







# Supplementary Information

# Neuronal morphometry directly from bitmap images

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## Supplementary Figures

### Supplementary Figure 1. Overview of the *Sholl Analysis* software.

1 (a) User interface, version 3.4. Sub-modules noted in blue.

(b) Maximium intensity projection of a Drosophila class IV dendritic arborization sensory neuron (ddaC) labeled by the *ppk1.9-GAL4*-driven reporter *UAS-mCD8::GFP*, a sample image distributed with the plug-in. The annulus formed by *Starting radius* (the first sampled distance) and *Critical radius* is indicated. Outer arc depicts *Enclosing radius*, the distance to the most distal dendritic tip.

(c) Semi-log plot of the cell depicted in (b), where the number of intersections was normalized to the area of each sampled shell. Two regression lines are shown to demonstrate that curves can be fitted to all data points, or to a subset restricted to the  $10^{\text{th}}$ to  $90^{\text{th}}$  percentiles of the data (shaded in gray). R<sup>2</sup> is the coefficient of determination, and *k* the *Sholl regression coefficient*.

(d) Linear Sholl plot of the cell in (b). Key metrics include *Critical value*  $(N_m)$ , *Critical radius*  $(r_c)$  and *Mean value*  $(N_{av})$ . Differences between sampled and fitted maxima are shaded in gray. The centroid of the sampled profile is marked (×). *Schoenen ramification index* (*RI*) is the ratio between number of branches at the maximum and the number primary branches, using either sampled data or the fitted  $N_m$ . The number of primary branches can be entered manually, or drawn from the number of intersections at *Starting radius*.

## Supplementary Figure 2. Accuracy of bitmap image-based Sholl Analysis.

19 (a) Maximum intensity projection of an Alexa 594 dye-filled layer-5 pyramidal neuron of

juvenile mouse visual cortex<sup>1</sup>. Arrowheads highlight the apical tuft (top) and the soma (bottom).

(b) Manually reconstructed dendrites (blue) and axon (magenta) of the neuron in (a).

(c) Linear Sholl plots from bitmap images (dots), following either manual segmentation
("user segm.") or automated segmentation of the image stack. For comparison, results
from reconstruction-based analysis are plotted for the axon (dashed magenta line) and
dendrites (solid blue line). The plot of the left corresponds to the basal region populated
by both axonal and dendritic arbors, while the plot on the right corresponds to apical
dendrites.

(d) Bland-Altman plot to examine the agreement between the bitmap approach and traced
reconstruction approach for three different neurons (numbered and color-coded). Each
data point represents the count of intersections at a particular distance from the apical

- bifurcation: pairwise differences between the two approaches at each distance are plotted
- 2 against each mean. The 95% limits of agreement for individual cells are shown to the
- right, as is the average for all three cells and the average bias (dotted lines).

# Supplementary Figure 3. Resilience of bitmap image-based morphometry to image degradation over a range of synthetic noise.

- 4 (a) Maximum intensity projection of an axonal arbor of a Drosophila olfactory projection 5 neuron from the DIADEM Challenge dataset  $(OP \ 1)^{2, 3}$ . We contaminated the original
- stack (voxel size:  $0.33 \times 0.33 \times 1.0 \mu$ m) with Poisson noise, using increasing multiples of
- 7 the stack standard deviation ( $\sigma = 9.55$ ) as the probability mass function of the Poisson
- <sup>8</sup> random variable. This noise was either added (+) or subtracted (-), over a range from
- 9  $-18\sigma$  to  $+18\sigma$ . Images are shown with the coefficient of determination below each image 10 (R<sup>2</sup>, mean ± s.d.) to indicate the degree of similarity with the original; R<sup>2</sup>= 1 corresponds
- to identical images. Arrowheads indicate the Sholl analysis center (see b).

(b) Each graph represents one of 7 metrics (3 from sampled data, 4 from fitted data) that 12 were calculated from Sholl plots generated directly from bitmap images with Sholl 13 Analysis ("Bitmap"), or from their respective reconstructions traced with Neural Circuit 14  $Tracer^4$  ("Reconstruction"). The parameters and routines used to retrieve the data were 15 fixed (See Supplementary Methods and Supplementary Files for details). Shaded areas 16 in each graph (light gray) indicate the range of noise  $(-14\sigma \text{ to } +8\sigma)$  over which metrics 17 were largely consistent with those calculated from the original image (zero noise, dark 18 grey vertical bar). Dashed lines indicate two references calculated at zero noise: one from 19 a user-derived manual segmentation of the stack ("Bitmap reference", blue) and one from 20 the DIADEM gold standard reconstruction (red). For each metric, the concordance 21 correlation coefficient  $(\rho_c)^5$  between the bitmap approach and reconstruction approach are 22 shown. 23

### 24 Supplementary Figure 4. Sholl-based metrics of Type-1 and Type-2 PV 25 interneurons.

Metrics loading on the first principal component (71.6% of observed variation), used as clustering variable in **Fig. 1c**: (a) Sholl regression coefficient, (b) Sum of intersections, (c) Distance associated with at least two intersections (a modified *Enclosing radius*), (d) Centroid radius, (e) Centroid value, (f) Critical value, (g) Mean value, (h) Critical radius. Values enclosed by brackets depict factor loadings. Because pipette fluorescence could not be entirely eliminated near the soma, the *number of primary branches* and *Schoenen ramification indices* were excluded from the analysis.

## Supplementary Methods

#### Programming

- 1 Programming was performed with Eclipse SDK 3.7.2 (Eclipse Foundation) and Fiji's
- 2 built-in Script Editor. The source code of *Sholl Analysis* is available through the plug-in's
- 3 internet documentation page (http://fiji.sc/Sholl\_Analysis).

#### **Image Acquisition**

Images acquisition has been described previously for Drosophila sensory neurons<sup>6</sup>, and 4 for neocortical pyramidal cells and PV interneurons<sup>1</sup>. Neocortical cells were visualized in 5 P12-P20 acute mouse visual cortex slices using custom-built 2-photon imaging 6 workstations (Scientifica UK) with ScanImage' v3.7 running in MATLAB (MathWorks). 7 Two-photon excitation of Alexa-594 loaded via the patch pipette was obtained with a 8 Ti:Sa laser (Spectraphysics MaiTai or Coherent Chameleon) tuned to 800-820nm, and 9 data was acquired with Hamamatsu R3896 bi-alkali detectors and National Instruments 10 PCI-6110 digitization boards. All recordings were in neocortical layer 5, as determined 11 by the presence of conspicuous large pyramidal somata with characteristic apical 12 dendrites, as visualized by Dodt contrast. PV interneurons were targeted in slices from 13 GFP-expressing G42 mice<sup>8</sup> by tuning laser to 880–900nm and visualizing GFP 14 fluorescence. 15

To produce Purkinie cell-specific expression of Brainbow, transgenic Pcp2-cre mice 16 (Jackson Laboratory) were crossed to Brainbow 2.1 mice (line R, Jackson Laboratory). 17 Five-month-old progeny were deeply anaesthetized (Ketamine/Xylazine, 80/5 mg/kg), 18 and perfused with 4% paraformaldehyde. Sagittal brain slices were cut 24 hours later 19 from the cerebellar vermis (100 µm thick) using a Leica Vibratome 1000S, and mounted 20 with Prolong Gold Antifade (Invitrogen). Images were collected with an Olympus 21 confocal microscope with a 60X oil immersion objective (NA= 1.35), using the following 22 laser wavelengths: 559nm, 515nm, and 440nm. Images (512 X 512 pixels) were acquired 23 using a z-axis step of 0.5µm and were deconvolved with AutoOuant software (Media 24 Cybernetics). 25

#### **Image Processing**

Image processing was performed in Fiji<sup>9</sup>. Image fields were stitched together<sup>10</sup>, and 26 fluorescence signal from filling pipettes and dye spillage (PV cells) or fluorescence 27 artifacts (Brainbow cells) was eliminated manually. Background was eliminated through 28 29 3D median filtering (typically radius=2-3), and stacks were segmented using one of ImageJ's built-in threshold methods. Due to diminished brightness, some image stacks 30 were enhanced with the *Tubeness* plug-in (http://fiji.sc/Tubeness)<sup>11</sup>. Subsequently, 31 bitmap Sholl was performed as described in the Batch Processing section of the Sholl 32 Analysis internet documentation page, which contains most of the image processing 33 routines used in this study. 34

Reconstructions were performed using Neuromantic<sup>12</sup> or, in the case of Brainbow tissue, 1 with Neurolucida (MicroBrightField, Inc.). Neurolucida tracings were converted to the 2 SWC format<sup>13</sup> using L-Measure<sup>14</sup>. Reconstructions were imported into Simple Neurite 3 Tracer<sup>11</sup> using the appropriate coordinate offset so that the tracings would align optimally 4 with the corresponding bitmap image. The Sholl technique for these reconstructions was 5 performed using Simple Neurite Tracer, using a manually chosen point as the center of 6 analysis. The closest voxel to this point was chosen for subsequent bitmap *Sholl Analysis*. 7 For consistency, data was obtained using the minimum sampling distance allowed by the 8 bitmap approach, i.e., the cube root of the product of the voxel dimensions. 9

10 Automated reconstructions of DIADEM projections were performed in Neural Circuit

11 Tracer 2.0<sup>4</sup>. Scripts and instructions on how to process the DIADEM *OP* 1 dataset are

12 available as **Supplementary Files**.

#### Data Analysis

For Bland-Altman plots<sup>15</sup> of pyramidal cell apical dendrites, profiles were obtained as described above, using the main apical bifurcation as the center of analysis. Pairwise comparisons were performed at each sampled distance. Bias was calculated as the average of the differences between the two methods. Limits of agreement were calculated as bias  $\pm 1.96$  times the standard deviation of the differences.

For each neuron, we retrieved all the metrics calculated by the Sholl Analysis plug-in and 18 performed clustering analysis following Principal Component Analysis as described 19 elsewhere<sup>16, 17</sup> (Supplementary Fig. 4). The first component (which accounted for 71.6% 20 of the observed variation) was used as clustering variable. Hierarchical clustering was 21 performed using Ward's method and squared Euclidean distances as linkage metric. A 22 25% linkage cutoff, as normalized to the greatest separation in the data set, was used as a 23 best-cut selection criterion for the number of found clusters<sup>17</sup>. Analyses were performed 24 in JMP 10.0 (SAS Institute) and Prism 5.0 (Graphpad Software). 25

## Supplementary Files

# Processing routines for the OP\_1 DIADEM dataset (related to Supplementary Figure 3).

- 26 Scripts used to obtain the data presented on Supplementary Fig. 3: ImageJ macros
- 27 (OP 1 NoiseTest.ijm and OP 1 UserSeg.ijm) and Neural Circuit Tracer macro
- 28 (OP 1 NCTracer.macro) used for automated reconstruction of the OP 1 image.

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