# Bright and photostable chemigenetic indicators for extended in vivo voltage imaging

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Imaging changes in membrane potential using genetically encoded fluorescent voltage indicators (GEVIs) has great potential for monitoring neuronal activity with high spatial and temporal resolution. Brightness and photostability of fluorescent proteins and rhodopsins have limited the utility of existing GEVIs. We engineered a novel GEVI, "Voltron", that utilizes bright and photostable synthetic dyes instead of protein-based fluorophores, extending the combined duration of imaging and number of neurons imaged simultaneously by more than tenfold relative to existing GEVIs. We used Voltron for in vivo voltage imaging in mice, zebrafish, and fruit flies. In mouse cortex, Voltron allowed single-trial recording of spikes and subthreshold voltage signals from dozens of neurons simultaneously, over 15 min of continuous imaging. In larval zebrafish, Voltron enabled the precise correlation of spike timing with behavior.

Animal behavior is produced by patterns of neuronal activity that span a wide range of spatial and temporal scales. To understand how neural circuits mediate behavior thus requires high-speed recording from ensembles of neurons for long periods of time. Although the activity of large numbers of neurons can now be routinely recorded using genetically encoded calcium indicators (GECIs) (1), the slow kinetics of calcium signals complicate the measurement of action potentials, and sub-threshold voltage signals are missed entirely (1-3). Voltage imaging using genetically encoded voltage indicators (GEVIs) can overcome these challenges, enabling imaging of fast spikes and subthreshold dynamics in genetically defined neurons (4, 5). The high imaging speed and excitation intensity required for voltage imaging, combined with the smaller volume of the cellular membrane, place increased demands on voltage indicators relative to GECIs. Extant GEVIs rely on fluorescence from either microbial

rhodopsins (6-8) or fluorescent proteins (FPs) (9-13). These fluorophores lack the brightness and photostability to allow in vivo voltage imaging from large fields of view over time scales of many behavioral events, precluding the millisecond-timescale analysis of neural circuits. Improved rhodamine dyes such as the Janelia Fluor<sup>®</sup> (JF) dyes enable use in complex biological experiments because of their high brightness and photostability (14), compatibility with selflabeling protein tags (15, 16), and the ability to traverse the blood-brain barrier for in vivo delivery (17). We describe a "chemigenetic", or hybrid protein-small molecule, GEVI scaffold that we call Voltron, which irreversibly binds these synthetic fluorophore dves. Voltron provides an increased photon yield that enables in vivo imaging of neuronal spiking and subthreshold voltage signals in model organisms with order-of-magnitude improvement in the number of neurons imaged simultaneously over substantially longer

durations.

Our design for a chemigenetic voltage indicator combines a voltage-sensitive microbial rhodopsin domain (6, 7, 11) with a dye-capture protein domain (Fig. 1A) that irreversibly binds a synthetic fluorophore dye ligand (14, 15) (Fig. 1B), analogous to previously reported voltage indicators that use fluorescent proteins (10, 11, 18). Transmembranevoltage-dependent changes in the absorption spectrum (6, 19) of the rhodopsin domain of Voltron reversibly modulate the degree of fluorescence quenching of the nearby bound dye through Förster resonance energy transfer (FRET). We investigated the modularity of this approach, finding that three different rhodopsin domains, QuasAr1 (7), QuasAr2 (7), and Ace2N (11, 20), modulated the fluorescence of the rhodamine dye Janelia Fluor<sup>®</sup> 549 (JF<sub>549</sub>) after binding to either HaloTag (15) or SNAP-tag (21) dye-capture protein domains (figs. S1 to S8). Removing a small number of amino acid residues at the junction of the rhodopsin and selflabeling tag domains increased the amplitude of fluorescent voltage signals (fig. S1), presumably by decreasing average distance and thus increasing FRET efficiency between the dye and rhodopsin retinal cofactor. The configuration providing the best signal-to-noise ratio for spikes was Ace2N fused to HaloTag with five amino acids removed at their junction (Fig. 1, A and B, and fig. S2), hereafter referred to as Voltron.

We tested several Voltron-dye combinations in cultured rat neurons and acute mouse brain slices with high-speed imaging and simultaneous whole-cell patch clamp electrophysiology (Fig. 1C, figs. S6 and S9 to S13, and tables S1 and S2). Voltron could detect neuronal action potentials and sub-threshold potential changes with a variety of JF dye ligands with emission maxima between 520 nm and 660 nm using fluorescence imaging with one-photon excitation (Fig. 1, C to E, and fig. S6), but was not compatible with twophoton imaging, as described previously for rhodopsincontaining GEVIs (22, 23). Voltron bound to  $JF_{525}$ (Voltron<sub>525</sub>) exhibited the highest sensitivity, giving a fluorescence change of –23  $\pm$  1%  ${\bigtriangleup}F/F_0$  for a voltage step from – 70 mV to +30 mV (Fig. 1E and fig. S9); Voltron<sub>549</sub> showed similar sensitivity. Voltron<sub>525</sub> responded to voltage steps with submillisecond on and off time constants (table S3 and fig. S10). We compared the brightness and photostability of Voltron in neuronal cultures with those of two other fluorescent protein-based GEVIs: Ace2N-mNeon (11) and ASAP2f (13). Both Voltron<sub>525</sub> and Voltron<sub>549</sub> were brighter than Ace2N-mNeon (3-4-fold) and ASAP2f (16-18-fold) (Fig. 1F) in cell culture. This difference did not result from differences in expression; we compared the brightness of Voltron<sub>549</sub> and Ace2N-mNeon at the single-molecule level and observed a similar 3-4-fold brightness difference (Fig. 1G). Voltron<sub>525</sub> and Voltron<sub>549</sub> were also more photostable in ensemble measurements (Fig. 1H, tables S4 and S5, and figs. S14 and S15) as well as in single-molecule assays, in which photobleaching times were 8-fold longer for Voltron<sub>549</sub> than those of Ace2N-mNeon (Fig. 1I). Overall, the improved brightness and photostability of Voltron increased the photon yield by at least 10-fold in neurons over existing GEVIs that rely on fluorescence from FPs.

In vivo, Voltron could be reliably expressed and labeled with dye in mice, larval zebrafish, and adult fruit flies (Figs. 1 to 4 and figs. S16 to S19 and S21 to S45). Simultaneous in vivo electrophysiology and Voltron imaging in each of these organisms confirmed the detection of individual action potentials (Fig. 1, J and K, and figs. S17 to S19). For imaging in the mouse brain, we used a variant of Voltron appended with a 63 amino acid sequence from the rat potassium channel Kv2.1 that restricts expression to the membrane of the cell body and proximal dendrites (24, 25) (Voltron-ST, fig. S20). The rapid kinetics of Voltron<sub>525</sub>-ST allowed clear observation of action potentials in fast-spiking parvalbuminexpressing interneurons in the CA1 region of mouse hippocampus (Fig. 2, A to G, and fig. S21). We measured the orientation tuning of the spiking and subthreshold responses of cortical layer 2/3 pyramidal neurons in mouse primary visual cortex in response to the mouse observing directional movement of light and dark stripes, a benchmark for new indicators (1, 11) (Fig. 2, H to L, and figs. S22 to S24), and confirmed that spiking activity showed sharper orientation selectivity than did subthreshold voltage signals (26). We extended the imaging period over several consecutive weeks by injecting additional JF<sub>525</sub> HaloTag ligand prior to each imaging session (Fig. 2, J to L, and fig. S24).

Next, we attempted to image larger areas containing more neurons for longer times in vivo in mouse cortex (Fig. 3). By widefield microscopy at illumination intensities between 3 and 20 mW/mm<sup>2</sup>, we could clearly identify and distinguish action potentials from nearby neurons throughout 15 min of continuous imaging (SNR = 5.3 during the first minute, 4.4 during final minute); (Fig. 3, B to E). We expanded the field-of-view to include dozens of cortical interneurons labeled with Voltron<sub>525</sub>-ST in a transgenic mouse line (NDNF-Cre) (27), while imaging at 400 Hz (Fig. 3, F and G, and figs. S25 to S42). Overall, we imaged a total of 449 neurons (12 fields of view in 3 mice), demonstrating routine voltage imaging of populations of neurons in superficial mouse cortex (Fig. 3G and figs. S25 to S42). This scale of in vivo voltage imaging enabled analysis of membrane potential correlations between many neuron pairs (fig. S26).

We used Voltron to image behaving zebrafish larvae, which respond to visual input with fast, directed swim bouts that are tailored to the details of the stimulus (28). We sought to uncover how this sensory-to-motor transformation unfolds in neuronal populations at fine timescales that are

inaccessible with calcium imaging. We verified that Voltron could detect action potentials and subthreshold voltage signals in live zebrafish after labeling with several different colors of dye ligands (figs. S17 and S43). We then used Voltron<sub>525</sub> to monitor neural activity during swim bouts induced by visual motion (Fig. 4A). We recorded Voltron signals from 179 neurons across 43 fish in a motor-sensory nucleus in the tegmental area of the midbrain (Fig. 4B and fig. S44), yielding data on subthreshold membrane voltage modulation as well as automatically-detected spike times (Fig. 4C and fig. S45). We found neuron populations with different temporal activity patterns, including neurons whose firing rate increased ~1 s before the fish started swimming (fig. S44, B and C, "Ramp"), neurons whose firing rate was suppressed each time the fish swam (Fig. 4D. "Off"), and neurons that fired each time the fish swam (Fig. 4D, "Onset" and "Late"). Of the latter types, some fired just before swimming (~20 ms before swim onset, "Onset") and others fired just after swimming (~10 ms after swim onset, "Late"). There was a change in subthreshold voltage that preceded these firing-rate changes by tens of milliseconds (Fig. 4D and fig. S44D). The neuron types were spatially intermingled within this midbrain nucleus (Fig. 4, E and F). The existence of neurons that fired before swimming and neurons that fired after swimming may indicate that this nucleus both partakes in the generation of swim bouts and is influenced by the motor output (Fig. 4G). Thus, Voltron allows for the dissection of population motor coding and sensorimotor integration circuits in ways that neither single-cell electrophysiology nor population calcium imaging can.

We tested Voltron in adult Drosophila in vivo by expressing the protein in a pair of dopaminergic neurons, one in each brain hemisphere, which innervate a single compartment in the mushroom body. We detected strong spiking signals from axons and dendrites of these neurons with Voltron<sub>549</sub> (Fig. 1K and fig. S18). The fluorescence signals matched action potentials detected using electrophysiology. In some neuronal cell types in Drosophila, calcium indicators located in the cell body have failed to exhibit fluorescence changes even under conditions where high spike rates are expected (29). However, spikes were clearly detectable when imaging from the soma of dopamine neurons with Voltron (fig. S18E). We could clearly distinguish spikes from the two neurons based on the amplitude of the spiking signals even when imaging from neuropil where their axons overlap extensively, likely because each bilaterallyprojecting cell contributes a denser innervation of the mushroom body in the ipsilateral hemisphere (fig. S18D).

Combining the molecular specificity of genetically encoded reagents with the superior photophysics of chemical dyes is an established path to improved imaging reagents (14). However, previous attempts to create hybrid proteinsmall molecule indicators by various approaches have not been successful for in vivo imaging (30). We engineered a modular sensor scaffold in which the targeting and sensor domains are genetically encoded and only the fluorophore and its protein-binding anchor are synthetic. The resulting chemigenetic indicator, Voltron, exhibits increased photon output, enabling in vivo voltage imaging of many more neurons over longer times—approximately  $10^2$  more neuronminutes than other sensors. This improvement enables imaging experiments that can help reveal how the precise electrical dynamics of neuronal populations orchestrate behavior over different time scales.

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#### SUPPLEMENTARY MATERIALS

science.sciencemag.org/cgi/content/full/science.aav6416/DC1 Materials and Methods Tables S1 to S5 Figs. S1 to S45 References (*31–62*)

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Fig. 1 (preceding page). Development of the chemigenetic voltage indicator Voltron. (A) Schematic of Voltron sequence: A rhodopsin (Ace2) is fused to a self-labeling tag domain (HaloTag) with additional sequences added to improve or localize membrane targeting: endoplasmic reticulum export sequence (ER), Golgi export trafficking sequence (TS), and somatic targeting sequence (ST). (B) Model of Voltron mechanism. (C) Left panel: cultured rat hippocampal neuron expressing Voltron and labeled with JF<sub>525</sub>. Scale bar: 20 µm. Right panel: single-trial recording of action potentials and subthreshold voltage signals from current injections in primary neuron culture using 400 Hz imaging (top, fluorescence) or electrophysiology (bottom, membrane potential). (D) Fluorescence emission spectra of different JF dyes overlaid with the absorbance spectrum of Ace2N. (E) Fluorescence change as a function of membrane voltage with different JF dye-Voltron conjugates. (F) Relative fluorescence of ASAP2f, Ace2N-mNeon, Voltron<sub>525</sub> and Voltron<sub>549</sub> in cultured neurons (n = 70, 68, 48 and 62 measurements from five independent transfections for each construct). Illumination intensity  $\sim 10 \text{ mW/mm}^2$  at imaging plane. \*\*\*P < 0.001, one-way analysis of variance (ANOVA) followed by Bonferroni's test on each pair. Fluorescence was normalized to ASAP2f mean intensity. (G) Relative single molecule brightness of Ace2N-mNeon and Voltron<sub>549</sub>. \*\*\*P < 0.001, two-tailed Student's t-test. (H) Bleaching curves for ASAP2f, Ace2N-mNeon, Voltron<sub>525</sub>, and Voltron<sub>549</sub> in primary neuron culture. Illumination intensity ~23 mW/mm<sup>2</sup> at imaging plane. Bleaching curves were normalized to mean cellular fluorescence from (F) or normalized to the zero-time value (inset). (I) Mean time to bleach of Ace2N-mNeon and Voltron<sub>549</sub> during single-molecule imaging, 100 ms frames. \*\*\*P < 0.001, two-tailed Student's t-test. (J and K) Simultaneous in vivo Voltron imaging (300 and 800 Hz, top) and electrophysiology (bottom) in larval zebrafish (extracellular) and adult Drosophila (whole-cell), respectively. Spike-triggered averages are shown to the right.

Fig. 2 (next page). Membrane voltage dynamics in hippocampal parvalbumin (PV) neurons and visual cortex pyramidal neurons of mice using Voltron. (A) Schematic of imaging of spontaneous activity in the CA1 region of the hippocampus of an awake mouse. (B) Image of hippocampal parvalbumin neuron expressing Voltron labeled with JF<sub>525</sub>. (C to E) Voltron<sub>525</sub> raw DF/F<sub>0</sub> traces showing spontaneous spikes of a PV neuron (B) located at a depth of 60 µm in hippocampal CA1 region of a fully awake mouse imaged at 3858 frames per second. Boxes indicate intervals shown at expanded time scales. Scale bar: 20 µm. (F) Overlay of 177 spikes detected during a 15 s period (gray) and their average (black). (G) Spike shape of 11 PV neurons. (H) Schematic of imaging of primary visual cortex of an anesthetized mouse during display of drifting grating visual stimuli. (I) Example trace showing 500 Hz Voltron fluorescence during one trial of a sequence of visual stimuli. Arrows below represent the direction of movement of the drifting grating. (J to L) Top left, images of a pyramidal cell at a depth of 148  $\mu$ m, imaged three times over a period of four weeks on the indicated weeks after virus injection. Scale bar: 10 µm. Top right, average of all spikes in session (black) and standard deviation (grev). Middle, raw  $\Delta F/F_0$  trace for five repetitions in each session, showing two orthogonal orientations (indicated with arrows below) from the neuron pictured on the top left. Bottom, orientation tuning to full-frame drifting gratings of the neuron pictured on the top left, displayed from number of spikes during trials (blue), number of spikes during preceding intertrial intervals (grey), and subthreshold  $\Delta F/F_0$ (right y-axis) after low-pass filtering traces using a 10-point median filter. For each orientation, response is calculated by averaging the low-pass filtered trace between 100 – 400 ms after trial onset, and baseline is calculated by averaging the low pass filtered trace from 80 ms preceding trial onset to 20 ms after trial onset. Displayed as response minus baseline. Error bars represent standard error of the mean (s.e.m.) (20 - 22 repetitions per session).







Fig. 3 (preceding page). Long duration and large field-of-view imaging of voltage activity in GABA-ergic neurons in mouse neocortex. (A) Schematic of the imaging setup. (B) Image of two neurons expressing ST-Voltron<sub>525</sub> in layer 1 of visual cortex of an NDNF-Cre mouse. Scale bar: 10 µm. (C)  $\Delta F/F_0$  traces from neurons in (B), recorded over 15 min at 400 Hz. (D) Color-coded zooms of indicated regions of the traces in (C) with detected action potentials indicated by black dots above the fluorescence traces. (E) Average of all spikes in session (black) and standard deviation (grey). (F) Left panel: Fluorescence image of a cranial window over primary visual cortex (V1) in an NDNF-Cre mouse showing Cre-dependent expression of ST-Voltron<sub>525</sub> (bright spots). Scale bar: 1 mm. Right panel: zoomed image of (F) in the area indicated by the white rectangle, with neurons labels corresponding to fluorescence traces in (G). Scale bar: 100 µm. (G) Left panel:  $\Delta F/F_0$  traces during 3 min. recording at 400 Hz from neurons pictured in (F), in decreasing order of signal-to-noise ratio. Right panel: zooms of  $\Delta F/F_0$  traces from color-coded regions of (G) with detected action potentials represented as black dots above, illustrating representative traces with high (top), medium (middle), and low (bottom) SNR. Traces have been background-subtracted, which removes shared subthreshold membrane potential fluctuations (Supplementary Methods; Compare vs. fig. S25 without subtraction).

Fig. 4 (next page). Voltron reveals millisecond-timescale neural dynamics during swimming behavior in zebrafish. (A) Schematic illustration of the setup. An immobilized zebrafish is placed under the light-sheet microscope and the motor signals (inset) from its tail are recorded during the imaging session using a pair of electrodes. Visual stimuli (forward drifting gratings) for triggering swimming responses are presented below the fish. (B) Left panel: anatomical location of the imaged brain region (midbrain nucleus; see fig. S44A). Center, a representative field of view of the imaged region expressing Voltron. Scale bar, 20 µm. Right, the position of neurons analyzed in (C). (C) Left panel: periods of visual motion (pink) and swim signals (grey) are plotted above Voltron fluorescence traces (black) simultaneously recorded from 11 neurons shown in (B). Right panel: zoom of swimming signals (top) and Voltron fluorescence traces from two representative neurons (bottom) are expanded from the dashed box in the left panel. Dots on the top of each trace represent action potentials recognized by the algorithm described in fig. S45, A and B. Downward triangles and dotted gray lines indicate initiation of each swim bout. (D) Mean subthreshold signal (top), mean frequency of action potentials (middle) and raster plots of action potentials (bottom) near the initiation of swim bouts from three representative neurons: "Off" (green), "Onset" (red) and "Late" (blue) neuron. Shadows in the top and middle panels represent s.e.m. across swim events. (E) Classification of recorded neurons by their mean subthreshold signals near the initiation of swim bouts, 179 neurons recorded from 43 fish were classified using nonnegative matrix factorization and colored according to the weights for three factors: "onset" (red), "off" (green) and "late" (blue). The details of this classification are described in the Methods. (F) Spatial organization of the same population of neurons as in (E). Neurons from multiple fish are superimposed to a single map based on the distance from the center of this midbrain nucleus. (G) Hypothetical model of neural activity modulation in this midbrain nucleus.



## Science

#### Bright and photostable chemigenetic indicators for extended in vivo voltage imaging

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