

# High-speed *in vivo* calcium imaging reveals neuronal network activity with near-millisecond precision

Benjamin F Grewe, Dominik Langer, Hansjörg Kasper, Björn M Kampa & Fritjof Helmchen

**Two-photon calcium imaging of neuronal populations enables optical recording of spiking activity in living animals, but standard laser scanners are too slow to accurately determine spike times. Here we report *in vivo* imaging in mouse neocortex with greatly improved temporal resolution using random-access scanning with acousto-optic deflectors. We obtained fluorescence measurements from 34–91 layer 2/3 neurons at a 180–490 Hz sampling rate. We detected single action potential-evoked calcium transients with signal-to-noise ratios of 2–5 and determined spike times with near-millisecond precision and 5–15 ms confidence intervals. An automated ‘peeling’ algorithm enabled reconstruction of complex spike trains from fluorescence traces up to 20–30 Hz frequency, uncovering spatiotemporal trial-to-trial variability of sensory responses in barrel cortex and visual cortex. By revealing spike sequences in neuronal populations on a fast time scale, high-speed calcium imaging will facilitate optical studies of information processing in brain microcircuits.**

Neural circuits in the brain operate on the millisecond time scale via spatiotemporal patterns of neuronal spikes. Two-photon calcium imaging recently has enabled functional measurements from neuronal networks *in vivo*<sup>1</sup>, but its temporal resolution is limited compared to that of electrical recordings. Standard laser scanning systems based on galvanometric mirrors typically sample neuronal populations at 10–15 Hz maximum rate<sup>2–6</sup>. Although single spikes can be optically detected both with synthetic<sup>4,6–8</sup> and genetically encoded<sup>9–11</sup> calcium indicators, an accurate spike time reconstruction from two-photon imaging data has not been possible so far.

Strategies to increase imaging speed include targeted path scanning<sup>12</sup> or resonant scanning<sup>8</sup> with galvanometric mirrors, scanless imaging using spatial light modulators<sup>13</sup> and the use of nonmechanical acousto-optic deflectors (AODs)<sup>14–16</sup>. With AODs, the laser focus can be moved within microseconds between any two positions in a field of view. Such random-access scanning avoids wasting time on background regions and maximizes signal integration time on the structures of interest. Drawbacks of AODs are their relatively poor laser diffraction efficiency and their large optical dispersion, which necessitates correction of spatial and temporal laser beam distortions<sup>17,18</sup>.

Because of these difficulties, random-access AOD scanning has not yet been applied for *in vivo* imaging, although it has been used for multisite recordings from neuronal dendrites in brain slices<sup>14–16</sup>.

Here we demonstrate high-speed optical recording of spiking activity in the mouse neocortex using an AOD-based two-photon microscope optimized for *in vivo* application. A random-access scanning mode provided a signal-to-noise ratio (SNR) sufficient to detect single spikes at low error rate and with near-millisecond precision. Moreover, analysis tools for automated reconstruction of spike trains from calcium measurements permitted us to extract bursts of spikes as well as complex sensory-evoked spiking patterns on a subsecond time scale. These methods will enable studies of the fast spatiotemporal network dynamics underlying neural computations.

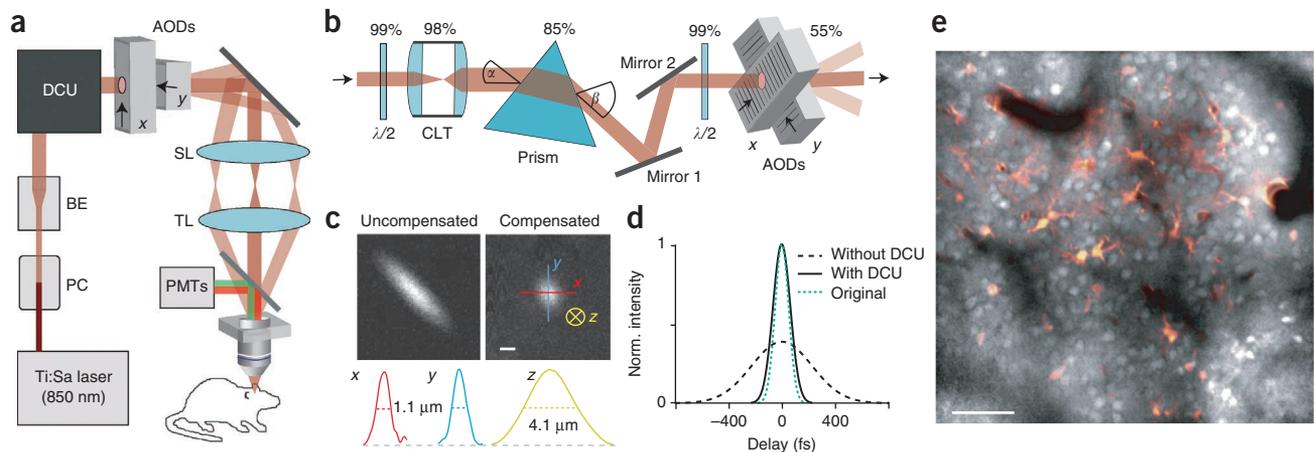
## RESULTS

### *In vivo* two-photon imaging using acousto-optic scanners

Our first goal was to design an AOD-based two-photon microscope suitable for *in vivo* application. We custom-built a microscope setup that uses a pair of crossed AODs for two-dimensional deflection of the laser beam (**Fig. 1a**). A critical issue in using AODs for two-photon excitation is that spatial and temporal dispersion cause laser focus deformation and pulse broadening, respectively. These effects can either be mitigated by using relatively long laser pulses (0.5–1.8 ps)<sup>14–16</sup>, albeit at the expense of excitation efficiency, or they need to be compensated for with an additional diffractive element. Here we adopted a single-prism compensation approach<sup>17</sup> and modified it to improve laser-beam transmission and dispersion compensation over a large field of view (**Fig. 1b**). Compensation with the prism abolished elliptical deformation of the laser focus, as illustrated by imaging small fluorescent beads in the field of view center (**Fig. 1c**). Two half-wavelength ( $\lambda/2$ ) waveplates before the prism and the first AOD, respectively, optimized laser beam polarization along the pathway and maximized transmission through prism (85%) and AOD pair (55%). In total, 45% of the incoming light was transmitted by the dispersion compensation unit (DCU) and the AODs. Additionally, a cylindrical telescope assured a round laser beam profile at the AOD aperture, compensating for the asymmetric light path through the prism (Online Methods).

Department of Neurophysiology, Brain Research Institute, University of Zurich, Zurich, Switzerland. Correspondence should be addressed to F.H. (helmchen@hifo.uzh.ch).

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**Figure 1** | AOD-based two-photon imaging of neocortical L2/3 neurons *in vivo*. **(a)** Schematic of the two-photon microscope setup. Laser intensity and beam size were adjusted with a Pockels cell (PC) and a variable beam expander (BE), respectively. After a DCU two orthogonal AODs were used for  $x$ - $y$  scanning. **(b)** Schematic of the DCU consisting of a cylindrical lens telescope (CLT), two  $\lambda/2$  waveplates and a single prism oriented at  $45^\circ$  angle to the AODs. Laser beam transmission percentage for each element is indicated. The CLT compensates for beam ellipticity caused by mismatch of the laser beam input and output angle ( $\alpha$  and  $\beta$ ). **(c)** Two-photon images of 500-nm fluorescent beads without (uncompensated) and with (compensated) the DCU. Intensity profiles along  $x$ ,  $y$  and  $z$  direction are shown on the bottom with FWHM values indicated. Scale bar, 1  $\mu\text{m}$ . **(d)** Laser pulse width measured with and without the DCU as well as the original pulse width at the laser output. **(e)** Two-photon image of a cell population stained with OGB-1 in L2/3 of mouse neocortex at 200  $\mu\text{m}$  depth below the pia. Image of astrocytes labeled with sulforhodamine 101 (red) is overlaid. Scale bar, 50  $\mu\text{m}$ .

We quantitatively characterized the spatial resolution by imaging 100-nm fluorescent beads (**Supplementary Fig. 1**). In the field of view center, lateral spatial resolution was uniform with  $1.01 \pm 0.14 \mu\text{m}$  and  $1.01 \pm 0.03 \mu\text{m}$  full-width at half-maximum (FWHM) in  $x$  and  $y$  direction, respectively; ellipticity, defined as FWHM ratio along major and minor axis, was 1.0 ( $n = 4$  beads, mean  $\pm$  s.d.; ellipticity without compensation, 3.5). The resolution was limited by the resolvable number of spots of the AODs rather than the diffraction limit of the microscope objective (Online Methods). Axial resolution was  $4.13 \pm 0.14 \mu\text{m}$  FWHM ( $n = 4$ ). As expected<sup>18</sup>, the focus was elongated toward the field of view borders but ellipticity remained below 2 throughout the entire field of view (lateral and axial resolution remained below 2  $\mu\text{m}$  and 6.5  $\mu\text{m}$  FWHM, respectively; **Supplementary Fig. 1**). With the prism placed about 35 cm in front of the AODs, the DCU also compensated for the group delay dispersion in the entire optical path, restoring laser pulse width from  $\sim 570$  fs without compensation to  $\sim 140$  fs (130 fs original pulse width) (**Fig. 1d**). The total transmission efficiency of our microscope was  $\sim 25\%$  at 850 nm wavelength, providing ample average laser power (up to 700 mW) below the microscope objective.

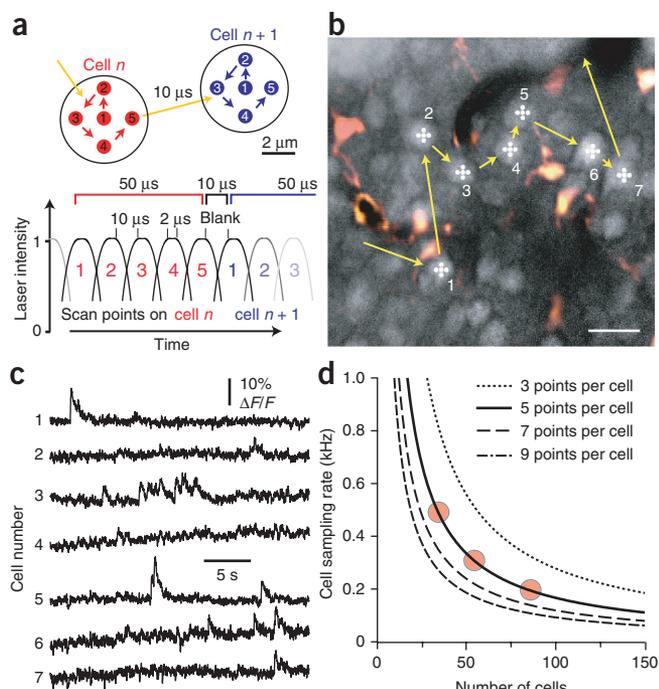
These optimizations rendered our system suitable for *in vivo* imaging and provided a field of view of up to 305  $\mu\text{m}$  side length (40 $\times$  objective). In living mice, we could readily image cell populations in neocortical layer 2/3 (L2/3) down to 300  $\mu\text{m}$  depth below the pia after multicell bolus loading<sup>2</sup> with the fluorescent calcium indicator Oregon Green BAPTA-1 (OGB-1) and counterstaining of astrocytes with sulforhodamine 101 (ref. 19) (**Fig. 1e** and **Supplementary Movie 1**).

### High-speed calcium imaging from neuronal populations

We next implemented a random-access scanning mode for fast calcium measurements. Although the 10-mm AOD aperture

size nominally supports point-to-point transitions within 15.4  $\mu\text{s}$  (sound velocity  $650 \text{ m s}^{-1}$ ), the transition time could be shortened to 10  $\mu\text{s}$  without any measurable effects<sup>15</sup> (Online Methods). For frame scanning, we chose an additional 2- $\mu\text{s}$  pixel dwell time, resulting in a frame acquisition time of 786 ms ( $256 \times 256$  pixel). For random-access scanning from cell populations, we used a longer signal integration time per neuron to increase fluorescence signals and improve SNR. To avoid stationary parking of the laser focus on the cell, which may cause photobleaching and cell damage<sup>15</sup>, we developed a random-access pattern scanning (RAPS) mode, in which a predefined fixed spatial pattern of a few points is scanned on each neuron. In this study, we mainly used a five-point pattern that we scaled to match the cell size (**Fig. 2a**). After completing the pattern scan on one neuron, the laser focus jumped to the next neuron where again a pattern scan was started. On each cell, fluorescence signal was continuously integrated during the pattern scan to maximize SNR. Signal integration was only blanked during the 10- $\mu\text{s}$  transition period between individual neurons, resulting in a total effective dwell time of 50  $\mu\text{s}$  per cell (**Fig. 2a**). Using five-point RAPS, we detected no signs of photodamage such as locally increased fluorescence<sup>15,20</sup>. Over cumulative scanning periods of up to 7 min, neuronal morphologies were unaltered and basal fluorescence only slightly decreased by  $\sim 6\%$ , comparable to galvanometric frame scanning (**Supplementary Fig. 2**).

Our RAPS mode enabled high-speed calcium imaging from neuronal populations. As an example, we measured spontaneous calcium transients in 55 L2/3 neurons at 298 Hz (**Fig. 2b**). Spontaneous fluorescence transients with rapid onsets and amplitudes in the 5–20% range were clearly visible (**Fig. 2c**), suggesting that RAPS is well-suited to resolve action potential-evoked calcium transients. In general, five-point RAPS can address 16,700 cell positions per second. Clearly, the number of sampled cells trades off against the effective sampling rate



**Figure 2** | Random-access pattern scanning from neuronal populations. **(a)** Principle of RAPS exemplified for a five-point pattern that is sequentially scanned on two cell somata (top). Signal integration protocol for five-point RAPS (bottom). Cellular fluorescence signals are integrated over the entire five-point scan periods except for the 10 μs transition between cells. **(b)** Two-photon image of an L2/3 neuronal population labeled with OGB-1 (image of sulforhodamine 101–stained astrocytes (red) is overlaid; imaging depth, 198 μm). High-speed imaging (298 Hz sampling rate per cell) was performed using five-point RAPS targeted to 55 cells that were manually preselected from a reference image. RAPS transitions for seven example neurons are indicated. Scale bar, 20 μm. **(c)** Spontaneous fluorescence transients in the seven example neurons depicted in **b**. **(d)** Sampling rate per cell as a function of number of cells sampled and number of RAPS points per cell. Circles indicate the three regimes of sampling rates and cell numbers used in this study.

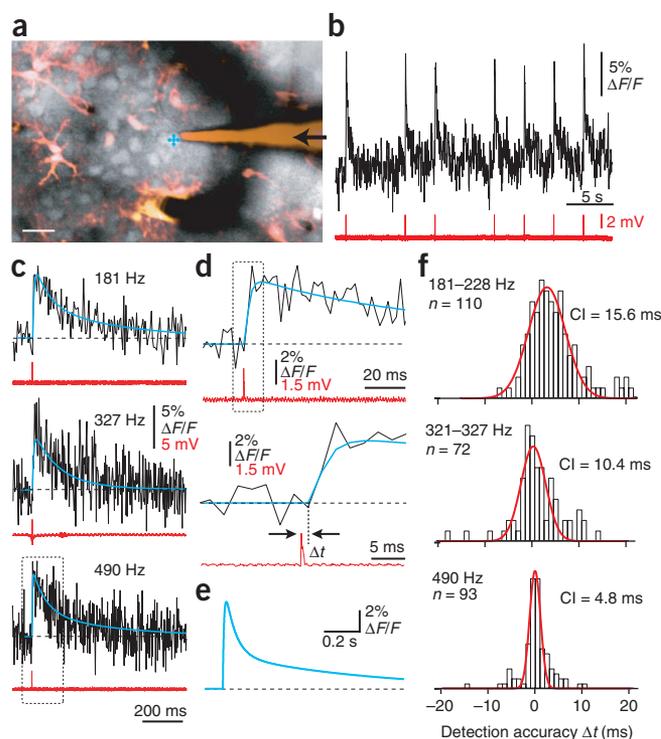
cell sampling conditions ( $n = 3$  at 181–228 Hz, groups of 72–91 cells sampled;  $n = 4$  at 321–327 Hz, 51–55 cells sampled;  $n = 3$  at 490 Hz, 34 cells sampled). In all cases 1AP-evoked calcium transients were clearly resolved (**Fig. 3b,c**). For a quantitative analysis of the reliability of spike detection, we developed an automated event detection algorithm based on a Schmitt trigger approach (Online Methods). From 293 total events that were mainly 1APs with a few doublets, 280 (95.5%) were correctly detected and 13 were missed (4.5% false negatives; 23 min cumulative recording time). Five events were incorrectly assigned (1.7% false positives). All action potential doublets (2–10 ms interspike interval) were detected, and 77% of them (17 out of 22) were correctly identified as doublets by the algorithm based on the expected integral of a 1AP-evoked calcium transient. The reliability of event detection was independent of whether spikes occurred spontaneously (1.5% false positives; 1/67 events) or whether they were evoked by air-puff whisker stimulation (1.8%; 4/221). To assess potential neuropil contamination of the somatic

per cell (**Fig. 2d**): 16 neurons can be recorded at very high rate (1 kHz), 30–40 cells at about 500 Hz, and groups of 100 cells at 167 Hz. Similar hyperbolic relationships between sampling rate and cell number hold for RAPS patterns with different numbers of points (**Fig. 2d**).

### Reliable spike detection with near-millisecond precision

To directly examine whether single action potentials (1APs) can be detected and how precisely their timing might be inferred from the fluorescence traces, we combined RAPS with juxtacellular electrical recordings from individual neurons (**Fig. 3a**). We obtained simultaneous optical and electrical recordings from 10 L2/3 neurons in mouse barrel cortex using three different

**Figure 3** | Determining spike times from AOD-based optical recordings. **(a)** L2/3 cell population labeled with OGB-1 and sulforhodamine 101. A juxtacellular recording was obtained with a patch pipette (arrow) from the neuron marked with the five-point RAPS pattern (blue). Scale bar, 20 μm. **(b)** Simultaneous fluorescence measurement (top) and electrical recording (bottom) of one out of 51 neurons sampled at 327 Hz (neuron marked in **a**). Fluorescence trace was smoothed with a five-point box filter. **(c)** Example 1AP-evoked calcium transients for three different cells measured for 91 neurons sampled at 181 Hz (top), 51 neurons at 327 Hz (middle) and 34 neurons at 490 Hz (bottom; dashed box indicates the close-up shown in **d**). Blue traces are curve fits to the unfiltered raw fluorescence data. Dashed lines indicate zero lines. **(d)** Close-up of the initial phase of the calcium transient marked by the dashed box in **c** and the corresponding juxtacellular voltage recording (top). The onset of the fluorescence trace was fit with a rising exponential and an exponential decay (blue trace). Further zoom-in (bottom), with arrows marking the time difference,  $\Delta t$ , between the spike time predicted from the onset fit and the actual spike time (0.85 ms in this case). **(e)** Average 1AP-evoked calcium transient pooled over all confirmed 1AP events independent of cell sampling rate ( $n = 250$ ). **(f)** Summary histograms of the distribution of  $\Delta t$  measured under the three sampling conditions. CI, 95% confidence intervals obtained from Gaussian fits (red curves;  $n$  is total number of events in each group).



transients, we averaged failures to whisker stimulation, revealing small ( $\sim 1\%$ ) fluorescence transients hidden in the noise (Supplementary Fig. 3). We confirmed a negligible neuropil contamination by direct comparison of fluorescence transients in somata and surrounding neuropil, demonstrating in particular apparent failures to evoke action potentials in the presence of large concomitant neuropil signals (Supplementary Fig. 3).

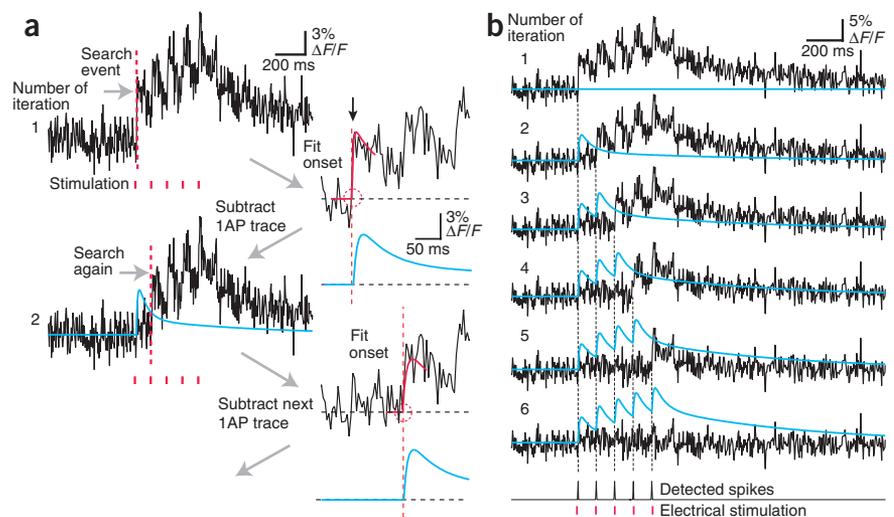
Each fluorescence transient detected was fitted in a two-step procedure with a model function composed of a single-exponential rise and a double-exponential decay. We chose two decay components because a rapid initial decay phase was apparent in the majority of transients (Fig. 3c,d and Supplementary Fig. 4). In the first step, we fitted the onset to determine the start of the event and the onset time constant. Then we fitted the entire calcium transient to obtain estimates of amplitudes and time constants for the two decay components (Online Methods). Results were independent of cell sampling rate, and thus we pooled them. Onset time constant was on average  $8.1 \pm 0.5$  ms (constrained to 2–30 ms,  $n = 250$  1AP events; mean  $\pm$  s.e.m.).

Amplitudes (decay time constants) were  $7.7 \pm 0.2\%$  ( $56 \pm 3$  ms) and  $3.1 \pm 0.1\%$  ( $777 \pm 80$  ms) for the fast and slow component, respectively. The average peak amplitude of the fitted calcium transients was  $7.2 \pm 0.2\%$ . Hence, our analysis revealed a stereotypical 1AP-evoked calcium transient (Fig. 3e) that we used for subsequent analysis of spike trains. We defined the SNR as peak amplitude of the 1AP-evoked calcium transient divided by baseline noise. Baseline noise, defined as the s.d. of the fluorescence trace at rest, was low ( $2.1 \pm 0.34\%$  relative fluorescence change,  $\Delta F/F$ ) yielding SNR values of 2–5 (mean  $\pm$  s.e.m.,  $3.5 \pm 0.06$ ; Supplementary Fig. 4). We conclude that AOD-RAPS allows reliable detection of 1AP-evoked calcium transients.

Using the spike time estimate provided by the onset fit (Fig. 3d), we quantified how accurately spike times can be determined using RAPS. The time difference,  $\Delta t$ , between the estimated and the actual spike time was  $4.7 \pm 0.6$  ms,  $1.1 \pm 0.6$  ms and  $0.27 \pm 0.35$  ms for  $\sim 200$  Hz,  $\sim 325$  Hz and 490 Hz cell sampling rate, respectively (mean  $\pm$  s.e.m.;  $n = 110, 72$  and 93). The mean of the  $\Delta t$  distribution thus reports spike time with an accuracy on the order of the sampling interval or better. To quantify the uncertainty in this spike time estimate, we constructed histograms of  $\Delta t$  for all sampling conditions and determined the width of these distributions from Gaussian fits. The 95% confidence intervals ( $\pm 2$  s.d.) were 15.6, 10.4 and 4.8 ms for  $\sim 200$  Hz,  $\sim 325$  Hz and 490 Hz cell sampling rates, respectively (Fig. 3f). We conclude that AOD-RAPS reveals spike times with near-millisecond precision and 5–15 ms confidence intervals.

### A peeling algorithm for automated spike-train reconstruction

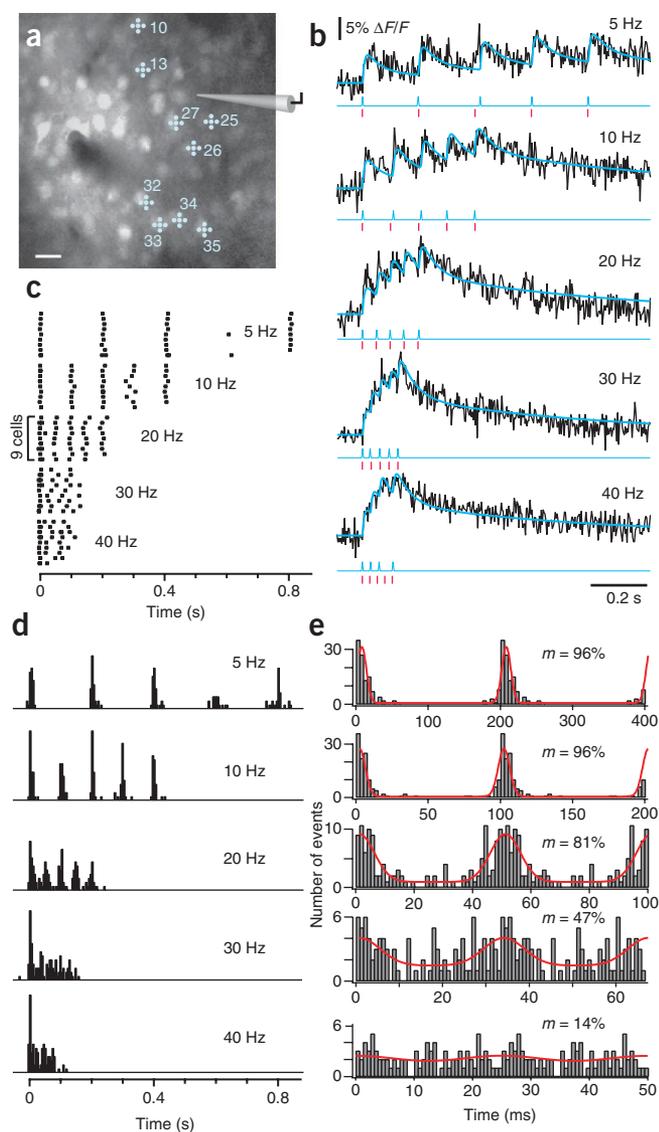
Calcium transients summate during higher-frequency spike trains ( $>1$  Hz) because they last longer than action potentials.



**Figure 4** | Peeling algorithm for extracting spike trains from fluorescence transients. **(a)** Illustration of the automated peeling procedure. In the initial step, a first ‘event’ is detected using a customized Schmitt-trigger threshold routine. The onset of the detected calcium transient is fit within a short time window (red curve) in order to obtain a good estimate of the starting point of the event (red circle). Then a stereotypical 1AP-evoked calcium transient is placed with its start at this time point and is subtracted from the original fluorescence trace. Then the algorithm starts the next iteration on the resulting difference trace. **(b)** Example of the extraction of a train of five action potentials evoked by electrical stimulation at 10 Hz. For each iteration, the residual fluorescence trace as well as the accumulated trace of all 1AP-evoked calcium transients thus far extracted (blue trace) are depicted. After five iterations, no additional event was found in the residual fluorescence trace. At the bottom, detected spike times are shown together with the stimulus times.

Reconstruction of spike trains from noisy fluorescence traces thus is a chief goal of *in vivo* calcium imaging experiments<sup>1,21</sup>. We developed a new spike-train reconstruction algorithm that is based on ‘peeling’ off 1AP-evoked calcium transients from the fluorescence trace until the entire spike train is uncovered (Online Methods). The principle of this automated algorithm is to (i) find the first event using the event detection algorithm, (ii) fit the onset to derive the timing of the first spike and (iii) subtract the stereotypical 1AP-evoked calcium transient placed at this time point from the fluorescence trace (Fig. 4a). These three steps are repeated until no additional events are found in the residual fluorescence trace (Fig. 4b and Supplementary Movie 2). This procedure assumes an elementary 1AP-evoked calcium transient and linear summation, which were reasonable approximations under our experimental conditions because dye saturation hardly affected even the largest transients analyzed (Supplementary Fig. 5).

We first applied the peeling algorithm to investigate how well bursts of action potentials can be reconstructed from optical recordings using RAPS. To systematically induce spike trains in the 5–40 Hz frequency range, we directly stimulated neuronal populations with short electrical pulses<sup>22</sup> through a patch-pipette positioned in L2/3 (Fig. 5a). We increased stimulus intensity stepwise until a subpopulation of neurons reliably responded. At low frequencies, individual calcium transients were clearly discernible but they became increasingly harder to discriminate at higher frequencies (Fig. 5b). The largest fluorescence changes with 40 Hz stimulation were about 25–30%, which was still much lower than saturating fluorescence changes under our conditions (maximal relative fluorescence change ( $\Delta F/F_{\max}$ ) = 93%;



**Figure 5** | Spike train reconstruction for bursts with different action potential frequency. **(a)** Two-photon image of a L2/3 neuronal population in mouse barrel cortex labeled with OGB-1. Trains of 5 electrical stimuli at variable frequency were applied extracellularly through a micropipette. In this example, 9 out of 40 neurons sampled at 416 Hz using five-point RAPS responded reliably to the electrical stimulation. Responding cells are marked with cell numbers and schematic scan pattern. Scale bar, 20  $\mu$ m. **(b)** Example fluorescence transients for stimulus frequencies of 5–40 Hz from a neuron in another experiment. Blue traces are model traces reconstructed by the peeling algorithm. Extracted spike times (blue) are shown together with the stimulus times (red). **(c)** Raster plots of the spiking responses to stimulation at different frequencies for the nine neurons marked in **a**, extracted using the peeling algorithm. The length of individual ticks reflects the confidence interval of spike detection from 1AP-evoked calcium transients. **(d)** Summary histograms of reconstructed spiking responses to stimulation at different frequencies ( $n = 29$  cells from three experiments; RAPS rates, 278–416 Hz). Note that the stimulus frequency is still apparent in the 20-Hz histogram. **(e)** Phase analysis of spiking responses to the burst stimulation. Spike times were recalculated modulo the duration of one stimulus cycle, and histograms were accumulated, revealing the phase relationship of detected spikes relative to the stimulus interval. For better visibility, two cycles containing the same datasets are shown side by side. Red traces are curve fits with a Gaussian function, revealing peak amplitude  $A_{\max}$  and basal offset  $A_{\min}$ . Values for the modulation, calculated as  $m = (A_{\max} - A_{\min}) / (A_{\max} + A_{\min})$ , are indicated.

on a fast time scale, we measured population spiking dynamics in primary sensory areas of the neocortex. First, we recorded population response in the barrel cortex while repetitively stimulating the contralateral whiskers with a 5-Hz train of 5 air puffs (**Fig. 6a**). The sensory-evoked responses in individual neurons as well as in the sampled population showed trial-to-trial variability with apparent failures to respond to particular stimuli during the air-puff trains (**Fig. 6b,c** and **Supplementary Fig. 6**). The cell sampling rate (298 Hz; 95% confidence interval, 10.4 ms) was sufficient to resolve differences in global latency of population responses, which were in the range of 10–20 ms and may have originated from distinct states of ongoing activity at the time of stimulation (**Fig. 6b**). For example, the population response to the first stimulus was significantly delayed in trial 1 compared to the response in trial 5 (mean onset difference, 9.1 ms;  $P < 0.001$ ). Notably, the spatial dynamics of population activity within a few tens of milliseconds after individual air puffs could be visualized in movies based on the automatically detected spike times and taking into account the confidence interval of spike time reconstruction (**Supplementary Movie 3**).

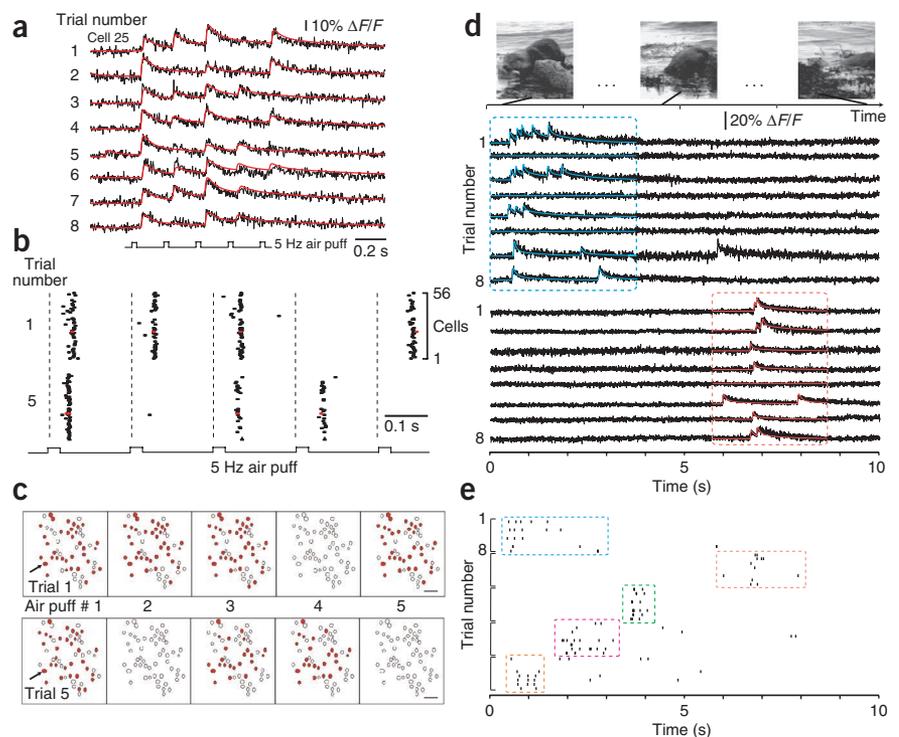
Second, we measured spiking activity in mouse primary visual cortex in response to the presentation of a natural movie of 10 s duration. In three experiments we found several neurons that responded consistently during brief epochs (around 1–2 s duration) at particular time periods during the movie (**Fig. 6d**), which is in agreement with electrophysiological findings<sup>23</sup>. With the peeling algorithm, we extracted spike raster plots, revealing within-epoch variability of spike numbers and spike timing (**Fig. 6e**). These examples demonstrate that AOD-RAPS resolves spatiotemporal dynamics of sensory-evoked spiking activity in neocortical neural networks on a subsecond time scale.

Online Methods). For each trace, we used the peeling algorithm to reconstruct a model trace of accumulated calcium transients and to extract a raster plot of the detected spike times. A summary raster plot for one experiment (**Fig. 5c**) as well as cumulative spike time histograms for five experiments (**Fig. 5d**;  $n = 29$  cells) indicate that the imposed burst frequency is well extracted up to 20 Hz, but it cannot be clearly resolved at higher frequencies. This finding was corroborated by an additional phase analysis, in which we generated histograms of the spiking phase within the stimulus cycles for all spikes in the train (**Fig. 5e**). The widths of Gaussian fits to these phase histograms were on the order of 5 ms and the modulation was high (>80%) up to 20 Hz stimulus frequency, 47% at 30 Hz, but strongly reduced at 40 Hz (**Fig. 5e**). We conclude that AOD-RAPS permits reconstruction of spike times for bursts of action potentials with frequencies up to 20 Hz and with confidence intervals on the order of 20 ms.

### Spatiotemporal dynamics of sensory-evoked spiking activity

To directly determine whether the combination of AOD-RAPS and peeling analysis facilitates *in vivo* studies of neural coding

**Figure 6** | Subsecond trial-to-trial variability of sensory-evoked responses in mouse neocortex. (a) Example calcium transients in an L2/3 neuron of mouse barrel cortex in response to stimulation with a 5-Hz train of air puffs (five-point RAPS at 298 Hz, 56 neurons sampled, eight consecutive trials). Model traces reconstructed by the peeling algorithm (red) indicate detected action potentials, including putative evoked doublets and triplets. (b) Population raster plots for two selected trials (all trials are shown in **Supplementary Fig. 6**). Vertical dashed lines indicate air-puff stimulation triggers. Tick length reflects confidence interval for spike reconstruction (red ticks indicate spikes for the neuron shown in **a**). (c) Snapshots of the subpopulations activated by an air-puff train for trial 1 and 5. Active cells that elicited at least one spike within a 50-ms time window after a stimulus are marked in red (arrow points to example cell in **a**). (d) Three chronological scenes from a 10-s natural movie that was repeatedly presented to the contra-lateral eye (top). Example fluorescence transients from two L2/3 neurons in mouse visual cortex evoked by eight consecutive presentations of the movie (two different five-point RAPS experiments at 278 Hz and 309 Hz). Response epochs are indicated by a blue and a red box. Overlaid colored traces in boxes are model traces reconstructed by the peeling algorithm. (e) Raster plots of reconstructed spiking responses to eight repeats of the movie presentation for five neurons that showed reliable activation during specific epochs of the movie (indicated by boxes).



## DISCUSSION

Here we overcame a major limitation of optical recordings from neuronal populations by demonstrating two-photon imaging of neural networks in the intact brain with unprecedented temporal resolution. Compared to previous *in vivo* experiments using galvanometer-based frame scanning at 1–30 Hz<sup>3,4,6,8</sup>, our AOD-based scanning system achieved cell sampling rates up to 500 Hz, gaining a factor of 10–100 in temporal resolution. Previous AOD-based two-photon microscopes have achieved similar scanning speed but they were mainly used for calcium imaging of neuronal dendrites in brain slices<sup>14–16</sup>. Here our aim was to design a relatively simple microscope that efficiently delivers short laser pulses to the intact brain and thus enables *in vivo* application. All main microscope components are readily available, and beam path alignment is straightforward, with the DCU prism and the AODs as key adjustable components. Alternatively, fast cell sampling might be achievable with special galvanometric line-scan techniques<sup>12,24</sup>. However, these techniques still waste some scan time on background areas and lack the flexibility to scan arbitrary patterns; it is currently unclear whether they can provide sufficient SNR for measuring population activity *in vivo*.

Our AOD-RAPS mode extends previous random-access scanning modes<sup>14,15</sup>. By scanning a small point pattern on each individual neuron, we achieved a high SNR while minimizing photobleaching and photodamage. The resulting SNR of about 3.5 for IAP-evoked calcium transients enabled us to detect spikes with high reliability (>95%) and with near-millisecond precision. Our ability to simultaneously attain high SNR and high cell sampling rates is explained by the fact that the effective dwell times per cell are similar to those of slower frame scanning systems<sup>4,6–8,25</sup>. The high temporal resolution was particularly beneficial for

characterizing IAP-evoked calcium transients in detail. We confirmed peak amplitudes of 7–8% for IAP-evoked somatic calcium transients<sup>4,8</sup> but also found that their decay typically consisted of a fast and a slow component. The initial fast component (<100 ms) might be undersampled with low-speed systems, which could partially explain difficulties to detect IAPs.

Various methods have been explored for inferring spike trains from calcium indicator fluorescence measurements, including deconvolution techniques<sup>26</sup>, template matching<sup>6,7</sup>, model-based fitting<sup>25</sup> and sequential Monte Carlo methods<sup>27</sup>. With our new iterative ‘peeling’ algorithm, we could resolve spike times for spikes spaced as close as 40–50 ms apart. The peeling algorithm is generally applicable and computationally simple. In its simplest version described here the algorithm assumes a stereotypical calcium transient and neglects dye saturation. Various extensions are possible though; for example, different IAP transient waveforms are likely to apply for different cell types and for large calcium changes the reduction in the fluorescence transient amplitude with increasing dye saturation could be incorporated.

Although in this work we collected *in vivo* measurements in two dimensions, our approach should be extendable to three dimensions using either mechanical z-dimension scanning<sup>5</sup> or chirped acoustic waves in a series of AODs<sup>16,28</sup>. We expect that high-speed measurements could be especially beneficial for analyzing spike sequences in specific neuronal subsets after slower screening of large populations for relevant subensembles. Retrograde labeling techniques and transgenic mice with fluorescent protein expression could be particularly helpful for guiding measurements to specific cell types. Moreover, the use of genetically encoded calcium indicators<sup>9–11,29</sup> with high-speed calcium imaging opens new opportunities for repeated long-term functional interrogation

of neuronal networks. A particular challenge will be to perform high-speed AOD-based calcium imaging in awake animals, where motion artifacts need to be minimized or corrected for<sup>30,31</sup>.

The combination of fast optical recording and automated spike train reconstruction will facilitate studies of various aspects of neural coding. First, a better characterization of bursting behavior of cortical neurons should be possible, which appears to be enhanced during wakefulness<sup>25,32</sup>. Second, phase-relationship studies of action potential firing with respect to global neuronal oscillations such as hippocampal 4–10 Hz theta oscillations<sup>33</sup> should be feasible. Third, high-speed imaging should enable detailed analysis of the variability of absolute (in a cell) and relative (between cells) spike timing, addressing the question of temporal versus rate coding<sup>34</sup>. Finally, recording a few neurons at highest speed (0.5–1 kHz) may allow optical investigation of network plasticity that is likely to be ruled by relative spike timing differences on the order of a few ten milliseconds<sup>35,36</sup>. AOD-based *in vivo* imaging thus is likely to become a versatile technique for studying fundamental principles of neural information processing in microcircuits of the brain.

## METHODS

Methods and any associated references are available in the online version of the paper at <http://www.nature.com/naturemethods/>.

Note: Supplementary information is available on the Nature Methods website.

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## AUTHOR CONTRIBUTIONS

B.F.G. and F.H. designed and optimized the AOD-based microscope system; B.F.G. built the microscope; B.F.G. and D.L. designed the data acquisition software; B.F.G. and H.K. designed the AOD control electronics; B.F.G. performed all *in vivo* experiments; F.H. developed the peeling algorithm for spike train reconstruction; B.M.K. helped with animal preparation and *in vivo* experiments; B.F.G. and F.H. analyzed the data and wrote the manuscript.

## COMPETING FINANCIAL INTERESTS

The authors declare no competing financial interests.

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## ONLINE METHODS

**AOD-based two-photon microscopy.** We used a custom-built two-photon microscope based on two-dimensional laser scanning with a pair of AODs. Optical components were mounted on a vertical X95 profile column (X95-750; Linos) attached to an x-y motorized stage (KT 310; Feinmess) to permit lateral movements of the microscope. Laser pulses of about 130-fs width at 850 nm wavelength were provided by a Ti:sapphire laser system (>3 W maximum average power; Chameleon Ultra II; Coherent). Laser intensity was modulated with a Pockels cell (model 350-80; Conoptics) and the laser beam was 3× expanded with a variable beam expander (S6ASS2075, Silloptics). Owing to its intrinsic divergence, the laser beam further expanded along the 4.5-m optical path to a beam diameter of 7.9 mm at the AOD aperture (full  $1/e^2$  width). Scan lens (achromatic,  $f_{SL} = 300$  mm, NIR coating; Thorlabs) and tube lens (achromatic,  $f_{TL} = 180$  mm; Olympus) were chosen to realize a maximum scanning field of  $305 \mu\text{m} \times 305 \mu\text{m}$  under a 40× objective. All experiments were performed with a water-immersion objective (40× LUMPlanFl/IR, numerical aperture (NA) 0.8, back aperture 7.2 mm; Olympus). The 0.6× demagnification of scan- and tube-lens telescope resulted in a beam diameter of 4.9 mm at the objective's back aperture, which hence was underfilled. The microscope objective and the fluorescence detection system were mounted on a motorized z-dimension stage (PMT 160 DC; Feinmess). Green and red fluorescence signals were detected in two emission channels using photomultipliers (R6357; Hamamatsu), digitized at 20 MHz and digitally integrated using an FPGA board (PXI-8713R; National Instruments). Scan signals for the AODs, including the RAPS mode, and data acquisition were controlled with software custom-written in the LabView environment (National Instruments).

We chose two orthogonally mounted AODs (DTSXY-A12-850, AAoptoelectronics) optimized for high transmission and an adequate resolution over a large field of view (FOV) (10 mm active aperture, 47 mrad total scan angle  $\Theta$ , ~55% transmission at  $\lambda = 850$  nm). For a Gaussian laser beam with full  $1/e^2$  width  $D$  the maximum number of resolvable spots per axis is given by  $N = \pi/4 \times \Theta \times D/\lambda$  (see, for example, ref. 18). With slightly underfilled AOD aperture ( $D = 7.9$  mm), we calculate 342 resolvable spots, and given our FOV of  $305 \mu\text{m}$ , a theoretical focal spot size of about  $0.9 \mu\text{m}$ , in close agreement with the results from the bead measurements (**Supplementary Fig. 1**). We thus conclude that the small scan angle of the AODs rather than the diffraction limit of the underfilled objective, which would yield about  $0.5 \mu\text{m}$  resolution, is the major limiting factor for spatial resolution in our microscope. Because efficient *in vivo* imaging of cell bodies over a substantial FOV size was our primary goal, this spatial resolution was adequate for our purposes.

As reported in another study<sup>15</sup>, the transition time of AODs can be substantially shortened compared to the theoretical value. The reason is that within about 66% of the nominal transition time (given by the passage time of the sound wave across the full beam diameter at the AOD aperture) more than 90% of the laser power is redirected to the new position, meaning that <1% excitation remains at the original position. We adopted this approach and used a 10- $\mu\text{s}$  transition time between scan angles, which is 82% of the nominal transition time for our 7.9-mm beam size at the AOD aperture (12.2  $\mu\text{s}$ ; sound velocity  $650 \text{ m s}^{-1}$ ) and 66% of the nominal transition time for the fully filled AOD aperture (15.4  $\mu\text{s}$ ). In agreement with the previous report<sup>15</sup>, we did not observe any measurable effect on image quality.

**Dispersion compensation unit.** Spatial and temporal dispersive effects caused by the acousto-optic material were compensated with a single prism (SF11, apex angle  $60^\circ$ , uncoated; Thorlabs) before the first AOD<sup>17,37</sup>. By tuning the laser beam's incident angle on the prism to the theoretical value of  $53^\circ$ , we could counterbalance spatial dispersion effect nearly perfectly for the center of the FOV (**Supplementary Fig. 1**). The appropriate distance of the prism from the first AOD for minimizing laser pulse width after the AODs was about 35 cm, as determined by pulse length measurements with a frequency-resolved optical gating (FROG) device (Grenouille; Swamp Optics; the beam profiler option of the FROG was also used for measurement of the beam diameter along the optical path). Two  $\lambda/2$  waveplates (RZ-1/2-850; Thorlabs/OFR) were used to appropriately turn laser beam polarization for maximizing light transmission. A cylindrical lens telescope composed of two plano-convex cylindrical lenses ( $f_1 = 100$  mm,  $f_2 = 50$  mm, achromatic, N-BK7, near-infrared (NIR) coating; Thorlabs) was necessary to counterbalance the unidirectional demagnification caused by the asymmetric beam pathway of the laser beam through the prism (beam ellipticity of 0.61 if not corrected).

**Mouse preparation and fluorescence labeling.** All animal procedures were carried out according to the guidelines of the Center for Laboratory Animals of the University of Zurich and were approved by the Cantonal Veterinary Office. Wild-type mice (16–28 days old) were anesthetized with urethane (1.2–1.5  $\text{g kg}^{-1}$  of body weight, intraperitoneally) or isoflurane (1–2% in oxygen). A craniotomy above the somatosensory cortex was prepared as described previously<sup>4,19</sup>. The dura was carefully removed, and the exposed cortex was superfused with normal rat Ringer (NRR) solution (135 mM NaCl, 5.4 mM KCl, 5 mM HEPES, 1.8 mM  $\text{CaCl}_2$ ; pH 7.2 with NaOH). To dampen heartbeat- and breathing-induced motion, the cranial window was filled with agarose (type III-A, Sigma; 1% in NRR) and covered with an immobilized glass cover slip.

Cell populations were labeled in superficial neocortical layers with the calcium indicator Oregon Green BAPTA-1 (Molecular Probes, Invitrogen) using the multicell bolus loading technique<sup>2,38</sup>. Briefly, 50  $\mu\text{g}$  of the membrane-permeant acetoxymethyl (AM) ester form of OGB-1 were dissolved in DMSO plus 20% Pluronic F-127 (BASF) and diluted in NRR to a final concentration of about 1 mM. This solution was pressure-ejected into neocortical layer 2/3 in barrel cortex or visual cortex using a micropipette<sup>4</sup>. Brief (10 min) application of sulforhodamine 101 (50  $\mu\text{M}$  in NRR) to the exposed neocortical surface resulted in labeling of the astrocytic network<sup>19</sup>.

**Calcium imaging and electrophysiology.** Frame scanning with 10- $\mu\text{s}$  pixel-to-pixel transition time and 2- $\mu\text{s}$  pixel dwell times was used to obtain overview images of neuronal populations in L2/3. Groups of cell somata in the focal plane were manually selected for random-access scanning, and cell positions were saved. Fluorescence signals were recorded using RAPS to maximize SNR while minimizing bleaching effects. In this study, we used a cross-like five-point pattern with point-to-point distance of  $1.5 \mu\text{m}$  so that all points were contained within the somatic area. The total scan time per cell was 60  $\mu\text{s}$  with an effective on-cell signal integration time of 50  $\mu\text{s}$  (**Fig. 2**). The stability of fluorescence levels during five-point RAPS was evaluated by measuring the baseline fluorescence from neurons that were imaged in 21 imaging

sessions of 20-s duration (7 min cumulative scanning time). On average, fluorescence intensities of cells slightly decreased to  $94.1 \pm 0.1\%$ , indicating some photobleaching ( $n = 80$  cells from 3 measurements; **Supplementary Fig. 2**). Neighboring control neurons, which were not included in the RAPS recording but only rarely imaged using frame scans every 30 s, showed stable fluorescence intensity ( $97.4 \pm 2.5\%$ ,  $n = 10$  cells). The observed fluorescence decrease was not specific to five-point RAPS as a similar decrease was seen for neurons that were imaged using galvanometric frame scanning with a standard two-photon microscope using similar laser power and total dwell time per cell (decrease to  $91.3 \pm 0.9\%$ ;  $n = 25$  cells from 3 measurements; **Supplementary Fig. 2**).

To evaluate potential contamination of somatic fluorescence transients by neuropil signals<sup>21</sup>, we performed five-point RAPS recordings of air-puff-evoked fluorescence transients from cell somata and simultaneously from the surrounding neuropil (**Supplementary Fig. 3**). Somatic and neuropil signals were independent from each other, showing all possible combinations of evoked signals and apparent failures. Notably, apparent failures to evoke action potentials were found in cases of large activation of the surrounding neuropil indicating a rather small contamination by neuropil. This conclusion was supported by identified failure events (no action potential evoked with air-puff stimulation) that could be identified in our combined electrical and optical recording dataset. Averaging fluorescence traces for these failures revealed signals with  $1.2 \pm 0.3\%$  amplitude that might represent small contamination by neuropil (**Supplementary Fig. 3**). Because these events are typically buried in noise and their integral is far below 50% of the expected integral for a 1AP-evoked transient, they will not be recognized by the peeling algorithm or discarded (see below).

Juxtacellular recordings were obtained from OGB-1-loaded L2/3 neurons. Cells were visually targeted in the frame scan mode of the AOD two-photon microscope. Borosilicate glass pipettes with open tip resistances of 4–8 M $\Omega$  were filled with extracellular solution containing Alexa Fluor 594 (50  $\mu$ M) for pipette visualization. Electrical signals were recorded with an Axoclamp 2-B amplifier (Axon Instruments) and digitized at 10 kHz with a PXI-6229 data acquisition card (National Instruments). For electrical stimulation experiments 200- $\mu$ s pulses (0.1–1 mA) were delivered through patch pipettes placed within the imaging area<sup>22</sup>. Sensory stimulation of the barrel cortex and the visual cortical areas was performed by 30-ms air puffs to the whiskers on the contralateral side of the face and by presenting a 10-s natural contrast movie to the mouse's contralateral eye (movie 161 from a published database<sup>39</sup>), respectively.

**Data analysis.** Somatic fluorescence signals were expressed as relative fluorescence changes ( $\Delta F/F$ ) after subtraction of the background, which was determined from a position inside a blood vessel lumen. All fluorescence traces in the figures are unfiltered except for the trace in **Figure 3b**, which was filtered with a five-point box filter to improve visibility of the compressed trace. Fluorescence traces and electrophysiological signals were analyzed with IGOR Pro software (Wavemetrics Inc.). Below we describe in detail the automated analysis routines that we developed for event detection, onset and decay fitting, and reconstruction of spike trains from superimposed fluorescence transients.

**Event detection.** Events were detected using a Schmitt trigger approach with additional criteria. A Schmitt trigger searches point

by point through a trace for events that first pass a high threshold and then stay elevated above a second lower threshold for at least a certain minimum duration. Shorter events are discarded. In our implementation we used +2 s.d. of the baseline noise (4.2%) as high threshold, -1 s.d. (-2.1%) as low threshold and typically 70 ms as minimum event length. To render our algorithm less sensitive to drifts in the baseline, we applied the Schmitt trigger in a sliding window approach in which a baseline was fit with a linear regression in a 0.4-s window before the current position. Offset and slope of this baseline were taken into account for the Schmitt trigger evaluation. An event detected by the Schmitt trigger had to fulfill two additional criteria to be accepted. First, the integral of the baseline-corrected fluorescence trace in the event window (from passing high threshold to falling below low threshold) was calculated and compared to the integral of a reasonable expectation of a 1AP-evoked calcium transient. The event was only accepted if the ratio of these two integrals was above 0.5, indicating a high probability that at least one action potential has occurred. The rounded ratio number was also used to estimate the number of nearly simultaneously occurring action potentials, that is, a ratio of between 1.5 and 2.5 indicated the occurrence of a doublet. As last criterion, a similar integral comparison was performed on a shorter time window (within 40–60 ms after high-threshold crossing) to ensure that only events with rather sharp onset, as expected for action potential-evoked calcium transients<sup>40</sup>, were selected. For accepted events, the routine returned the time point of high-threshold crossing as an initial guess of the event start.

**Onset fit.** Onsets of detected events were fitted within a window of  $\pm 40$  ms ( $\pm 60$  ms for  $\sim 200$  Hz cell sampling rate) around the initial guess  $t_0$  from the event detection routine with the following function:

$$f_{\text{onset}}(t) = A(1 - e^{-(t-t_0)/\tau_{\text{on}}})e^{-(t-t_0)/\tau_1} \quad \text{for } t > t_0$$

$$f_{\text{onset}}(t) = 0 \quad \text{for } t \leq t_0 \quad (1)$$

Before fitting, baseline offset and linear drift were subtracted from the trace segment. An exponentially decaying component ( $\tau_1$  set to a fixed value of 70 ms) was included because fluorescence traces typically already started to decay within the chosen time window. The free parameters were  $t_0$ ,  $\tau_{\text{on}}$  and  $A$ .  $t_0$  was constrained to the fit window and  $\tau_{\text{on}}$  was constrained to 2–30 ms to avoid artificially steep or shallow onsets. The major goal of onset fitting was to obtain a good estimate of  $t_0$ .

**Fitting of entire 1AP-evoked fluorescence transients.** The high-speed measurements revealed that the decay of action potential-evoked somatic calcium transients in most cases could not be well described with a single-exponential curve. Several decay components may be expected as the spatiotemporal dynamics of intracellular calcium concentration in the soma is governed by multiple processes, including calcium diffusion and buffering in the cytosol and in the nucleus as well as uptake and extrusion mechanisms<sup>41</sup>. We therefore used a calcium transient waveform with sharp exponential onset and a slower double-exponential decay to fit the fluorescence trace:

$$f_{\text{Ca}}(t) = \left(1 - e^{-(t-t_0)/\tau_{\text{on}}}\right) \left(A_1 e^{-(t-t_0)/\tau_1} + A_2 e^{-(t-t_0)/\tau_2}\right) \quad \text{for } t > t_0$$

$$f_{\text{Ca}}(t) = 0 \quad \text{for } t \leq t_0 \quad (2)$$

$A_1$ ,  $\tau_1$ ,  $A_2$  and  $\tau_2$  were fitting variables while  $t_0$  and  $\tau_{on}$  were constrained to the values determined by the onset fitting routine. The fit range was from  $t_0$  to 1.5 s thereafter.

For the juxtacellular recordings, spike times  $t_s$  were determined as the time point of the positive peak of the extracellular spike, which coincides with the steepest rise in membrane potential during the action potential. As the evoked calcium influx occurs during the repolarizing action potential phase<sup>42</sup>, which is about 1 ms after the steepest rise in neocortical pyramidal neurons<sup>43</sup>, we calculated the time difference between optical estimate and actual spike time as  $\Delta t = t_0 - (t_s + 1 \text{ ms})$ .

#### Peeling algorithm for automated spike train reconstruction.

To reconstruct complex spike trains, we developed a generalized approach for automatically extracting spike times from arbitrary fluorescence traces. We assumed that each fluorescence trace represents the linear summation of 1AP-evoked calcium transients with a stereotypical waveform. This assumption is justified because the largest transients under our conditions (25–30%  $\Delta F/F$ ) were little affected by dye saturation (see below). The principle of the algorithm is to iteratively subtract ('peel off') an 1AP-evoked calcium transient waveform at the detected event times from the fluorescence trace until a model trace of the compound calcium transients is reconstructed and a noisy residual trace remains (Fig. 4 and Supplementary Movie 2). In our implementation we always used the estimate of the 1AP-evoked calcium transient waveform from the combined electrical (juxtacellular) and optical recordings for subtraction (Fig. 3e). To accommodate slight cell-to-cell variations in calcium transient amplitude, this waveform was scaled in some experiments (0.7–1.3 scale factor). To prevent subtraction of erroneous events we performed an 'integral check': subtraction of the 1AP-evoked calcium transient was only accepted if it did not produce a negative integral in the residual trace (more than 50% of the negative of the integral of a 1AP-evoked transient); otherwise the subtraction was undone and the procedure moved on to the next event found. For accepted events the algorithm 'jumped back' on the trace (typically 200 ms) after waveform subtraction and started the search for the next event. The peeling algorithm is computationally simple and can be implemented effectively as a fast procedure. We used a macro implementation in the IGOR software (Wavemetrics).

**Modeling of summation of  $[Ca^{2+}]_i$  transients.** To assess the amount of dye saturation during repetitive electrical stimulation (Fig. 5), we first experimentally determined the maximal relative fluorescence change,  $\Delta F/F_{\max}$ , under our experimental conditions. After the usual OGB-1 staining procedure we deliberately destroyed L2/3 neurons by applying strong electrical shocks through a local micropipette while simultaneously monitoring fluorescence changes. Analysis of neurons, for which cell damage was obvious as a sudden fluorescence increase to a stable ceiling value, yielded an average  $\Delta F/F_{\max}$  value of  $93 \pm 15\%$  ( $n = 10$  cells; mean  $\pm$  s.d.). Together with reasonable assumptions of 50 nM for the resting intracellular calcium concentration,  $[Ca^{2+}]_{\text{rest}}$ <sup>44,45</sup> and of 200 nM for the dissociation constant  $K_d$  of OGB-1 (ref. 45), we thus could convert the average 1AP-evoked  $\Delta F/F$  transient into an intracellular concentration transient of free calcium,  $[Ca^{2+}]_i$  transient using the standard single-wavelength conversion equation:

$$[Ca^{2+}]_i = \frac{[Ca^{2+}]_{\text{rest}} + K_d \frac{(\Delta F/F)}{(\Delta F/F)_{\max}}}{1 - \frac{(\Delta F/F)}{(\Delta F/F)_{\max}}} \quad (3)$$

The calculated 1AP-evoked  $[Ca^{2+}]_i$  transient had a peak amplitude of about 10 nM, which is consistent with previous calibrated  $[Ca^{2+}]_i$  measurements from neocortical neurons<sup>46</sup> (Supplementary Fig. 5). We then calculated  $[Ca^{2+}]_i$  elevations during burst stimulation at different frequency by assuming linear superposition of the individual  $[Ca^{2+}]_i$  transients. Despite the linear summation, compound  $[Ca^{2+}]_i$  traces seemed to show some degree of saturation; however, this misleading impression was due to the combination of the finite onset of the transient and the fast initial decay component (Supplementary Fig. 5a). The  $[Ca^{2+}]_i$  accumulations were then converted back into expected  $\Delta F/F$  changes according to:

$$(\Delta F/F) = (\Delta F/F)_{\max} \frac{([Ca^{2+}]_i - [Ca^{2+}]_{\text{rest}})}{([Ca^{2+}]_i + K_d)} \quad (4)$$

The  $\Delta F/F$  traces qualitatively looked similar to the linearly summed  $[Ca^{2+}]_i$  traces and an analysis of the  $\Delta F/F$  change evoked by the last stimulus in a burst revealed that the elementary  $\Delta F/F$  was reduced only little, even for the strongest stimulus (maximal reduction 20%; Supplementary Fig. 5b). The simulated model traces also were very similar to actual experimental data (Supplementary Fig. 5c). From this analysis we conclude that even with 40 Hz stimulation the observed fluorescence can be well approximated by a linear summation of elementary transients (see results of the peeling algorithm in Supplementary Fig. 5d).

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