $4 \mathrm{e}-$ i, n, o, 5g, i, 8a-c, j, k, r, s, we used +; 15E01-AD (BDSC \#70558)/+; UAS-GCaMP7f (BDSC \#79031)/47E04-DBD (BDSC \#70366) flies for PFN ${ }_{d}$ cells.

In Fig. 3m-o and Extended Data Figs. 4b, c, i, j, k, 5h, i, 8d, e, l, m, t, u, we used +; +; UAS-GCaMP7f/VT066307-Gal4 flies for PFN cells.

In Fig. 3p-r and Extended Data Fig. 5e, f, we used +; +; UAS-GCaMP7f/60D05-Gal4 flies for EPG cells.

In Fig. 5b-d, we used pJFRC99-20XUAS-IVS-Syn21-Shibire-ts1-p10 inserted at VK00005 (referred to here as UAS-shibire ${ }^{\text {ts }}$ ) to drive shibi$r e^{\text {ts }}$ (Rubin Laboratory). We used +; 37G12-LexA/LexAop-sytGCaMP6s (Vanessa Ruta Laboratory); 60D05-Gal4/UAS-shibire ${ }^{\text {ts }}$ flies for the experimental group. For the control groups, we used $+; 37 \mathrm{G} 12-\mathrm{LexA} /$ LexAop-sytGCaMP6s; 60D05-Gal4/empty-Gal4 flies and +;37G12-LexA/ LexAop-sytGCaMP6s; UAS-shibirets/empty-Gal4 flies.

In Extended Data Fig. 1e, we used +; +/72B05-AD; UAS-GCaMP7f/ VT055827-DBD flies for $h \Delta \mathrm{~B}$ cells.

InExtended DataFigs.1f, 8f, h, i, n, p,q,v,x, we used+;UAS-sytGCaMP7f /72B05-AD; +/VT055827-DBD flies for $h \Delta B$ cells.

In Extended Data Fig. 1i, j, we used +; +; UAS-GCaMP6m (BDSC \#42750)/60D05-Gal4 flies for EPG cells.

In Extended Data Fig. 4b, c, i, l, m, we used +; VT020742-AD/+; UAS-GCaMP7f/VT017270-DBD (FlyLightSS47398) flies for LNO1 cells.

In Extended Data Fig. 4e, f, i, p, q, we used +; VT019012-AD/+; UAS-GCaMP7f/72C10-DBD (FlyLight SS52267) flies for SpsP cells.

InExtended Data Fig. 8g,o, w, we used+;+;UAS-GCaMP7f/37G12-Gal4 flies for PFR cells.

## Distinguishing PFR subtypes in Gal4 lines

The hemibrain connectome ${ }^{20}$ defines two subtypes of PFR cells ${ }^{21}$ :PFR_a cells and PFR_b cells, which differ in the details of their projections and connectivity in the fan-shaped body. Both PFR_a cells and PFR_b cells are columnar cells that project from the protocerebral bridge to the fan-shaped body. On the basis of the connectome ${ }^{20}$, PFR_a cells and PFR_b cells that innervate four of the bridge glomeruli project to the fan-shaped body in the same way, and PFR_a cells and PFR_b cells that innervate 12 other bridge glomeruli project to the fan-shaped body in a slightly different way. We used this fact to interrogate the MultiColor Flip-Out (MCFO) single-cell anatomical dataset ${ }^{44}$ from the FlyLight Generation 1 MCFO Collection to quantify the ratio of each PFR subtype in the two Gal4 driver lines that we used for targeting transgenes to PFR cells. For the driver line 37G12, we found that 10 out of 13 cells in the MCFO data had an innervation pattern that is consistent with PFR_a but not PFR_b, and the innervation patterns of the other three cells were indistinguishable between the two subtypes. For the driver line VT005534, we found that two out of three cells in the MCFO data were consistent with them being PFR_a cells and not PFR_b cells, and the third cell had an anatomy that did not allow us to distinguish between subtypes. We observed no cell whose projection pattern matched PFR_b but not PFR_a. These results argue that the majority of the PFR cells targeted by the two Gal4 driver lines that we used are PFR_a cells.

## Fly preparation and setup

As described previously, we glued flies to a custom stage for imaging during flight ${ }^{24}$ and to a slightly different custom stage-which allows for more emission light to be collected by the objective-for imaging during walking ${ }^{11}$. Dissection and imaging protocols followed previous studies ${ }^{11}$.For tethered flight experiments, each fly was illuminated with $850-n m$ LEDs with two fibre optics from behind ${ }^{24}$. A Prosilica GE680 camera attached to a fixed-focus Infinistix lens ( $94-\mathrm{mm}$ working distance, $\times 1.0$ magnification; Infinity) imaged the wing-stroke envelope of a fly at $80-100 \mathrm{~Hz}$. The lens also held an OD4 $875-\mathrm{nm}$ shortpass filter (Edmund Optics) to block the two-photon excitation laser ( 925 nm ). This camera was connected to a computer that tracked the left and right wing beat amplitude (L-R WBA) of the fly with custom software developed by A. Straw (https://github.com/motmot/strokelitude) ${ }^{24}$. Two analogue voltages were output in real time by this software and the difference between the L-R WBA was used to control the angular position of the bright dot on the LED arena in the closed-loop experiments (described below). For tethered walking experiments, we followed protocols previously described ${ }^{11}$.

## LED arena and visual stimuli

We used a cylindrical LED arena display system ${ }^{45}$ with blue ( 465 nm ) LEDs (BM-10B88MD, Betlux Electronics). The arena was $81^{\circ}$ high and wrapped around $270^{\circ}$ of the azimuth, with each pixel subtending approximately $1.875^{\circ}$. To minimize blue light from the LEDs inducing noise in the photomultiplier tubes of the microscope, we reduced the LED intensities, over most of the arena, by covering the LEDs with five sheets of bluegel (Tokyo Blue, Rosco). Over the 16 pixels at the very top of the arena (top approximately $30^{\circ}$ ), we only placed two gel sheets, so that the closed-loop dot at the top of the arena was brighter than the optic flow dots at the bottom, which may have helped to promote that the fly interpret the bright blue dot as a celestial cue (like the sun) and the optic flow at the bottom as ground or side motion. During flight experiments, we held the arena in an approximately $66^{\circ}$ pitched-back
position, so that the vertical and horizontal axes of the LED matched the major ommatidial axes of the eye ${ }^{27}$. During walking experiments, we typically presented a tall vertical bar-rather than a small dot-in closed loop and we tilted the arena by only approximately $30^{\circ}$ because the ball physically occludes the ventral visual field and a shallower arena tilt made it more likely that the fly could see the closed-loop stimulus over all $270^{\circ}$ of the azimuthal positions that it could take.

We adapted past approaches for generating optic flow (starfield) stimuli ${ }^{26,27}$. In brief, we populated a virtual 3D world with 45 , randomly positioned spheres ( 2.3 cm in diameter) per cubic metre. The spheres were bright on a dark background. We only rendered spheres that were within 2 m of the fly because spheres further away contributed only minimally to the observed motion and, if rendered, would have overpopulated the visual field with bright pixels. We then calculated the angular projection of each sphere onto the head of the fly and used this projection to determine the pattern to display on the LED arena on each frame. To prevent the size of each sphere from being infinitely large as it approached the fly, we limited each diameter of the sphere on the arena to be no larger than $7.5^{\circ}$. The starfield extended from 4 pixels (about $8^{\circ}$ ) above to 20 pixels (about $40^{\circ}$ ) below the midline of the arena. In all experiments that used the open-loop optic flow (Figs.1,3j-r, Extended Data Figs. 1e-m, 2e, f, 4b-i, 5, 7b-e, 8), the position of optic flow was updated at a frame rate of 25 Hz . (Note that the LED refresh rate was at least $372 \mathrm{~Hz}^{45}$.) To simulate the optic flow that a fly would experience when it is translating through 3D space, we moved a virtual fly in the desired direction(s) through the virtual world and displayed the resultant pattern of optic flow on the arena. We used a translation speed of $35 \mathrm{~cm} / \mathrm{s}$ in all experiments, except those in Extended Data Figs. 7 and 8 where we tested multiple speeds as indicated (ranging from 8.75 to $70 \mathrm{~cm} / \mathrm{s}$ ). Although we report on the translation speed of the virtual fly in metric units, the optic flow experienced by insects translating at $35 \mathrm{~cm} / \mathrm{s}$ will vary dramatically depending on the clutter of the local environment. We believe that the optic flow stimuli that we presented in our study are potentially in an ethologically relevant range because (1) our virtual fly translated at speeds that bracket observed flight speeds in natural environments ${ }^{46-48}$ and (2) cells sensitive to optic flow reported here responded with progressively increasing activity to the presented stimuli/speeds rather than immediately saturating or showing no detectable responses (for example, Extended Data Fig. 8). That said, our stimuli simulated a dense visual environment and it will be important to test our results in the context of reduced visual clutter in future work.

In flight experiments with a closed-loop dot (Figs.1,3c-e, Extended Data Figs. $1 \mathrm{~g}-\mathrm{m}, 2,3 \mathrm{e}, \mathrm{h}, 4 \mathrm{~b}-\mathrm{f}, \mathrm{i}, 7 \mathrm{~b}-\mathrm{e}$ ), the dot subtended $3.75^{\circ}$ by $3.75^{\circ}$ and was located approximately $34^{\circ}$ above the midline of the arena. We used the difference of the L-R WBAs to control the azimuthal velocity of the bright dot on the LED arena. That is, when the R WBA is smaller than the amplitude WBA (indicating that the fly is attempting to turn to the right), the dot rotated to the left, and vice versa. The negative-feedback closed-loop gain was set to $7.3^{\circ}$ per second per degree change in L-R WBA. In initial experiments, we set the gain to $5.5^{\circ}$ per second and we have lumped those data in with the data at $7.3^{\circ}$ per second in Fig. 1f and Extended Data Fig. 1g-m because we did not observe obvious differences in any of our analyses. In closed-loop walking experiments with a visual stimulus (Fig. 5b-d, Extended Data Fig. 7f-o), the bright bar was $11.25^{\circ}$ wide and spanned the entire height of the arena. We directly linked the azimuthal position of the bright bar on the LED arena to the azimuthal position of the ball under the fly using Fictrac ${ }^{11,49}$, as previously described. This closed loop set up mimics the visual experience of a fly with a bright cue at visual infinity, like the sun. We did not provide translational stimuli in closed loop in this paper.

## Calcium imaging

We used a two-photon microscope with a moveable objective (Ultima IV, Bruker). The two-photon laser (Chameleon Ultra II Ti:Sapphire,

Coherent) was tuned to $1,000-1,010 \mathrm{~nm}$ for simultaneous imaging of GCaMP6m and jRGECO1a (Fig. 3c-e, Extended Data Fig. 2), and was otherwise tuned to 925 nm in all of the other imaging experiments. We used a $\times 40 / 0.8$ NA objective (Olympus) or $\times 16 / 0.8$ NA objective (Nikon) for all imaging experiments. The laser intensity at the back aperture was $30-40 \mathrm{~mW}$ for walking experiments and $40-80 \mathrm{~mW}$ for flight experiments. Because of light loss through the objective and the fact that the platform to which the fly was attached blocks roughly half the light from reaching the fly, we estimated an illumination intensity, at the fly, of approximately $16-32 \mathrm{~mW}$ for flight experiments. In walking experiments, the platform to which we attached the fly blocks less light and we expected an illumination intensity, at the fly, of approximately $24-32 \mathrm{~mW}$. A $575-\mathrm{nm}$ dichroic split the emission light. A 490-560-nm bandpass filter (Chroma) was used for the green channel PMT and a 590-650-nm bandpass filter (Chroma) was used for the red channel PMT. We recorded all imaging data using three to five $z$-slices, with a Piezo objective mover (Bruker Ext. Range Piezo), at a volumetric rate of $4-10 \mathrm{~Hz}$. We perfused the brain with extracellular saline composed of (in mM ) $103 \mathrm{NaCl}, 3 \mathrm{KCl}, 5 \mathrm{~N}$-Tris(hydroxymethyl) methyl-2-aminoethanesulfonic acid (TES), 10 trehalose, 10 glucose, 2 sucrose, $26 \mathrm{NaHCO}_{3}, 1 \mathrm{NaH}_{2} \mathrm{PO}_{4}, 1.5 \mathrm{CaCl}_{2}, 4 \mathrm{MgCl}_{2}$, and bubbled with $95 \%$ $\mathrm{O}_{2} / 5 \% \mathrm{CO}_{2}$. The saline had a pH of approximately 7.3 and an osmolarity of approximately 280 mOsm . We controlled the temperature of the bath by flowing the saline through a Peltier device and measured the temperature of the bath with a thermistor (CL-100, Warner Instruments).

## Optogenetic stimulation

In the optogenetic experiments in Fig. 5j-I, we used the two-photon laser tuned to 925 nm to excite GtACR1, with the same scanning light being used to excite GCaMP. To excite CsChrimson in the optogenetic experiments (Fig. 5n-p, Extended Data Fig. $7 \mathrm{k}-\mathrm{o}$ ), we focused a 617 -nm laser (M617F2, Thorlabs) on to the front, middle of the head of the fly with a custom lens set (M15L01 and MAP10100100-A, Thorlabs). We placed two bandpass filters (et $620 / 60 \mathrm{~m}$, Chroma) in the two-photon emission path of the microscope to minimize any of the optogenetic light being measured by the photomultiplier tubes. In flight experiments (Fig. 5n-p), we used pulse-width modulation at 490 Hz (Arduino Mega board) with a duty cycle of 0.8 to change the intensity of the $617-\mathrm{nm}$ laser. We measured the intensity of the laser at the head of the fly to be $20.8 \mu \mathrm{~W}$. In the experiments in which we triggered backwards walking via activation of csChrimson (Extended Data Fig. $7 \mathrm{k}-\mathrm{o}$ ) in lobula columnar neurons, the duty cycle of the red light was 0.7 and the effective light intensity was $18.2 \mu \mathrm{~W}$.

In Fig. 5 j -I, for two main reasons, rather than directly exciting PFN ${ }_{v}$ cells, we optogenetically inhibited the LNO1 inputs to PFN $_{v}$ cells. First, $\left[\mathrm{Ca}^{2+}\right]$ imaging revealed opposite responses to our optic flow stimuli in the two cell types (Extended Data Fig. 4a-c), arguing for a sign-inverting synapse between them. Second, we tried optogenetically activating the PFN $_{v}$ cells directly (data not shown), which yielded more variable movements of the PFR bump. We believe that stimulating LNO1 cells yielded more consistent effects on the PFR bump because there are only two LNO1 cells per side and they synapse uniformly on all PFN $_{v}$ cells within a tiny neuropil (the second layer of the nodulus) on their side ${ }^{20}$. The majority of the synaptic output of LNO1 cells goes to PFN $_{v}$ cells in the nodulus, with each LNO1 cell on average forming approximately 655 synapses on $\mathrm{PFN}_{\mathrm{v}}$ cells ${ }^{20}$. Stimulating GtACR1 in a small volume probably made homogeneous activation of the $\mathrm{PFN}_{\mathrm{v}}$ population more feasible.

Similarly, in Fig. $5 \mathrm{~m}-$ p, rather than directly silencing PFN $_{d}$ cells, we optogenetically excited SpsP cells to inhibit PFN $_{d}$ cells. Exciting SpsP cells was likely to be an effective way to inhibit PFN $_{d}$ cells for two reasons. First, $\left[\mathrm{Ca}^{2+}\right]$ imaging revealed sign-inverted responses to our optic flow stimuli in the two cell types (Extended Data Fig. 4d-h), arguing for sign-inverting synapses existing between them. Second, approximately $80 \%$ of SpsP synapses are to PFN $_{d}$ cells in the bridge, with each SpsP cell forming approximately 563 synapses on $\mathrm{PFN}_{\mathrm{d}}$ cells ${ }^{20}$, on average. In
addition, stimulating CsChrimson in four copies of SpsP cells probably makes homogeneous inhibition of the $\mathrm{PFN}_{\mathrm{d}}$ population more feasible than via direct optogenetic inhibition of the PFN $_{d}$ cells (where some $\mathrm{PFN}_{\mathrm{d}}$ cells might be more inhibited than others depending on the expression level of the opsin and the light delivery details).

## Immunohistochemistry

Dissection of fly brains, fixation and staining of neuropil and neurons were performed as previously described ${ }^{11}$. For primary antibodies, we used mouse anti-Brp (nc82, DSHB) at 1:10 and chicken anti-GFP (600-901-215, Rockland) at 1:1,000. For secondary antibodies, we used Alexa Fluor 488 goat anti-chicken (A11039, Invitrogen) at 1:800 and Alexa Fluor 633 goat anti-mouse (A21052, Invitrogen) at 1:400.

## Data analysis

Data acquisition and alignment. All data were digitized by a Digidata 1440 (Molecular Devices) at 10 kHz , except for the two-photon images, which were acquired using PrairieView (Bruker) at varying frequencies and saved as tiff files for later analysis. We used the frame triggers associated with our imaging frames (from Prairie View), recorded on Digidata 1440 , to carefully align behavioural measurements with $\left[\mathrm{Ca}^{2+}\right]$ imaging measurements.

Experimental structure. For Fig. 1d-f and Extended Data Fig. 1g-m, each fly performed tethered flight while in control of a bright dot in closed loop. Each recording was split into two segments, where we first presented a static starfield for 90 s , followed by progressive optic flow for 90 s .

For Fig.1g-i, we presented each fly with a closed-loop dot throughout. We presented four blocks of six translational optic flow stimuli (six translational plus two rotational) per block, shown in a pseudorandom order. Each $4-s$ optic flow stimulus was preceded and followed by 4 s of optic flow that mimics forward travel, which ensured that the EPG and $h \Delta B$ (or PFR) bumps were aligned-for a stable 'baseline'-before and after each tested optic flow stimulus. We presented 4 s of a static starfield between each repetition of the above three patterns. We used the same protocol for Extended Data Fig. $7 \mathrm{~b}-\mathrm{e}$ ( $35 \mathrm{~cm} / \mathrm{s}$ column), but we presented two yaw-rotation optic flow stimuli to each block, whose data we did not analyse for this paper.

For Fig. 3c-e and Extended Data Figs. 2a-d, 3e, h, each fly was presented with a closed-loop dot and static starfield throughout the recording. Recording durations ranged from 1 to 4 min .

For Fig. 3 j -r and Extended Data Figs. $4 \mathrm{e}-\mathrm{h}\left(\mathrm{PFN}_{\mathrm{d}}\right.$ rows), $\mathrm{i}\left(\mathrm{PFN}_{\mathrm{d}}\right.$ cells in the noduli, $\mathrm{PFN}_{\mathrm{d}}$ cells and $\mathrm{PFN}_{\mathrm{v}}$ cells in the bridge), 5,8 , we did not have a closed-loop dot. We presented four blocks of 24 stimuli ( 6 translational directions at 4 different speeds) per block, shown in a pseudorandom order. Each stimulus was preceded by 1.2 s of a static starfield, followed by 4 s of optic flow at different directions, and ending with 1.2 s of a static starfield.

For Fig. 5b-d, each fly was presented with a tall bright bar in a closed loop throughout. EPG $>$ Shibire ${ }^{\text {ts }}$ flies experienced both $25^{\circ} \mathrm{C}$ and $34^{\circ} \mathrm{C}$ trials in these experiments and we waited approximately 5 min after the bath temperature reached $34{ }^{\circ} \mathrm{C}$ before imaging in the EPG-silenced condition so as to increase the likelihood of thorough vesicle depletion. Recording durations ranged from 6 to 8 min .

For Fig. $5 \mathbf{f}-\mathrm{h}, \mathrm{j}-1$, flies performed tethered flight in the context of a dark (unlit) visual display. We recorded data for approximately $1-4 \mathrm{~min}$ and if the fly was flying robustly, we collected a second dataset from the same fly.

For Fig. $5 \mathrm{n}-\mathrm{p}$, flies performed tethered flight in the context of a dark (unlit) visual display. We recorded data for 2-6 min , and if the fly was flying robustly, we collected a second dataset from the same fly. We presented 12 -s red-light pulses to activate csChrimson every roughly 20 s .

For Extended Data Figs. 1e, f, 4b, c, e,f (SpsP rows) and $\mathbf{i}\left(\right.$ PFN $_{v}$ cells in the noduli, SpsP cells and LNO1 cells), we presented each fly with a
closed-loop dot throughout. We presented four blocks of eight optic flow stimuli (six translational plus two rotational) per block, shown in a pseudorandom order. Each optic flow stimulus was preceded by 4 s of a static starfield, followed by 4 s of optic flow at different directions, and ending with 4 s of static starfield.

For Extended Data Fig. 1i, j (EPG > GCaMP6m walking data), each fly was walking in the dark for the first 2.5 min of the recording and was presented with a tall bright bar in closed loop for the second 2.5 min of the recording. We recorded data for 5 min , with up to three $5-\mathrm{min}$ datasets collected per fly.

For Extended Data Figs. $1 \mathrm{n}-\mathrm{p}, 4 \mathrm{j}-\mathrm{q}$, each fly was walking in the dark. We recorded data for 5-10 min, with up to three 10-min datasets collected per fly.

For Extended Data Fig. 2e,f, we presented each fly with a closed-loop dot throughout. We presented four blocks of three translational optic flow per block, shown in a pseudorandom order. Each stimulus was preceded by 1.2 s of a static starfield and 4 s of translational optic flow simulating forward travel, followed by 4 s of optic flow at different directions, and ending with 4 s of optic flow simulating forward travel.

For Extended Data Fig. 7d, e ( $17.5 \mathrm{~cm} / \mathrm{s}$ and $70 \mathrm{~cm} / \mathrm{s}$ columns), we presented each fly with a closed-loop dot throughout. We presented 3 blocks of 18 stimuli per block ( 6 translational directions at 3 different speeds), shown in a pseudorandom order. Each stimulus was preceded by 1.2 s of a static starfield and 4 s of translational optic flow simulating forward travel, followed by 4 s of optic flow at different directions, and ending with a 4 s of optic flow simulating forward travel.

For Extended Data Fig. $7 \mathrm{f}-\mathrm{j}$, each fly was presented with a tall bright bar in closed loop for the first 5 min of the recording and was walking in the dark for the second 5 min of the recording. We recorded data for 10 min , with up to three $10-\mathrm{min}$ datasets collected per fly.

For Extended Data Fig. 7k-o, each fly was presented with a tall bright bar in closed loop throughout. We recorded data for 7-10 min, with up to three datasets collected per fly. We presented 4 -s red-light pulses to activate csChrimson every $1-3 \mathrm{~min}$.

Image registration. Before quantifying fluorescence intensities, imaging frames were registered in Python by translating each frame in the $x$ and $y$ plane to best match the time-averaged frame for each $z$-plane. Multiple recordings from the same fly were registered to the same time-averaged template if the positional shift between recordings was small.

Defining regions of interest. To analyse calcium imaging data, we defined regions of interest (ROIs) in Fiji and Python for each glomerulus (protocerebral bridge), wedge (ellipsoid body) or column (fan-shaped body). For the bridge data, we defined ROIs by manually delineating each glomerulus from the registered time-averaged image of each $z$-plane (Fig. 2, Extended Data Figs. 2, 3, 4e-h PFN ${ }_{d}$ row, 4 i PFN ${ }_{d}$ cells and $\mathrm{PFN}_{\mathrm{v}}$ cells in the bridge, $4 \mathrm{j}-\mathrm{k}, 4 \mathrm{n}-\mathrm{o}, 5,8 \mathrm{a}-\mathrm{e}, \mathrm{j}-\mathrm{m}, \mathrm{r}-\mathrm{u}$ ), as previously described ${ }^{11}$. Because single SpsP neurons innervate the entire left or right side of the protocerebral bridge (Extended Data Fig. 4e, f (SpsP row), $p-q$ ), when imaging them, we treated the entire left bridge as one ROI and the entire right bridge as another. When imaging PFN cells or LNO1 cells in the noduli (Extended Data Fig. 4b, c, i, l-m), we treated the entire left nodulus as one ROI and the entire right nodulus as another.

For ellipsoid body imaging (Figs. 1, 5, Extended Data Figs. 1, 7), we defined ROIs by first outlining the region of each $z$-slice that corresponded to the ellipsoid body. We then radially subdivided the ellipsoid body into 16 equal wedges radiating from a manually defined centre, as previously described ${ }^{8}$.For fan-shaped body imaging (Figs.1,5, Extended Data Figs. 1, 7, $8 f-i, n-q, v-x)$, we defined ROIs by first outlining the region in each $z$-slice that corresponded to the fan-shaped body. We then defined two boundary lines delineating the left and right edges of the fan-shaped body. When these two edge lines were extended down, they metatan intersection point beneath the fan-shapedbody. We subdivided
the angle generated by thus intersecting the two fan-shaped body edges-which corresponds to the overall angular width of the fan-shape d body region-into 16 , equally spaced, angular subdivisions radi ating from the intersection point. We assigned pixels to one of the 16 fan-shaped body columns based on the pixel needing to (1) reside in the overall fan-shaped region and (2) reside in the radiating angular region associated with the column of interest.

Calculating fluorescence intensities. We used ROIs, defined above, as the unit for calculating fluorescent intensities (see above). If pixels from multiple $z$-planes corresponded to the same ROI (for example, the same column in the fan-shaped body), as defined above, then we grouped pixels from the multiple $z$-planes together for generating a single fluorescence signal for that ROI. For each ROI, we calculated the mean pixel value at each time point and then used three different methods for normalization. We call the first method $\Delta F / F_{0}$ (Fig. 3d, e, j-r, Extended Data Figs. 1e, f (phase-nulled bump shape), 3, 4i ( $\mathrm{PFN}_{\mathrm{d}}$ and PFN ${ }_{d}$ cells in the bridge), $\mathrm{j}, \mathrm{l}, \mathrm{n}, \mathrm{p}, 5,8$ ), where $F_{0}$ is the mean of the lowest $5 \%$ of raw fluorescence values in a given ROI over time and $\Delta F$ is $F-F_{0}$. We call the second method normalized $\Delta F / F_{0}$ (Figs. 1, 3c, 5, Extended Data Figs. 1e, f (heatmap), $\mathrm{g}-\mathrm{p}, 2,7$ ), which uses this equation: $\left(F-F_{0}\right) /$ $\left(F_{\max }-F_{0}\right)$, where $F_{0}$ was still the mean of the lowest $5 \%$ of raw fluorescence values in a given ROI over time and $F_{\max }$ was defined as the mean of the top $3 \%$ of raw values in a given ROI over time. This metric normalizes the fluorescence intensity of each glomerulus, wedge or column ROI to its own minimum and maximum and makes the assumption that each column, wedge or glomerulus has the same dynamic range as the others in the structure, with intensity differences arising from technical variation in the expression of the indicator or from the number of cells expressing the indicator within a column or wedge. We used this method to estimate the phase of heading or travelling signals where it seemed reasonable to make the above assumption for accurately estimating the phase of a bump in a structure. We call the third method $z$-score normalized $\Delta F / F_{0}$ (Extended Data Figs. 4b-h, i (signals in the noduli and SpsP cells), $\mathrm{k}, \mathrm{m}, \mathrm{o}, \mathrm{q}$ ) where we show how many standard deviations each time point's signal is away from the mean. We calculated the signal as $\Delta F / F_{0}$ and then we z-normalized the signal. We used this method to estimate the asymmetry of neural responses to optic flow in the bridge or noduli, where it seemed sensible to normalize the baseline asymmetry (when there are no visual stimuli) to zero. Importantly, none of the conclusions presented in this paper rely on the normalization method used for visualizing and analysing the data.

Calculating the phase of bumps and aligning phase across structures. To calculate the phase of the joint movement of the calcium bumps in the left and right protocerebral bridge, we first converted the raw bridge signal into a 16-18-point vector, with each glomerulus' signal normalized as described above. Then, for each time point, we took a Fourier transform of this vector and used the phase at a period of eight glomeruli to define the phase of the bumps, as previously described ${ }^{11}$. To calculate phase of the EPG bump in the ellipsoid body, we computed the population vector average of the 16-point activity vector, as previously described ${ }^{8}$. To calculate the phase of the $h \Delta B$ and PFR bumps in the fan-shaped body, we computed the population vector average like in the ellipsoid body, using the following mapping of fan-shaped body columns to ellipsoid body wedges. The leftmost column in the fan-shaped body corresponded to the wedge at the very bottom of the ellipsoid body, just to the left of the vertical bisecting line; the rightmost column in the fan-shaped body corresponded to the wedge at the very bottom of the ellipsoid body, just to the right of the vertical bisecting line. We then numbered the fan-shaped body columns 1 to 16, from left to right, just like we numbered the ellipsoid body wedges clockwise around that structure ${ }^{8}$. This mapping is meant to match the expected mapping of signals from anatomy, described previously ${ }^{21}$, and as further discussed immediately below.

To align the EPG phase in the ellipsoid body with the $h \Delta B$ phase or the PFR phase in the fan-shaped body, we used the approach just described (Figs.1,5, Extended Data Figs.1,7). To align the EPG and PFN ${ }_{d}$ and PFN ${ }_{v}$ phase signals in the protocerebral bridge (Fig. 3c-e, Extended Data Figs. 2,3), we used the fact that these neuron populations commonly innervate 14 of 18 glomeruli in the protocerebral bridge, which allows for an obvious alignment anchor, as done previously ${ }^{11}$. To calculate the offset between the phase of neural bumps and the angular position of a cue (bright bar or dot) rotating in angular closed loop on our visual display, we computed the circular mean of the difference between the neural phase and the cue angle during the time points when the cue was visible to the fly. We used this difference to provide a constant (non-time-varying) offset to the neural phase signal such that the difference between the phase and cue angles was minimized across the whole measurement window of relevance. This approach is needed because of the past finding that phase signals in the central complex have variable offset angles to the angular position of cues in the external world across flies (and sometimes across time within a fly) ${ }^{8,11}$. To calculate the phase offset between neural bump position and visual cue angle, we did not analyse time points when the fly was not flying in all of our flight experiments (Figs. 1-5, Extended Data Figs. 1-5, 7, 8 except panels $8 \mathrm{~h}, \mathrm{p}, \mathrm{x}$ ) nor did we analyse time points when the fly was standing in walking experiments (Fig. 5c, d, Extended Data Fig. 10, p). For a fly to be detected as standing, the forward speed needed to be less than $2 \mathrm{~mm} / \mathrm{s}$, the sideslip speed less than $2 \mathrm{~mm} / \mathrm{s}$, and the turning speed less than $30^{\circ} / \mathrm{s}$. We also excluded the first 10 s of each period in Fig. If to minimize the impact of a changing visual stimulus on the offset estimate.

Comparing data acquired at different sampling rates or with a time lag. When comparing two-photon imaging data (collected at approximately $5-10 \mathrm{~Hz}$ ) and behavioural (flight turns or ball walking) data (collected at $50-100 \mathrm{~Hz}$ ) for the same fly, we subsampled the behavioural data to the imaging frame rate by computing the mean of behavioural signals during the time window in which each imaging data point was collected (Figs.1f, 5b-d, Extended Data Figs.1g-j, 4j-q, 7m-o), as previously described ${ }^{11}$.

Although we collected both the EPG signal in the ellipsoid body and the $h \Delta B$ (or PFR) signal in the fan-shaped body at the same frame rate, the precise time points in which these two signals were sampled were slightly different because the piezo drive that moves the objective had to travel from the higher fan-shaped body $z$-levels to the lower ellipsoid body $z$-levels. Importantly, each $z$-slice in a such volumetric time series was associated with its own trigger time and we could use this fact to more accurately align the fan-shaped body and ellipsoid body phase signals to each other. Specifically, when comparing EPG and $h \Delta B$ (or PFR) bump positions over time, we first created a common 10 Hz ( $100-\mathrm{ms}$ interval) time base. We then assigned phase estimates from the two structures or cell types to this common time base by linearly interpolating each time series (using its specific $z$-slice triggers), and we used these interpolated time points, on the common time base, for calculating the phase differences between EPG and $h \Delta B$ cells, or EPG and PFR cells (Fig. 1g-i, Extended Data Figs. 1p, 7c-e, m-o). For the histograms and other analyses in Figs. $1 \mathrm{~g}, 5 \mathrm{~g}, \mathrm{~h}, \mathrm{k}, \mathrm{l}, \mathrm{o}, \mathrm{p}$, Extended Data Figs. 11, m, n-p,7g-j, we simply subtracted the EPG phase and the $h \Delta B$ phase or the PFR phase measured in each frame, without temporal interpolation. None of our conclusions are altered if we change the interpolation interval or do not interpolate.

Sideslip and backward walking analysis. In Extended Data Fig. 1n-p, we detected time segments where flies walked in three different, broad travelling directions (forward, rightward and leftward). Forward walking segments were defined by the flies having a forward velocity between +3 and $+10 \mathrm{~mm} / \mathrm{s}$ and a sideslip velocity between -2 and $+2 \mathrm{~mm} / \mathrm{s}$. Sideward walking segments were defined by the flies having a forward
walking velocity between +2 and $-10 \mathrm{~mm} / \mathrm{s}$ and a sideslip velocity between +3 and $+10 \mathrm{~mm} / \mathrm{s}$ to the relevant side.

We expressed CsChrimson in a group of lobula columnar neurons, LC16, whose activation with red light has been shown to induce flies to walk backward (Extended Data Fig. 7k-o, more details in ‘Optogenetic stimulation') ${ }^{50}$. Consistent with previous studies in free walking flies ${ }^{50}$, we also observed variable backward walking behaviours mixed with sideward walking and turning in our tethered preparation. To test whether the PFR phase separates from the EPG phase when a fly walks backward, we analysed optogenetic activation trials based on the following three criteria being met. First, the backward walking speed needed to be larger than $6 \mathrm{~mm} / \mathrm{s}$. Second, the duration of continuous backward walking (defined by backward walking speed being above $0.5 \mathrm{~mm} / \mathrm{s}$ ) needed to be longer than 1 s . Third, during the backward walking period, the sideward walking velocity needed to be biased towards one direction; the fraction of optogenetic trials in which the sideward velocity was clearly either positive or negative exceeded $80 \%$. We included this third criterion so that we could split optogenetic trials into those where the PFR phase should have moved to the right and those in which it should have moved to the left in the fan-shaped body (Extended Data Fig. 7k-o).

Phase nulling. To compute the time-averaged shape of the bump in PFN and EPG cells, we followed previous methods ${ }^{11}$. In brief, we (1) computationally rotated each frame by the estimated phase of the bump on that frame, such that the bump peak was at the same location on all frames, and then (2) averaged together the signal from all frames to get an averaged bump, whose shape we could analyse via fits to sinusoids (Fig. 3, Extended Data Figs. 3, 5, 8a). In this phase nulling process, we first interpolated the GCaMP signal from each frame to $1 / 10$ of a glomerulus, column, or wedge with a cubic spline. We then shifted this interpolated signal by the phase angle calculated for that frame. In both the ellipsoid body and the fan-shaped body (Extended Data Fig. 1e,f), we performed a circular shift, such the signals wrapped around the edges of the fan-shaped body. In the protocerebral bridge, we performed this circular shift independently for the left and right bridge. For the protocerebral bridge data, we subsampled the spatially interpolated GCaMP signal back to a 16 -glomerulus vector before plotting the data (Fig. 3, Extended Data Figs. 3, 5, 8a) so as to more accurately reflect, in our averaged signals, what the actual signal in the brain looked like.

To compute the cell-averaged shape of the EPG-to- $\Delta 7$ synapse number across the glomeruli of the bridge in Extended Data Fig. 3, we followed a similar protocol to the one described above for the imaging data. We treated the EPG-to- $\Delta 7$ synapse number profile of each $\Delta 7$ cell as the equivalent of one imaging frame, with the synapse number of each glomerulus the equivalent of the fluorescence intensity of a single glomerulus from that frame. The rest of the steps-calculating phase, interpolation, shifting, averaging and subsampling-were the same as those described above.

## Statistics and reproducibility

We performed unpaired two-tailed $t$-tests (Fig. 5d, h, Extended Data Fig. 1h, i, l, m, 7d, j) and Watson-Williams multi-sample tests (two-tailed; Fig. 51 , p, Extended Data Fig. 1p, 2g, 7i, o). See the related figures and captions for details. All experiments discussed in the paper were conducted once at the conditions shown; no experimental replicate was excluded. For most experiments, data across multiple days were collected and the data across days were consistent. In immunohistochemistry plots (Extended Data Fig. 1a-c), two brains were imaged, but only one is shown. Both imaged brains showed the same qualitative pattern of staining. Note also the fly exclusion criteria described in Fly Husbandry.

In Fig. 5d, the $P$ values are $2.7 \times 10^{-5}, 6.2 \times 10^{-6}$ and $1.5 \times 10^{-4}$ comparing the fourth column (from left) with the first, second and third columns, respectively. The $P$ values are $1.6 \times 10^{-6}, 2.4 \times 10^{-7}$ and $1.3 \times 10^{-5}$ comparing the seventh column (from left) with the first, fifth and sixth columns,
respectively. In Fig. 5 h, the $P$ values are $1.1 \times 10^{-7}$ and $9.9 \times 10^{-8}$ comparing the third column (from left) with the first and second columns, respectively. The $P$ values are $1.5 \times 10^{-5}$ and $6.9 \times 10^{-6}$ comparing the fifth column (from left) with the first and fourth columns, respectively. In Fig. 5l, the $P$ values are $7.0 \times 10^{-8}$ and $2.8 \times 10^{-8}$ comparing the third column (from left) with the first and second columns, respectively. The $P$ values are $4.0 \times 10^{-4}$ and $2.5 \times 10^{-4}$ comparing the fifth column (from left) with the first and fourth columns, respectively. In Fig. 5p, the $P$ values are $2.0 \times 10^{-6}$ and $6.6 \times 10^{-4}$ comparing the third column (from left) with the first and second columns, respectively.

For Fig. 1i, to test whether the $\mathrm{h} \Delta \mathrm{B}$ bump tracks the allocentric travelling direction (data fall on the diagonal line) better than tracking the allocentric heading direction (data fall on the horizonal line at zero), we calculated the mean circular squared difference between the data and the diagonal line versus the data and the horizontal line at zero. The result was $106 \mathrm{deg}^{2}$ for the diagonal line and $11,807 \mathrm{deg}^{2}$ for the horizontal line at zero, demonstrating that the $h \Delta B$ bump tracks the allocentric travelling direction of the fly better than the allocentric heading direction.
All of the sinusoidal fits throughout the paper had three free parameters: baseline, amplitude and phase.

For fitting sinusoids to the activity bumps shown in Fig. 3d, e and Extended Data Fig. 3h, the left-bridge and right-bridge data were fit to sinusoids separately because their amplitudes could vary independently. The period of each sinusoidal fit was eight glomeruli, with the first and ninth glomeruli set to the same value (Extended Data Fig. 5). Reduced $\chi^{2}$ tests were performed to test goodness of the fit. $\chi^{2}$ values per degrees of freedom ranged between 0.17 and 0.83 for all PFN fits, between 0.05 and 0.13 for all PFR fits, and between 0.24 and 1.91 for all EPG fits. The corresponding $P$ values ranged between 0.53 and 0.98 for all PFN fits, between 0.98 and 0.99 for all PFR fits, and between 0.08 and 0.95 for all EPG fits. These fit results mean that we cannot reject the hypothesis that the data are from an underlying sinusoidal distribution of activity.

For fitting sinusoids to the tuning curves in Fig. $3 \mathrm{k}, \mathrm{l}, \mathrm{n}, \mathrm{o}, \mathrm{q}, \mathrm{r}, \chi^{2}$ per degrees of freedom were between 0.15 to 1.20 giving $P$ values between 0.31 and 0.93 . Again, the hypothesis that these data are generated by a sinusoidal distribution cannot be rejected. Although the EPG amplitude tuning curves to optic flow (Fig. 3q, r) fit well to sinusoids, the amplitude parameters of the fits were very small compared with the baseline parameters. For Fig. 3q, the amplitude and baseline parameters were 0.040 and 0.73 (unit: $\Delta F / F_{0}$ ), respectively. For Fig. 3r, the amplitude and baseline parameters were 0.024 and 0.76 (unit: $\Delta F / F_{0}$ ), respectively. By contrast, for the PFN signals in Fig. $3 \mathrm{k}, \mathrm{l}, \mathrm{n}, \mathrm{o}$, the amplitude parameters were $0.69,0.69,0.30$ and 0.33 and the baseline parameters were 0.90 , $0.90,0.43$ and 0.42 , respectively. We thus concluded that the $\mathrm{PFN}_{\mathrm{v}}$ and $\mathrm{PFN}_{\mathrm{d}}$ sinusoidal activity patterns in the bridge are strongly modulated by optic flow, whereas the EPG activity pattern is very weakly modulated by optic flow.

The data points in Fig. 3d, e, k, l, n, o, q, r and Extended Data Fig. 3h, were fit to sinusoids using the method of variance-weighted least squares. All other fits to sinusoids used the method of least squares.

For Extended Data Fig. 7d, the null hypothesis is that the PFR bump tracks the allocentric travelling direction (data fall on the diagonal line) equally well than tracking the allocentric heading direction (data fall on the horizonal line at zero). We calculated the mean circular squared difference between the data and the diagonal line versus the data and the horizontal line at zero for the $35 \mathrm{~cm} / \mathrm{s}$ column. The result is 549 $\mathrm{deg}^{2}$ for the diagonal line and $7,710 \mathrm{deg}^{2}$ for the horizontal line at zero. Thus, the PFR bump tracks the allocentric travelling direction of the fly better than the allocentric heading direction in these experiments.

## Modelling

We constructed a model, based heavily on the data, to test whether the observed PFN activity profiles could provide summed input to
$h \Delta B$ neurons that would induce the $h \Delta B$ bump of activity to indicate the travelling angle of the fly. Neurons in the model are labelled by an angle $\theta$ that indicates their position along the fan-shaped body. In reality, this angle takes discrete values corresponding to the columns of the fan-shaped body, but, to simplify the notation, we use a continuous label here. The allocentric heading angle of the fly is denoted by $H$.

The data argue that the PFN activity profiles in the bridge have a sinusoidal shape (Fig. 3d, e, Extended Data Fig. 3) with phases locked to the phase of the EPG bumps (Extended Data Fig. 2), and that the projections of the PFN cells from the bridge to the fan-shaped body result in anatomically shifted inputs to the h $\Delta$ B cells (Fig. 3f-i, Extended Data Fig. 6). The phase of the EPG bump tracks the inverse of the heading angle of the fly, $H$, meaning that when the fly turns clockwise, for example, the bump rotates counterclockwise (when looking at the ellipsoid body from the rear). (To make things hopefully less confusing with regard to this minus sign, we flipped the orientation of the horizontal axis in some of our figures.) On the basis of these observations, we model the PFN activity profiles in the fan-shaped body as

$$
\operatorname{PFN}_{i}(\theta)=A_{i}\left(a_{i}+\cos \left(-H-\theta-\phi_{i}\right)\right)+c_{i}
$$

where $i=1,2,3,4$ refers to right-bridge $P_{\text {PN }}$, left-bridge $P_{\text {d }}$, right-bridge PFN $_{v}$ and left-bridge $P F N_{v}$ cells, and $a_{i}$ and $c_{i}$ are parameters reflecting amplitude-dependent and amplitude-independent offsets (that is, mean levels) of the sinusoidal activity patterns (Extended Data Fig. 8). $A_{i}$ is the amplitude of the sinusoid for $\mathrm{PFN}_{i}$, which depends on the egocentric travelling angle (that is, simulated optic flow; Fig. $3 \mathrm{j}-\mathrm{o}$ ). The angles $\phi$ are the shifts in the PFN projections from the bridge to the $h \Delta \mathrm{~B}$ cells (Fig. 3f-i, Extended Data Fig. 6). The total input to the $h \Delta B$ cells, which we call $h \Delta \operatorname{BInput}(\theta)$, is given by the sum of the PFN activities weighted by factors $g_{i}$ that reflect the strengths of the PFN connections to the $h \Delta B$ cells:

$$
\mathrm{h} \Delta \operatorname{BInput}(\theta)=\sum_{i=1}^{4} g_{i} \operatorname{PFN}(\theta)=\sum_{i=1}^{4} g_{i}\left(A_{i}\left(a_{i}+\cos \left(-H-\theta-\phi_{i}\right)\right)+c_{i}\right)
$$

The $h \Delta \mathrm{~B}$ bump will appear at the value of $\theta$ for which this summed input is maximal, which occurs at

$$
\theta_{\max }=-\arctan \left(\frac{\sum_{i=1}^{4} g_{i} A_{i} \sin \left(\phi_{i}\right)}{\sum_{i=1}^{4} g_{i} A_{i} \cos \left(\phi_{i}\right)}\right)-H
$$

The prediction of the model is that this angle should be equal to the negative of the allocentric travelling angle. Many of the parameters of the model do not appear in this expression, and the overall scale of the $g_{i}$ values for the different PFN cells cancels in the above ratio. We obtained the amplitude factors, $A_{i}$, directly from the data. For this purpose, we could use the amplitudes measured in the protocerebral bridge (Fig. 3j-o) with good results, but we chose instead to use the measurements from the noduli (Extended Data Fig. 4a-h), which is the site of the sensory input that drives the amplitude modulation of the PFN cells. Although the noduli do not have a columnar structure and thus can only provide a measure of mean activity for a given PFN type, we took advantage of the fact that the mean and amplitude of the PFN sinusoids in the bridge show virtually identical modulation (Extended Data Fig. 8) to infer the amplitudes $A_{i}$. We divided the measured amplitudes by their averages across all the measured simulated motion directions for each PFN type to correct for possible expression and imaging differences.

We set the remaining parameters in the above expression for $\theta_{\text {max }}$ in two ways (both results are shown in Fig. 4e). First, we assumed that the four values of $g$ were the same, meaning equal weighting of the four

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PFN types, and we took the angles $\phi$ to be $45^{\circ},-45^{\circ},-135^{\circ}$ and $135^{\circ}$. This resulted in a 'fit' to the data that involves assumptions, but no free parameters (Fig. 4 e , red circles). To avoid these assumptions, we also used values of these two sets of parameters extracted from a connectome-based analysis ${ }^{20}$ (Extended Data Fig. 6). On average, right (left) $\mathrm{PFN}_{\mathrm{d}}$ cells make 257.3 (260.7) synapses onto the 'axonal' region of the $h \Delta B$ cells and 164.4 (162.7) onto the 'dendritic' region. Because these regions are $180^{\circ}$ apart, implying a subtraction of sinusoidal signals, we took the strengths of these inputs to be $g_{1}=257.3-164.4=92.9$ and $g_{2}=260.7-162.7=98$. Right (left) $\mathrm{PFN}_{\mathrm{v}}$ cells synapse onto the 'dendritic' regions with, on average, 67.0 and 74.3 synapses, and we used these numbers as the values of $g_{3}$ and $g_{4}$. This assumes that there is no appreciable attenuation between the dendritic and axonal regions of the $\mathrm{h} \Delta \mathrm{B}$ cells. The angles $\phi$, up to an overall rotation that we chose to bring these angles in approximate alignment with the set of angles used above, were extracted from the hemibrain data by the procedure shown in Extended Data Fig. 6 and were taken to be $44.5^{\circ},-41.5^{\circ},-131.5^{\circ}$ and $136.5^{\circ}$. This generated the second set of model results shown in Fig. 4 e (green diamonds).

## Reporting summary

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

## Data availability

Data for all of the main figures are available on Dropbox (https://www. dropbox.com/sh/p8bqwavlsyl9ppv/AABz2-vda4Q3gukXqp8Ba2Gw a ? $\mathrm{dl}=0$ ). Other data are available on request from the corresponding author.

## Code availability

The analysis code has been deposited on GitHub (https://github.com/ Cheng-Lyu/TravelingDirectionPaper_code).

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Author contributions C.L. and G.M. conceived of the project. C.L. performed the experiments and analysed the data. C.L., G.M. and L.F.A. jointly interpreted the data and decided on new experiments. L.F.A. developed and implemented the formal models. C.L. wrote the initial draft of the paper, which was then edited by G.M. and L.F.A.

Competing interests The authors declare no competing interests.

## Additional information

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Extended Data Fig. 1 |See next page for caption.

## Article

Extended Data Fig. 1 |Characterizing the anatomy and physiology of h $\Delta B$ cells, showing that syt GCaMP and RGECO1a yield similar EPG phase estimates in the ellipsoid body, quantifying the EPG phase tracking of the closed loop dot, and evidence that the $h \Delta B$ phase tracks the fly's traveling direction in walking flies. $a$, At least sixteen somas are labeled by the $h \Delta B$ split-Gal4 line used in this paper. By comparison, the hemibrain connectome (v1.1) reports nineteen $h \Delta B$ cells ${ }^{20}$.b, GFP expression of the $h \Delta B$ split Gal4 in the fan-shaped body. $\mathbf{c}$, Same as panel $\mathbf{b}$, but not showing the anti-nc82 neuropil stain. $d, h \Delta B$ cells from hemibrain connectome $v 1.1^{20}$.e, Top, $h \Delta B$ GCaMP7f signal in a tethered, flying fly experiencing optic-flow (in the time window bracketed by the vertical dashed lines) with foci of expansion that simulate the following directions of travel: $180^{\circ}$ (backward), $-120^{\circ},-60^{\circ}, 0^{\circ}$ (forward), $60^{\circ}$, $120^{\circ}$. Bottom, Phase-nulled and averaged $h \Delta B$ activity patterns in the fanshaped body, calculated from the above $\left[\mathrm{Ca}^{2+}\right]$ signals in the last 2.5 s of optic flow presentation. Population means with s.e.m. are shown.f, Same as panele, but with $h \Delta B$ sytGCaMP7f signal. Note that the single-bump structure in the sytGCaMP7f signal is clearer than the structure in the cytoplasmic GCaMP7f signal, which is consistent with sytGCaMP7f biasing GCaMP to axonal compartments of h $\Delta$ Bs.g, Probability distributions of the difference between the EPG phase and the bright dot's angular position, without and with optic flow. h, Circular standard deviation of the EPG phase - dot position distributions, without and with optic flow. Two-tailed unpaired t-test was performed. i, Correlations between the angular velocities of the EPG phase and the visual landmark position under different conditions. The first two columns use the same data as in panels $\mathbf{g}$ and $\mathbf{h}$. The third and fourth columns use data from simultaneous GCaMP7f imaging of EPG cells and PFR cells in tetheredflying flies with a closed-loop dot. The fifth column use data from GCaMP6m imaging of EPG cells in tethered-walking flies with a closed-loop bar. Two-tailed one sample $t$-tests were performed against zero. $P$ values are $1.7 \mathrm{e}-3,1.3 \mathrm{e}-4$, $5.3 \mathrm{e}-4,1.2 \mathrm{e}-5$ and $3.6 \mathrm{e}-4$ comparing each column (from left to right) to zero, respectively. The relatively low, but significantly different from zero, rvalues show that the EPG phase tracks, even if poorly, the rotation of the landmark. The EPG phase measured in walking experiments tracks the closed-loop stimulus better than in tethered flight. See Main Text for possible technical reasons for why one would observe this difference. The fact that EPG-phase
tracking of the closed loop dot is better when we co-imaged EPG cells and PFR cells compared to when we imaged EPG cells and $h \Delta B s$ argues that the flies' genetic background (and thus how reliably flies perform tethered flight) can also quantitatively impact these measures. $\mathbf{j}$, Angular-velocity correlations of the EPG phase and the visual landmark position under different conditions as a function of the time-lag between the two velocity signals. Same data as in panel $\mathbf{i}$, but data with and without optic flow are lumped together. Correlation is highest at $290 \mathrm{~ms}, 260 \mathrm{~ms}$ and 375 ms for the three panels from left to right, respectively. Thus, we used time lags of 275 ms (mean of 290 and 260) and 375 ms for calculating the correlations in flight and walking experiments in panel $\mathbf{i}$, respectively.k, Probability distribution of the angular position of the dot on the arena. Same data as in panelsg and $\mathbf{h}$, but data with and without optic flow are lumped together. We tested the uniformity of the distribution across angles using reduced X 2 test. P value is $>0.995$, meaning that we cannot reject the hypothesis that the dot position is not evenly distributed on the arena. 1, Circular standard deviation of the EPG phase minus the $h \Delta B$ phase distributions, without and with optic flow. Same data as in panels $\mathbf{g}$, $\mathbf{h}$. Twotailed unpaired $t$-test was performed. $P$ value equals $1.3 \mathrm{e}-6 . \mathrm{m}$, Correlations between the EPG phase and the $h \Delta B$ phase. Same data as in panels $\mathbf{g}$, $\mathbf{h}$ and $\mathbf{I}$. Two-tailed unpaired $t$-test was performed. $P$ value equals $3.9 \mathrm{e}-4$. n , Data collected from tethered flies walking on a floating ball in complete darkness are shown in this panel and all subsequent panels in this figure. Sample time series of simultaneously imaged EPG and $h \Delta B$ Gal4 lines. Top two traces show $\left[\mathrm{Ca}^{2+}\right]$ signals. Third trace shows the phase estimates of the two bumps. Bottom two traces show the forward velocity and sideslip velocity of the fly. Quasiunidirectional walking bouts are labeled with walking directions indicated. o, Probability distribution of the difference between EPG phase and $h \Delta B$ phase from time segments where flies were walking in three different general directions (Methods). p, EPG - h $\Delta$ B phase as a function of the egocentric traveling direction. Gray: individual fly circular means. Black: population circular mean and s.e.m. The sign of EPG - $h \Delta B$ phase deviations seen here, in walking, are consistent with the signs observed in flight, for the same directions of backward-left and backward-right travel. Watson-Williams multisample tests were performed. $P$ values are $1.6 e-3$ and $2.6 e-6$ comparing the 1 st and 3rd columns (from left to right) to the 2nd column, respectively.


Extended Data Fig. $2 \mid$ PFN $_{\mathrm{d}}$ and PFN ${ }_{\mathrm{v}}$ activity bumps in the bridge are phase aligned with the EPG heading signal. a, Sample trace, in tethered flight without optic flow, of simultaneously imaged GCaMP6m in EPG cells and jRGECO1a in $\mathrm{PFN}_{\mathrm{d}}$ cells reveals that the activity bumps of these two cell classes are phase aligned in the bridge.b, Probability distribution of the EPG-PFN ${ }_{d}$ phase in tethered flight without optic flow. In this panel and throughout, the single fly data are in light gray and the population mean is in black.c, d, Same as panels a, b, but for GCaMP6m in EPG cells and jRGECO1a in PFN ${ }^{\text {cells }}$. $\mathbf{e}$, Top three rows, sample trace of simultaneously imaged GCaMP6m in EPG cells and jRGECO1a in PFN ${ }_{v}$ cells in a tethered, flying fly experiencing optic flow (in the time window bracketed by the vertical dashed lines) with foci of expansion that simulate the following directions of travel: $-120^{\circ}, 0^{\circ}$ (forward), $120^{\circ}$. Bottom,
circular-mean phase difference between EPG cells and PFN ${ }_{v}$ cells.f, Probability distribution of the EPG - PFN ${ }_{v}$ phase under three optic flow conditions. g, Circular mean of the EPG - PFN phase and s.e.m. under different visual stimulus conditions. Watson-Williams multi-sample tests, $\mathrm{P}>0.66$ when comparing any experimental group with $0^{\circ}$. Note that we only collected a full EPG-PFN, dual-imaging data set with optic flow (moving dots) with PFN $\mathrm{N}_{\mathrm{v}}$ cells because, for reasons that are not fully clear, the jRGECO1a signal was too weak in PFN ${ }_{d}$ cells to properly estimate the $\mathrm{PFN}_{\mathrm{d}}$ phase outside of the context of stationary dots (i.e., during optic flow). When imaging PFN ${ }_{d}$ cells with a split-Gal4 driver and with GCaMP rather than with jRGECO1a (e.g.,Fig. 3j-l), the signal is much brighter.


Extended Data Fig. $3 \mid \Delta 7$ cells are poised to help create sinusoidally shaped activity bumps in PFN $_{\mathrm{d}}, \mathrm{PFN}_{\mathrm{v}}$, and PFR cells in the protocerebral bridge. Connectivity data are based on those in neuPrint ${ }^{20}$, hemibrain:v1.1. a, Two $\Delta 7$ cells from neuPrint reveal a graded increase and decrease in dendritic density across the bridge. $\mathbf{b}$, Synapse-number matrix for detected synapses from EPG cells to $\Delta 7$ cells in the protocerebral bridge. Each row represents one $\Delta 7$ cell. $\mathbf{c}$, Same data as in panel b, but plotting each $\Delta 7$ cell separately. d, Phase-nulled EPG-to- $\Delta 7$ synapse \# across the glomeruli of the bridge, averaged across all $42 \Delta 7$ cells, based on the data in panel $c$. The anatomical input strength from EPG cells to $\Delta 7$ cells is sinusoidally modulated across the bridge. e, Transforming the EPG activity pattern across the bridge (blue) into a predicted $\Delta 7$ activity pattern (green, bottom row) based on the synaptic density profile in panel $\mathbf{c}$ (schematized in the middle). We first calculated the dot product between the EPG activity vector and each $\Delta 7$ cell's EPG-to- $\Delta 7$ synapse-number vector (panel c). Then, for each glomerulus, we averaged the dot-product-output for all of the $\Delta 7$ cells that have axonal terminals in that glomerulus, thus creating the predicted activity value for that glomerulus. (The size of each green square here schematizes the \# of synapses from EPG cells to the $\Delta 7$ cell of that type in that column; the intensity of each $\Delta 7$ row indicates the expected output strength of each $\Delta 7$ cell type, after being driven by the EPG signal above.) We plot the inverted, predicted activity output from $\Delta 7$ cells in the bottom row (green) because $\Delta 7$ cells are glutamatergic ${ }^{43}$ and glutamatergic neurons in the Drosophila central nervous system typically
inhibit their postsynaptic targets (via Glu-Cl channels). After inverting the $\Delta 7$ activity one can then imagine simply averaging the $\Delta 7$ predicted-activity row with the EPG activity-with some relative weighting for the $\Delta 7$ and EPG curvesto generate the net drive to the many downstream neurons that receive both EPG and $\Delta 7$ input ${ }^{20}$, like PFN cells. Note that the EPG activity bumps are slightly narrower than the sinusoidal fits whereas the $\Delta 7$ activity bumps are slightly wider than the sinusoidal fits.f, Same as panel e, but using the phase-nulled, averaged EPG GCaMP activity pattern from a previous study ${ }^{11}$. Note although the EPG bump is narrower in these data from walking flies than in panel efrom flying flies, the shape of the predicted $\Delta 7$ output remains similar. g, Same as panele, but starting with (imagined) EPG activity where there is only one active glomerulus on each side of the bridge. Note that the shape of the predicted $\Delta 7$ output remains similar to that in panelse,f.h,Measured, phase-nulled activity profiles from PFN $_{\mathrm{d}}, \mathrm{PFN}_{\mathrm{v}}$ and PFR cells. Thin lines: individual flies. Thick lines: population average. All three activity patterns conform well to their sinusoidal fits (gray dashed lines) (see Methods for goodness of fit). We hypothesize that the sinusoidal activity patterns in bridge columnar cells like $\operatorname{PFN}_{d}, \mathrm{PFN}_{v}$, PFR cells arises from the combined impact of EPG and $\Delta 7$ input. In other words, we posit that $\Delta 7$ cells 'sinusoidalize' the EPG bumps in the bridge - that is, they function to broaden and smoothen the EPG input to the bridge, to create two sinusoidally shaped bumps in their recipient cells, with these bumps often functioning as explicit, 2D vector signals in the fan-shaped body.
a







m
d

## Cose <br> - Input synapses to cell <br> - Output synapses from cell

e




g






i


Egocentric traveling angles with the peak physiological response from each labeled cell type (as estimated from sinusoidal fits to the optic-flow tuning curves measured in flight)
Extended Data Fig. 4 |See next page for caption.

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Extended Data Fig. $4 \mid$ LNO1 and SpsP cells have [Ca ${ }^{2+}$ ] responses that are strongly tuned to the fly's egocentric translation direction-in both walking and flying flies-with responses suggesting that these cells provide sign-inverting input to PFN $_{v}$ and PFN $_{\mathrm{d}}$ cells, respectively. Connectivity data and cell-type names are based on those in neuPrint ${ }^{20}$, hemibrain:v1.1. a, LNO1 neurons are a class of cells (two total neurons per side, four per brain) that receive extensive synaptic input outside the central complex and provide extensive synaptic input to PFN $_{v}$ cells in the noduli, with each PFN ${ }_{v}$ cell on average receive 131 synapses from LNO1s ${ }^{20}$.b, Mean GCaMP signals in PFN $_{v}$ and LNO1 cells in the nodulus as a function of the simulated traveling direction of the fly (via open-loop optic flow). Dotted rectangle indicates a repeated-data column, in this panel and throughout.c, Single-fly (colored circles) and population means $\pm$ s.e.m. (black bars) of the average signal in the final 2.5 s of the optic flow epoch. Sinusoidal fits shown in this panel (Methods), and throughout. d, Each SpsP cell (two total neurons per side, four per brain) receives extensive synaptic input outside the central complex and provides extensive synaptic input to PFN $_{d}$ cells on one side of the protocerebral bridge, with each PFN $_{d}$ cell on average receive 56 synapses from SpsP cells ${ }^{20}$. e, Same as panel b, but mean GCaMP signals in PFN $_{\mathrm{d}}$ and SpsP cells in the bridge as a function of the simulated traveling direction of the fly (via open-loop optic flow). A closed-loop bright dot was not present on the LED display when collecting the PFN $_{d}$ data. $\mathbf{f}$, Same as panel $\mathbf{c}$, but averaging the bridge signal in panele.g, Same as panelb, but analyzing the $P F N_{d}$ signal in the noduli. A closedloop bright dot was not present on the LED display. h, Same as panel c, but averaging the nodulus signal in panel $\mathbf{g}$. $\mathbf{i}$, The optic-flow-simulated egocentric
traveling angle at which the activity of each cell type is strongest is depicted with a line at the associated angle. Note that the left-vs-right angular differences measured in the noduli are smaller, and closer to $90^{\circ}$, than the left-vs-right angular differences measured in the bridge. This difference might bea purposeful shift in optic-flow tuning related to the use of orthogonal and nonorthogonal PFN axes under different behavioral contexts (see Supplementary Text) and/or originate from differences in how SpsP cells in the bridge and LNO1 cells in the noduli balance optic-flow with proprioceptive/efference-copy inputs to generate their signals.j, Data collected from tethered flies walking on a floating ball in complete darkness are shown in this panel and all subsequent panels in this figure. Mean PFN ${ }_{v}$ GCaMP signals in the bridge as a function of the fly's forward speed. $\mathbf{k}$, Right-minus-left PFN ${ }_{v}$ GCaMP signals in the bridge as a function of the fly's sideslip speed. $\mathbf{1 - m}$, Same as panelj and $\mathbf{k}$, but analyzing LNO1 signals in the nodulus. n, o, Same as panelj and $\mathbf{k}$, but analyzing PFN $_{d}$ signals in the bridge. $\mathbf{p}-\mathbf{q}$, Same as panel $\mathbf{j}, \mathbf{k}$, but analyzing SpsP signals in the bridge. In panel $\mathbf{b}, \mathbf{e}, \mathbf{g}, \mathbf{j}-\mathbf{q}$, thin lines represent single-fly means and thick lines represent population means. Note that $\mathrm{PFN}_{\mathrm{v}}$ and LNO 1 cells have sign-inverted responses, and that $\mathrm{PFN}_{\mathrm{d}}$ and SpsP cells have sign-inverted responses. The response signs to optic-flow simulating the fly's body translating forward and leftward (rightward) in flight are the same as the signs of responses to the fly walking forward and side-slipping leftward (rightward) when walking. Thus, these data are consistent with all these neurons being sensitive to the fly's egocentric translation direction, as assessed via optic flow (dominantly) in flight, and via proprioception or efference-copy (dominantly) in walking.
a


C

e
 across the bridge
b
Assigning angles to glomeruli in the
protocerebral bridge based on how EPGs
project from the ellipsoid body to the bridge

d

> Assigning angles to glomeruli in the bridge based on the axonal positions of $\Delta 7 \mathrm{~s}$

g

i


PFN ${ }_{v}$

Assigning angles to PFNs in specific bridge glomeruli based on anatomy and physiology

Extended Data Fig. 5 |See next page for caption.

## Article

Extended Data Fig. $5 \mid$ Multiple, functionally relevant ways of indexing angles across the protocerebral bridge. Connectivity data and cell-type names are based on those in neuPrint ${ }^{20}$, hemibrain:v1.1. a, The previously described mapping between EPG dendritic locations in the ellipsoid body and axonal-terminal locations in the bridge ${ }^{21}$. Numbers ordered based on the location of each EPG cell in the ellipsoid body.b, EPG cells divide the ellipsoid body into 16 wedges, each $22.5^{\circ}$ wide. Each glomerulus in the bridge inherits its angle, in our analysis here, based on the EPG projection pattern shown in panel a. The angles of the outer two bridge glomeruli-which do not receive standard EPG input, but only EPGt input ${ }^{20}$-were inferred to have angles equal to the middle two glomeruli ( $0^{\circ}$ and $22.5^{\circ}$, respectively) based on how other cell types (e.g., PEN cells) innervate the bridge, as discussed in past work ${ }^{11}$. This angular assignment maintains a $45^{\circ}$ step size between adjacent glomeruli on each side of the bridge, which seems natural due to symmetry considerations. (Note that EPGt cells map from the ellipsoid body to the outer two glomeruli of the bridge with a small angular offset compared to the pattern set up by the EPG cells that target the central 16 glomeruli-as reported by other studies ${ }^{28}$-a caveat that slightly complicates our angular assignments; however, EPGt cells receive extensive axonal input in the bridge that has the potential to align their output signals with the rest of the bridge system.) Glomeruli are numbered 1 to 18 from left to right, to aid the comparisons made below. c, Two $\Delta 7$ cells from neuPrint (and past work ${ }^{21}$ ) reveal that the axonal terminals of each $\Delta 7$ cell are 8 -glomeruli apart ( $\# 5 \rightarrow \# 13$ for cell $A$ and $\# 2 \rightarrow \# 10 \rightarrow \# 18$ for cell $B$ ). This anatomy argues that any two glomeruli 8 apart, such as $\# 5$ and \#13, will experience $\Delta 7$ output of equal strength. Compelling physiological evidence for this statement is available in the $\left[\mathrm{Ca}^{2+}\right]$ signals of the PEN2 (equivalently, PEN_b) columnar cell class in the bridge, which is a strong anatomical recipient of $\Delta 7$ synapses ${ }^{20}$ and shows $\left[\mathrm{Ca}^{2+}\right]$ activity across the bridge-clearly dissociable from the activity in EPG cells-with consistently equal signal strength at glomeruli spaced 8 apart, perfectly following the $\Delta 7$ anatomical prediction (orange trace in Fig. 3d and data points in Extended Data Fig. 2 i from ref. ${ }^{15}$ ). Note that in the EPG indexing, shown in panel b, glomeruli \#5 and \#13, as examples, have angular indices that are not identical, but differ by $22.5^{\circ}$. d, Angles assigned to each bridge glomerulus based on the $\Delta 7$ axonal anatomy. Because the $\Delta 7$ output anatomy requires that any two glomeruli 8 apart, across the whole bridge, have the same angular index assignment, this results in a situation where all neighboring glomeruli have angular assignments that are separated by $45^{\circ}$. Note that almost all neighboring glomeruli are separated by $45^{\circ}$ in the EPG mapping as well, except that, critically, in the EPG mapping the middle two glomeruli are separated by only $22.5^{\circ}$. This discontinuity is not evident in the $\Delta 7$ output. To create an angular indexing of the bridge for $\Delta 7 \mathrm{~s}$ that accommodates the anatomical constraints just described-i.e., one that incorporates an additional $22.5^{\circ}$ in the bridge representation of angular space
and thus 'erases' the EPG discontinuity-we shifted the angular index for each glomerulus on the left bridge leftward by $11.25^{\circ}$ relative to the EPG indexing and we shifted the angular index for each glomerulus on the right bridge rightward by $11.25^{\circ}$ relative to the EPG indexing. e, The EPG indexing in panels $\mathbf{a}, \mathbf{b}$ predicts that EPG activity in the left bridge (\#2 $\rightarrow \# 9$ ) will be left-shifted by $22.5^{\circ}$ compared to EPG activity in the right bridge ( $\# 10 \rightarrow \# 17$ ). Indeed, when we overlapped the left- and right-bridge EPG signals we found the two curves are detectably offset from each other.f, To quantify the data from panel e, for each imaging frame in which the fly was flying, we calculated the phase of the EPG bump in the left and right bridge separately (via a population-vector average) and took the difference of these two angles (black bars: population mean and s.e.m.). We then averaged this angular difference across all analyzed frames for the same fly. For EPG cells, this angular difference should be $-22.5^{\circ}$ if it follows the EPG indexing in panel $\mathbf{b}$ and it should be $0^{\circ}$ if the activity follows the $\Delta 7$ indexing in panel $\mathbf{d}$. Across a population of 9 flies, we found the angular difference is close to $-22.5^{\circ}$, but shifted toward $0^{\circ}$ by $4.6^{\circ}$, consistent with the fact that the EPG signal itself receives strong anatomical input from the $\Delta 7 \mathrm{~s}$ and thus could be modulated in its shape to follow the $\Delta 7$ indexing, in principle ${ }^{20}$. It seems that the $\Delta 7$ feedback to EPG cells reshapes its signal, but incompletely. $\mathbf{g}, \mathbf{h}$, Same as panele, but analyzing the $\mathrm{PFN}_{\mathrm{d}}$ and $\mathrm{PFN}_{\mathrm{v}}$ activity in the bridge. Because PFN cells only innervate the outer 8 glomeruli in each side of the bridge (unlike EPG cells, which innervate the inner 8), we compared glomeruli $\# 1 \rightarrow \# 8$ in the left bridge overlapped with glomeruli $\# 11 \rightarrow \# 18$ in the right bridge here (the middle two glomeruli contain no signal for PFN cells). i, Same as panel f, but analyzing the $\mathrm{PFN}_{\mathrm{d}}$ and $\mathrm{PFN}_{\mathrm{v}}$ activity in the bridge. Black bars: population mean and s.e.m. Note that because PFN $_{d}$ and PFN ${ }_{v}$ cells innervate (and thus we can only analyze) the outer 8 glomeruli of the bridge, the angular difference in phase estimates between the left- and right-bridge activity should be $+67.5^{\circ}$ if it follows the EPG indexing (panel b) and $+90^{\circ}$ if it follows the $\Delta 7$ indexing (panel d). We found that the average angular difference in both $\operatorname{PFN}_{d}$ and $P F N_{v}$ cells is intermediate between $+67.5^{\circ}$ and $+90^{\circ}$, consistent with PFNs receiving functional inputs from both EPG cells and $\Delta 7$ cells. We use the angular offsets measured in this panel as the basis for slightly adjusting the PFN $_{d}$ and PFN ${ }_{v}$ angular indices in the bridge to an intermediate value between the EPG and $\Delta 7$ indexing options, described above. We believe that this approach represents the most careful way to combine the known anatomy and physiology to determine the azimuthal angle that each PFN cell signals with its activity in driving the $\mathrm{h} \Delta \mathrm{B}$ neurites in the fan-shaped body, which we analyze in the next figure. $\mathbf{j}$, Angles assigned to each bridge glomerulus for PFN $_{d}$ cells, based on the EPG indices from panel $\mathbf{b}$ and the physiologically determined adjustment required, based on the measurements in paneli.k, Same as panelj, but for $\mathrm{PFN}_{\mathrm{v}}$ cells.


Extended Data Fig. 6 |Computing the angular shift implemented by the PFN-to-h $\mathbf{h B}$ connections. Connectivity data and cell-type names are based on those in neuPrint ${ }^{20}$, hemibrain:v1.1. a, The anatomical angle of each PFN $_{v}$ cell is indicated based on which glomerulus it inervates in the protocerebral bridge, using the indexing described in Extended Data Fig. $5 \mathrm{k} . \mathbf{b}$, Same as panel a, but for $\mathrm{PFN}_{\mathrm{d}}$ cells, using the indexing described in Extended Data Fig. 5 j . c, Synapse-number matrix for detected synapses from PFN $_{v}$ cells to $h \Delta B$ cells in the fan-shaped body. Note that the two stripes in the heatmap represent $\mathrm{PFN}_{\mathrm{v}}$ cells synapsing onto the dendritic regions of $\mathrm{h} \Delta \mathrm{B}$ cells. d , Same as panel $\mathbf{c}$, but for synapses from $\mathrm{PFN}_{\mathrm{d}}$ cells to $\mathrm{h} \Delta \mathrm{B}$ cells. Note that two of the five stripes in the heatmap represent $\mathrm{PFN}_{\mathrm{d}}$ cells synapsing onto the dendritic regions of $h \Delta B$ cells, whereas the other, brighter, three stripes represent PFN $_{d}$ cell synapsing onto the axons of $h \Delta B$ cells. The average \# of synapses that each $h \Delta B$ compartment (axon vs. dendrite) receives from PFN cells is indicated on the bottom. e, Because $h \Delta B$ cells are postsynaptic to both PFN $_{v}$ and PFN $_{d}$ cells that project to the fan-shaped body from both sides of the bridge (panels $\mathbf{c}, \mathbf{d}$ ), each $\mathrm{h} \Delta \mathrm{B}$ cell can be assigned an anatomical angle in four potential ways. To calculate the angle for an $\mathrm{h} \Delta \mathrm{B}$ cell through its connection with the left-bridge $\mathrm{PFN}_{\mathrm{v}}$ cells, for example, we averaged the anatomical angles of all the left-bridge PFN $\mathrm{N}_{\mathrm{v}}$ cells that connect to the $\mathrm{h} \Delta \mathrm{B}$ cell in question, weighted by the number of synapses from that PFN $_{v}$ cell to the $h \Delta B$ cell. $f$, The anatomical angle of each $h \Delta B$ cell calculated based on its monosynaptic inputs from left-bridge PFN $_{\mathrm{v}}$ s using the method described in panele and data in panel $\mathbf{c}$. $\mathbf{g}$, Same as panel $\mathbf{f}$, but calculations were made with right-bridge $\operatorname{PFN} \mathrm{N}_{\mathrm{v}}$ inputs to $\mathrm{h} \Delta \mathrm{B}$ cells. h , Same as panel $f$, but calculations were made with left-bridge PFN $_{d}$ inputs to $h \Delta B$ cells, using only the synapses formed on the axonal terminals of $h \Delta B$ cells. (We test the impact of this assumption-of complete functional dominance of PFN ${ }_{d}$
axonal synapses to $\Delta \Delta B$ cells-below.) i, Same as panelf, but calculations were made with right-bridge PFN $_{d}$ inputs to $h \Delta B$ cells, using only axonal synapses. $j$, For each $h \Delta B$ cell, we calculated the angular difference between the mean left-bridge PFN $_{d}$ input and the mean right-bridge PFN $_{d}$ inputs (i.e., the difference between data points in panels $\mathbf{h}$ and $\mathbf{i}$ ) and we plot a histogram of those values. $\mathbf{k}-\mathbf{m}$, Same asj for the cell types indicated. $\mathbf{n}$, The anatomically predicted angles for the coordinate axes of the four PFN vectors, as projected to the fan-shaped body and interpreted by $\mathrm{h} \Delta \mathrm{B}$ axons and dendrites, calculated by averaging the histogram values in panelsj-m, respectively. $\mathbf{o}$, Same as panel $\mathbf{n}$, but including all synapses from $\mathrm{PFN}_{\mathrm{d}}$ to $\mathrm{h} \Delta \mathrm{B}$ cells, not just the axonal ones as in panel $\mathbf{n}$. We weigh dendritic and axonal synapses by $\mathrm{PFN}_{\mathrm{d}}$ to $h \Delta \mathrm{~B}$ cells equally in the panele calculation. Note that the angles between four coordinate-frame axes do not change very much when also including the dendritic synapses from $\mathrm{PFN}_{\mathrm{d}}$ to $h \Delta \mathrm{~B}$ cells, likely because they are less numerous than the axonal ones and the impact of the dendritic angles also seem to cancel out in their net effect (compare panels $\mathbf{o}$ and $\mathbf{n}$ ). $\mathbf{p}$, Same as panel $\mathbf{n}$, but using the EPG indexing from Extended Data Fig. 5 instead of the adjusted PFN $\mathrm{N}_{v}$ and PFN $_{\mathrm{d}}$ indexing. Note that the EPG indexing makes the front angle between the left-and right-bridge PFN ${ }_{d}$ axes smaller. The same is true for the back angle between the left- and right-bridge PFN $_{v}$ axes. $\mathbf{q}$, Same as panel $\mathbf{n}$, but using the $\Delta 7$ indexing from Extended Data Fig. 5 instead of the PFN $_{v}$ and PFN $_{\mathrm{d}}$ indexing. Note that the $\Delta 7$ indexing makes the front and back angles broader than $90^{\circ}$, when used in isolation. This analysis suggests that EPG and $\Delta 7$ inputs to PFNs are perfectly weighted to create axes that are orthogonal in our experiments in flying flies and also raise the possibility that orthogonality of this 4 -vector system can be dynamically modulated via changing the weights of EPG and $\Delta 7$ inputs to PFNs (see Supplementary Text).


Extended Data Fig. 7|See next page for caption.

Extended Data Fig. $7 \mid$ PFR neurons track a variable similar to allocentric traveling direction in walking and flying flies. a, Schematics of two example EPG cells, two example PFR cells and two example $h \Delta B$ cells, which are the anatomically dominant input to PFRs. b, Sample GCaMP7f frames of the EPG bump in the ellipsoid body and the PFR bump in the fan-shaped body.c, Top, EPG (blue) and PFR (purple) GCaMP7f signal in a tethered, flying fly experiencing optic-flow (in the time window bracketed by the vertical dashed lines) with foci of expansion that simulate the following directions of travel: $180^{\circ}$ (backward), $-120^{\circ},-60^{\circ}, 0^{\circ}$ (forward), $60^{\circ}, 120^{\circ}, 180^{\circ}$ (backward; repeated data). Third row, EPG and PFR phases extracted from the above [ $\left.\mathrm{Ca}^{2+}\right]$ signals. Fourth row, circular-mean phase difference between EPG cells and PFR cells. Bottom two rows, average of left-minus-right and left-plus-right wingbeat amplitude. Single fly means: light gray. Population means: black. Dotted rectangle indicates a repeated-data column. d, EPG - PFR phase as a function of the egocentric traveling direction simulated by the optic flow, at three different speeds. Circular means were calculated in the last 2.5 s of optic flow presentation. Gray: individual fly circular means. Black: population circular mean and s.e.m. Dotted rectangle indicates a repeated-data column. (See Methods for how we calculate the optic flow speed.) Note that the data points deviate slightly from the unity line in a manner that means that the PFR phase is slightly shifted away from the traveling direction indicated by the optic flow and toward a frontal heading direction. The $h \Delta B$ data in Fig. 1h does not show this deviation from unity. We performed two-tailed one-samplet-tests against the diagonal line for data points in the $\pm 60^{\circ}$ and $\pm 120^{\circ}$ columns for the $35 \mathrm{~cm} / \mathrm{s}$ data from PFR cells here and the $35 \mathrm{~cm} / \mathrm{s}$ data from $\mathrm{h} \Delta$ B cells in Fig. 1 h . For the PFR results on the left of panel d, P values are $4.7 \mathrm{e}-5,4.7 \mathrm{e}-5,5.4 \mathrm{e}-4$ and $9.1 \mathrm{e}-3$ for the $-120^{\circ},-60^{\circ},+60^{\circ}$ and $+120^{\circ}$ columns, respectively. For the $h \Delta B$ results in Fig. $1 \mathrm{~h}, \mathrm{P}$ values are $0.39,0.88,0.058$ and 0.44 for the $-120^{\circ},-60^{\circ}$, $+60^{\circ}$ and $+120^{\circ}$ columns, respectively. e, PFR phase as a function of the inferred allocentric traveling direction, calculated by assuming that the EPG phase indicates allocentric heading direction and adding to this angle, at every sample point, the optic-flow angle. Gray:individual fly means. Black: population mean. In panels $\mathbf{d}$ and $\mathbf{e}$, data from the middle column $(35 \mathrm{~cm} / \mathrm{s})$ were the same as in panel c.f, Tethered, walking, $\left[\mathrm{Ca}^{2+}\right]$-imaging setup with a bright blue bar that rotates in closed loop with the fly's turns.g, Sample time series of
simultaneously imaged EPG and PFR bumps in a tethered, walking fly. Top two traces show $\left[\mathrm{Ca}^{2+}\right]$ signals. Third trace shows the phase estimates of the two bumps. Bottom trace shows the forward speed of the fly. h, Probability distributions of the EPG - PFR phase in walking and standing flies. Thin lines: single flies. Thick line: population mean.i, Circular mean of the EPG - PFR phase in walking and standing flies. Watson-Williams multi-sample tests, $P>0.63$ when comparing any experimental group with $0^{\circ}$. Gray dots: single fly values. Black bars: population means $\pm$ s.e.m. $\mathbf{j}$, Same as panel $\mathbf{i}$, but plotting circular standard deviation. Two-tailed unpaired $t$-tests were performed. $P$ value equals 0.042.k, Tethered-walking setup where we used a 617 nm LED focused on the center of the fly's head to optogenetically trigger backward walking via activation of LC 16 visual neurons expressing CsChrimson ${ }^{50}$ (Methods). I, An example 2D trajectory of optogenetically triggered backward walking. An arrow is shown every $\sim 0.1$ seconds. Red arrows indicate backward walking during the red-light pulse; blue arrows indicate the 1.2 s before the red light turned on. $\mathbf{m}$, Left, time series of EPG (blue) and PFR (purple) bumps and phase-estimates from the trajectory in panel I. Right, time series of forward velocity, sideslip velocity and the difference between the PFR and EPG phase in the trajectory shown in panel 1 . The $\Delta \mathrm{F} / \mathrm{F}$ heatmap range is more compressed here than in other plots because the PFR signal strength typically dips when the fly initiates backward walking (a phenomenon whose mechanism we have not yet explored). Nevertheless, clear moments where the PFR phase separates from the EPG phase are evident, even after the PFR signal strength has recovered, in this sample trace (and in others). $\mathbf{n}$, Time series of the mean forward velocity, mean sideslip velocity and the circular mean of the difference between the PFR and EPG phase during backward walking, grouped by optogenetic trials in which the fly walked to the back left (left panel) or to the back right (right panel). The sign of PFR-EPG phase deviations seen here, in walking, are consistent with the signs observed in flight, for the same directions of backward-left and backward-right travel. Thin lines and gray dots: individual trials. Thick line and black dot: population mean (circular mean for bottom row). o, Circular mean and s.e.m. of the peak EPG - PFR phase during triggered left-backward and right-backward walking bouts ( 0.6 s to 1.4 s after the dashed lines in panel $\mathbf{n}$ ). Watson-Williams multi-sample tests were performed and $P$ value equals $1.6 \mathrm{e}-6$.


Extended Data Fig. $8 \mid$ See next page for caption.

Extended Data Fig. $8 \mid$ Response-tuning in PFN, PFR and $\mathrm{h} \Delta \mathrm{B}$ neurons to the translation speed indicated by our optic-flow stimuli. a, Top row: same optic-flow tuning curves as in panel b, plotted twice (left and right). Bottom row: phase-nulled $\mathrm{PFN}_{\mathrm{d}} \mathrm{GCaMP}$ activity across the bridge, averaged in the final 2.5 s of the optic flow epoch. We show responses to optic flow simulating traveling backward at four different speeds (left) and responses to optic flow simulating forward travel at four different speeds (right). The mapping between bridge $\left[\mathrm{Ca}^{2+}\right]$ signals and data points in the plots in subsequent panels is indicated (arrows) for a few example points, using measurements from leftbridge PFN $_{d}$ cells, as an example. How we calculate the mean and amplitude of each bump is schematized. $\mathbf{b}$, The population-averaged amplitude of the phase-nulled left-bridge $\mathrm{PFN}_{\mathrm{d}}\left[\mathrm{Ca}^{2+}\right]$ activity in the final 2.5 s of the optic flow epoch, plotted as a function of the egocentric traveling direction simulated by the optic flow. The translational speed of optic flow increases across the four columns, from left to right. Gray lines: sinusoidal fits. S.e.m. are shown in this panel and throughout. c,Same as panelb, but analyzing the right-bridge PFN $_{d}$ activity.d,Same as panel b, but analyzing the left-bridge PFN $_{v}$ activity. e, Same as panel $\mathbf{b}$, but analyzing the right-bridge PFN $_{v}$ activity. $\mathbf{f}$, Same as panel $\mathbf{b}$, but analyzing the $h \Delta B$ activity in the fan-shaped body.g,Same as panel $\mathbf{b}$, but analyzing the PFR activity in the fan-shaped body. $\mathbf{h}$, Same as panelb, but analyzing the $h \Delta B$ activity in the fan-shaped body in non-flying flies. $i$, Same as panelf, but with a more zoomed-in y-axis.j, Amplitude of the four sinusoids in panelb to indicate how $\mathrm{PFN}_{\mathrm{d}}$ responses, overall, scale with optic-flow translation speed. $\mathbf{k}-\mathbf{m}$,Same as panel $\mathbf{j}$, but for the plots and cell type shown to the left. Note that the amplitudes of the PFN sinusoidal activity patterns are not
only scaled by the traveling direction angle (panels $\mathbf{b}-\mathbf{e}$ ), but also by traveling speed (panelsj-m). These plots make sense as a way to quantify the amplitude of sinusoidally modulated responses, like those of PFNs, but we also show, for completeness, the results of the same analysis for $h \Delta B$ and PFR cells, where this way of quantifying forward-speed tuning makes less sense. n, Mean of the four sinusoids in panelf to indicate how $\mathrm{h} \Delta \mathrm{B}$ responses, overall, scale with opticflow translation speed. o, Same as panel $\mathbf{n}$, but for the PFR plots shown to the left. p,Same as panel $\mathbf{n}$, but for the $h \Delta B$ plots shown to the left. Note that response-scaling with speed in $h \Delta B$ and $P F R$ cells was not consistent across all traveling directions (panels $\mathbf{f}-\mathbf{h}$ ). The fact that the speed tuning of $h \Delta B$ cells remains nonuniform across traveling directions in non-flying flies (panel $\mathbf{h}$ ) suggests that this nonuniform tuning is not entirely due to an efference copy/ proprioceptive signal being mismatched with backward optic-flow directions in tethered flight, though the interpretation of this nonuniform tuning will need to be resolved in future work. q, Same as panel $\mathbf{n}$, but for the $h \Delta B$ plots shown to the left. r, Same as panel b, but analyzing the mean (rather than the amplitude) of the left-bridge $\mathrm{PFN}_{\mathrm{d}}\left[\mathrm{Ca}^{2+}\right]$ activity patterns. Gray lines: same sinusoidal fits from panel $\mathbf{b}$ with a vertical offset and a scale factor that is constant across all four speeds. The fact that our amplitude fits from panel b also fit the mean responses shown here well supports the hypothesis that the heading input and the optic-flow input to PFN cells are integrated multiplicatively (see Methods). $\mathbf{s}-\mathbf{x}$, Same as panel $\mathbf{r}$, but analyzing the cell type indicated on the left side of the figure, for each row. See Methods for how the optic-flow speed was calculated.

## Article

a


Extended Data Fig. 9 |The neural circuit described in this paper implements an egocentric-to-allocentric coordinate transformation. a, Schematic of the computation implemented in the Drosophila central complex. Traveling-direction signals referenced to the body axis (i.e., optic flow signals in SpsP and LNO1 cells, which indicate the egocentric traveling
b


Zipser \& Andersen (1988) (ref. 1)
angle, green) are converted into traveling-angle signals referenced to cues in the world (i.e., the $h \Delta \mathrm{~B}$ bump position, which indicates allocentric traveling angle, red). $\mathbf{b}$, Schematic of a very similar computation hypothesized to take place in monkey parietal cortex.


Extended Data Fig. $10 \mid$ A traveling-direction signal computed via optic flow is robust to changes in the yaw angle of the fly's head. a, A fly flying straight with the head aligned to the body axis. EPG and $\mathrm{h} \Delta \mathrm{B}$ signals are aligned in the ellipsoid body and fan-shaped body, respectively. $\mathbf{b}$, A fly flying straight forward with the head rotated $20^{\circ}$ to the right. The EPG bump-assuming the EPG bump position tracks the fly's head (rather than body) direction-will rotate $20^{\circ}$ counterclockwise. The $h \Delta B$ bump, however, will remain pointing in the same allocentric traveling direction because the net effect of the EPG bump rotating $20^{\circ}$ in one direction and the ego-motion signal from optic flow (not represented in the diagram) rotating $20^{\circ}$ in the opposite direction is that the $\mathrm{PFR} / \mathrm{h} \Delta \mathrm{B}$ bump stably indicates the same traveling direction throughout.

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Our web collection on statistics for biologists contains articles on many of the points above.

## Software and code

Policy information about availability of computer code
Data collection Behavioral and visual stimulus data were recorded as voltages on a Digidata 1440 (Molecular Devices) I/O board. Two-photon imaging data were collected using PrairieView 5.4 (Bruker). Floating ball positions were measured using Fictrac v1. Wing tracking was conducted with Strokelitude (https://github.com/motmot/strokelitude).

Data analysis Two photon imaging data were pre-processed using Fiji (to define regions of interest, version: 2.1.0/1.53c). All data were analyzed with custom code in python 2.7 and 3.6. Analysis code is deposited on github (https://github.com/Cheng-Lyu/TravelingDirectionPaper_code).
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## Life sciences study design

| Sample size | No statistical tests were used to determine sample size．We used sample sizes（ $\sim 4-13$ flies per condition）that been previously shown to have sufficient statistical power in similar experiments in the past（e．g．，Seelig \＆Jayaraman 2015，Green et al．2017）． |
| :---: | :---: |
| Data exclusions | We did not exclude flies or data from any analysis，unless flies appeared unhealthy at the time of the experiment or were unable to last through the required experimental trials，i．e．，would not maintain continuous flight for $>5 \mathrm{~s}$ bouts，probably due to $5-6$ transgenes expression that can affect overall health and flight vigor． |
| Replication | All experiments discussed in the paper were conducted once at the conditions shown；no experimental replicate was excluded．For most experiments，data across multiple days were collected and the data across days were consistent．In immunohistochemistry plots（Extended Data Fig．1a－c），two brains were imaged，but only one is shown．Both imaged brains showed the same qualitative pattern of staining |
| Randomization | Organisms are not allocated to control and experimental groups by the experimenter in this work，rather the flies＇genotype determines their group．Thus，randomization of individuals into treatments groups is not relevant． |
| Blinding | The investigators were not blind to the flies＇genotypes．All data collection and analysis was done computationally． |

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| 区 | $\square$ Eukaryotic cell lines | Х | $\square$ Flow cytometry |
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|  | \ Animals and other organisms |  |  |
| 】 | $\square$ Human research participants |  |  |
| Х | $\square$ Clinical data |  |  |
| 区 | $\square$ Dual use research of concern |  |  |

## Antibodies

| Antibodies used | For primary antibodies，we used mouse anti－Brp（nc82，DSHB）and chicken anti－GFP（Rockland，600－901－215）．For secondary <br> antibodies，we used Alexa Fluor 488 goat anti－chicken（A11039，Invitrogen）and Alexa Fluor 633 goat anti－mouse（A21052， <br> Invitrogen）． |
| :--- | :--- |
| Validation | All antibodies used in this study were validated as described at the following websites（and references therein）：DSHB：https：／／ <br> dshb．biology．uiowa．edu／nc82？quantity＝1\＆product－form＝1，Rockland：https：／／rockland－inc．com／store／Antibodies－to－GFP－and－ <br> Antibodies－to－RFP－600－901－215－O4L＿23908．aspx，Invitrogen：https：／／www．thermofisher．com／antibody／product／Goat－anti－Chicken－ <br> IgY－H－L－Secondary－Antibody－Polyclonal／A－11039 and https：／／www．thermofisher．com／antibody／product／Goat－anti－Mouse－IgG－H－L－ <br> Highly－Cross－Adsorbed－Secondary－Antibody－Polyclonal／A－21052 |

## Animals and other organisms

Policy information about studies involving animals；ARRIVE guidelines recommended for reporting animal research
Laboratory animals We used female Drosophila melanogaster that were 2－6 days old．All fly strains and fly genotypes are described in details in the Methods．

Wild animals
The study did not involve wild animals．


[^0]:    ${ }^{1}$ Laboratory of Integrative Brain Function and Howard Hughes Medical Institute, The Rockefeller University, New York, NY, USA. ${ }^{2}$ Mortimer B. Zuckerman Mind Brain Behavior Institute,
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[^1]:    Data for main Figures are available on Dropbox (https://www.dropbox.com/sh/p8bqwavlsyl9ppv/AABz2-vda4Q3gukXqp8Ba2Gwa?dl=0). Other data are available upon request.

