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# Conjunctive input processing drives feature selectivity in hippocampal CA1 neurons

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Feature-selective firing allows networks to produce representations of the external and internal environments. Despite its importance, the mechanisms generating neuronal feature selectivity are incompletely understood. In many cortical microcircuits the integration of two functionally distinct inputs occurs nonlinearly through generation of active dendritic signals that drive burst firing and robust plasticity. To examine the role of this processing in feature selectivity, we recorded CA1 pyramidal neuron membrane potential and local field potential in mice running on a linear treadmill. We found that dendritic plateau potentials were produced by an interaction between properly timed input from entorhinal cortex and hippocampal CA3. These conjunctive signals positively modulated the firing of previously established place fields and rapidly induced new place field formation to produce feature selectivity in CA1 that is a function of both entorhinal cortex and CA3 input. Such selectivity could allow mixed network level representations that support context-dependent spatial maps.

The neuronal microcircuit is a fundamental processing unit of nervous systems and as such is intricately involved in producing the network computations that drive behavior. Many cortical microcircuits show a stereotyped organization that may allow them to implement a common set of core operations<sup>1</sup>. One such core operation is derived from the fact that most cortical microcircuits receive at least two functionally distinct afferent inputs from different brain areas1. In pyramidal neuron-based microcircuits, these different inputs are spatially segregated, with long-range inputs mainly innervating the most distal apical tuft dendrite regions and more local inputs usually forming synapses onto the proximal perisomatic dendrites $^{2-5}$ . The electrical isolation present in most pyramidal neurons means that each functional class of inputs is initially processed in relative independence of the other<sup>6–9</sup>. However, active dendritic mechanisms, such as backpropagating action potentials (APs) and dendritic Ca2+ plateau potentials, allow the different afferent input streams to interact nonlinearly when they arrive with appropriate coincident timing<sup>6-13</sup>. Additionally, the initiation of dendritic plateau potentials is known to robustly induce rapid and long-lasting changes in synaptic strength and dendritic excitability 10,14. This form of input interaction or integration could support a nonlinear combination of the input streams to produce neurons with a feature selectivity that is a function of both input paths<sup>6,9</sup>. Such a population will, in turn, generate mixed or multimodal network representations with advantageous computational properties<sup>15,16</sup>.

In the CA1 region of the hippocampus, long-range external information from entorhinal cortex (EC3) arrives onto the most distal dendritic regions of principal neurons while more local, internal information from hippocampal area CA3 arrives onto proximal

perisomatic dendrites<sup>2,3,17,18</sup>. *In vitro* studies have shown that these inputs can be integrated supralinearly, with the exact level of amplification being dependent on the coincidence of the two input pathways. A voltage-gated Ca<sup>2+</sup> channel and NMDA receptor-dependent dendritic plateau potential generated in the distal apical dendritic regions mediates this nonlinear form of dendritic integration<sup>9–11</sup>. Recently, several *in vivo* studies have provided strong evidence that dendritic plateau potentials and the complex burst firing they produce are present during both anesthetized and awake conditions<sup>13,19–21</sup>. Such active dendritic processing could mediate a nonlinear interaction between EC3 and CA3 inputs that allows the CA1 circuit to associate contextual and spatial information, thus generating and maintaining context-dependent spatial maps<sup>10,22–25</sup>.

### **RESULTS**

### Intracellular characterization of place-specific firing

To investigate dendritic plateau potentials in awake, behaving mice, we trained water-restricted mice to run head-fixed on a linear track treadmill with spatial cues for a 10% sucrose water reward delivered each trial (lap) at the same location on a ~2 m track (**Fig. 1a**; see Online Methods)<sup>26</sup>. Extracellular recordings under these conditions have demonstrated that CA1 pyramidal neurons fire at specific locations on the track and that these place cells have similar properties to those recorded from freely moving animals<sup>26</sup>. We obtained simultaneous whole-cell intracellular and local field potential (LFP) extracellular recordings in area CA1 of the dorsal hippocampus of navigating mice (**Fig. 1b**). The activity profiles of recorded neurons generally fell into three categories: silent cells, non-place cells and place cells (**Supplementary Fig. 1**; see Online Methods for criteria). At this point

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we will restrict our analysis to place cells, which exhibited locationspecific AP firing at rates that were similar to those measured using extracellular methods (mean peak rate,  $14.3 \pm 1.5$  Hz, N = 22neurons from 21 mice; Fig. 1 and Supplementary Fig. 2)<sup>26</sup>. In accord with previous intracellular recordings of place cells 19,20, we observed a ramp-like depolarization in the subthreshold membrane potential (ramp) (mean ramp amplitude,  $7.9 \pm 1.0$  mV, N = 22; Fig. 1 and Supplementary Fig. 2), an increase in the amplitude of intracellular theta oscillation (theta<sub>in</sub>) (mean  $\Delta$ theta, 2.8  $\pm$  0.26 mV, N = 22; Fig. 1 and Supplementary Fig. 2) and phase precession of both APs and theta<sub>in</sub> at the preferred firing location (**Supplementary** Fig. 2). The entire population of place fields spanned the length of the belt (Fig. 1d).

### Detection and properties of dendritic plateau-driven complex spiking and burst firing

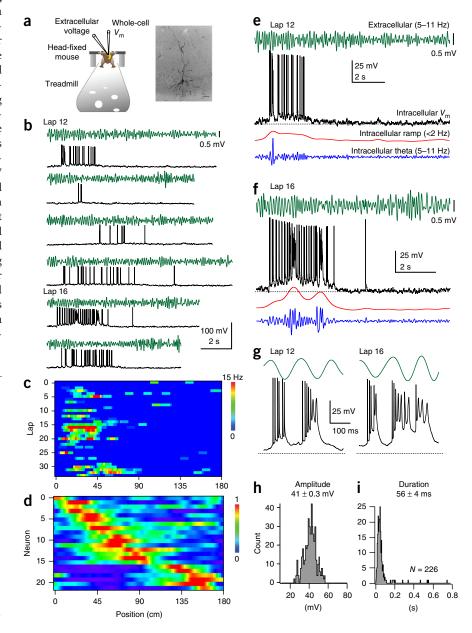
We also observed bursts of APs that were driven by characteristic membrane potential (V<sub>m</sub>) depolarizations that are the signature of

dendritic plateau potential initiation (Fig. 1e-g and **Supplementary Fig. 3**)<sup>10,13,19,20</sup>. Plateau events were detected as a threshold crossing (-35 mV) of the smoothed intracellular voltage (Supplementary Fig. 3). The threshold value was determined from dual dendritic and somatic in vitro voltage recordings with simultaneous calcium imaging (Supplementary Fig. 3f-j). The average duration of plateau events in vivo, measured as the time spent above threshold, was  $56 \pm 4$  ms and the amplitude of these events from baseline  $V_{\rm m}$  was 41  $\pm$  0.3 mV (**Fig. 1h,i**, N=17cells, 226 events), similar to that recorded in vitro (Supplementary Fig. 3) and from anesthetized mice21. We also found that the probability of plateau initiation varied between laps and was positively correlated with ramp amplitude, Δtheta and peak firing rate (Supplementary Fig. 4). NMDA receptor blockade using intracellular MK801 reduced plateau probability and duration, which is consistent with the pharmacology of plateau potentials recorded in vitro and in anesthetized mice (Supplementary Fig. 5)<sup>10,11,21</sup>.

Figure 1 Intracellular recordings of CA1 place cell firing. (a) Schematic of recording set up (left) and confocal stack of a biocytin filled cell (right). Scale bar, 50 μm. (b) Representative intracellular  $V_{\rm m}$  (black) and extracellular theta (green) for laps 12-17 for a representative place cell (cell 3 in d). (c) AP firing rate for all single laps as a function of distance for cell shown in b. (d) Normalized firing rates of all place cells (N = 22 from 21 mice) ordered by place field position. (e,f) Representative extracellular theta (green), intracellular  $V_{\rm m}$  (black), intracellular ramp (red) and thetain (blue) as a function of time for lap 12 (e) and lap 16 (f) for cell in b. (g) Representative complex spikes (plateaus) from traces shown in e and f. (h,i) Amplitude (h) and duration (i) distributions for all plateaus (N = 226 events from 22 neurons from 21 mice).

### Spatio-temporal properties of plateaus

To examine the microcircuit mechanisms of plateau potential initiation, we measured the extracellular theta phase preference of plateaus and APs in all place cells. *In vitro* studies predict that plateaus should be initiated when EC3 and CA3 input are coincidently active. Extracellular studies, however, have shown that EC3 and CA3 inputs tend to be active at different phases of theta, with the phase preference of EC3 being near the peak of theta while CA3 inputs are most active near the trough of extracellular theta<sup>27,28</sup>. Consistent with previous reports for CA1 cells, the phase preference of APs recorded here was near the trough of extracellular theta (173  $\pm$  16°; 12,784 events in 21 neurons). The phase preference of plateaus, however, was more advanced than that of APs (56  $\pm$  7°; 223 events in 16 neurons; twotailed unpaired t-test,  $P = 1.8 \times 10^{-6}$ ; Fig. 2b), making their phase preference more similar to that previously reported for EC3 input. Plateaus also displayed a significantly higher level of theta modulation (APs,  $0.43 \pm 0.04$ ; plateaus,  $0.92 \pm 0.03$ ; two-tailed unpaired t-test,  $P = 4.9 \times 10^{-4}$ ). Interestingly, we observed a relationship between



Peak

е

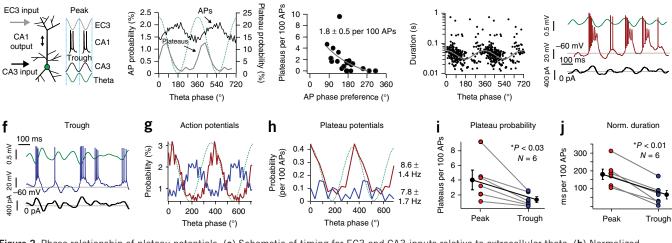
Plateau duration

Input phases

а

b

Theta relationship



Plateau probability

C

d

Figure 2 Phase relationship of plateau potentials. (a) Schematic of timing for EC3 and CA3 inputs relative to extracellular theta. (b) Normalized population AP probability (black; N = 12,894 events from 21 neurons from 20 mice) or plateau probability (gray; N = 223 events from 16 neurons from 20 mice) as a function of theta phase. Dotted green line is idealized sinusoid. Bin size is  $10^{\circ}$  (APs) or  $36^{\circ}$  (plateaus). (c) Plateau probability (per 100 APs; N = 21 neurons from 20 mice) as a function of theta phase preference for each cell. Mean plateau probability shown. Gray line is an exponential fit. (d) Plateau duration as a function of theta phase (N = 223 events from 16 neurons from 20 mice). Gray line is sine function fit to durations <140 ms (single theta cycle). (e,f) Representative intracellular  $V_m$  (red, e; blue, f), extracellular theta (green) and injected current (black) traces from a cell with current injected into the soma to produce AP spiking near the peak (e) or trough (f) of extracellular theta (see Supplementary Fig. 6). (g,h) Normalized population AP probability (g; N = 2,991 (red) and 2,357 (blue) events from 6 neurons from 6 mice) or plateau probability (h; N = 127 events (red) and 32 events (blue) from 6 neurons from 6 mice) as a function of theta phase for current injections shown in b. (i,j) Average plateau probability (i) and normalized (norm.) duration (j) for current injection shown in e and f. Individuals are shown colored and averages in black as mean  $\pm$  s.e.m. (N = 6); paired two-tailed t-test, peak versus trough, N = 0.0289 (i, N = 0.0289 (i, N = 0.0289 (i, N = 0.0289 (i) N =

plateau probability and AP theta phase preference of individual neurons: plateau probability was higher in those cells showing the most advanced theta phase preference (**Fig. 2c**). Plateau durations also had a phasic relationship with the LFP, such that the duration of plateau events decreased as the theta phase of their initiation moved from the peak of extracellular theta to the trough, farther from the preferred phase of EC3 input (**Fig. 2d**). Together these results are consistent with previous *in vitro* data showing that dendritic Ca<sup>2+</sup> plateaus occur when CA3 input is appropriately timed to drive AP output and back-propagation to coincide with EC3 input.

### Experimental manipulation of perisomatic $\ensuremath{\emph{V}_m}$ and AP firing phase

We further examined this temporal relationship by manipulating the phase of perisomatic  $V_{\rm m}$  fluctuations and resultant CA1 firing, thereby mimicking the impact of either advanced or delayed CA3 input. For this we used a closed loop experiment in which we online filtered and variably delayed the extracellular LFP and then used the resulting waveform to drive current injection into the recorded cell (Fig. 2 and Supplementary Fig. 6). In the first condition we minimized the delay to produce advanced  $V_{\rm m}$  fluctuations and spiking biased toward the peak of extracellular theta (AP peak near 45°; Fig. 2e,g). In the second condition we increased the delay on the injected current to produce later phase  $V_{\rm m}$  fluctuations, and the cells preferentially spiked near the trough of extracellular theta (~200°; ~95 ms delay; Fig. 2f,g). Plateau probability and normalized duration were significantly higher when spiking was biased toward the peak of extracellular theta (probability,  $4.1 \pm 1.2$  plateaus per 100 APs; duration 183.2  $\pm$  41 ms per 100 APs; N = 6; Fig. 2i,j) than when spiking was near the trough (probability,  $1.3 \pm 0.4$  plateaus per 100 APs; duration;  $63.5 \pm 33.5$  ms per 100 APs; N = 6; Fig. 2i,j) even though the average firing rates were similar under the two conditions (peak,  $8.6 \pm 1.4$  Hz; trough,  $7.8 \pm 1.7$  Hz; N = 6). The phase preference of plateaus under

these conditions was similar to that of the control (**Fig. 2h**). This manipulation provides further evidence that plateau potentials in CA1 pyramidal neurons are preferentially generated when CA3 input drives AP output to coarsely overlap with synaptic input from EC3.

### Experimental reduction of EC3 input to CA1

To elucidate the role of the distal long-range input, we recorded from mice expressing archaerhodopsin (Arch) in EC3 pyramidal cells (see Online Methods and Fig. 3a)<sup>17</sup>. We inhibited synaptic input from EC3 neurons by activating Arch in the axons and terminals of these cells using an optical fiber fitted inside the LFP electrode that was located in the stratum radiatum near the recorded neuron (3-5 s duration 594-nm laser pulses; Supplementary Fig. 7). A similar manipulation reduced the time integral of synaptically evoked excitatory postsynaptic potential (EPSP) (as measured by area under the curve) ~30% in hippocampal brain slices from these transgenic mice (Supplementary Fig. 8). Activation of Arch influenced our measures of burst firing (Fig. 3b,e,f) and significantly reduced plateau probability and normalized duration by ~50% (no light versus light: probability,  $3.8 \pm 0.8$  versus  $1.7 \pm 0.5$  plateaus per 100 APs; duration,  $63.4 \pm 6.8$  versus  $27.8 \pm 6.0$  ms per 100 APs; N = 8 neurons; Fig. 3c,d,g-i and Supplementary Fig. 9). The ramp amplitude and peak firing rates were also slightly, but significantly (P = 0.01 and P = 0.009, respectively), reduced by this modest decrease in EC3 input (Supplementary Fig. 9c-e) whereas running speed was comparable for laps with and without light stimuli (no light,  $29.6 \pm 1.6$  cm/s; light,  $28.5 \pm 1.3$  cm/s; N = 8). This manipulation of the distal synaptic input stream indicates that EC3 input is critical in generating plateau potentials in awake, behaving mice.

### EC3 and CA3 pathways in the generation of plateaus

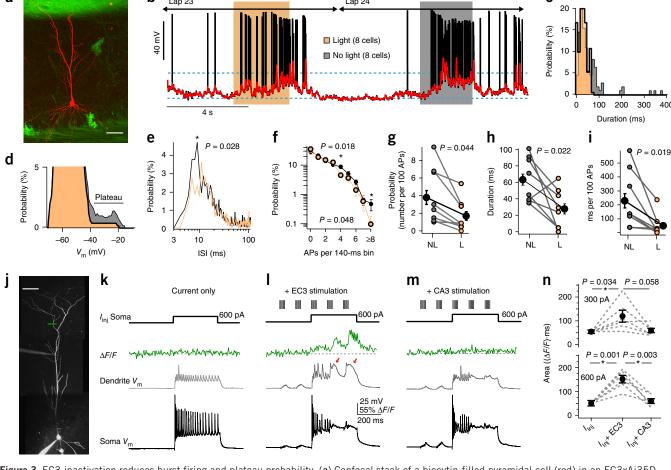
We next examined the relative contribution of each individual pathway in plateau initiation by performing an *in vitro* experiment



a

b

Lap 23



Lap 24

Figure 3 EC3 inactivation reduces burst firing and plateau probability. (a) Confocal stack of a biocytin-filled pyramidal cell (red) in an EC3xAi35D mouse; green, Arch expression. Scale bar, 50  $\mu$ m. (b) Intracellular  $V_m$  (black) and smoothed  $V_m$  (red) for two consecutive laps. Shaded region designates light-on (gold) or light-off (gray) periods. Laser light duration ~3 s and laps were interleaved. (c-e) Distributions for plateau duration (c; N = 111 no-light events, N = 25 light events from 8 neurons from 8 mice), subthreshold  $V_m$  (d; from cell in b) and interspike interval (e; N = 3,928 no-light events, 1,293 light events from 8 neurons from 8 mice) for light (gold) and no-light (gray) periods. (f) Frequency distribution for all cells for light (N = 1,293 events, gold) and no-light (N = 3,928 events, gray) periods. Bin size is 140 ms. (g-i) Average plateau probability (g), plateau duration (h) and normalized plateau duration (i) for no-light (NL; gray) and light (L; gold) periods (N = 8 neurons from 8 mice). Individuals are colored and averages in black as mean  $\pm$  s.e.m.; P values are indicated, two-tailed paired t-tests (g-i). (j) Two-photon projection showing dual recording from a CA1 pyramidal neuron with Ca<sup>2+</sup> imaging location (green line). Scale bar, 50  $\mu$ m. (**k-m**) Somatic  $V_m$  (black), dendritic  $V_m$  (gray) and Ca<sup>2+</sup> fluorescence (green) for 600 pA current injection alone (k), current plus EC3 stimulation (I) or current plus CA3 stimulation (m). (n) Time integral of fluorescence signal as  $\Delta F/F$  for 300 pA (top) or 600 pA (bottom) current and stimulation as shown in **k**-m. Values are mean ± s.e.m. and P values are indicated; two-tailed, paired t-tests of 6 neurons from 6 mice.

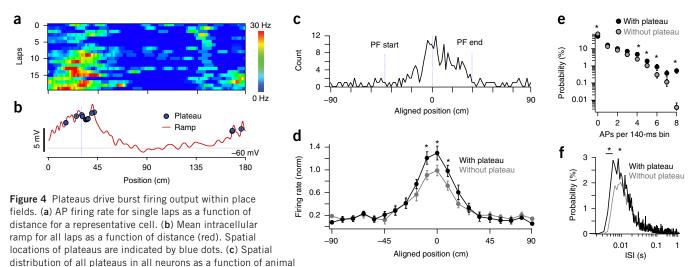
that allows independent pathway activation. Here we paired separate stimulation of either the EC3 or CA3 input pathways with longduration current injections (300-600 pA, 400 ms) into CA1 pyramidal somata (Fig. 3j-n). Pairing of current injection with EC3 input pathway stimulation increased the occurrence of dendritic plateau potentials, quantified as the associated tuft Ca<sup>2+</sup> signal area (measured as time integral of the change in fluorescence signal over baseline fluorescence,  $\Delta F/F$ ) (600 pA alone, 50 ± 11  $\Delta F/F$  ms; plus EC3, 151 ± 16  $\Delta F/F$  ms; N = 6 neurons; **Fig. 3l,n**). This was not the case, however, when the same currents were injected together with similarly sized CA3 input pathway stimulation. Instead, Ca<sup>2+</sup> plateau initiation was rare and the tuft Ca<sup>2+</sup> signal was not different from that observed for current injection alone (600 pA alone, 50  $\pm$  11  $\Delta F/F$  ms; plus CA3,  $60 \pm 10 \Delta F/F$  ms; N = 6; **Fig. 3m,n**). This result highlights the special, perhaps necessary, role of the EC3 pathway in the production of plateau potentials in CA1 pyramidal neurons. For its part, CA3 input appears to provide apical dendritic depolarization and,

perhaps most importantly, to produce AP output that backpropagates into the distant regions of the apical dendrite to interact with the EC3 input $^{7-10}$ .

### Gain modulation of place-field firing by plateau initiation

To determine the impact of these events on CA1 output, we calculated plateau probability as a function of the animal's location. We found when examining place field traversals that plateau probability was highest within the field and peaked near the place field center, consistent with previous reports of intracellularly recorded complex spiking<sup>19</sup> (bootstrapped permutation test,  $P = 1 \times 10^{-4}$ ; Fig. 4a-c). Notably, plateau potentials positively modulated the frequency of in-field AP firing (~30% increase in peak firing rate) in a manner consistent with an increase in firing rate gain and heavily increased the incidence of high-frequency firing and short inter-spike interval (ISI) events (Fig. 4d-f). These data indicate that the generation of plateau potentials elevates in-field AP firing frequency by promoting





position. Place field (PF) centers were normalized within trials.  $P = 1 \times 10^{-4}$ , bootstrapped permutation test (N = 226 events from 17 neurons; see Online Methods). (**d**) Normalized (norm) firing rate as a function of animal position aligned to place field centers for trials with and without plateaus. (**e**) Frequency distribution for all laps with and without plateaus. Bin size is 140 ms. (**f**) Interspike interval (ISI) distribution for laps with and without plateaus. For **d**-**f**, N = 5,645 APs, 78 laps with plateau; N = 5,754 APs, 141 laps without plateau; from 17 neurons. \*P < 0.05, paired two-tailed *t*-tests. Exact P values (from left to right): **d**, 0.034, 0.024, 0.041; **e**, 0.005, 0.044, 0.041, 0.032, 0.002; **f**, 0.042, 0.038, 0.043, 0.027, 0.040.

high-frequency burst firing output from CA1 pyramidal neurons. In addition to this effect on firing rate, burst firing output should also be particularly effective at transmitting information to downstream regions owing to the facilitating nature of CA1 pyramidal neuron synapses<sup>29,30</sup>. Thus, one function of dendritic plateau potential initiation appears to be a distinctive gain modulation of place-field firing rate via the induction of high-frequency bursts of AP output within the field.

Considering all of the above data, dendritic plateau potentials appear to operate as coincidence detectors that signal the presence of correlated or conjunctive EC3 and CA3 input by modulating the rate and mode of AP output in CA1 pyramidal neurons. Such a nonlinear input interaction would allow the association of internal and external features through a burst-firing-related output modulation

mechanism that could produce a mixed representation of space and context useful for encoding episodic memory<sup>15,16,22–25</sup>.

### Spontaneous plateaus are associated with new place field formation

In addition to the above described ability of plateau potentials to produce a robust gain modulation of CA1 output, plateaus were also observed to be associated with the rapid formation of new place fields. A subset of pyramidal neurons abruptly transitioned from either silent or non-place firing into position-specific firing at a particular time during the recording session (N=6 neurons; Fig. 5 and Supplementary Fig. 10). Inspection of the  $V_{\rm m}$  traces during this transition revealed the presence of long-duration, plateau-driven complex spiking that consisted of bursts of high-frequency APs riding on top of large (~40 mV) and long-lasting (138  $\pm$  23 ms,

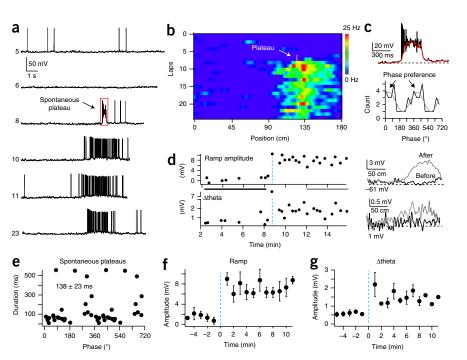


Figure 5 Place fields form after appearance of a large plateau potential. (a) Representative intracellular  $V_{\rm m}$  as a function of time for laps (numbers at left) before, during and after appearance of a spontaneous plateau. Red box indicates portion of trace shown in c. (b) AP firing rate for single laps as a function of distance for representative cell from a. (c) Top, intracellular  $V_{\rm m}$  from lap 8 on an expanded time base to show plateau characteristics. Red line is smoothed trace. Bottom, phase preference of plateaus for all place cells induced by a spontaneous plateau (N = 6 cells from 6 mice). Gray line is a sine fit. (d) Mean intracellular ramp amplitude (top) and Δtheta (bottom) as a function of time for cell in a. The traces at right are averages across laps within the time window indicated by the gray or black bar on left plot to show the average ramp and theta for laps before and after plateau. (e) Plateau duration as a function of phase for all place cells induced by a spontaneous plateau. (f,g) Average intracellular ramp amplitude (f) and  $\Delta$ theta (g) for all place cells induced by a spontaneous plateau as a function of time. Data are shown as mean ± s.e.m.; see Online Methods for number of neurons in each data point.

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N=22 events) depolarizations in all neurons that formed new place fields (**Fig. 5a,c** and **Supplementary Fig. 10**).  $V_{\rm m}$  traces from laps following the dendritic plateau potential displayed a consistent location-specific increase in firing rate (mean peak firing rate 12.7  $\pm$  2.2 Hz; N=6) that was driven by large-amplitude, slow  $V_{\rm m}$  depolarizations (ramp; before,  $0.8\pm0.2$  mV; after,  $6.9\pm1.0$  mV; N=6;  $P=2.3\times10^{-9}$ , paired two-tailed t-tests) and substantial intracellular

 $V_{\rm m}$  theta oscillations ( $\Delta$ theta; before, 0.6  $\pm$  0.2; after, 1.7  $\pm$  0.4 mV; N=6;  $P=1.6\times 10^{-4}$ , paired two-tailed t-tests) at the location on the track where the plateau had appeared for the remaining duration of the recordings (19.8  $\pm$  4.2 laps; 9.6  $\pm$  1.2 min; N=6) (**Fig. 5** and **Supplementary Fig. 10**). The above data suggest a role for dendritic plateau potentials in the rapid formation of new place fields in CA1 pyramidal neurons.

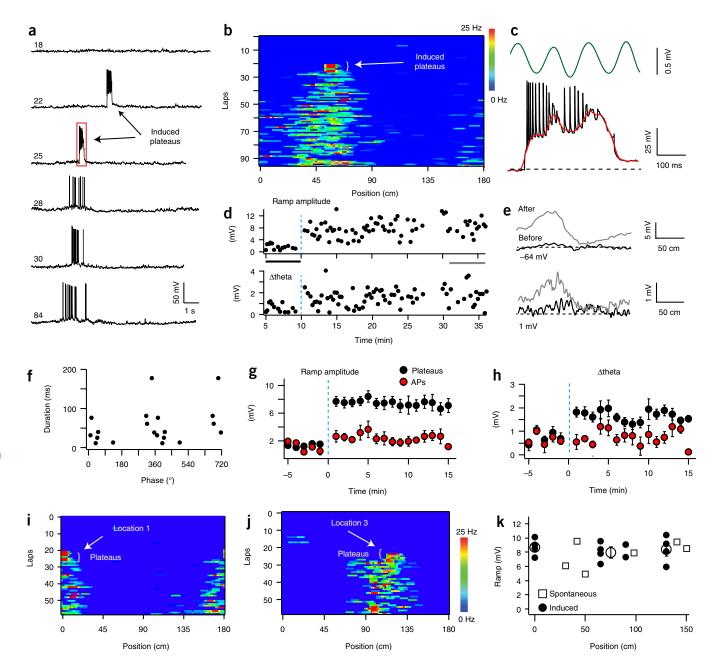


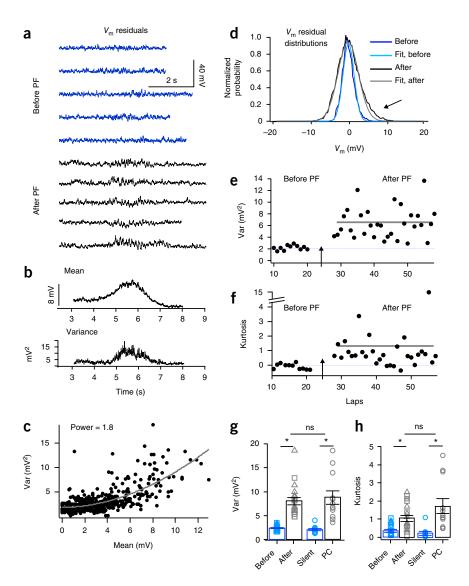
Figure 6 Plateaus are sufficient to drive new place field formation. (a) Representative intracellular  $V_m$  as a function of time for laps (numbers at left) before, during and after plateau induction. (b) AP firing rate for single laps as a function of distance for cell from a. Arrow indicates current injection locations. (c) Intracellular  $V_m$  (black) and extracellular theta (green) expanded from box in a. Red line is smoothed trace. (d) Mean intracellular ramp amplitude (top) and  $\Delta$ theta (bottom) as a function of time for cell in a. (e) Average intracellular ramp (top) and theta (bottom) as a function of position for laps indicated by gray or black bars in d. (f) Plateau duration as a function of theta phase. (g,h) Average intracellular ramp amplitude (g) and  $\Delta$ theta (h) for cells with plateau-inducing (black) or AP-inducing (red) current injections as a function of time. Data are shown as mean  $\pm$  s.e.m.; see Online Methods for number of neurons in each data point. (i,j) AP firing rate for single laps as a function of distance for place fields induced at locations 1 (i) and 3 (j). (k) Average ramp amplitude after place field induction for all place cells induced with current injection (black circles) and for spontaneous plateaus (open squares) as a function of track position. Averages across cells at the three positions are shown as large open circles (mean  $\pm$  s.e.m.).

Figure 7  $V_{\rm m}$  variance suggests input amplitude potentiation. (a) Representative intracellular  $V_{\rm m}$ residuals ( $V_{\rm m}$  – mean  $V_{\rm m}$ ) for several laps before (blue) and after (black) place field induction (PF; data from cell shown in Fig. 6b). (b) Mean  $V_{\rm m}$  and variance for cell in **a**. (c) Variance as a function of mean for cell in a. Line is a fit of the data by a power function,  $y = m^p x + b$ , where P = 1.8. (d) Normalized residual probability distribution before place field induction (blue) and after (black) for cell in a. Lighter colored lines are Gaussian fits. (e,f) Variance (e) and kurtosis (f) as a function of lap to display the change after place field induction. (g,h) Average variance (g) and excess kurtosis (h) either before (blue) or after (black) place field induction by spontaneous (squares, N = 6 cell from 6 mice) or induced plateau (triangles, N =13 cell from 13 mice) or for silent cells (blue, N = 10 cell from 10 mice) and place cells (PC) (black, N = 12 cell from 12 mice). \* $P = 8.5 \times 10^{-9}$  variance before versus after and \* $P = 3.2 \times 10^{-5}$  kurtosis before versus after; paired two-tailed t-tests; \* $P = 4.87 \times 10^{-7}$ , place-cell versus silent-cell variance and \* $P = 1.2 \times 10^{-3}$  place-cell versus silent-cell kurtosis; unpaired two-tailed t-tests.

### Induced plateaus drive new place field formation

To more directly test whether plateau potentials are sufficient to induce place field formation, we developed a closed-loop experiment to evoke plateau potentials at specific locations along the track. Although naturally occurring plateaus require coincident input from CA3 and EC3, we were able to induce plateau potential initiation through intracellular current injection (300 ms, ~600 pA, Fig. 6) at the same location along the track for repeated laps (~5 laps; Fig. 6 and Supplementary Fig. 11). The induced plateau potentials had

similar properties to naturally occurring plateaus (phase preference,  $25^{\circ} \pm 15^{\circ}$ , N = 102 events; phase modulation index,  $0.83 \pm 0.04$ , N = 102events; duration,  $56 \pm 10$  ms, N = 141 events). Such repeated plateau initiation was sufficient to induce spatially selective AP firing at the location of the current injection (mean peak firing rate  $15.4 \pm 2.1$  Hz; N = 14 neurons) in 93% of cells tested (14 of 15 neurons). This positionspecific firing was driven by the rapid appearance of a large-amplitude  $V_{\rm m}$  depolarization (ramp; before, 0.8  $\pm$  0.2 mV; after, 7.2  $\pm$  0.6 mV; N = 14;  $P = 2.5 \times 10^{-11}$ , paired two-tailed *t*-tests, **Fig. 6d,e,g**) and  $V_{\rm m}$ theta oscillation ( $\Delta$ theta; before, 0.6  $\pm$  0.2 mV; after, 1.7  $\pm$  0.2 mV; N = 14;  $P = 7.4 \times 10^{-8}$ , paired two-tailed t-tests; Fig. 6d,e,h). The induced place fields were stable for the remaining duration of the recording (15.1  $\pm$  1.8 min; N = 14) and for many laps (39  $\pm$  7; N = 14). In most respects, the induced place fields were similar to those of non-induced place cells: the mean peak firing rate, ramp amplitude, phase precession of APs, phase precession of intracellular theta and AP theta phase preference were not significantly different from those of standard place cells (Supplementary Fig. 11d-f; two-tailed unpaired t-tests, P = 0.22, 0.46, 0.067, 0.09 and 0.28, respectively). However, Δtheta was slightly, but significantly, lower in the induced place fields when compared to standard place cells (**Supplementary Fig. 11e**; two-tailed unpaired t-test, P = 0.001).



Input resistance did not change following place field induction (before,  $69.5 \pm 2.8 \text{ M}\Omega$ ; after,  $73.1 \pm 3.5 \text{ M}\Omega$ ; N = 14 neurons, P = 0.48; paired two-tailed t-test; **Supplementary Fig. 12**).

The amplitude of the resulting position-specific increase in  $V_{\rm m}$  ramp depolarization and firing rate also did not vary as a function of position for induced plateau initiation (N=14; F=0.2425, ANOVA; **Fig. 6k**). This indicates that there was no spatial bias to place-field generation and that the only determinant was the position of repeated plateau potential initiation. These observations suggest that CA1 pyramidal neurons receive proportional amounts of input from presynaptic cells that are tuned to all possible spatial locations and as a result are equally capable of expressing place-specific firing at any potential position.

### High-frequency single spiking is not effective

To determine whether the plateau potentials or the associated high-frequency AP firing was the main driver of place field formation, we next used a current-injection waveform that generated a similar number of high-frequency AP trains but that did not contain any plateau potentials (train of 30 APs at 100 Hz,  $\sim$ 1-nA, 2-ms-duration pulses). The trains of APs induced only a small increase in the ramp amplitude (ramp; before,  $1.1 \pm 0.3$  mV; after,  $1.9 \pm 0.4$  mV; N = 6

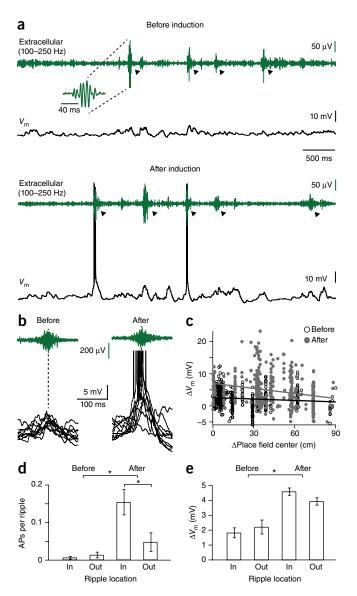
Figure 8 Ripple-associated  $V_{\rm m}$  depolarization and AP output increase after induction. (a) Extracellular ripple (LFP filtered between 100 and 250 Hz) and intracellular  $V_{\rm m}$  recording before (top) and after (bottom) place field induction in a CA1 pyramidal neuron. Animal was stationary during the period shown. Arrowheads indicate ripples detected by our algorithm (see Online Methods). (b) Enlarged view of ten consecutive ripples and corresponding  $V_{\rm m}$ . Note the increased  $V_{\rm m}$  depolarization and the increased AP probability during ripples after place field induction. (c) Relationships between the ripple-associated subthreshold  $V_{\rm m}$  changes  $(\Delta V_{\rm m})$  and the locations of the ripple relative to the place field center (at 0) before (black open circles) and after (gray filled circles) place field formation. Data are taken from the cell shown in a. Each circle represents one ripple (before, N = 230 ripples; after, N = 340 ripples); the lines show linear fits. Ripple locations before and after the place field center were pooled. (d) Number of APs per ripple for events inside and outside the neuron's place field (mean  $\pm$  s.e.m., N = 16 neurons, two-tailed unpaired t-test, before versus after  $P = 4.0 \times 10^{-4}$ , after inside versus after outside P = 0.017). (e)  $\Delta V_{\rm m}$  for ripples inside and outside the neuron's place field (mean  $\pm$  s.e.m., N = 16 neurons, unpaired two-tailed *t*-test, before versus after  $P = 1.0 \times 10^{-4}$ ).

neurons; P=0.007, paired two-tailed t-tests) that was both smaller than that induced by plateau initiation ( $P=4.7\times10^{-9}$ ; unpaired two-tailed t-test) and insufficient to produce a lasting increase in position-specific firing rate ( $0.8\pm0.1~{\rm Hz}; N=6$ ; **Supplementary Fig. 13**). There was no significant effect on intracellular theta oscillations ( $\Delta$ theta; before,  $0.7\pm0.1~{\rm mV}$ ; after,  $0.8\pm0.1~{\rm mV}; N=6$  neurons; P=0.41, paired two-tailed t-tests). These data indicate that dendritic plateau potentials, but not high-frequency AP firing, are sufficient for rapid place field generation in CA1 pyramidal neurons during our behavioral task.

### Plateaus increase the amplitude of incoming input

We next sought to determine the mechanism of the plateau-induced formation of new place fields. Given the previously described ability of plateau potentials to induce synaptic plasticity<sup>10,14</sup>, a straightforward prediction is that synaptic potentiation at the position of the plateaus drives subsequent place-specific firing. Alternatively, plateaus could produce an increase in the frequency of inputs present at a given position of the track. An analysis of  $V_{\rm m}$  fluctuations can distinguish between these two possibilities, as  $V_{\mathrm{m}}$  variance is a linear function of the frequency of inputs but increases as the square of EPSP amplitude (Supplementary Fig. 14)<sup>31,32</sup>. The analysis showed that both spontaneous and induced place field generation caused the variance of  $V_{\rm m}$  fluctuations within the fields to increase nearly fourfold over that of laps without place field firing (before,  $2.4 \pm 0.1 \text{ mV}^2$ ; after =  $8.0 \pm 0.8 \text{ mV}^2$ ; N = 19 neurons;  $P = 8.5 \times 10^{-9}$ , paired two-tailed t-tests; Fig. 7), and variance was found to increase as approximately the square of the mean  $V_{\rm m}$  (variance versus mean plots were best fit by a power function with mean power =  $1.7 \pm 0.2$ ; N = 19 neurons). Additionally, place field generation caused an increase in the higher order moments (particularly excess kurtosis) of the  $V_{\rm m}$  distribution (before, 0.36  $\pm$  0.08; after, 1.0  $\pm$  0.2; N = 19 neurons;  $P = 3.2 \times 10^{-5}$ , paired two-tailed t-tests; Fig. 7f,h). The observed large increase in V<sub>m</sub> variance within the induced place fields and the supralinear relationship to the mean  $V_{\rm m}$  is consistent with a position-specific increase in EPSP amplitude rather than an increase in the frequency of the synaptic inputs (Supplementary Fig. 14).

We next performed the  $V_{\rm m}$  fluctuation analysis on place cell and silent cell populations. This analysis showed that place cells had within-field  $V_{\rm m}$  variance that was approximately four times that of silent cells (silent cell,  $2.0\pm0.2~{\rm mV^2}$ , n=10; place cell,  $8.8\pm1.4~{\rm mV^2}$ , n=12;  $P=4.8\times10^{-7}$ , unpaired two-tailed t-tests; **Fig. 7g**) and was



not different from that in neurons with induced place fields (unpaired two-tailed t-test, P=0.42; **Fig. 7g**). The degree of nonlinearity in the relationship between  $V_{\rm m}$  variance and mean was also not different from that of induced place fields (power =  $1.6\pm0.2$ ; N=15 neurons; unpaired two-tailed t-test; P=0.30). Together these analyses support the idea that an elevation in position-specific synaptic weight is an important mechanism underlying place-field firing in hippocampal CA1 pyramidal neurons.

### Impact on sharp wave/ripple-related activity

Finally, we observed that the induction of new place fields by plateau potential initiation during active running was associated with an alteration in the activity of neurons during subsequent sharp wave/ripple (SPW/R) network states that occurred within nonexploratory periods. When rodents stop actively exploring an environment, the hippocampus transiently enters a distinct network state that is characterized by short-duration (<100 ms), high-frequency (~200 Hz) oscillations in the extracellular field potential (**Fig. 8**)<sup>33,34</sup>. Intracellular  $V_{\rm m}$  depolarization produced during ripple activity was significantly enhanced following the induction of place fields during active exploration (before, 2.0  $\pm$  0.3 mV; after, 4.3  $\pm$  0.2 mV; N = 16; **Fig. 8c**).

Furthermore, this enhanced  $V_{\rm m}$  depolarization also increased the number of APs produced during ripple activity (before, 0.01  $\pm$  0.004 APs; after, 0.10  $\pm$  0.025 APs; N = 16; **Fig. 8d**). The effect, particularly on AP firing, was most pronounced when ripples occurred at positions on the track that were near the location of the induced place field (after inside place field, 0.154  $\pm$  0.034 AP; after outside place field, 0.047  $\pm$  0.026 AP; N = 16; **Fig. 8d**). These data indicate that a common mechanism, plateau potential—mediated plasticity, underlies neuronal feature selectivity during both distinct hippocampal network states (theta versus SPW/R states), further strengthening the idea that the neuronal activity associated with ripples is a reactivation of the activity that occurred during active exploration.

#### DISCUSSION

We show that dendritic plateau potentials enhance place field firing rates and the incidence of complex spike burst firing in CA1 pyramidal neurons. The timing of plateau potential initiation coincides with EC3 input to CA1 cells, and plateau probability is increased when perisomatic  $V_{\rm m}$  is manipulated to drive CA1 spiking near the theta phase preference of EC3 input. Furthermore, optogenetic inhibition of EC3 input in the behaving animal, as well as independent pathway activation in the slice, suggest a unique role for EC3 input in the generation of dendritic plateau potentials. These data are consistent with previous *in vitro* studies showing that dendritic plateau potentials produce a nonlinear integration of CA3 and EC3 input streams, the size of which is related to the degree of correlation.

In addition, the data show that dendritic plateau potentials are sufficient to induce place field formation in CA1 pyramidal cells and that the underlying mechanism is likely to be a strengthening of synaptic inputs active around the time of plateau generation. The ability of plateaus to induce fields at any position along the track indicates that a given CA1 pyramidal cell receives input tuned to all spatial locations and is therefore equally able to express location-specific firing at any position. We did not find any evidence of a position-specific bias in the number or frequency of inputs, suggesting that CA1 cells receive an approximately proportional amount of inputs for all regions of the linear track and that the generation of a long-duration plateau potential chooses the particular feature for which the neuron will be selective (Supplementary Fig. 15). The plateau potential-driven increase in synaptic input also appears to result in an enhanced reactivation during SPW/R activity, implicating a common mechanism for positionspecific firing during both active exploration and non-exploratory network states. Furthermore, since CA3 is considered to be the source of SPW/R activity<sup>35,36</sup>, the plasticity evoked by dendritic plateaus should involve CA3 inputs to CA1 pyramidal neurons.

The two mechanisms currently thought to be involved in the formation of place fields in hippocampal neurons are a linear combination of different periodic grid cell inputs<sup>37,38</sup> and various Hebbian synaptic plasticity mechanisms<sup>39-41</sup>. The data presented here indicate that input-potentiating plasticity mechanisms rather than location-dependent increases in input numbers are the most prominent determinant of position-selective firing in CA1 place cells. However, there remains the possibility that variations in EC3 input, mediated by overlapping grid-cell input, may regulate the probability of plateau potential initiation in a position-dependent manner. This could potentially connect the two mechanisms. The observation that dendritic plateau potentials were much more effective than high-frequency APs at rapidly producing long-lasting place-specific input potentiation has implications for the rules governing place field formation in CA1 pyramidal neurons. Since plateau potentials are induced by the conjunction of two input pathways (EC3 and CA3),

it follows that CA1 neurons may use nonstandard associative learning rules  $^{42,43}$  to form place fields with properties that are a function of both CA3 and EC3 input. More experiments are needed to determine the exact synaptic mechanisms and induction rules involved in the generation of CA1 place fields.

The spontaneous plateaus that were found to induce place fields were approximately three times as long as those plateaus produced within existing place fields or those induced by current injections. This suggests that there may be some special condition associated with their initiation. Such a condition could be subcortical input driving both the dendritic disinhibition and neuromodulation that are likely required for such long-duration events. Future experiments manipulating these elements should reveal the detailed circuit mechanisms involved in spontaneous plateau generation. In the end, the plasticity produced by plateau potentials is capable of generating a place field in a single trial, and such rapid field induction is a known property of CA1 pyramidal neuron activity during exploration<sup>44–46</sup>. While it is not entirely clear how long newly generated place fields will persist, the continued generation of plateau potentials within the new field could enhance their stability and this could be another important function for plateau generation within place fields.

Although we have above mainly focused on the role of excitatory input in dendritic plateau potential generation, inhibitory inputs are also likely to be important in regulating these signals<sup>26,47–49</sup>. In particular, dendritically targeting interneurons that display a late theta phase firing preference are well suited to control the initiation and duration of dendritic plateau potentials. Along these lines, oriens—lacunosum-moleculare (OLM) interneurons are known to reduce complex spike probability and duration as well as influence spatial learning<sup>26,49</sup>, underscoring the role of inhibitory elements in this microcircuit operation.

This and other studies present evidence that active dendritic integration in pyramidal neuron based cortical microcircuits supports a fundamental operation, the nonlinear interaction of long-range and local inputs that leads to firing rate modulation and neuronal plasticity<sup>6–11,15,16,50</sup>. Indeed, evidence of a similar nonlinear modulation of tuned responses by active dendritic processing has been reported in layer 5 pyramidal neurons of the barrel cortex of behaving mice<sup>6,7</sup>, and a comparable form of dendritic plateau—driven plasticity has been observed in neocortical neurons both *in vitro* and in anesthetized mice<sup>14,50</sup>. Additional experiments are needed to fully explore the roles of various cortical microcircuit elements in what appears to be a candidate general microcircuit operation or low-level computation.

### **METHODS**

Methods and any associated references are available in the online version of the paper.

Note: Any Supplementary Information and Source Data files are available in the online version of the paper.

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### **AUTHOR CONTRIBUTIONS**

K.C.B. and J.C.M. designed experiments; K.C.B. and C.G. performed *in vivo* recordings; S.P.V. and A.D.M. performed *in vitro* recordings; J.J.M. designed and

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built light probes; J.S. and S.T. designed and produced pOxr1 Cre mice; J.C.M.,

K.C.B. and C.G. analyzed data. J.C.M. and K.C.B. wrote the manuscript with input

- 1. Shepherd, G.M. The Synaptic Organization of the Brain 5th edn. (Oxford Univ. Press, New York, 2004).
- Steward, O. & Scoville, S.A. Cells of origin of entorhinal cortical afferents to the hippocampus and fascia dentata of the rat. J. Comp. Neurol. 169, 347-370
- Megías, M., Emri, Z., Freund, T.F. & Gulvas, A.I. Total number and distribution of inhibitory and excitatory synapses on hippocampal CA1 pyramidal cells. Neuroscience 102, 527-540 (2001).
- Cauller, L.J., Clancy, B. & Connors, B.W. Backward cortical projections to primary somatosensory cortex in rats extend long horizontal axons in layer I. J. Comp. Neurol. 390, 297-310 (1998).
- Petreanu, L., Mao, T., Sternson, S.M. & Svoboda, K. The subcellular organization of neocortical excitatory connections. Nature 457, 1142-1145 (2009).
- Xu, N.L. et al. Nonlinear dendritic integration of sensory and motor input produces an object localization signal. Nature 492, 247-251 (2012).
- 7. Harnett, M.T. et al. Potassium channels control the interaction between active dendritic compartments in layer 5 cortical pyramidal neurons. Neuron 79, 516-529
- Larkum, M.E., Zhu, J.J. & Sakmann, B. A new cellular mechanism for coupling inputs arriving at different cortical layers. Nature 398, 338-341 (1999).
- Larkum. M. A cellular mechanism for cortical associations: an organizing principle for the cerebral cortex. Trends Neurosci. 36, 141-151 (2013).
- 10. Takahashi, H. & Magee, J.C. Pathway interactions and synaptic plasticity in the dendritic tuft regions of CA1 pyramidal neurons. Neuron 62, 102-111 (2009).
- 11. Tsay, D., Dudman, J.T. & Siegelbaum, S.A. HCN1 channels constrain synaptically evoked Ca2+ spikes in distal dendrites of CA1 pyramidal neurons. Neuron 56, 1076-1089 (2007).
- 12. Jarsky, T., Roxin, A., Kath, W.L. & Spruston, N. Conditional dendritic spike propagation following distal synaptic activation in hippocampal CA1 pyramidal neurons. Nat. Neurosci. 8, 1667-1676 (2005).
- 13. Kamondi, A., Acsády, L. & Buzsáki, G. Dendritic spikes are enhanced by cooperative network activity in the intact hippocampus. J. Neurosci. 18, 3919-3928 (1998).
- 14. Sjöström, P.J. & Häusser, M. A cooperative switch determines the sign of synaptic plasticity in distal dendrites of neocortical pyramidal neurons. Neuron 51, 227-238 (2006).
- 15. Salinas, E. & Seinowski, T.J. Gain modulation in the central nervous system: where behavior, neurophysiology and computation meet. Neuroscientist 7, 430-440
- 16. Pouget, A., Deneve, S. & Duhamel, J.-R. A computational perspective on the neural basis of multisensory spatial representations. Nat. Rev. Neurosci. 3, 741-747
- 17. Suh, J., Rivest, A.J., Nakashiba, T., Tominaga, T. & Tonegawa, S. Entorhinal cortex layer III input to the hippocampus is crucial for temporal association memory. Science 334, 1415-1420 (2011).
- 18. Witter, M.P. et al. Cortico-hippocampal communication by way of parallel parahippocampal-subicular pathways. Hippocampus 10, 398-410 (2000).
- 19. Epsztein, J., Brecht, M. & Lee, A.K. Intracellular determinants of hippocampal CA1 place and silent cell activity in a novel environment. Neuron 70, 109-120
- 20. Harvey, C.D., Collman, F., Dombeck, D.A. & Tank, D.W. Intracellular dynamics of hippocampal place cells during virtual navigation. Nature 461, 941-946 (2009).
- 21. Grienberger, C., Chen, X. & Konnerth, A. NMDA receptor-dependent multidendrite Ca<sup>2+</sup> spikes required for hippocampal burst firing in vivo. Neuron 81, 1274-1281 (2014)
- 22. Wood, E.R., Dudchenko, P.A., Robitsek, R.J. & Eichenbaum, H. Hippocampal neurons encode information about different types of memory episodes occurring in the same location. Neuron 27, 623-633 (2000).

- 23. Markus, E.J. et al. Interactions between location and task affect the spatial and directional firing of hippocampal neurons. J. Neurosci. 15, 7079-7094 (1995).
- 24. Frank, L.M., Brown, E.N. & Wilson, M. Trajectory encoding in the hippocampus and entorhinal cortex. Neuron 27, 169-178 (2000).
- 25. Leutgeb, S. et al. Independent codes for spatial and episodic memory in hippocampal ensembles. Science 309, 619-623 (2005).
- 26. Royer, S. et al. Control of timing, rate and bursts of hippocampal place cells by dendritic and somatic inhibition. Nat. Neurosci. 15, 769-775 (2012).
- 27. Brankačk, J., Stewart, M. & Fox, S.E. Current source density analysis of the hippocampal theta rhythm: associated sustained potentials and candidate synaptic generators. Brain Res. 615, 310-327 (1993).
- 28. Mizuseki, K., Sirota, A., Pastalkova, E. & Buzsáki, G. Theta oscillations provide temporal windows for local circuit computation in the entorhinal-hippocampal loop. Neuron 64, 267-280 (2009).
- 29. Thomson, A.M. Facilitation, augmentation and potentiation at central synapses. Trends Neurosci. 23, 305-312 (2000).
- 30. Xu, W. et al. Distinct neuronal coding schemes in memory revealed by selective erasure of fast synchronous synaptic transmission. Neuron 73, 990-1001 (2012).
- 31. Anderson, J.S., Lampl, I., Gillespie, D.C. & Ferster, D. The contribution of noise to contrast invariance of orientation tuning in cat visual cortex. Science 290, 1968-1972 (2000).
- 32. Kuhn, A., Aertsen, A. & Rotter, S. Neuronal integration of synaptic input in the fluctuation driven regime. J. Neurosci. 24, 2345-2356 (2004).
- 33. Buzsáki, G., Horvath, Z., Urioste, R., Hetke, J. & Wise, K. High frequency network oscillation in the hippocampus. Science 256, 1025-1027 (1992).
- 34. O'Neill, J., Senior, T. & Csicsvari, J. Place-selective firing of CA1 pyramidal cells during sharp wave/ripple network patterns in exploratory behavior. Neuron 49, 143-155 (2006).
- 35. Buzsáki, G., Leung, L.W. & Vanderwolf, C.H. Cellular bases of hippocampal EEG in the behaving rat. Brain Res. 6, 139-171 (1983).
- 36. Sullivan, D. et al. Relationships between hippocampal sharp waves, ripples, and fast gamma oscillation: influence of dentate and entorhinal cortical activity. J. Neurosci. 31, 8605-8616 (2011).
- 37. O'Keefe, J. & Burgess, N. Dual phase and rate coding in hippocampal place cells: theoretical significance and relationship to entorhinal grid cells. Hippocampus 15, 853-866 (2005).
- 38. Rolls, E.T. Entorhinal cortex grid cells can map to hippocampal place cells by competitive learning. Network 17, 447-465 (2006).
- 39. McHugh, T.J., Blum, K.I., Tsien, J.Z., Tonegawa, S. & Wilson, M.A. Impaired hippocampal representation of space in CA1-specific NMDAR1 knock out mice. Cell 87, 1339-1349 (1996).
- 40. Kentros, C. et al. Abolition of long-term stability of new hippocampal place cell maps by NMDA receptor blockade. Science 280, 2121-2126 (1998).
- 41. Mehta, M.R., Quirk, M.C. & Wilson, M.A. Experience-dependent asymmetric shape of hippocampal receptive fields. Neuron 25, 707-715 (2000).
- 42. Song, S., Miller, K.D. & Abbott, L.F. Competitive Hebbian learning through spiketiming-dependent synaptic plasticity. Nat. Neurosci. 3, 919-926 (2000).
- 43. McClelland, J.L., McNaughton, B.L. & O'Reilly, R.C. Why there are complementary learning systems in the hippocampus and neocortex: Insights from the successes and failures of connectionist models of learning and memory. Psychol. Rev. 102, 419-457 (1995).
- 44. Hill, A.J. First occurrence of hippocampal spatial firing in a new environment. Exp. Neurol. 62, 282-297 (1978).
- 45. Frank, L.M. Hippocampal plasticity across multiple days of exposure to novel environments. J. Neurosci. 24, 7681-7689 (2004).
- 46. Monaco, J.D., Rao, G., Roth, E.D. & Knierim, J.J. Attentive scanning behavior drives one-trial potentiation of hippocampal place fields. Nat. Neurosci. 17, 725-731
- 47. Palmer, L., Murayama, M. & Larkum, M. Inhibitory regulation of dendritic activity in vivo. Front. Neural Circuits 6, 26 (2012).
- 48. Jiang, X., Wang, G., Lee, A.J., Stornetta, R.L. & Zhu, J.J. The organization of two new cortical interneuronal circuits. Nat. Neurosci. 16, 210-218 (2013).
- 49. Lovett-Barron, M. et al. Dendritic inhibition in the hippocampus supports fear learning. Science 343, 857-863 (2014).
- 50. Gambino, F. et al. Sensory-evoked LTP driven by dendritic plateau potentials in vivo. Nature 515, 116-119 (2014).



### **ONLINE METHODS**

**Animal experimentation.** All experiments were performed according to methods approved by the Janelia Farm Institutional Animal Care and Use Committee (protocol 12-84).

Surgery and training schedule. Custom-made titanium head plates with an opening over the right hippocampus were affixed to the skulls of 5- to 6-weekold mice using Loctite brand cyanoacrylate glue and dental acrylic while under either isoflurane or ketamine/xylazine anesthesia. The skull underneath the head implant opening was covered with cyanoacrylate glue and future locations for the craniotomies for the whole cell and field recordings were marked using stereotactic coordinates (2.0 caudal, 1.7 lateral for whole cell and 3.6-3.7 caudal, 1.7 lateral for field). After 5-7 d of recovery from surgery, running wheels were added to the cages and animals were placed on a water schedule protocol receiving 1.5 ml/d. After 5-7 d of water scheduling, animals were placed on the head fixation apparatus on either a training rig or the experimental rig for 20- to 40-min sessions per day for  $5{\text -}14$  d. Mice were trained to run for a 10% sucrose/water reward delivered once for every rotation of the belt (approximately 2 m) at the same location through a licking port. Mice were supplemented with additional water after training sessions to ensure they received 1.5 ml/d. Mice were used for recording after the number of trials (laps) completed per day was similar for 2-3 d. Animals that started training on the training rig were trained for at least two sessions on the experimental rig. The belt the animal used for training was the same belt used during the experimental session. The day before recording, animals were anesthetized using either isoflurane or ketamine/xylazine and two small (approximately 0.5 mm in diameter) craniotomies, one for the patch electrode and one for the field electrode, were drilled at previously marked locations. The dura was left intact and craniotomies were covered with silicone elastomer (Kwik-cast, World Precision Instruments).

Behavioral set-up and control. The linear track treadmill contains a belt made from velvet fabric (McMaster Carr) coated with visual and tactile cues as previously described<sup>26</sup>. There were three types of cues covering the length of the belt: glue spines, Velcro tabs and white spots. The belt is self-propelled and the mouse experiences all three sets of local cues per rotation of the belt. The sucrose/water reward was delivered through a custom-fabricated lick port controlled by a solenoid valve (Parker) between the glue spines and Velcro. Licks were detected as a beam break using a through-beam optical sensor (Panasonic). Photoelectric sensors were positioned at three locations on the belt between each cue type and used to determine the relative location of the animal along the belt and trigger the reward delivery, laser shutter and spatial current injections. The animal's speed was measured using a rotary encoder attached to one of the wheel axles. The valve, sensors and encoder were controlled with a custom-built microprocessor (Arduino) behavioral box interfaced with a Matlab graphical user interface. A separate microprocessor (Arduino) interfaced with a Matlab graphical user interface was used to control the laser shutter and spatial current injections on the basis of the animal's relative position on the belt.

In vivo electrophysiology. For each animal before whole cell patching, the depth of the pyramidal cell layer was detected using an extracellular recording. Extracellular electrodes were glass patch electrodes broken so that the resistance when filled with 0.9% NaCl was 1.5–3 M $\Omega$ . The extracellular electrode used to determine the pyramidal cell depth for whole-cell recording was mounted vertically on a micromanipulator (Luigs and Neumann). The extracellular signal was monitored using an audio amplifier (Grass Technologies). As the electrode was advanced thorough the cortex, the pyramidal cell layer was identified when theta modulated spikes were prevalent and the amplitude of ripples increased, typically 1.1-1.3 mm below the surface of the brain. The extracellular electrode to be used for LFP recordings during whole cell patching was mounted to a second micromanipulator (Narishige) on a 40-45° angle relative to the bregma, unless otherwise indicated, and advanced through the more caudal craniotomy. For most experiments, this extracellular electrode was advanced until detection of the pyramidal cell layer but not through it. For EC3 inactivation experiments, the fiber-containing electrode was advanced approximately 200–300  $\mu m$  beyond the pyramidal cell layer to position the light near EC3 axons. To correct for any location differences in theta phase between the LFP electrode location and the location of whole cell patch recordings, we recorded the two LFP signals

simultaneously. Long-taper whole-cell patch electrodes (7–12 M $\Omega$ ) were filled with (in mM) 134 potassium gluconate, 6 KCl, 10 HEPES, 4 NaCl, 0.3 Mg-GTP, 4 Mg-ATP and 14 Tris-phosphocreatine. Whole-cell patch electrodes were advanced through the cortex with 6-8 psi of pressure to prevent the electrode tip from clogging. Upon entry into the hippocampus (approximately 100–200  $\mu m$ from depth measured using the extracellular electrode), the pressure was reduced to 0.3-0.4 psi. Cells were identified by reproducible increases in electrode resistance. All recordings were made in current clamp using a Dagan BVC-700A amplifier and digitized at 20 kHz using an Instrutech ITC-18 with HEKA Patchmaster acquisition software. For the experiments in Figure 2, the LFP was filtered using a single-pole high-pass filter with 1-Hz cut-off frequency followed by a second-order Butterworth low-pass filter with a 12-Hz cutoff, delayed, and amplified using a custom-built FPGA device controlled by a Matlab graphical user interface. The filtering procedure produced an ~25 ms lag in the peak of the filtered response as compared with the unfiltered LFP. During whole-cell recording, the amount of amplification was adjusted until the current injection was sufficient to elicit spiking in either of the two delay conditions. To bias spiking toward the peak of extracellular theta, the filtered LFP was used with either 0 or 10 ms additional delay over that introduced by the instrument (25-35 ms total delay). To produce spiking on the trough of extracellular theta, the LFP was filtered and inverted before injection (producing the equivalent of ~95 ms total delay). The exact timing of the current injection relative to the LFP was subject to any theta phase offsets between the local LFP and that at the recording location. All data were grouped on the basis of the actual timing of the spiking relative to the LFP phase as measured during data analysis.

Optical fiber-containing LFP electrode preparation. To prepare an optical fiber-containing electrode, 9  $\mu m$  core fiber (1550 BHP, Thorlabs) with one end connectorized was loaded through the perfusion port of an electrode holder, stripped, cleaved, and etched in hydrofluoric acid in two steps: 5 mm of fiber etched to 30  $\mu m$  diameter, then the last 1 mm of fiber etched to 8–10  $\mu m$ . The etched fiber was loaded into a quartz (1.0/0.7 mm or 1.2/0.9 mm OD/ID, Sutter Instruments) electrode with a tip size of 12–20 μm. The fiber positioning inside the pipette was adjusted until the fiber tip was recessed 100–500  $\mu m$  from the pipette tip. These optical fiber-containing electrodes (LFP/fiber) were filled with saline the day of the experiment and used on subsequent days until the power out of the device dropped by more than 50% or the electrical resistance doubled. For laser light delivery, the output of a 594-nm laser (Mambo, Cobolt) was fiber-coupled into a single-mode fiber patch cable using a 3.3-mm focal length aspheric lens and the fiber mounted on a fiber-launch translation stage (MBT616D, Thorlabs) with associated hardware for FC/APC connectors. APC angled connectors were necessary to prevent back reflections into the laser head. The coupling fiber was connected to the LFP/fiber electrode using a FC/APC-FC/APC coupler. Optical throughput of a freshly prepared LFP/fiber electrode was 60-70%, and laser power out of the LFP/fiber electrode was between 7 and 12 mW for silencing experiments.

Photodetector for in vivo intensity measurements. To determine the light intensity profile for LFP/fiber electrodes, we constructed a photodetector device that could measure local light intensities in vivo. A plug of 645-nm-emitting quantum dots (QPP-645, Ocean Nanotech) was imbedded in epoxy at the tip of a pipette. To collect quantum dot fluorescence excited by laser light, this photodetector pipette also contained a 200- $\mu$ m-core, 0.22 NA fiber, etched at one end to 40  $\mu$ m diameter and fully inserted and glued into the photodetector pipette (Supplementary Fig. 7a). This fiber was connected to a bandpass filter (641/75, Semrock) and fluorescence was measured using a fiber-coupled spectrometer (QE65000, Ocean Optics). For the in vivo work, the photodetector was mounted onto the same manipulator used for patch experiments and inserted in a behaving animal at the same location as a patch electrode, to record the light intensity as a function of depth from the cortical surface. The laser light intensity was also measured at several distances from the LFP/fiber electrode tip, to generate an in vivo laser intensity heat map (Supplementary Fig. 7b). The photodetector was calibrated in saline using a 200-μm-core fiber coupled to a 561-nm laser as a light source of spatially defined light intensity using the same geometry as that used in vivo.

EC3 inactivation. To inactivate EC3 inputs, we crossed mice expressing Cre in EC3 (pOxr1-cre)<sup>17</sup> with mice expressing Rosa-CAG-LSL-Arch-GFP-WPRE

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(Ai35D, Allen Brain Institute) or Rosa-CAG-LSL-ArchT-EGFP-WPRE-bGHpA (Ai40D, Allen Brain Institute) to express Arch or ArchT selectively in EC3 neurons. There were no detectible differences in data from Arch or ArchT expressing mice, so data were combined from these two mouse lines. Arch expressed in EC3 axons and terminals was activated using light delivered through an optical fiber–containing LFP electrode (see above). The electrode was mounted at an approximately  $50^\circ$  angle relative to the bregma and, after detection of the pyramidal cell layer, was advanced an additional  ${\sim}300~\mu{\rm m}$  into stratum radiatum. EC3 was inhibited by activating Arch with 594-nm laser pulses 3-5 s long within the putative place field during running typically every other trial (Fig. 3b). Laser powers were 7-12~mW measured in air at the tip of the LFP/fiber electrode before an experiment. Light intensity at the location of EC3 axon terminals was estimated to be  $14-36~mW/mm^2$ , on the basis of in vivo measurements of light intensity using the photodetector (above and Supplementary Fig. 5).

In vitro electrophysiology (Fig. 3 and Supplementary Fig. 3). 400- $\mu m$  transverse hippocampal slices were cut from 8- to 10-week-old male C57/Bl6 mice using a Leica Vibratome VT1200S after perfusing an isoflurane-anesthetized animal with ice-cold solution containing (in mM) 210 sucrose, 25 NaHCO<sub>3</sub>, 2.5 KCl, 1.25 NaH<sub>2</sub>PO<sub>4</sub>, 0.75 CaCl<sub>2</sub>, 7 MgCl<sub>2</sub>, 7 glucose. Slices were incubated for 30 min at 35 °C, and then recorded from at 35 °C, in a solution containing (in mM) 125 NaCl, 25 NaHCO3, 3 KCl, 1.25 NaH2PO4, 1 MgCl2, 1.3 CaCl2, and 25 glucose. All solutions contained fresh sodium pyruvate (3 mM) and ascorbic acid (1 mM), and were bubbled with 95%  $O_2$  and 5%  $CO_2$ . Cells were visualized using an Olympus BX-61 microscope using a water-immersion lens (60×, 0.9 NA, Olympus, Melville, NY). Whole-cell current-clamp recordings were performed using a Dagan BVC-700 (Minneapolis, MN) in active 'bridge' mode and were analog-filtered at 10 kHz before being digitized at 50 kHz using Prairie View acquisition software (Bruker Technologies, Middleton, WI). The pipette solution was the same as described for the in vivo electrophysiology but also included 100 μM OGB-6f and 50 μM Alexa Fluor 594 (Invitrogen). Dual recordings were performed by first filling the soma and then target-patching the dendrite using a galvanometer-based two-photon laser scanning system (Ultima; Bruker Technologies, Middleton, WI; using Chameleon Ultra II; Coherent, Auburn, CA). Line scans for Ca<sup>2+</sup> imaging were performed with excitation at 920 nm using a frequency of 150 Hz. Ca<sup>2+</sup> imaging was performed in the distal apical dendritic regions because this is known to be the site of dendritic plateau potential initiation in pyramidal neurons<sup>6-11</sup>. Trains of EPSPs were elicited by electrically stimulating axons in the stratum radiatum or stratum lacunosummoleculare using platinum-iridium alloy bipolar microelectrodes (MicroProbes, Gaithersburg, MD) placed  $\sim$ 100–150  $\mu m$  away from the recording site.

In vitro electrophysiology (EC3 inactivation, Supplementary Fig. 8). Longitudinal slices through area CA1 of the dorsal hippocampus (400  $\mu m$ ) were prepared using standard procedures from 5- to 11-week-old EC3 cre  $\times$  Ai35 or Ai40D male or female mice. Slices were prepared as above with the following changes to recording solutions: cutting solution contained (in mM) 197.2 sucrose, 28 NaHCO<sub>3</sub>, 2.5 KCl, 1.25 NaH<sub>2</sub>PO<sub>4</sub>, 7 MgCl<sub>2</sub>, 1 CaCl<sub>2</sub> and 7 glucose, incubation solution contained 65.73 sucrose, 79.33 NaCl, 26 NaHCO<sub>3</sub>, 2.83 KCl, 1.25 NaH<sub>2</sub>PO<sub>4</sub>, 3 MgCl<sub>2</sub>, 1.2 CaCl<sub>2</sub> and 19 glucose, and recording solution contained 119 NaCl, 25 NaHCO<sub>3</sub>, 3 KCl, 1.25 NaH<sub>2</sub>PO<sub>4</sub>, 1 MgCl<sub>2</sub>, 1.3 CaCl<sub>2</sub> and 25 glucose with  $2~\mu M$  SR 95531 hydrobromide (gabazine) and 50 nM CGP 55845. Trains of EPSPs were elicited by electrically stimulating perforant path axons using a platinum-iridium alloy microelectrode (MicroProbes, Gaithersburg, MD) placed ~700–850 µm from the recording site. Theta burst stimuli consisted of five pulses at 100 Hz delivered five times with an inter-burst interval of 150 ms. Stimulus intensity was set such that the peak amplitude of the response to a burst recorded at the distal dendritic trunk was  $\sim$ 5–10 mV. For whole-field Arch activation in slices, broad-spectrum light from an X-Cite lamp (Lumen Dynamics, Ontario, Canada) was passed through a 55-nm-wide bandpass excitation filter centered at 590 nm and delivered through a 20× objective (Carl Zeiss, Germany), resulting in light intensities at the sample of  $\sim 30-60 \text{ mW/mm}^2$ .

**Data analysis.** The firing fields of single neurons were determined by first dividing the length of the belt into 100 bins. For each bin, the number of APs discharged in the bin was divided by the time the animal spent in the bin in order to generate a vector of firing rates. The firing rate vector was smoothed

by a running average (boxcar) of 5 bins. Periods when the mouse ran slower than 5 cm/s were removed from analysis. Neurons were considered place cells if the firing rates of a series of the adjacent bins was 0.2 of the peak for at least 20 cm (10 bins) and had a mean in-field firing rate more than 3 times the mean out-of-field firing rate.

To produce mean place-field firing-frequency plots for the population of place cells (**Fig. 1d**), the peak of the spatial firing rate distribution of each cell was centered at 100 cm (peak determined from smoothed (5-pixel Gaussian kernel) firing rate distribution). The aligned spatial firing rate distributions were normalized by dividing by the peak firing rate of each neuron and then this population was averaged to produce a single distribution. This mean normalized distribution was then binned (10 cm). Only neurons with a plateau probability >1 per 100 APs were used in this analysis, as well as for the ISI distributions shown in **Figure 4c** (N=16).

To quantify the average baseline  $V_{\rm m}$ , APs were removed by deleting all points 0.26 ms before and 3.4 ms after a threshold value ( $dV_m/dt = 50 \text{ V/s}$ ) and baseline  $V_{
m m}$  was defined as the peak of  $V_{
m m}$  histograms ( $V_{
m m}$  mode) from the resulting traces using a bin size of 0.2 mV. All traces were corrected for baseline drift on a lap-bylap basis by determining the average deviation of the most hyperpolarized 5% of AP voltage thresholds measured from an expected value of -50 mV. To determine the properties of plateau potentials underlying complex spiking, we used a signal detection protocol that began by smoothing the above trace with a running average (401 point, ~20 ms) boxcar procedure, following linear interpolation of the deleted AP points. Events were detected from this trace by threshold crossing (-35 mV). This value was determined as a conservative estimate of where  $V_{\rm m}$ distributions deviate from normal (Gaussian) (Supplementary Fig. 3). A second threshold level was evaluated (-30 mV) and, other than decreasing the total number of events detected by 12%, no quantitative differences were observed in any parameters. For the in vitro dual recordings, a burst of APs was classified as a plateau potential if the dendritic membrane potential corresponding to a somatic AP failed to repolarize below -30 mV. Plateau amplitude was calculated as the difference of event peak, and the baseline  $V_{\mathrm{m}}$  and plateau duration was the time between the positive-going and negative-going threshold crossings. Plateau probability was determined by dividing the total number of plateau events by the total number of APs per cell. To analyze ramps of depolarization, we low-pass filtered (<3 Hz) the raw AP-deleted traces using an FIR filter with a 200 ms Hamming window. Ramp amplitude was quantified as the difference between peak (10 cm average around the most depolarized value) and the baseline (10 cm average around the most hyperpolarized value). To analyze subthreshold  $V_{\rm m}$  theta oscillations, we band-pass filtered (4–11 Hz) the raw AP-deleted traces using an FIR filter with a 200-ms Hamming window and derived the amplitude vector using the Hilbert transform. The change in theta envelope ( $\Delta$ theta) was calculated in the same manner as the ramp amplitude.

The theta phase of APs and thetain were determined by first band-pass filtering the extracellular LFP in the theta range (4-11 Hz) and then deriving a vector of instantaneous phase using the Hilbert transform. The theta phase of each AP threshold crossing and theta<sub>in</sub> peak depolarization was found by interpolating from the vector of instantaneous phase. Theta-phase histograms of APs and plateaus were produced by dividing the theta cycle into 36 or 10 equal phase bins, respectively. The phase histogram of the AP and plateau events were computed for each individual neuron. Each AP phase histogram was fit by a sine function and the phase preference and modulation index were determined from the peak and modulation depth ((peak - trough)/peak) determined from this fit. These same values were determined for the plateau from smoothed plateau phase histograms (three-bin Gaussian window). For the population averages in Figure 2c, histograms of each neuron were first normalized by dividing by the total number of events found in each neuron. To determine whether there were any offsets in the phase of the recorded theta oscillation, in all recordings a reference LFP recording was performed at the site of the whole-cell recording simultaneous with the standard LFP recording and the theta phase peaks of the two simultaneously recorded LFP signals were compared. Most phase peak differences were less than 10° and no corrections were performed. However, differences between 10° and 40° were found in five neurons and we corrected for these differences during analysis.

For the determination of phase precession of APs and theta<sub>in</sub>, the phase values of these events were binned into 10-cm spatial bins for each individual neuron. For the population, the average phase of the first 10 cm of the place field

NATURE NEUROSCIENCE doi:10.1038/nn.4062

(with the start location being the proximal position where rate is 20% of peak firing) was compared with the average phase of the last 10 cm of the place field (with the end location being the distal position with 20% of peak firing).

The impact of EC3 inhibition on plateau properties was characterized in place cells (N= 8) where EC3 was inhibited by activating Arch within the place field on alternating laps (**Fig. 3b**). Average event probability (per 100 AP), duration and normalized duration (probability multiplied by duration) were determined for periods of running during which the laser shutter was opened (light) and these events were compared to those detected at the same spatial location on the belt (average position of the light periods) for control laps (no light).

The level of place field induction was quantified as the difference in the mean  $V_{\rm m}$  ramp of all laps before plateau or AP initiation versus the mean  $V_{\rm m}$  ramp of all laps recorded between 10 and 15 min after induction (or, for shorter recordings, the final 5 min). The  $V_{\rm m}$  ramp for each lap was calculated as above. For the plots in **Figure 5f,g**, the data are mean  $\pm$  s.e.m., with the number of neurons in each point being 3, 4, 5, 6, 6, 6, 5, 4, 6, 6, 5, 5, 5, 3, 3, 3. For the plots in **Figure 6g,h** the data are mean  $\pm$  s.e.m., with the number of neurons in each point being 8, 9, 14, 14, 14, 14, 14, 13, 14, 11, 12, 11, 9, 9, 9, 10, 10, 10, 10 for the plateau induction protocol and 3, 4, 6, 6, 6, 6, 6, 6, 6, 6, 6, 4, 5, 4, 5, 4, 4, 4, 3, 2 for the AP induction protocol.

A non-stationary fluctuation analysis (NSFA) was performed on  $V_{\rm m}$  by first aligning each trace to the center of the place field (peak of  $V_{\rm m}$  ramp) and then generating a mean trace from the aligned traces for each condition (before versus after). The location of the average place field center was used for the condition where no place field firing was evident. No aligning was performed on silent cells. Next APs were subtracted as above and the intracellular theta oscillation subtracted from each wave using the band-pass-filtered trace generated as above. The mean trace (Fig. 7b) was then subtracted from each lap to produce a residual trace for each lap (Fig. 7a). The trial-by-trial variance was calculated from a 2-s region centered on the peak of the place field of each lap and high-order moments calculated from the entire trace (Fig. 7e,f). A mean variance trace was also calculated using the  $V_{\rm m}$  residual for each lap (Fig. 7b). To produce variance-mean plots, the variance and mean were calculated (in 500-ms bins) for each lap and then combined into a single plot that was fit by the power function  $y = m^p x + b$ . In this case the variance was calculated from residual traces produced by subtracting the low-pass-filtered  $V_{\mathrm{m}}$  (ramp  $V_{\mathrm{m}}$ ) from the  $V_{\mathrm{m}}$  trace for each lap.

A simple simulation of random input integration was run to demonstrate the impact of changes in input unit frequency versus input unit amplitude. 300 Poisson-like interval input trains (150 excitatory and 150 inhibitory) were generated using the following function:  $n_{x+1} = n_x - \log(U/\lambda)$ , where  $n_{x+1}$  is the next interval,  $n_x$  is the current interval, U is a random number and  $\lambda$  is the rate. All intervals <4 ms were excluded to mimic the AP refractory period. For standard conditions,  $\lambda$  was set to produce approximately a 20-Hz input rate per train; for the simulation shown in **Supplementary Figure 14**, mean interval = 48 ms, distribution decayed exponentially with  $\tau$  = 42 ms. Excitatory and inhibitory units were produced by convolving a 'synaptic current' of the form  $f(t) = a[1 - \exp(-t/\tau_r)]^5 \exp(-t/\tau_d)$ , where a is a constant,  $\tau_r = 0.04$  ms and  $\tau_{\rm d}$  = 0.8 ms, with a 'membrane filter' that was an exponential function with  $\tau_{\rm m}$  = 6.7 ms. Excitatory amplitudes were pulled from a Gaussian distribution with a mean amplitude of 0.2 mV for control conditions while inhibitory units had an mean average of -0.2 mV. This produced inputs approximating unitary EPSP inputs recorded in CA1 neurons. A forcing function (green trace in Supplementary Fig. 14a) was used to scale either amplitude or  $\lambda$  of only the excitatory trains. Input trains were summed for 20 simulated trials and a NSFA was performed as above. The equations governing this process (Supplementary Fig. 14) show how variance is more sensitive (by the square) to changes in amplitude than rate. Overall the simulation shows that for conditions where inhibitory

input rate does not increase significantly (that is, fourfold; **Supplementary Fig. 14g**) it is impossible to achieve the levels of  $V_{\rm m}$  variance (elevations of approximately fourfold) observed in experimentally recorded place fields (with ~10 mV ramp) for this simple type of input integration model. Furthermore, even when extreme rate changes are used (sixfold excitation increase paired with fourfold inhibition increase) the relationship between  $V_{\rm m}$  variance and mean is approximately linear (**Supplementary Fig. 14g**). By contrast, the relationship between  $V_{\rm m}$  variance and mean was found to be greater than linear (power = 1.7) when the forcing function was applied to unit amplitude (**Supplementary Fig. 14f**).

Ripples were detected using the following algorithm. (1) LFP recordings from periods during which the animal did not run were concatenated and subsequently band-pass filtered between 100 and 250 Hz using an FIR filter. (2) The envelope of the filtered signal was calculated using the Hilbert transformation and ripples were subsequently detected as signals increasing >7 s.d. above baseline. (3) The onset and the end of the ripple were marked as the time points at which the envelope decreased below 3 s.d. of the baseline period; the time of the ripple peak was determined by peak detection between ripple onset and end. (4) The successful identification of the ripples and their features (peak, onset and end) was confirmed through visual inspection of the filtered signals along with the raw LFP signal.  $V_{\rm m}$  periods during ripples were subsequently further analyzed. The number of APs during a ripple was determined by the number of threshold crossings in the corresponding  $dV_m/dt$  trace (threshold = 50 V/s). Smoothed  $V_m$ traces (as above) were used to analyze ripple-associated subthreshold  $V_{\rm m}$ .  $\Delta V_{\rm m}$ was calculated as the difference between the mean  $V_{\mathrm{m}}$  values centered  $\pm$  10 ms around the ripple peak and the baseline  $V_{\mathrm{m}}$ . For each lap, the baseline  $V_{\mathrm{m}}$  value was determined by the peak of the  $V_{\rm m}$  histogram (see above).

For the analysis in Figure 8 (N=16 neurons), the neuron's place field was determined using the subthreshold slow  $V_{\rm m}$  depolarization (or ramp), which is a typical intracellular feature of place fields  $^{20}$ . To quantify the ramp, the linear track was divided into 100 spatial bins (each 1.9 cm wide) and an average  $V_{\rm m}$  value was calculated for each bin using the previously generated AP-deleted  $V_{\rm m}$  trace. After calculating the mean ramp depolarization across all laps, the place field was defined as locations on the linear track where the average of the subthreshold ramp continuously exceeded a baseline period (determined by visual inspection) of about 10 neighboring bins (>19 cm) for at least 5 adjacent bins (9 cm). The remainder of the linear track was considered to be outside the place field. These place fields covered on average  $74\pm2\%$  (mean  $\pm$  s.e.m.) of the linear track. Ripple location was calculated relative to the midpoint (place field center) between place field start and end. Locations before and after the place field center were pooled.

**Statistical methods.** No statistical methods were used to predetermine sample sizes, but our sample sizes are similar to or larger than those reported in previous publications  $^{19-21}$ . Where appropriate, data were analyzed using two-tailed paired or unpaired t-tests. Plateau duration, amplitude and probability are shown in text to be normally distributed. We assumed the same for ramp and theta $_{\rm in}$  amplitudes. If normality was uncertain, we used non-parametric test as stated in the main text or figure legends. All manipulations were done within single neurons, with manipulations interleaved trial-by-trial (light versus no light) or in blocks of five trials (current injections). Data were analyzed automatically without consideration of trial condition. To determine whether plateau counts displayed location dependence (**Fig. 4c**), locations were shuffled 10,000 times, resulting histograms were fit with a Gaussian and  $R^2$  values were compared between data histogram and location-shuffled data (bootstrapped permutation test). Data are shown as mean  $\pm$  s.e.m. Data collection and analysis were not performed blind to the experimental conditions.

A Supplementary Methods Checklist is available.

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